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A low energy demand scenario for meeting the 1.5 °C target and sustainable development goals without negative emission technologies

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Supplementary Information

A Low Energy Demand Scenario for meeting the 1.5°C Target and Sustainable Development Goals without Negative Emissions Technologies

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A summary of the main assumptions and findings with links to the below Supplementary Notes, Figures and Tables is presented in Table 1 of the Main text.

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Supplementary Note 1

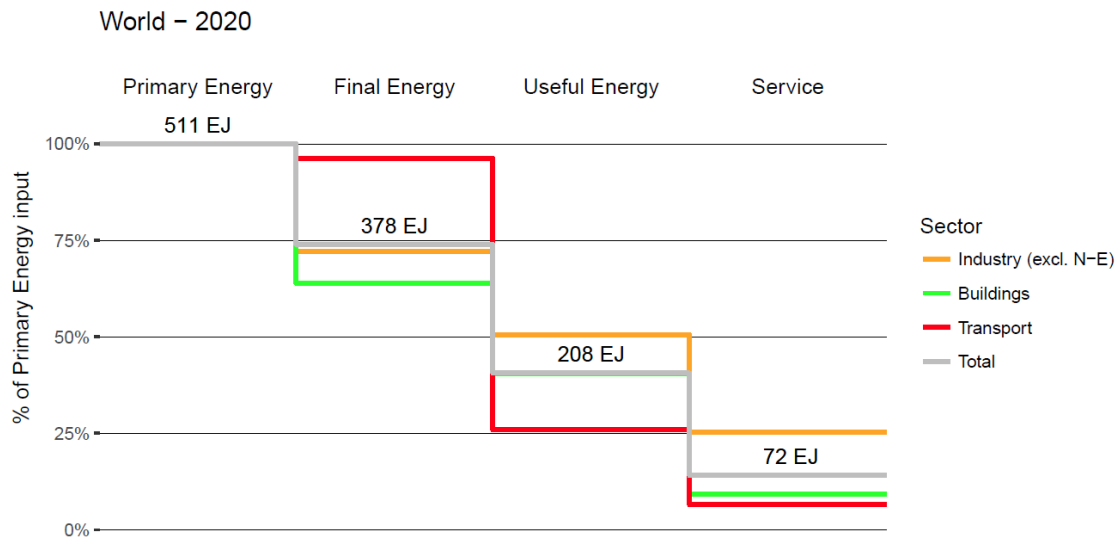
How Low Can We Go? The LED scenario focuses on energy services and final energy demand. Our motivation for this emphasis on energy end-use is threefold.

First, the final use of energy has long been identified both as the least efficient part of the global energy system and as having the largest improvement potentials¹.

Second, improvements in end-use efficiency leverage significant upstream savings in energy resources. Conversion efficiency from primary to useful energy in the global energy system is currently around 40% (Supplementary Figure 1). This means that 1 unit of useful energy conserved through efficiency improvements translates into a reduction of 2.5 units of primary energy². Cullen and Allwood² have estimated the emission reduction potential from improvements in end-use efficiency to be four times larger than efficiency improvement potentials in the energy supply upstream. Nakicenovic et al. (1990)³ extended traditional energy efficiency calculations to include energy-service provision. We have also adopted this approach for Supplementary Figure 1, which integrates exergetic service efficiency calculations.

The concept of exergetic service efficiency applies the traditional exergy calculus (Carnot efficiency) to service provision. The realized efficiencies between useful energy input and services delivered (passenger-km transported, lumens of lighting services, etc.) are determined by comparing current technologies and service provision modes with best available practice providing identical levels and quality of energy services (comparing passenger-km transported in an average car with average (low) load factors to a fuel efficient car with 4 passengers yields a corresponding exergy efficiency of service provision and provides an energy-equivalence aggregation (in Joules) of otherwise non-commensurate energy services).

The conversion efficiency of total primary energy inputs into services delivered is conservatively estimated at 14% on average for the global energy system in 2020. This means that improving energy efficiency at the service level by 1 unit yields a reduction in primary resource requirements by a factor of 7.



Supplementary Figure 1. Energy conversion cascades in the global energy system in 2020. Lines show percent of primary energy delivered as final energy, useful energy, and services respectively for three end-use sectors (industry, residential & commercial buildings, transport) and totals for the whole energy system in 2020. Energy flows exclude non-energy feedstock uses of energy (labelled as N-E). Total energy flows (EJ) are shown at each stage of the energy conversion cascade. Data on current primary, final, and useful energy levels and corresponding efficiencies are from the MESSAGE model calibrated to 2020 base year data (see Supplementary Notes 10 & 11); service efficiencies are first-order (conservative) estimates based on Nakicenovic et al. (1990)³ and Nakicenovic et al. (1993)⁴.

Third, we wanted to explore a scenario of rapid transformation and emissions reduction. End-use technologies and user behaviour are less 'locked-in' than capital-intensive and long-lived energy-supply technologies and infrastructures⁵. As a result, they offer a potential for more rapid change. The use of an integrated assessment modelling framework for interpreting our LED scenario enables us to track the systemic interdependencies between end-use and supply. More specifically, we are interested in how changing quantities and qualities of final energy demand for the provision of energy services affect corresponding upstream energy-conversion chains and efficiencies.

Scenario Development Approach. First, we develop a scenario narrative or storyline of secular trends shaping energy end-use globally to 2050. Second, we map the storyline down onto four main energy services comprising daily life in the Global North and South: thermal comfort, consumer goods, mobility, and food. Third, we build quantitative estimates of how our scenario narrative affects final energy demand. We also estimate the implications of resulting changes in energy-service quality and quantity on intermediate and upstream sectors including public and commercial buildings, manufacturing, construction, freight

transport, agriculture and the energy supply. Fourth, we use a global integrated assessment model framework, MESSAGE-GLOBIOM, to evaluate the consequences of our low energy demand scenario on energy supply and land-use. We also show that our scenario limits warming to 1.5°C with no overshoot, and has numerous other health and sustainable development benefits. We document our scenario in greater detail in the following Supplementary Notes and also provide an online data base with all numerical model results available under the following link: <https://db1.ene.iiasa.ac.at/LEDDB/>⁶.

Scenarios exploring future uncertainties are based on assumptions about the drivers of change and the impacts these could have on human and natural systems. The LED scenario combines a rich qualitative scenario narrative with quantitative analysis to explore the implications of radically-improved end-use efficiency and hence lower energy demand on the challenges of meeting a 1.5°C climate target without negative emissions technologies while simultaneously meeting a range of sustainable development objectives. The salience and plausibility of a future scenario like LED is based on scientific principles including: logical reasoning (i.e. assumptions derived from a clear scenario narrative in a coherent way); consistency (assumptions are varied across sectors, activities, technologies in a consistent way); stringency (implications and impacts are assessed comprehensively and using state-of-the-art integrated assessment models); and reproducibility (the scenarios assumptions, implications and impacts are grounded in the underlying scientific literature and documented in detail to allow others to reproduce the scenario and its results). These principles were followed in the development of LED.

As with any scenario and modelling analysis of future emission pathways, the LED scenario makes a series of assumptions: in developing a general scenario storyline or narrative, in mapping that storyline down onto specific changes in energy and land-use, and in modelling the systemic implications of those specific changes using MESSAGE-GLOBIOM.

Supplementary Table 1 summarises the main assumptions made in emission scenarios in general (first column) and then in the LED scenario specifically (second column). For each of the main types of assumption, Supplementary Table 1 also provides examples of the scientific literature on which we base our assumptions (third column), and where the full explanation and justification can be found in our manuscript and in the Supplementary Notes (fourth column).

Supplementary Table 1. Main assumptions used in the LED scenario.

Assumptions about ...	in the LED scenario ...	justified by ...	fully documented in ... *
what are the main drivers of the energy system	- the type and quantity of energy services consumed by end-users	examples: Fouquet 2010 ⁷ , GEA 2012 ⁸	Supplementary Note 1
how these drivers change in the future	- strengthening influence to 2050 of five drivers of change clearly evidenced today: rising quality of life; urbanisation; new and better energy services; more diverse roles for energy end-users; and innovation in information technologies	examples: quality of life (UNDP 2016 ⁹), end-user roles (Schot 2016 ¹⁰)	Supplementary Note 2
how changes in future drivers affect end-use services	- bottom-up estimates of final energy demand in 2050 <i>specific to each main end-use service</i> based on a simple decomposition into activity levels and energy intensity - as general examples: - activity levels rise to improve quality of life in response to new digitally-enabled energy services - energy intensity falls sharply as a result of electrification, economies of scope, increased utilisation rates of goods, and efficiency improvements and standards	examples: thermal comfort (Gunalp et al. 2017 ¹¹), mobility (ITF 2017 ¹²)	Supplementary Notes 3-6
how changes in future end-use services affect activity in upstream sectors	- bottom-up estimates of final energy demand in 2050 specific to each main upstream sector based on a simple decomposition into activity levels and energy intensity, and taking into account relevant changes in end-use services - as general examples: - dematerialisation of energy services reduces demand for industrial output (e.g., less steel for fewer cars) - urbanisation, decentralised production, and sharing economies slow rising demand for freight transport (e.g., fewer tonne-kilometres)	examples: industry (Allwood et al. 2012 ¹³ , Kallis 2017 ¹⁴)	Supplementary Notes 7-9
how changes in future end-use services and upstream activity affect energy and land-use systems	- bottom-up estimates of final energy demand for end-use services and upstream sectors in 2050 are fixed constraints which the energy and land-use systems must meet - MESSAGE-GLOBIOM appropriately represents main technical and economic relationships within energy and land-use systems - MESSAGE-GLOBIOM identifies least-cost transformation pathway from 2020 to 2050 to meet exogenously-specified energy demand (subject to additional constraints and assumptions)	examples: MESSAGE (Messner & Strubegger 1995 ¹⁵ , Riahi et al. 2017 ¹⁶), GLOBIOM (Havlik et al. 2014 ¹⁷)	Supplementary Note 11
how changes in energy and land-use systems affect the global climate	- MESSAGE-GLOBIOM quantifies emissions from the use of energy resources and land - emissions are input into coupled climate system model (MAGICC) to estimate global warming outcome	examples: energy-climate assessments (Riahi et al. 2007 ¹⁸); MAGICC (Meinshausen et al. 2011 ¹⁹)	Supplementary Note 12

Supplementary Note 2

The Low Energy Demand (LED) Scenario Narrative. The main text summarises the LED scenario narrative in brief. Here we provide further information on:

- LED scenario drivers;
- Additional features of the LED scenario narrative;
- Key characteristics of the LED scenario;
- Starting reference point for the LED scenario;
- Decent living standards in the LED scenario.

LED scenario drivers. The Low Energy Demand (LED) Scenario has five drivers and five additional features which are derived from or generated by the drivers (Supplementary Figure 2).

Each driver is a clearly observable 'mega-trend' that has, is still, and will continue to drive change in energy end-use. These mega-trends are secular in being persistent and not reliant on normative assumptions nor strong climate policy. Rather our scenario narrative is driven by assumptions about behavioural, technological and institutional changes already clearly afoot.

The five scenario drivers are: Quality of Life; Urbanisation; Novel Energy Services; End-User Roles; Information Innovation. These five drivers of change are described further in Supplementary Table 2 and summarised here:

Quality of Life [QOL]. Continued push for higher living standards, clean local environments, and widely accessible services, particularly in developing countries as incomes and aspirational living standards rise, supported by policy efforts to ensure a decent living for all. Note that decent living standards are addressed in detail in a dedicated section at the end of this Supplementary Note 2.

Urbanisation [URB]. Continued rapid urbanisation from a combination of population growth, internal migration and demographic shifts, particularly in mid-size cities in developing countries.

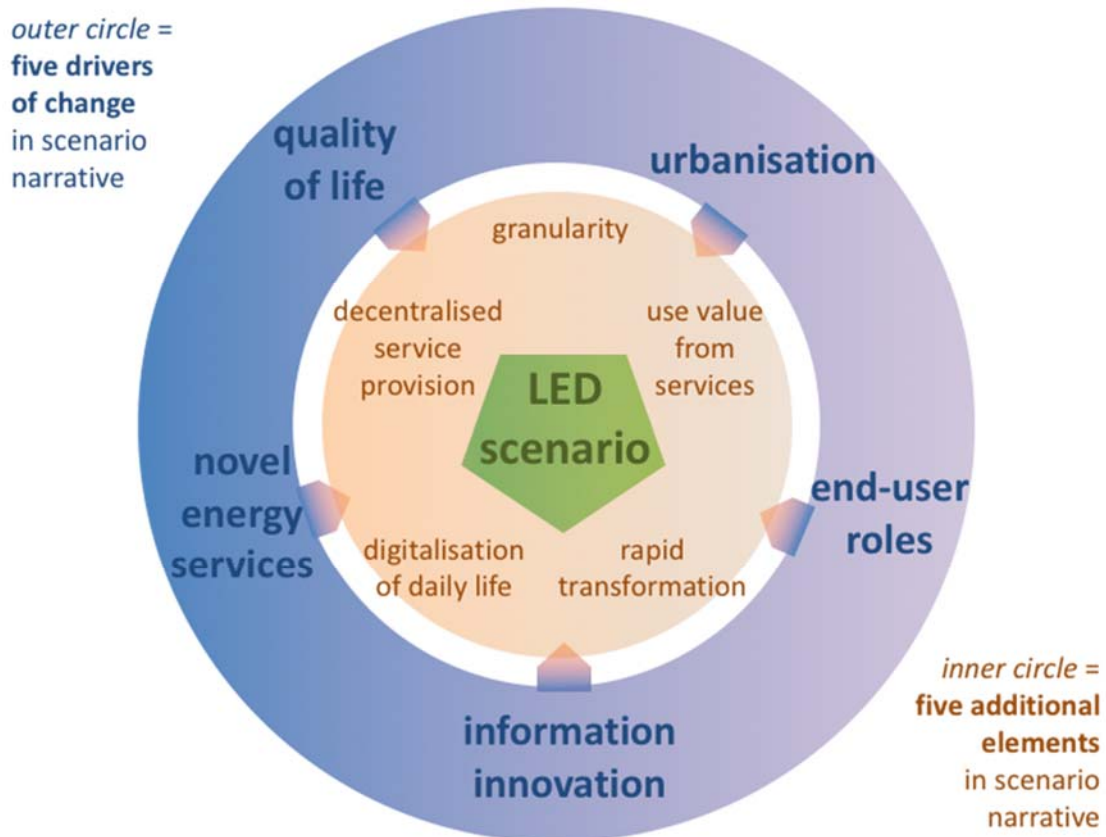
Novel Energy Services [SER]. Continued end-user demands for qualitative performance improvements in energy services including new functionality, new features, and new forms of service provision, consistent with quality of life improvements.

End-User Roles [USR]. Continued shift in end-user roles from passive consumer of centrally-provided services to multiple novel way of interaction, shifting engagement with energy production, trade, design, community and networks.

Information Innovation [INF]. Continued rapid improvements in information and communication technologies (ICTs) and applications of micro-processors, sensors, and wireless transmitters, enabling data-harvesting and analytics to improve system performance and energy service provision.

Supplementary Table 2. Drivers of Change in the LED Scenario.

<i>driver [label]</i>	<i>description</i>	<i>evidence</i>
Quality of Life [QOL]	<ul style="list-style-type: none"> - rising incomes & purchasing power - globalising aspirations - development efforts & policies (SDGs) - ageing populations & health needs - value placed on clean and healthy local environments (including indoors) 	<ul style="list-style-type: none"> - GDP per capita trends⁹ - global trade & cultural spillover - technology spillovers & leapfrogging²⁰
Urbanisation [URB]	<ul style="list-style-type: none"> - rising urban populations - rising number of cities, esp. mid-size - spatial constraints on mobility, property size & goods ownership - more opportunities for experimentation & diversity 	<ul style="list-style-type: none"> - urbanisation trends²¹ - peak car²² - peak material consumption
Novel Energy Services [SER]	<ul style="list-style-type: none"> - consumer preferences for performance improvements, ease of use & convenience - attractiveness of new value propositions & service functionality - risk-taking early adopters seeding market growth 	<ul style="list-style-type: none"> - long-run historical energy transitions⁷ - market transformation by disruptive innovations²³ - ICT integration into 'smart' energy service provision²⁴
End-User Roles [USR]	<ul style="list-style-type: none"> - energy market liberalisation & new entrants - availability of residential-scale energy production - accessibility & affordability of energy as politically-active issue - co-design of end-use technologies and services (esp. through ICTs) - energy citizenry as democratic response to utilities' market power 	<ul style="list-style-type: none"> - falling cost & rising numbers of residential PV (and battery storage)²⁵ - proliferation of local energy groups¹⁰ - town & city-scale leadership on energy & climate²⁶ - integration of user-active ICTs with energy technologies
Information Innovation [INF]	<ul style="list-style-type: none"> - rapid & sustained cost declines in general purpose ICTs with economies of scope (inc. microprocessors, sensors, wireless transmitters) - rapid & sustained performance improvements in wide range of ICT devices and applications - standardised, mass produced units manufactured at large scales benefitting from economies of scale and learning effects - rapid innovation cycles - network effects from dominant digital platforms spurring further innovation 	<ul style="list-style-type: none"> - Moore's Law & modularity - experience curves for mass-produced ICTs²⁷ - ICT penetration into conventional energy-using hardware & infrastructure²⁸



Supplementary Figure 2. Schematic representation of the LED scenario narrative. Outer circle shows LED narrative drivers, inner circle lists LED scenario additional features.

Inter-relationships between the five drivers of change generate additional elements in the LED scenario narrative. Each of these additional elements can be characterised by interdependent processes of behavioural, technological and institutional change (Supplementary Figures 3-7).

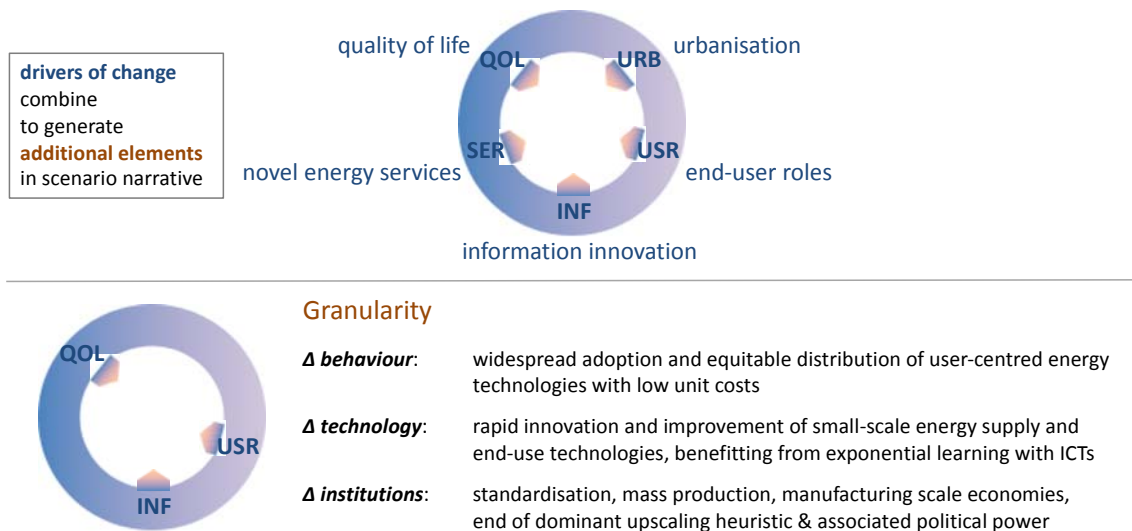
We use the following working definitions of these key terms:

- behavioural change (or Δ behaviour) = change in the quantity or quality of energy services consumed by end-users; micro-level (end-users)
- technological change (or Δ technology) = change in the technological, material or infrastructural form of energy services consumed by end-users; micro-to-macro level (devices to systems)
- institutional change (or Δ institutions) = change in organisational forms, markets, business models, ownership, policy environments, and supply chains through which energy services are provided for consumption by end-users; meso-to-macro level (organisations to markets)

The five drivers of change and the five additional elements of the LED scenario narrative are summarised in Supplementary Figure 2. Further details on each of the five additional elements and how they are generated by the five drivers of change are provided here.

Granularity. A strong emphasis on granular technologies is generated by end users pursuing improved quality of life [QOL] through performance improvements in energy end-use technologies [INF] and a more active role in the production as well as consumption of energy services [USR]. (See Supplementary Figure 3).

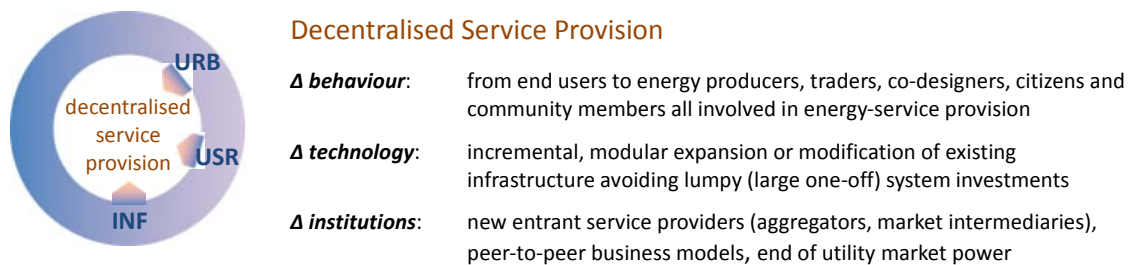
Granular technologies are small in unit size, have low unit investment costs, and are typically modular or scalable through standardised replication (e.g., solar PV, e-bikes); lumpy technologies are the converse (e.g., nuclear power, jet aircraft). Granular technologies have lower upfront costs and so lower barriers to entry. As a result, they are more equitably distributed among adopter populations so support more widespread improvements in quality of life. Low investment costs and short lifetimes mean granular technologies are also more open to experimentation and learning by users seeking to improve ease of use and convenience. Increasing integration of ICTs into granular end-use technologies further allows for rapid innovation cycles in digital design environments and applications through platforms or devices with rapid turnover.



Supplementary Figure 3. Drivers of change combine to generate additional features in LED scenario narrative: Granularity.

Decentralised Service Provision. A marked shift to more distributed forms of energy generation, distribution and end-use is generated by more active energy end-users [USR] in spatially constrained urban environments [URB] with information-rich networks and systems enabling real-time management of energy service provision [INF]. (See Supplementary Figure 4).

Decentralised or distributed energy resources range from energy end-use (e.g., smart phones) to storage (e.g., batteries) and supply (e.g., solar PV). Decentralisation at a systems level is a corollary of granularity at a technological level. Lock-in to lumpy infrastructures (e.g., grids, networks, pipelines) can be overcome through piecewise extensions or upgrades particularly in urban environments which are expanding incrementally into a highly fragmented and distributed availability of space. Alternatively, some new infrastructure may be modular in design (e.g., mobile telephone masts and transceivers). Distributed, additive manufacturing has the same decentralising and localising effect on material supply chains. Decentralisation is enabled by, and also reinforces increasingly varied and diverse end-user roles in energy service provision, accelerating 'edge-of-the-grid' innovation such as community energy networks or peer-to-peer trading between residential solar-battery or fuel cell systems. The widespread availability and distribution of cheap sensors and wireless transmitters supports large-scale data harvesting and cloud-based analytics for system management including balancing of intermittent supply with heterogeneous and variable demand.



Supplementary Figure 4. Drivers of change combine to generate additional features in LED scenario narrative: Decentralised Service Provision.

Use Value from Services. A movement away from owning goods to deriving use value from services is generated by the increasing convenience and accessibility of new flexible, user-responsive services [SER] enabled by digital technologies and platforms [INF] among communities and networks of users [USR]. (See Supplementary Figure 5).

Use-based business models create value from consuming a service rather than owning the good which provides that service. Data-driven digital platforms open up opportunities for distributed service providers to respond in real-time to users' needs. Sharing economies play an increasingly important role in linking providers with users, or users with users in peer-to-

peer forms of organisation. Trust devolves from centralised regulatory institutions. Localised service provision develops, particularly in dense urban areas where proximity lowers transaction costs. Municipalities reconfigure modes of service provision to tap users' increasing involvement. Asset utilisation rates increase in buildings, cars, and consumer goods, enabling a steady dematerialisation of daily life and freeing up road infrastructure for repurposing. Service provision becomes novel, flexible, available on-demand, and reflexively improving based on user experiences. In contrast, owning an end-use technology locks users in to a singular form of energy service. Flexibility in consuming a service tailored to specific needs on an ever-changing basis reflects increasing flexibility in working and living practices. Service offerings which fail to engage end-users rapidly fail; alternatives are rapidly introduced as barriers to entry are low and innovation cycles rapid.



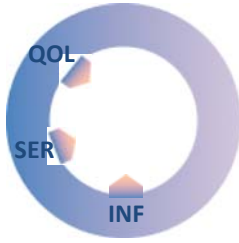
Use Value from Services

- Δ behaviour:** value derived from useful services, flexible and varied day-to-day service consumption, agile or destabilised routines
- Δ technology:** durability & versatility in end-use technologies, distributed data-harvesting and analytics, user-responsive learning systems
- Δ institutions:** digital platforms, network externalities, peer-to-peer business models, sharing economies, municipal hubs, non-ownership culture

Supplementary Figure 5. Drivers of change combine to generate additional features in LED scenario narrative: Use Value from Services.

Digitalisation of Daily Life. Pervasive integration of information technologies into energy service provision is generated by exponential cost declines and performance improvements in sensors, processors and wireless communication [INF] providing new service features including interactivity and control [SER] to make the demands of daily life easier for end users [QOL]. (See Supplementary Figure 6).

Rapid improvements in the cost, performance and interoperability of ICTs accelerate their widespread embedding in devices, appliances, homes, workplaces, utility networks, infrastructures. Energy services become easier, cheaper, and more practically controlled to suit and respond to users' needs. New control functionality enables both user specifications (inputs, preferences, routines) but also user passivity (learning algorithms, intelligent automation). Smart phones and other mobile devices provide gateways to service providers of mobility, thermal comfort, and food. Daily life becomes data-rich: sensing, analysing, responding, optimising, learning. Shared infrastructure responds to real-time information on end-users' preferences, experiences, and interactions. In particular, constraints on space and resources in dense urban areas stimulate efforts to optimise the design and use of roads, green spaces, and public institutions.



Digitalisation of Daily Life

- Δ *behaviour*: ubiquitous use of mobile devices to access & manage services, digital mediation of daily routines, mixture of taking and yielding control
- Δ *technology*: pervasive embedding of ICTs in devices & infrastructures, low cost inter-operable sensors, chips & transmitters, automation & AI
- Δ *institutions*: social contract on trade-off between data privacy & data harvesting, integration of tech providers & public service provision

Supplementary Figure 6. Drivers of change combine to generate additional features in LED scenario narrative: Digitalisation of Daily Life.

Rapid Transformation. Accelerating improvements in energy service provision is generated by strong end-user demands for improved quality of life [QOL] particularly in cities where spatial density and economies of scope foster experimentation [URB] and the rapid diffusion of successful innovations [INF]. (See Supplementary Figure 7).

As they have throughout history, end users continue to seek energy services which are higher quality, more accessible, cleaner, healthier, and more convenient. Rising incomes, rising aspirations, cultural spill-over, and globalised trade stimulate economic and social development which creates strong market demand for innovative service providers. Innovations brought to market quickly and effectively at scale win out. New functionality trumps cheapness. Granular technologies with lower adoption costs and risks are more equitably distributed, ensuring widespread accessibility to the benefits of rapid transformation. Granular technologies also diffuse faster *ceteris paribus* as they have lower upfront costs, lower complexity, and being widely distributed, are more observable and triable: all key innovation attributes which explain diffusion speeds²⁹. Rapid transformation implies losers as well as winners. Incumbents and marginalised groups of end-users receive transitional support mitigating their resistance to rapid change. Centralised planning agencies continue to be surprised by rapid rates of change (as currently with solar PV & electric vehicles). Energy-supply, utility networks, transport infrastructure expands at the margins avoiding singular lumpy investments.



Rapid Transformation

- Δ *behaviour*: strong end-use demand for change, social inertia reduced by clearly observable benefits of improved energy services
- Δ *technology*: small-scale, easy to use, infrastructure-compatible, widely-distributed energy-efficient end-use technologies
- Δ *institutions*: political economic resistance of incumbents, strong alliances among new entrants, transitional support for marginalised end-users

Supplementary Figure 7. Drivers of change combine to generate additional features in LED scenario narrative: Rapid Transformation.

Key characteristics of the LED scenario. In previous sections we have described the mega-trends driving change in the LED scenario, and the additional elements of the scenarios narrative generated by interrelationships between these mega-trends. Here we summarise the key characteristics of our scenario in general terms.

1. End-use and end-user focus. Our scenario is first and foremost about low energy demand. It is focused on energy end-use and end-use services. Resulting changes in energy-service qualities and quantities in turn induce transformation in intermediate sectors (manufacturing, freight, construction) and the upstream energy supply.

2. Balancing descriptive realism with normative goals. Mitigation scenarios and modelling tread a path between projecting likely outcomes based on current data, and illustrating optimal outcomes based on predefined policy goals. The motivating aim of our scenario is to trace the lowest bound for global energy demand to meet two normative objectives: ensuring decent living standards for all (see next section); and meeting the 1.5°C warming goal. However, we also make clear that our scenario narrative is built upon a realistic appraisal of current drivers of change in energy end-use.

3. Very rapid rates of change. The 1.5°C emissions budget requires rapid reductions in energy demand in the next few decades. Several of our scenario drivers underpin this fast transition, particularly the emphasis on granularity and decentralisation. Low cost, small-scale, modular end-use technologies with incremental expansions or adaptations of larger infrastructures offer greater potential for rapid change⁵. The end-user 'pull' for this rapid change is evidenced in consumer preferences for novel and better energy services consistent with the pursuit for a higher quality of life.

4. Secular drivers of change complemented by public policy. Mitigation scenarios rely narrowly on stringent climate policy (usually in the form of carbon pricing). However climate policy to-date has been weak, fragmented and insufficient to induce rapid decarbonisation. We build the LED scenario narrative of future energy end-use from behavioural, technological and institutional changes already visible in market settings (Supplementary Figures 3-7). Although these are not wholly independent of policy and regulatory frameworks, they are primarily driven by end users pursuing more attractive energy services which firms, cities and other organisational forms can provide. In addition to these 'secular' drivers of change, the LED scenario also relies on public policy. Climate policy (e.g., carbon pricing) is necessary to drive rapid decarbonisation of the energy supply, and sectoral policies (e.g., efficiency standards) are necessary to drive rapid improvements in end-use efficiency (e.g., heating systems, building envelopes). However, the LED scenario relies considerably less on climate policy than comparable stringent mitigation scenarios as the decarbonisation challenge is reduced by scaling down the size of the overall energy system (see Supplementary Note 11).

Starting reference point for the LED scenario. The Global Energy Assessment (GEA) Efficiency scenario³⁰ was chosen as the starting reference point for the development of the LED scenario narrative. The GEA Efficiency scenario describes a future in which deep, pervasive, and highly ambitious policy-driven efforts to improve energy-conversion efficiencies are rapidly and cumulatively built up throughout the economy⁸. Transformation pathways consistent with the GEA Efficiency scenario narrative are informed by detailed bottom-up assessments of energy demand in three end-use sectors: transport³¹, buildings³², and industry³³. As an example, changes in passenger and freight mobility are based on bottom-up analysis of modes, vehicles, fuels, efficiencies, and activity levels on a regionally disaggregated basis³¹.

GEA Efficiency serves as a useful reference point for the LED scenario for five reasons: (1) the underlying scenario narrative of GEA Efficiency is strongly technological in focus, so is a complementary base upon which the end-use focused narrative of the LED scenario can build without inconsistencies; (2) within the mitigation scenario literature GEA Efficiency already achieves relatively slow rates of global energy demand growth; (3) time-series data for GEA Efficiency at regional and sectoral scales are publicly available in online databases³⁴; (4) top-down systems modelling projections for GEA Efficiency are substantiated by detailed bottom-up assessments in the full Global Energy Assessment report (freely available online); (5) quantitative projections for GEA Efficiency are calculated using the global integrated assessment model, MESSAGE, which we also use here to quantify our LED scenario, allowing clear comparative interpretations and consistent assumptions.

GEA Efficiency is extensively documented so provides robust and transparent foundations on which to build.

Decent living standards in the LED scenario. Raising living standards in developing countries is central to the LED scenario. It is reasonable to expect that by 2050 living standards of all people will rise, even if future gains in economic growth are not equitably distributed. Based on some aggregate measures of human development, such as life expectancy or access to basic needs, at even past rates of progress most regions of the world barring some parts of Sub-Saharan Africa would reach thresholds that resemble the standards of industrialized countries by 2050. Development targets that break from the past and raise ambition would be consistent with a world that has embraced a low-carbon transformation, particularly in developing countries, where climate goals are typically embedded within a broader development agenda^{35,36}.

What would such a better world look like, from the perspective of households and their living standards? In a world without poverty, people would have surmounted a broad range of deprivations, regardless of their income^{37,38}. While the living standards to which people aspire depend on their culture, location, history and personal choice, there is enough common among us that one can expect that these standards include a minimum set of requirements, no matter what else they include^{39,40}. We call these decent living standards (DLS). These requirements ensure that people have the means to pursue a decent life, and avoid harm to their basic interests⁴⁰. Following Rao & Min³⁹, these requirements include amenities that ensure good health, and those that enable people to engage with society. They include safe and uncramped shelter, nutrition and water, clothing, health care, and basic comforts in the home, such as lighting and thermal comfort (including water heating), refrigerators and clean cooking devices. These basic comforts serve to avoid harm from extreme weather, disease and pollution. In engaging with society, people seek knowledge about the world, and the means to communicate with others, which give rise to the need for education, devices in the home to communicate (e.g., mobile phones) and access broadcast media (e.g. television), and access to mobility. (Note that these minimum requirements also include political, psychological and other social dimensions, but these aren't intrinsically material requirements, so we set them aside here.)

These material requirements of a decent life area associated with energy and other resource consumption to build the infrastructure in society to provide these goods and services and to operate them day to day. A world that achieves ambitious climate stabilization and attains these development goals has to ensure that the world has adequate energy in all regions to main these basic living standards. Furthermore, one has to allow for the possibility that a more equitable society is not an egalitarian one. Rather, the DLS serve as a floor, and average living standards may exceed this level, increasingly so in richer societies.

The components of a decent life in concept are reasonably well established in literature, but the quantities that people require are subjective, and therefore not easily generalized. Rao & Min³⁹ provide rough guidelines, where possible, for DLS. First and foremost, people need adequate nutrition, from foods that do not increase the risk of chronic disease. This suggests people should have 2,500 calories a day on average, with a limit on the share of calories from meat (see Supplementary Note 6). Other indirect energy needs arise from building and equipping homes. Rao & Min³⁹ find support in many high-income developing countries' regulations for a minimum floor space of 10 m² per capita, with a minimum size of 30 m² for a household, to accommodate a bathroom and kitchen. Such a home should be made of durable materials, and be equipped with the basic comforts discussed above. In particular, based on the climate, homes should have sufficient heating and cooling equipment to ensure that indoor temperature and humidity remain within an acceptable range all year long, and to heat water for bathing. In addition, every home should have a refrigerator, a television and a mobile phone per adult.

All households should have access to motorized transport, either from private or public modes. Otherwise, people are severely limited in their livelihood options, because people typically do not want to spend more than an hour a day commuting, regardless of what modes of transport they use⁴¹. The mobility needs (in terms of distance) of a society are hard to define at a global scale, because they depend on spatial organization of society at a local scale, related to the location of peoples' livelihoods, schools and hospitals, and other activities. However, one can estimate a minimum for a national average from the travel demand of affluent but compact societies that use public transport, such as Japan, which has the lowest travel demand (in passenger-km) among industrialized countries. The average person traveled about 7,000 km in 1987, 9,000 km per year in 1992⁴¹, and more recently around 10,000 km per year. Given that Japan was an affluent society with advanced transportation systems for its time by the late 1980s, one can assume that travel demand can be as low as 7,000 km per capita. We use this as our minimum acceptable threshold for DLS. The modes of transport should be such that air pollution should be below levels that pose hazards to health. This is particularly relevant for densely populated urban areas.

These goods and services consumed in homes, and the DLS activities outside the home (e.g. health care and education), give rise to other supporting economic activities, which are usually classified in commercial and industrial sectors. These are country-specific, since they depend on economic structure and other socioeconomic characteristics, and therefore cannot be a priori prescribed or estimated at a global scale.

Supplementary Note 3

Final Energy Demand by End-Use Service - Thermal Comfort. Here we discuss the underlying scenario drivers and energy demand implications for the provision of shelter, i.e. residential housing. We focus here on the thermal energy demand of residential dwellings (heating, cooling, cooking, and hot water provision). The energy use of residents in buildings (i.e. electricity use in appliances and communication and entertainment equipment) is discussed separately in Supplementary Note 4 on Consumer Goods. (Note that the two types of service categories are usually aggregated in the available scenario studies under the category residential/commercial sector or “buildings” that customarily also aggregate thermal and other energy uses (use of electricity in appliances). In order to allow comparisons with the published literature we also provide this aggregation separately here.)

Supplementary Table 3 below documents the assumptions underlying our LED scenario for residential thermal energy demand using a decomposition analysis linking the various scenario drivers related to activity as well as to energy variables respectively.

The starting point of our analysis is the GEA Efficiency scenario. Although the central metric of our LED scenario is formulated at the level of final energy (fuel input to home heating systems), we also need to discuss useful energy (heat/cooling delivered from residential heating/cooling systems) in the Supplementary Note here due to our underlying LED scenario storyline and also for reasons of comparability to the GEA Efficiency Scenario.

An important characteristic of the LED scenario is its focus on changing practices and technologies at the level of energy end-use, which change drastically compared to current patterns and which can only be documented when also considering useful energy. For buildings the level of energy demand, determined through the thermal integrity characteristics (insulation) of the building shell, is best defined at the level of useful energy (energy released by residential heating systems, e.g. radiators, AC units). The ratio of final to useful energy then describes the efficiency by which this useful energy is generated, including the efficiency of the boilers and the heat losses in pipes etc. For instance, traditional, single purpose high temperature (60 °C hot water) heating systems (e.g. gas fired boilers) typically only convert between 60% to 85% of final energy (gas) into useful energy (heat from the radiator) with the difference lost in boiler efficiency and heat pipe losses. Hence, for each unit of useful energy delivered between 1.2 to 1.7 units of final energy (fuel) are required. (Using traditional, inefficient biomass stoves this ratio can approach/exceed a factor of 5.) Conversely, novel residential energy systems such as heat pumps not only can provide for economies of scope (delivery of heating, cooling, as well as hot water services all via one end-use device as opposed to the traditional separate single-purpose devices), but can additionally harness ambient energy (air, ground, or water heat pumps) with coefficients of performance (heat out/fuel in, COP) reaching typically 3 or

above, provided low temperature (typically below 30 °C) heating/cooling (e.g. wall-integrated) systems are installed. In such cases final energy heating demand is lower than useful energy demand (as only the fuel input, typically electricity, is accounted for, but not the free ambient energy harnessed). This is the reason why in the decomposition analysis in Supplementary Table 3 we also report the final to useful energy multiplier and formulate the specific (per m² floor area) thermal energy demand at the useful energy level here to document the LED scenario in both dimensions of the efficiency of the building shell, and also that of the heating/cooling system used.

A second reason for also reporting useful energy here is methodological. Both LED and GEA Efficiency use an Integrated Assessment Modelling Framework (MESSAGE-GLOBIOM)⁴² to assess the upstream energy systems implications of scenarios of energy demand. In this framework, demands are formulated at the level of useful energy, with final energy determined endogenously in the model (both for GEA Efficiency and LED). The respective final-to-useful energy conversion efficiency is therefore determined by the choice of residential energy systems and technologies and a separate reporting of final and useful energy helps to clarify the differences between the LED and the GEA Efficiency scenarios.

It is worth noting that in this scenario comparison differences in 2020 values are substantial. The GEA Efficiency scenario used the year 2005 as base year and thus 2020 values constitute scenario projections. Conversely our LED scenario uses 2020 as base year drawing on recently published statistics⁴³, short-term trend extrapolations, as well as recent scenario studies^{11,44}. Updated 2020 data for LED particularly affect the residential floorspace area (LED: 178 billion m² globally in 2020 versus 155 billion m² in GEA Efficiency) and the final/useful energy conversion efficiency multiplier (LED: 1.6 versus 1.4 in GEA Efficiency globally in 2020), which translates into a difference in final energy use of 69 EJ globally in 2020 in LED versus the (optimistic) scenario projection of 49 EJ in GEA Efficiency.

The scenario projections of the basic drivers of population and available floorspace of residential dwellings of the GEA scenarios remain representative also of more recent comparable (intermediary) scenarios (e.g. the scenarios reviewed in Gueneralp et al.¹¹ or the IPCC SSP2 scenario¹⁶). With a global population growing to some 9 billion by 2050, residential floorspace is assumed to grow from some 180 (2020) to 260 (2050) billion m² in LED, which is comparable to the recent scenarios reviewed in Gueneralp et al.¹¹. Almost all of this growth in residential floorspace occurs in the Global South, again mirroring similar trends in the available scenario literature. The underlying growth pattern in residential floorspace holds important implications for energy demand. In the Global North, with a largely saturated floorspace demand (at some 30 m² per capita), future energy demand will be determined mostly by the performance of thermal retrofit of existing buildings, and only to a small extent by the characteristics of new built dwellings. Conversely in the South, a rapidly increasing housing stock (available per capita floorspace increases to some 30

m²/capita by 2050) implies that future energy demand will be largely determined by the energy performance of new residential buildings and to a much smaller extent also by the success of thermal retrofits of existing buildings.

The scenario drivers towards higher quality of life and urbanization interact to explain the assumed evolution of residential floorspace in the LED scenario.

In the Global South, a growing, increasingly urbanized population strives for higher quality of life translating into a significant growth in residential floorspace (to some 30 m² per capita by 2050, converging to values of the Global North), predominantly in new construction multi-family dwellings, offering numerous opportunities for efficiency improvements and improved thermal comfort via minimizing energy losses of building envelopes, high quality indoor air (via forced ventilation with energy recovery) and new multi-purpose end-use conversion devices offering further efficiency gains via recovery of ambient energy flows and reaping economies of scope (cogeneration) benefits via the use of heat pumps or fuel cells. These in turn follow the LED scenario logic of more decentralized provision of energy services as well as greater consumer autonomy (less dependence on energy supplied by centralized utilities), digitalization, and new consumer-driven business models (e.g. peer-to-peer energy trade among consumers).

In the Global North, LED (as in comparable scenarios in the literature) basically postulates saturating levels of residential floorspace per capita (at 30 m²/capita). Given the emphasis on quality of life, as well as the substantial improvements in urban environments in term of improved air quality and reduced traffic congestion described in the LED scenario storyline, “living in the city” becomes more emphasized in the Global North, departing from historical trends towards lower density suburbanization⁴⁵ and its associated single-family home driven growth of residential floorspace (that can approach 70 m²/capita in some regions⁴⁴). Efficiency improvements for buildings (but also transport, cf. the discussion below) in the Global North thus arise from three main effects: a) structural changes in building types and location (from single-family homes in low density suburbs to multi-family dwellings in denser urban core areas), from b) retrofitting existing buildings and building envelopes towards minimized heat (and cooling) energy losses (insulation), as well as c) end-user technology changes including heat recovery from ventilation and waste water systems, heat pumps, fuel cells, micro co-generation systems of heat and electricity, etc.

However there are also important tradeoffs to consider. Saturating demands for residential floorspace limit the structural effects of changes in residence types, the dominance of building retrofits may limit the impact of advanced low-energy building designs, and the efficiency impacts of novel end-use technologies such as heat pumps is limited for existing high-temperature residential heating systems (radiators operating with 60°C hot water) and stand-alone electric A/C units which cannot be changed to integrated low-temperature

heating /cooling configurations and new wall or ceiling heat/cooling heat transfer systems. These limitations are considered in LED, where corresponding optimistic assumption of the GEA Efficiency scenario have been reassessed with more moderation in the Global North. Conversely, comparable limitations are not in place in the Global South, where most of the residential floorspace growth is in new construction of multi-family dwellings in urban areas and thermal demand is dominated by cooling requirements rather than by heating offering larger efficiency gains from novel end-use systems such as heat pumps. In this case the original GEA Efficiency scenario assumptions have been reassessed drawing on recent literature in direction of a more optimistic (higher efficiency gains) outlook.

LED's residential buildings thermal energy demand in the Global North adopts a useful energy demand of some 160 MJ/m² by 2050 from the GEA Efficiency scenario, a significant reduction from current values of above 600 MJ/m². Such a reduction is feasible by assuming that current thermal retrofit rates in the region would double from 1.4 %/year to 3%/year, i.e. a residential building is assumed to undergo a retrofit on average every 30 years as illustrated in the recent “deep efficiency” scenario of Gueneralp et al.¹¹ (100-200 MJ/m²). That scenario reaches a similar result as GEA Efficiency (180 MJ/m²) that assumed a market penetration of advanced low energy buildings of well above 75% by 2050. Both scenarios are line with our LED scenario assumptions. While LED has comparable useful energy demand assumptions of GEA Efficiency, our scenario is more conservative with respect to the efficiency impacts (final/useful energy multiplier in Supplementary Table 3 below) of novel residential energy systems in the Global North as thermal retrofits of buildings (improvements in building shells through better insulation) are unlikely to result also in a complete replacement of existing (high temperature) heating cooling systems as well. After correcting the optimistic 2020 projections of GEA Efficiency with recent estimates of final and useful energy balances (from IEA⁴³ and De Stercke⁴⁶) we also revise upwards the optimistic 2050 projections of GEA Efficiency in the Global North in view of the limitations outlined above. As a result LED's final energy demand for thermal uses in residential buildings in the Global North ends up being 30% higher (LED 8 EJ by 2050, GEA: 6 EJ, see Supplementary Table 3).

For the Global South, the GEA Efficiency scenario projected quite conservatively specific useful energy demands of some 150 MJ/m² in 2050, higher than current averages in the South (120 MJ/m²). Thus, GEA Efficiency assumes that the energy efficiency performance of new residential buildings built in the Global South would not improve and achieve only a similar energy performance as thermal retrofitted building in the Global North. More recent scenario studies for residential buildings in the Global South suggest however substantial further efficiency improvement potentials by application of current best practice low energy building designs to new construction. The “deep efficiency” scenario developed by Gueneralp et al¹¹, and that shares driver assumptions in terms of population and residential floorspace with GEA Efficiency suggests a range of between 30 to 70 MJ/m² for advanced

new buildings in the Global South, but without considering the effects of large-scale penetration of heat pumps. We have adopted a value of 60 MJ/m² useful energy demand for residential buildings in the Global South for LED. Assuming the comparable structure of end-use heating/cooling systems with a high penetration of heat pumps and a corresponding final to useful energy ratio of 0.6 (compared to 0.7 in GEA Efficiency) this translates into specific final energy demands of some 40 MJ/m² in LED. These values only seemingly appear optimistic when compared to the assumptions underlying residential buildings in the Global North. First, the much lower thermal heating demand in the Global South (even when combined with a much higher cooling demand, this still results in lower thermal energy demands for residential buildings in the Global South) needs to be considered as well as the fact that by 2050 buildings will be predominantly new construction (as opposed to retrofits in the Global North) where the efficiency effects of novel integrated end-use devices such as heat pumps and fuel cells will have a larger impact compared to retrofits in the Global North. As such LED illustrates a pronounced leapfrogging effect in new building construction in the Global South. Total residential thermal energy demand in LED adds up to 13 EJ useful energy and 8 EJ final energy in the Global South, which is about 60% lower than in the GEA Efficiency scenario.

Globally, LED's final energy demand in residential buildings by 2050 is projected at 16 EJ by 2050, compared to 28 EJ (-43%) in GEA Efficiency or a range of between 30 to 38 EJ in the "deep efficiency" scenario of Gueneralp et al.¹¹ and the Beyond 2°C Scenario (B2DS) of IEA's Energy Technology Perspectives (ETP)²⁵. The reduction from 69 EJ to 16 EJ final energy demand for thermal comfort in residential buildings between 2020 and 2050 in the LED scenario cannot be decomposed into its corresponding sub-categories (heating, cooling, hot water, cooking) in our aggregated scenario framework, but comparable scenarios such as the IEA's ETP 2017²⁵ suggest an almost proportional decrease in heating and cooling energy demand as a result of significantly improved building envelopes.

Supplementary Table 3 summarizes the LED scenario, decomposed into its drivers and compares it to GEA Efficiency from which it was derived.

Supplementary Table 3. Decomposition of drivers of residential thermal energy demand. LED scenario and GEA Efficiency (in parenthesis).

		drivers			energy demand				efficiency (FE/UE ratio)
		popu- lation	floor- space	floorspace/ capita	unit useful energy demand	unit final energy demand	total useful energy demand	total final energy demand	
		<i>billion</i>	<i>billion m²</i>	<i>m²/capita</i>	<i>MJ/m²</i>	<i>MJ/m²</i>	<i>EJ/yr</i>	<i>EJ/yr</i>	
Global	2020	1.5	44 (42)	30 (29)	634 (484)	673 (528)	28 (20)	30 (22)	1.1
North	2050	1.6	47 (45)	30	158 (184)	166 (134)	7 (8)	8 (6)	1.1 (0.7)
Global	2020	6.2	134 (113)	22 (18)	120 (121)	294 (240)	16 (14)	39 (27)	2.5 (2.0)
South	2050	7.6	218 (208)	29 (27)	62 (152)	39 (107)	13 (32)	8 (22)	0.6 (0.7)
World	2020	7.6	178 (155)	23 (20)	248 (219)	388 (318)	44 (34)	69 (49)	1.6 (1.4)
	2050	9.2	264 (253)	29 (28)	77 (157)	61 (112)	20 (40)	16 (28)	0.8 (0.7)

Note: Global totals may not add up to the sum of regional totals due to independent rounding.

Supplementary Note 4

Final Energy Demand by End-Use Service - Consumer Goods. The main text and methods section summarises how the LED scenario narrative maps onto changes in the activity levels and energy intensities relating to consumer goods, with resulting consequences for final energy demand. Here we provide additional information on:

- Background data on consumer goods;
- Mapping the LED scenario narrative onto changes in the ownership and use of consumer goods;
- Activity levels and energy intensity of consumer goods;
- Bottom-up quantification of final energy demand for consumer goods;
- Upstream effects of changing consumer goods;
- Comparison of consumer goods in the LED scenario with the scenario literature.

Background data on consumer goods. Appliances (including lighting and cooking) use more than a third of the global energy consumed in buildings²⁵. Their part in electricity demand has been driven by the growth in several types of goods: large appliances (e.g., TVs, washing machines, refrigerators) increasing 50% since 1990; lighting, growing on average 2% annually since 2005; and networked devices and other small consumer electronics increasing 3.5% annually since 2010²⁵.

Information and communication technologies (ICTs) have dramatically progressed over the past half a century and multiplied the number of services to end-users. The computational capacity of ICTs has exponentially increased since the middle of the twentieth century, doubling every 1.5 years⁴⁷. This rate of improvement is popularised by “Moore’s Law” which holds that the number of transistors on a chip doubles every two years. Transistors now are also 60,000 times cheaper than the first ones sold in 1971⁴⁸. Technological innovation in cost, size and performance has led to widespread diffusion of digital technologies. A large number of ICTs and consumer electronics are powered with batteries. The energy required to perform the same computing work from a battery decreases 100 times every decade, which is faster than Moore’s law⁴⁹.

Historical trends show technological progresses in inventing, developing and diffusing higher performance technologies with lower environmental impacts. The energy efficiency of computers has doubled every 18 months, similar to the trends in computational power^{47,50}. However ICTs and consumer goods already account for 15% of electricity consumption in residential buildings⁵¹. ICTs impact final energy demand in two main categories: end-use devices, and supporting infrastructure.

The growth of energy consumption by ICT and consumer electronics has been the highest of all appliance categories in the first decade of this century, accounting for around 15% of global electricity demand⁵². The world’s population with access to the internet, for example, has increased from 10% to over 50% in the last 15 years⁵³. Data centres, a backbone of the internet infrastructure, increased their energy consumption to reach 1.3% of global electricity use in 2010⁵⁴. More recently, server demand has stabilized due to more efficient servers⁵⁴. Mobile phones are another end-use technology that has diffused rapidly and widely. Energy consumption attributed to mobile phones was estimated at 93 TWh in 2010, of which only 10% went to power the handsets, and the remainder the supporting infrastructure⁵⁵.

At current levels of energy efficiency, appliances and other equipment will double their electricity consumption by 2030, using more energy than any other final good or service category in buildings²⁵.

Mapping the LED scenario narrative onto changes in the ownership and use of consumer goods. Here we map the LED scenario's drivers of change onto the progress of appliances and other building equipment to 2050. This narrative of future change in consumer goods can be summarised by interrelated changes in behaviour, technology and institutions:

Δ behaviour: convenience, sharing, recycle, scope economies

Δ technology: convergence, dematerialization, micro computing & sensors, batteries

Δ institutions: social networks/platforms, usership, cross-sectoral regulation

Information Innovation & Digitalisation of Daily Life. Disruptive technologies based on mobile computing (e.g., laptops, tablets, smartphones) have become increasingly pervasive features of everyday life. Their impact on lifestyles continues and strengthens in the LED scenario. ICT features continue proliferating in quotidian objects such as thermostats and water heaters which acquire “smart” features and become connected through an 'Internet of Things' (IoT). The number of connected devices is projected to rise to 100 billion in 2050 from 14 billion in 2013⁵⁶. Connectivity enabling new services. Ubiquitous chips and sensors connect more and more intelligent devices which perform end-use services better and with a lower energy footprint. Smart grids interact with the connected devices to optimize their operation and reduce costs. Demand response to time-of-use pricing or signals from utilities becomes pervasive. Connected objects can react to their surroundings or provide new control functionality and convenience for end users. These changes help diffuse the observed efficiency improvements of ICT to a wider spectrum of appliances and devices in the future. Cloud-based services rapidly disseminate operating improvements (as software patches) and allow for rapid energy-performance optimisation and load management options.

Novel Energy Services & Granularity. Some ICTs converge multiple services performed by specialised devices into single 'general purpose' devices with associated changes in consumer behaviour. As an example, smartphones substitute other technologies to perform similar services (e.g. video camera, newspapers, GPS). We estimate the energy displaced as 100 times the amount of energy used by smartphones (see Supplementary Table 4 and Figure 2 in the main text). Smartphones also save 30 times the energy required on stand-by. Other objects substituting for several appliances include: smart TV (comprising access to internet and reaction in real time), kitchen appliances like Thermomix (combining thermal and mixing functions), and wearable devices like smart watches (including watch, phone, heart rate monitors and so on). Changes in technology and consumer behaviour reduce the energy intensity as well as the number of devices, assisting the trend of dematerialization.

Supplementary Table 4. Saving power consumption by converging multiple services in smartphones (sources include Lawrence Berkeley National Laboratory databases and catalogues and industry websites^{55,57-71,72-75}). Power consumption = 5 Watts (on), 1 Watt (stand-by).

Technology	Power consumption (W)	
	On	Stand-by
Camera	10	0.90
Hand-held calculator	0.001	<0.1
TV set	186.09	6.6
Game Console	67.68	1.01
Set-top box	44.87	43.46
DVD/VCR	22.37	5.04
White noise	18	0.5
Radio	17.7	1.12
Scanner, flatbed	15.6	2.48
Tablet/ I-Pad	10	0.75
Stereo portable	8.25	1.66
Alarm clock	7.6	0.7
(fixed) telephone	7.4	2.92
GPS	7.4	0.031
Electronic weather station	6	0.5
MP3/ I-Pod	5	0.75
PDA	5	2.24
Pager	4.03	2.24
Video camera	4	0.9
LED pocket lamp	1	0.5
Voice recorder	1.2	0.5
TOTAL (a)	449	72
Smartphone (b)	5	2.24
Share of Smartphone in Total (b/a)	1%	3%

Granularity & Rapid Transformation. Small-scale, low unit cost granular technologies (e.g., mobile phones) have lower adoption barriers and can diffuse more rapidly. Shorter lifetime accelerates the adoption of more efficient models contributing to rise the conversion efficiencies of the appliance stock more rapidly. Smaller appliances such as consumer electronics are more rapidly replaced because of the low embodied energy and the rapid efficiency improvement. Social networks accelerate the turnover by showing the benefits of new services and organizational models (including sharing), reducing social inertia.

In addition to device convergence, energy efficiency continues to improve, driven by developments in lighting, appliances, consumer electronics and ICTs. Technology improvements assimilate fast in ICT as granular, short-lived technologies tend to replace more rapidly older models.

Lighting, electronics (consumer and office) and residential appliances are among the sectors with the highest potential for resource gains and for energy demand reduction by 2.11 EJ each in 2030⁷⁶. These efficiency gains largely come from the dissemination in 2050 of the current top performance models, e.g., refrigerators reducing annual consumption from around 600 kWh to 120 kWh of the today's RF19 model from Sun Frost⁷⁷. Assuming the continuation of trends in the next decades, the energy efficiency of ICTs should increase by several factors until 2050. Activity levels also reduce further with the growth of cloud computing and virtualization which reduce the need for more computer infrastructure (software and hardware)⁷⁸. In additions to improving conversion efficiencies of devices, practical actions could reduce energy demand in appliances by 67% by reducing losses in passive systems⁷⁷. The practical actions summarised in Supplementary Table 5 can save 67% and 95% of current global energy use in appliances and lighting respectively (88 EJ + 12 EJ).

Supplementary Table 5. Practical actions to reduce losses from passive systems of appliances⁷⁷.

Appliance	Electricity demand EJ	Potential savings %	Practical actions to reduce passive losses
Cooker	8	80	better insulation of containers (stove-top, ovens)
Refrigerator/freezer	15	88	reducing heat gains (e.g., more insulation of the shell)
Consumer electronics	11	0	-
Washing machine	4	91	horizontal axis, lowering the water temperature, recovering energy from the hot wastewater, using less hot water
Dishwasher	2	91	lowering the water temperature, recovering energy from the hot wastewater, using less hot water
Clothes dryer	2	65	heat exchanger, lowering the water temperature, recovering energy from the hot wastewater, and using less hot water
Other	11	59	improving mechanical driven systems
Total	53	67	

Use Value from Services. "Usership" substitutes for ownership of devices. A higher utilisation rate (load factor) means faster end of the object's lifetime and more rapid replacement with better technology, improving efficiency and lowering operating costs. Fewer devices reduce manufacturing demand and help dematerialise the economy (including more recycling) and to make more services with less environmental impacts⁷⁹. Increasing sharing of equipment limits the rise of activity levels. Digital platforms and social networks enable increased exchange and sharing of smaller consumer electronics that further increase load factors and helps curb ownership growth. Larger appliances (e.g., washing machines) can also be shared in multi-family residential buildings in cities.

Activity levels and energy intensity of consumer goods. We develop a decomposition equation inspired by the methodology proposed in Cabeza et al.⁸⁰ and Unander et al.⁸¹, which provide a standard framework to explain changes in residential energy consumption:

$$kWh = \sum_{service} h \cdot \frac{n}{h} \cdot \frac{kWh}{n} = \sum_{service} h \cdot \frac{n}{h} \cdot \frac{u \cdot W}{n}$$

This provides us two main terms through to which on energy demand:

Activity: changes in the number of consumer goods per household: $h \cdot \frac{n}{h}$

Intensity: changes in the energy consumption per appliance or other equipment: $\frac{kWh}{n}$

Activity can be further decomposed into two main terms: 'Demography' changes the number of households (h); and 'Ownership' changes the number of devices (n) particularly in terms of the average number of goods per household ($\frac{n}{h}$).

Intensity can be further decomposed into two main terms: 'Usage' changes the average hours of use per device (u); and 'Efficiency' changes the average power of appliances (W).

In our analysis we focus on Activity and Intensity.

Activity refers to the quantity of energy service consumed by private users in residential households and commercial and public services, proxied by the number of appliances. Activities encompass the use of consumer goods, such as light bulbs for lighting and appliances for entertainment or cooking, without including devices for cooling or space heating which are covered in a separate chapter (i.e., thermal comfort). Activity levels increase or decrease depending on several factors such as improved and more equal access to the technology, introduction of new devices, or increases in the number of dwellings.

Intensity denotes the final energy necessary to deliver a unit of service measured in terms of average consumption per device during a year or kWh. This can vary by sector (residential/commercial) and by both service effectiveness and energy efficiency of devices such as light bulbs, appliances or cooking stoves. Examples include changes in consumer preferences towards devices that converge multiple services, such as listening to the radio or watching videos on smartphones, or the dissemination of more efficient kitchen appliances, light bulbs or other devices.

We also analyse upstream manufacturing effects in industry and impacts on the electricity supply. For example, the introduction of smarter devices which can connect and interact with other devices increases demand for electricity and industrial manufacturing output.

Supplementary Table 6 summarises how the drivers of change in the LED scenario narrative map onto more specific changes characterising consumer goods. Supplementary Tables 7 and 8 then summarise how the LED scenario impacts the factors which determine energy demand for consumer goods in the Global North and the Global South.

It is important to emphasise that the LED scenario narrative aims for improvement in the levels of material comfort in the Global South. The ownership of consumer goods such as televisions rise with incomes but saturates around \$8 - 10,000 annual income per person (\$PPP)⁸². Activity can reduce in the Global North as a result of saturating number of consumer goods and increasing levels of sharing.

Supplementary Table 6. Changing Consumer Goods Consistent with the LED Scenario Narrative. *In activity, arrows up denote changes that contribute to increase energy demand; In intensity, arrows up refers to changes that increase energy demand. Smaller arrows show the sub-categories that drive change in the main decomposition factors, Activity and Intensity.*

Change in consumer goods based on the LED scenario narrative	Impact on Energy Demand				
	Activity	- Ownership	Intensity	- Efficiency	- Usage
Granular technologies are affordable, can diffuse faster, and have shorter lifetimes allowing for rapid adoption of more efficient models	↑		↑	↑	↑
Convergence of devices into multiple purpose appliances (e.g., smartphones or smart TVs) and change in consumer preferences enable the performance of more services with less resources	↓	↓	↑	↑	
Electrification of almost all appliances (including battery powered and (partially) solar powered devices) and households in developing countries	↑				
Continued ICT penetration into appliances with an increase in the number of networked devices and new services (e.g., Internet of Things) that optimise the use of resources and allow the emergence of prosumer	↑		↑	↑	
Increasing shared ownership improves utilisation rates with lower number of devices	↓	↓	↑		
Efficiency improvement over time follows historical rates driven by lighting and ICTs			↑	↑	
Innovative and more efficient technologies appear until 2050 which are unforeseeable today (e.g. care robots)	↑	↑	↑	↑	

Supplementary Table 7. Impact of LED Scenario on Consumer Goods in the Global North (comparing to the reference scenario for 2020). See footnotes for explanation of data sources and energy intensity assumptions.

	ACTIVITY LEVELS (# devices, appliances)	ENERGY INTENSITY (kWh per device per year)	UPSTREAM
Lighting	<i>stabilized</i> : more efficient lighting requires fewer lights	<i>reduced</i> : dissemination of light-emitting diodes (LEDs), higher use of daylight in buildings, and adoption of lighting control systems in commercial buildings, reduces intensity by 75% ^a	more LEDs and generally solid-state lighting (SSLs) (manufacturing)
Appliances (incl. ICTs)	<i>reduced</i> : demand saturation and sharing; cloud computing and virtualization optimize the use of software and hardware	<i>reduced</i> : 60% ^b energy savings in average through the adoption of best available technologies (BAT) and better standards (including stand-by power reduction ^c), building automation systems and web-connected appliances ^d , and practical actions in passive systems	more intelligent devices (manufacturing); electrification (energy supply)
Cooking	<i>increased</i> : more use of improved electric appliances (e.g. stoves, ovens, microwaves)	<i>reduced</i> : 60-70% ^e efficiency improvement through the implementation of best available technology and practical actions in passive systems	electrification (energy supply)
Productive	increased: more use of electricity for agriculture and forestry activities	<i>increased</i> : machines are larger and more powerful (e.g. chainsaws)	electrification (energy supply)

Notes:

a - The potential for increasing energy efficiency in lighting is between 40 to 80%⁸³. Replacing conventional light bulbs with LEDs can save electricity use by 75%^{25,84}. In addition, using current technology to change lighting control systems in buildings can reduce energy demand by 50% in new buildings and 29% in a retrofit, particularly in commercial buildings⁷⁶. Cullen et al.⁷⁷ estimates the potential for energy savings in lighting at 95% through the implementation of practical actions in passive systems (i.e., not related to the conversion device) such as task lighting, reducing over-design and improving the luminaire in lighting.

b - The technical potential to reduce energy use is in average 50-80% in several sectors^{85,86}. Cold appliances could reduce the energy use in 45% in the European Union and even more in other regions if they catch up with the EU efficiency levels⁵¹. "Wet" appliances (washing machines, dishwashers, dryers) and kitchen appliances could save 40-60% with the implementation of best available technologies⁵¹. Already certified appliances improves efficiency by 35% in average comparing to standard appliances⁷⁶.

c - ICT and networked devices could reduce energy demand by 65% through the implementation of best available technologies and standards⁵⁶. For example, a large part of their electricity demand (up to 80% in some devices) goes to stand-by power, of which 40-80% can be avoided with better designs (and standards) and more appropriate uses⁵⁶. Mobile phones provide connectivity with nearly zero stand-by consumption^{55,56}.

d - Replacing manual with automated building management controls that regulate and controls energy services such as lighting, ICT or appliances, can reduce energy consumption by 10 to 20%⁸⁷. Implementing more efficient building automation systems can save 40% of energy demand in commercial buildings⁸⁸. Recent trends in automation and web-connected objects like in the Internet of Things and smart grids could further accelerate the adoption of automation systems in a wider range of building sizes, ownership (commercial and residential) worldwide⁸⁷.

e - There is a 80% potential energy savings in cooking through the implementation of practical measures⁷⁷.

Supplementary Table 8. Impact of LED Scenario on Consumer Goods in the Global South (comparing to the reference scenario for 2020). See footnotes of previous table for explanation of data sources and energy intensity assumptions.

	ACTIVITY LEVELS (# devices, appliances)	ENERGY INTENSITY (kWh per device per year)	UPSTREAM
Lighting	<i>increased:</i> 'quality of life' & more equal access to quality end-use technologies	<i>reduced:</i> dissemination of LEDs, and adoption of lighting control systems in commercial buildings, reduces intensity by 75% allowing smarter ('ICT') features and more efficient management of resources	more LEDs and generally SSLs (manufacturing), electrification (energy supply)
Appliances (incl. ICT)	<i>increased:</i> rising income and 'quality of life' & more equal access to quality end-use technologies	<i>reduced:</i> 10-20% of efficiency improvement by upgrading to developed countries' standards, and further 40-60% through implementing best available technologies and standards (including to minimize stand-by power) and practical actions to reduce losses from passive systems	more appliances (manufacturing); electrification (energy supply)
Cooking	<i>increased:</i> more equal access to end-use technologies	<i>reduced:</i> 40% of efficiency gains through the adoption of best available technologies and practical actions to reduce losses from passive systems	more electric stoves and microwaves (manufacturing); electrification (energy supply)
Productive	<i>increased:</i> more use of electricity for agriculture and forestry activities	<i>increased:</i> machines are larger and more powerful (e.g. chainsaw)	electrification (energy supply)

Bottom-up quantification of final energy demand for consumer goods. We estimate the overall effect of these changes to activity and intensity in both the Global North and South in 2050 using the GEA Efficiency scenario as a reference point (see Supplementary Note 2 for details of GEA Efficiency). GEA Efficiency is based on a bottom-up analysis of technical efficiency-driven changes in the types of goods, number of appliances, efficiencies and activity on a regionally disaggregated basis³².

The GEA Efficiency scenario and the LED scenario converge on the vision that energy demand from appliances and consumer goods is likely to increase in the coming decades associated with quality of life improvements. Both scenarios also anticipate that appliances and plug-in loads may dominate the energy demand from buildings in 2050 if the energy performance of buildings keeps improving.

The GEA Efficiency scenario focuses on improving conversion efficiencies to manage the growth of electricity consumption for appliances in 2050. The GEA Efficiency scenario

compares energy savings against a scenario of frozen efficiencies. The reduction of standby power (to near zero or 0.1 W) is the highest source of energy savings in relative terms with 65% of electricity demand. Savings for other appliances are 50% on average, particularly in the two appliances responsible for the highest electricity consumption (refrigerators and TVs). The GEA Efficiency scenario assumes continued growth in activity levels particularly in the Global South where incomes rise sharply.

Compared with the GEA Efficiency scenario, the LED scenario is more ambitious with respect to efficiency improvements of appliances thanks to the penetration of ICT in appliances and widespread dissemination of high performance standards. The LED scenario takes the high end of the range for potential improvement from the literature which is 60% on average in 2050 from the adoption of best available technologies and the convergence of standards in the Global South with the Global North^{25,51,56}. Hence, reductions in energy intensity are ca. 30% higher than in the GEA Efficiency scenario.

In addition, the LED scenario takes into account changes in consumer behaviour that reduce the number of appliances. Compared to GEA Efficiency activity levels reduce by 14% and 2% in the Global North and South respectively. In the Global North, activity falls due to demand saturation of appliances. In both the Global South and North activity growth is further constrained by the use of ICT-driven device convergence (e.g. smartphones, smart TVs) and the impact of sharing economy business models on utilisation rates (e.g., shared washing machines in buildings, ICT equipment in shared office spaces). Very high efficiency and changes in activity in lighting, appliances and cooking reduces 3,147 TWh annually (11 EJ/a) by 2050 in comparison with the GEA Efficiency scenario.

We estimate the impact of the LED scenario on energy demand from consumer goods by changing the assumptions on activity and intensity for both residential and commercial sectors in the GEA Efficiency scenario, as explained in Supplementary Tables 7 and 8.

Supplementary Table 9 presents the results of the LED scenario for both the Global North and the Global South in 2050. The expected number of households in 2050 is 609 million and 1717 million respectively in the two regions. Global specific electricity demand from consumer goods in 2050 is 11,477 TWh (or 41 EJ), of which 7,834 TWh is in the Global South and 3,643 TWh in the Global North. Lighting (residential and commercial) represents almost a third of final electricity consumption in the Global North and is also the main category in the Global South. The second highest source of demand is from refrigerators in the Global North, and from TVs in the Global South. 'Other appliances' are also important, including: 'wet appliances' other than washing machines (e.g., dishwashers, clothes dryers); mechanical systems (e.g., water pumps, ventilation systems, electric generators); other small consumer electronics and ICT (e.g., video, DVD, CD), kitchen (e.g., kettles, blenders),

and a diversity of other devices and innovations that might emerge by 2050 (e.g. personal care and communication robots, hologram machines).

Supplementary Table 10 compares the LED scenario with GEA Efficiency. Panel **a** shows results for the Global North and panel **b** for the Global South.

Overall energy demand is 20% and 22% lower in the Global North and Global South respectively in the LED scenario compared to GEA Efficiency. Activity reduces in the LED scenario particularly in the Global North where it is cut by 14% as a result of saturation of demand and the role of the sharing economy. Intensity decreases dramatically globally and reaches almost a third in lighting and appliances in developing countries thanks to the dissemination of LED light bulbs and highly efficient appliances. Even though the progresses made by developing countries, the number of devices owned per capita as well as the energy demand per capita remain roughly half the numbers in OECD, but these numbers are large enough to provide decent living standards (see Supplementary Note 2).

Supplementary Table 9. LED Scenario for Specific Electricity Demand from Consumer Goods in the Global North and Global South in 2050.

		Global North	Global South	World
SECTOR	TYPE	TWh	TWh	TWh
Residential	Lighting	84	396	480
	Appliances:			
	<i>Refrigerator</i>	121	396	517
	<i>Fan</i>	14	132	147
	<i>Washing machine</i>	50	128	178
	<i>TV</i>	66	649	715
	<i>Standby</i>	6	14	20
	of which ICTs:			
	<i>PCs</i>	24	263	287
	<i>Router/Modem</i>	17	190	207
	<i>Mobile Phones</i>	3	14	16
	Other appliances	850	3035	3885
	Cooking	92	121	213
	<i>Total Residential</i>	1327	5338	6664
Commercial	Lighting	252	598	850
	Appliances & misc.	1865	1228	3094
	Productive (agriculture/fisheries)	200	670	870
	<i>Total Commercial</i>	2317	2496	4813
	<i>Total</i>	3643	7834	11477 (41 EJ)

Supplementary Table 10. Impact of LED Scenario on Consumer Goods (compared to GEA Efficiency).

a. LED SCENARIO relative to GEA Efficiency Global North 2050									
PER GOOD	ACTIVITY (millions of units)			INTENSITY (kWh per unit)			ENERGY DEMAND (TWh)		
	GEA Efficiency	LED Scenario	Δ in LED Scenario	GEA Efficiency	LED Scenario	Δ in LED Scenario	GEA Efficiency	LED Scenario	Δ in LED Scenario
lighting appliances (incl. ICT)	30 894	24 171	-22%	36	26	-29%	627	335	-46%
cooking	42 960	39 053	-9%	169	155	-9%	3 643	3 016	-17%
productive	2 273	2 273	0%	40	40	0%	92	92	0%
	1 600	1 600	0%	125	125	0%	200	200	0%
total	77 727	67 097	-14%				4 562	3 643	-20%
<i>total per capita</i>	49	42	<i>units per capita</i>	112	104	<i>weighted avg</i>	2 851	2 277	<i>kWh per capita</i>

b. LED SCENARIO relative to GEA Efficiency Global South 2050									
PER GOOD	ACTIVITY (millions of units)			INTENSITY (kWh per unit)			ENERGY DEMAND (TWh)		
	GEA Efficiency	LED Scenario	Δ in LED Scenario	GEA Efficiency	LED Scenario	Δ in LED Scenario	GEA Efficiency	LED Scenario	Δ in LED Scenario
lighting appliances (incl. ICT)	80 110	80 110	0%	36	26	-29%	1 392	994	-29%
cooking	99 151	94 945	-4%	159	115	-28%	7 880	6 049	-23%
productive	2 999	2 999	0%	40	40	0%	121	121	0%
	7 600	7 600	0%	88	88	0%	670	670	0%
total	189 861	185 654	-2%				10 063	7 834	-22%
<i>total per capita</i>	25	24	<i>units per capita</i>	103	74	<i>weighted avg</i>	1 324	1 031	<i>kWh per capita</i>

* Number of appliances using standby are not counted in order to avoid double counting.

Upstream effects of changing consumer goods. We also estimate the upstream implications of the LED scenario on industry and electricity supply. Supplementary Table 11 shows the level of activity (number of appliances, ownership by household) and intensity (energy efficiency in Wh per device, usage in hours per year per device) in 2020 and 2050 for LED and GEA Efficiency scenarios. In 2020, LED is set equal to GEA, i.e., they share the same base year.

Activity levels (measured by the number of devices) are higher than in 2020 in both scenarios given the increase in demand for consumer goods and the introduction of new services. This creates new demands for industry and supply chains to provide an increasing number of electrical devices. The number of appliances is lower in 2050 in the LED scenario comparing to GEA Efficiency as a result of service efficiencies, higher utilisation rates, sharing goods, and ICT-driven convergence of multiple services onto smartphones and smart

TVs. Hence ownership is also lower in the LED scenario relative to GEA Efficiency both per household and per capita. The decrease in the Global North compensates for the smaller reduction in activity levels in developing countries.

Usage (weighted average per unit annual operating time) reduces in both scenarios as a result of the reduction in electricity use and share of the number of appliances of large devices that run over the entire year (e.g., refrigerator, freezers, routers/modems).

Energy efficiency improves (reduction of average Wh) in the Global North through the implementation of smart technologies, shared goods, and ICT-driven convergence of devices. In the Global South, efficiency improves in the LED scenario in relation to GEA Efficiency but the increase in large appliance ownership more than offsets the efficiency gains.

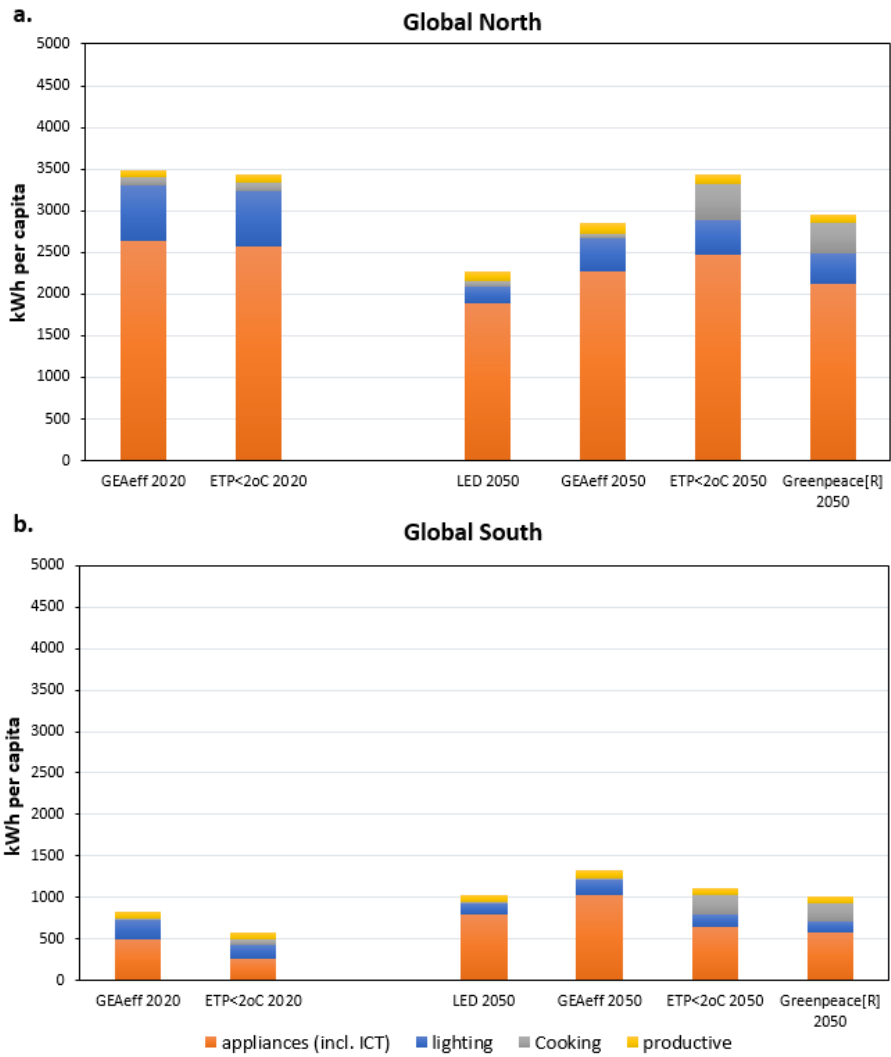
Supplementary Table 11. Number of appliances, energy efficiency and usage in the LED and GEA Efficiency scenarios in 2020 and 2050.

Stock and Usage of Appliances Global North			GEAeff 2020	GEAeff 2050	LED 2050
ACTIVITY	No of appliances	million of units	37 582	77 727	67 097
	Households (HH)	millions	533	728	728
	Appliances per HH	units/HH	71	107	92
	Appliances per capita	units	27	49	42
INTENSITY	Weighted avg	kWh/unit	126	112	104
	Energy efficiency	W/hr	74	112	68
	Average hours of use	hrs-year/device	1 697	1531	1 529

Stock and Usage of Appliances Global South			GEAeff 2020	GEAeff 2050	LED 2050
ACTIVITY	No of appliances	million of units	67 452	189 861	185 654
	Households (HH)	millions	1 400	2 999	2 999
	Appliances per HH	units (devices/HH)	48	63	62
	Appliances per capita	unit	11	25	24
INTENSITY	Weighted avg	kWh/device	75	103	74
	Energy efficiency	W/hr	33	55	50
	Average hours of use	hrs-year/device	2 274	1 863	1 503

Comparison of consumer goods in the LED scenario with the scenario literature. The LED scenario provides the lowest estimate for energy demand in consumer goods in 2050 when compared to other low energy demand scenarios in the literature. Supplementary Figure SI-3b-1 compares the specific electricity demand per capita (kWh) in 2020 and 2050 between LED, GEA Efficiency, the “Beyond 2°C scenario” from IEA Energy Technology Perspectives 2017²⁵, and the “[R]evolution” scenario from Greenpeace Energy Revolution⁵¹. In 2020 the LED Scenario is equal to GEA Efficiency. Panel **a** is for the Global North; panel **b** is for the Global South. Both panels use the same y-axis scale for comparability.

The LED scenario anticipates a decrease in specific electricity demand in the Global North from 3,490 kWh per capita in 2020 to 2,277 kWh per capita in 2050. This is the lowest energy demand among the scenarios. It also anticipates one of the lowest energy demands in the Global South in 2050 of 1,031 kWh per capita.



Supplementary Figure 8. Comparison of LED Scenario with Scenario Literature on Consumer Goods Per Capita. Note: some appliances related to cooking (e.g. microwaves, electric ovens, stoves) are included in "appliances (incl. ICT)" in GEA Efficiency which explains the differences with the IEA's ETP data.

Supplementary Note 5

Final Energy Demand by End-Use Service – Mobility. The main text and Methods section summarises how the LED scenario narrative maps onto changes in the activity levels and energy intensities of mobility, with resulting consequences for final energy demand. Here we provide additional information on:

- Mapping the LED scenario narrative onto changing patterns of mobility;
- Activity levels and energy intensity of mobility;
- Bottom-up quantification of final energy demand for mobility;
- Upstream effects of changing mobility;
- Comparison of mobility in the LED scenario with the scenario literature.

Mapping the LED scenario narrative onto changing patterns of mobility. Here we map the drivers and emergent features of the LED scenario narrative onto patterns and forms of mobility in 2050. We distinguish four combinations of drivers and describe how they reshape mobility as it is today (also see below an illustrative narrative of “A Day in the Life of 2050 ... Getting Around”).

Quality of Life & Urbanisation. Healthy lifestyles are pursued in clean local environments in a rapidly urbanising world. Overall activity (p-km) levels rise sharply in the Global South as rising incomes open up greater opportunities for work, leisure and social activities requiring mobility. A strong emphasis on reducing air pollution and congestion in cities leads to switching away from private cars towards public and shared modes. Shared vehicle fleets and flexible transit systems dramatically increase asset utilisation and reduce road usage. Walking and cycling also rise in modal share as considerably fewer vehicles free up existing road infrastructure for repurposing.

Novel & Better Energy Services & Use Value from Services. Alternatives to car ownership offer ease of use and convenience as well as affordability, particularly in rapidly-growing cities in the Global South. New forms of mobility are characterised by an increasing focus on pay-per-use, service value, flexibility, and variety of choice. Car-sharing, ride-sharing, bike-sharing in various forms (round-trip, designated parking, floating, peer-to-peer) rise as alternatives to car ownership, removing the inconvenience of maintaining and operating vehicles. Ever-cheaper sensors, chips, and wireless systems also enable deployment of autonomous vehicles. Congestion and trip times are dramatically reduced, and journey times in autonomous vehicles are freed up for productive uses.

Information Innovation, Digitalisation of Daily Life & End-User Roles. Ever-more affordable and accessible mobile devices are increasingly integrated into the daily planning and provision of daily transportation needs. Electric vehicles (“iPads-on-wheels”) further integrate digital technology and increasingly inter-link transportation and electricity systems. Mobility-as-a-service (‘MaaS’) offers a single easy-to-use digital gateway linking multiple forms of mobility for specific journeys on a pay-per-use basis. Distributed real-time data collection and analytics supports continual performance improvements and responsiveness to end-user demands. Demand slows for long-distance mobility (including aviation) as exponential improvements in virtual-reality technologies allow seamless interaction at a distance.

Granularity & Decentralised Service Provision. Users seeking more active roles adopt granular, household-scale refuelling infrastructure for electric vehicles, and in the longer-term, distributed H₂ electrolysis. Expansion and adaptation of centralised road and rail infrastructure occurs piecemeal. Enabled by digitalisation, infrastructure becomes smarter, more efficiently used, and more responsive to end-user needs. Public transport modes

including on high-frequency, high-capacity routes emphasise flexibility and use of existing infrastructure (e.g., rapid transit buses) rather than new fixed route infrastructure with high sunk costs (e.g., trams, trains). However; rail remains the mode of choice for long-distance inter-urban mobility. Freight activity slows as distributed and additive manufacturing reduces supply chain distances and standardisation erodes local differentiation in manufacturing capabilities.

This narrative of future mobility can be summarised by interrelated changes in behaviour, technology and institutions:

Δ *behaviour*: convenience, use value, sharing, high capacity

Δ *technology*: integrated gateways, autonomous & electric vehicles

Δ *institutions*: platforms, fleets, aggregators, collectives, communities

An illustrative narrative: “A Day in the Life of 2050 ... Getting Around”. My daily routine is varied: my work takes me all over the city and sometimes further afield. I also work at home on days when I need to pick the kids up from school. There’s no single best way of getting around. On most days I use the city’s ‘mobility-as-a-service’ app to combine a walk to the flexi-bus stop which then takes me across town, with an on-demand bike rental for the final leg of the journey. I pay a monthly fee and can use the service as much as I want. The app’s learnt my preferences and usually suggests the right thing. If the weather’s good, I choose combinations with more walking or cycling; if it’s raining, I’ll do the final leg in a shared taxi. Sometimes these are self-driving which I still find weird, but I appreciate the extra time to prepare for my work appointment and drink a coffee. Way fewer people drive now, and I hardly know anyone with a car. The streets and parking lots in our neighbourhood are being converted into parks, bike routes, and even orchards. It’s much easier, safer and fresher to walk or bike the kids to school.

Activity levels and energy intensity of mobility. Following Unander et al.⁸¹ and Fulton et al.⁸⁹, mobility-related energy demand can be decomposed into five factors:

$$MJ = \sum_{mode} \sum_{fuel} p.km \cdot \frac{v}{p} \cdot \frac{MJ}{v.km}$$

This gives five terms through which to act on energy demand:

Mode: changes in modal share: \sum_{mode}

Vehicle: changes in vehicle technology & fuel: \sum_{fuel}

Activity: changes in passenger.km levels: $p.km$

Capacity: changes in load factors: $\frac{v}{p}$ (expressed as the inverse)

Efficiency: changes in energy efficiency of vehicles or modes: $\frac{MJ}{v.km}$

In our analysis, we express *Activity* per mode and per vehicle, and we combine capacity and efficiency into a single Intensity term: $\frac{MJ}{p.km}$.

Activity describes the quantity of energy service consumed by passengers or private users (measured in passenger-kilometres, p-km), and by freight (measured in tonne-kilometres, t-km). Activity varies between different transport modes (e.g., car, motorbike, bus, train, plane). Activity levels can rise or fall overall, but levels can also shift between different modes (mode switching).

Intensity describes the final energy required to deliver a unit of energy service (measured in MJ/p-km or MJ/t-km). This varies by mode. Intensity is affected by both the fuel efficiency of vehicles, buses, trains and planes, but also by service efficiency. As an example, increases in load or capacity factor (people per vehicle or goods per truck) leads to more service being delivered for the same final energy consumed. Improvements in vehicle efficiency, switching to electric powertrains, increasing capacity factors, and modal shifts from private to public transport, can all improve energy intensity.

We also analyse the upstream effect of changing activity levels and energy intensities downstream. *Upstream* describes how changes in activity and intensity affect supply chains from manufacturing, industry and the energy supply. For example, rising activity in private vehicle modes creates more demand for materials in manufactured cars. Increased market shares for electric vehicles creates more demand for electricity.

Supplementary Table 12 summarises how the drivers of change in the LED scenario narrative map onto more specific changes characterising mobility. Supplementary Tables 13 and 14 then summarise how the LED scenario impacts each of these three factors which determine energy demand for passenger mobility in the Global North and the Global South (see Supplementary Note 9 for similar tables describing freight mobility).

It is important to note that the LED scenario allows for a substantial increase in activity levels for passenger mobility in the Global South across all modes. In the Global North, annual activity levels have risen steadily with rising incomes to then level off around \$25-35,000 per capita GDP (2000\$ PPP). Activity levels have saturated between 10,000 p-km per capita (Japan) to 25,000 p-km per capita (USA) (Figure 9.5 in the Global Energy Assessment, GEA⁸; and in Millard-Ball & Schipper²²). Current annual activity levels on average in the Global South are around 5,000 p-km per capita.

Supplementary Table 12. Changing Mobility Consistent with the LED Scenario Narrative.

Labels for scenario drivers: QOL = Quality of Life; URB = Urbanisation; SER = New & Better Energy Services; USR = End-User Roles; INF = Information Innovation; GRA = Granularity; DEC = Decentralised Service Provision; USE = Use Value from Services; DIG = Digitalisation of Daily Life; RAP = Rapid Transformation.

Scenario Drivers	Changing Mobility	Decomposition Factor Affected
QOL, URB	higher demand for mobility across all modes in the Global South as incomes rise driving improved quality of life	Activity
QOL, URB	lower demand for motorised modes within cities to save time, inconvenience (congestion, parking), and exposure to pollution	Activity
GRA, DIG	widespread adoption of low unit cost vehicles including bicycles, e-bikes & smart cars	Mode, Vehicle
USE, SER	shared car fleets increase capacity factors and reduce total fleet size with dramatic reductions in congestion & journey times	Mode, Capacity
QOL, USE	shared car fleets provide test beds for new clean vehicle technologies (EV, H2FCV) accelerating market penetration	Vehicle
SER, USE	producer & fleet-manager incentives for strong efficiency and performance improvements in shared vehicle fleets	Vehicle, Efficiency
URB, SER, SER, DIG	introduction of autonomous vehicle fleets providing on-demand use-based service including both private and shared mobility	Vehicle, Capacity, Efficiency
QOL, URB, SER, INF	rapid market penetration of zero-emission EVs to improve air quality in an urbanising world	Vehicle, Efficiency
QOL, DEC	switching from motorised modes to active modes within cities as decongested road infrastructure is repurposed	Activity, Mode
URB, SER, USE, DIG	mobility-as-a-service integrating public & shared modes to match journey requirements on a pay-per-use basis	Activity, Mode, Capacity
URB, DEC, USE	flexible & user-responsive public transport modes including flexible route buses & shared taxis	Mode, Capacity
QOL	electrification of remaining rail infrastructure to improve air quality	Vehicle
INF, DIG	lower demand for long-distance mobility as virtual reality enables seamless interactivity at a distance	Activity
SER, USE	sharing economies and dematerialisation reduce volume of single-owned consumer goods reducing freight demand	Activity
DEC, GRA, DIG	use of distributed, additive manufacturing localises supply chains and reduces freight distances	Activity
DEC, GRA	distributed H2 electrolysis & storage creates longer-term opportunity for new vehicle technologies in freight	Vehicle

Supplementary Table 13. Impact of LED Scenario on Passenger Mobility in the Global North. Increase or decrease relative to GEA Efficiency reference scenario (see text for details).

PER MODE	ACTIVITY	INTENSITY	UPSTREAM
light duty vehicles (LDV)	<i>increase:</i> rising demand partially offset by sharing	<i>reduced:</i> less congestion, high load factors & on-road usage, rapid EV introduction into fleets with factor 3 improvements in vehicle (powertrain) efficiency (mainly urban) ^a	fewer cars as load factors increase in shared vehicle fleets (manufacturing); electrification (energy supply)
two & three wheelers (2W-3W)	<i>increase:</i> e-bike penetration substituting for short intra-urban LDV journeys	<i>reduced:</i> less congestion, granularity so rapid e-bike (mainly urban)	more e-bikes (manufacturing); electrification (energy supply)
rail	<i>small increase:</i> continued use of public transport for high-capacity high-frequency routes (in line with GEA Efficiency modal shares)	<i>reduced:</i> all remaining rail infrastructure is electrified	electrification (energy supply)
bus	<i>large increase:</i> use of public transport for high-capacity high-frequency routes (in line with GEA Efficiency modal shares)	<i>reduced:</i> less congestion, high load factors & on-road usage so rapid EV introduction into fleets with factor 3 improvements in vehicle (powertrain) efficiency (mainly urban)	electrification (energy supply)
air	<i>small increase:</i> rising demand partially offset by telepresence ICTs as substitutes for some commercial travel	small reduction through efficiency improvements	only marginal change

Notes: ^a Vehicle stock assumptions based on ITF^{90,91}; see also Arbib & Seba⁹².

Supplementary Table 14. Impact of LED Scenario on Passenger Mobility in the Global South. Increase or decrease relative to GEA Efficiency reference scenario (see text for details).

PER MODE	ACTIVITY	INTENSITY	UPSTREAM
LDV	<i>strong increase:</i> 'quality of life' through increased mobility & more equal access to end-use technologies (cars)	reduced: same reasons as for Global North, but to greater extent as higher load factors due to spatial constraints in rapidly-developing cities so more rapid uptake of shared modes (e.g., flexi-route taxis) + more rapid electrification as EVs penetrate into expanding stocks more rapidly ^a	more cars (manufacturing); electrification (energy supply)
2W-3W	<i>strong increase:</i> rising 'quality of life' through increased mobility & more equal access to granular end-use technologies (e.g., e-bikes)	reduced: same reasons as for Global North, but more rapid electrification as new e-bike sales penetrate into expanding stocks more rapidly	more e-bikes (manufacturing); electrification (energy supply)
rail	<i>strong increase:</i> significant expansion in high-capacity high-frequency routes particularly for inter-urban mobility between mid-to-large size cities	reduced: same reasons as for Global North, all remaining and new rail infrastructure is electrified	more rail infrastructure (industry); electrification (energy supply)
bus	<i>strong increase:</i> significant expansion in high-capacity high-frequency routes particularly for intra-urban mobility including flexi-route buses (shared mobility)	reduced: same reasons as for Global North, less congestion, high load factors, higher service efficiencies with shared fleets, & on-road usage so rapid EV introduction into fleets with factor 3 improvements in vehicle (powertrain) efficiency (mainly urban)	more buses (manufacturing); electrification (energy supply)
air	<i>marginal increase:</i> rising demand partially offset by telepresence ICTs as substitutes for some commercial travel	assumed consistent with energy intensity in Global North	none

Notes: ^a Vehicle stock assumptions based on ITF^{90,91}; see also Arbib & Seba⁹².

Bottom-up quantification of final energy demand for mobility. We estimate the overall effect of these changes to activity (per mode) and intensity in both the Global North and South in 2050 using the GEA Efficiency scenario as a reference point.

The GEA Efficiency scenario of global energy-system transformation describes a future in which deep, pervasive, and highly ambitious policy-driven efforts to improve energy conversion efficiencies are rapidly and cumulatively built up throughout the economy³⁰. This scenario narrative is mapped onto the transportation sector in a detailed bottom-up analysis of modes, vehicles, fuels, efficiencies, and activity levels on a regionally disaggregated basis³¹.

The main features of the GEA Efficiency scenario of future mobility³¹. In GEA Efficiency, activity levels across all transport modes increase from 2020 to 2050 by 3% and 71% in the Global North and the Global South respectively. In the Global North, activity falls for LDVs but rises for rail and aviation. In the Global South, activity rises strongly across all modes except buses. Energy intensity falls by 28% and 26% on average across all modes in the Global North and the Global South respectively. Reductions in energy intensity are particularly strong in LDVs and aviation, linked to engine efficiency improvements and the use of alternative fuels.

As a result of these changes in activity levels and energy intensity, global final energy demand for transportation falls by 10% from 2020 to 2050 as improvements in energy efficiency offset ever-increasing mobility. Energy demand falls by 26% in the Global North, but rises by 27% in the Global South as rising incomes create and enable greater demands for mobility including private car ownership and use. On a per capita basis, the Global South remain at far lower levels than the Global North. By 2050, annual activity levels are still 76% lower in the Global South (3,892 vs. 15,925 p-km per capita) and energy demand is 86% lower (3.4 GJ vs. 24.0 GJ per capita).

Further details on future passenger mobility in GEA Efficiency include:

- *rising overall activity levels particularly in the Global South* as income growth releases latent demand, but annual per capita activity across all modes in the Global South (3,892 p-km) is still a long way from converging on developed country levels (15,925 p-km);
- *increasing car ownership in the Global South* with annual sales of LDVs roughly doubling from 2005 to 2050, but growth constrained by a range of factors including infrastructure limitations, congestion, policy measures, affordability for sizeable low-income consumer groups, and still falling short of the saturation levels observable currently in the Global North: with growth concentrated in the Global South;
- *extremely high technical efficiency improvements* across all modes of passenger transportation, particularly LDVs (as a result of market-driven innovation, ratcheting up of efficiency standards, and other policy measures including fuel taxes); fuel economy in new LDVs improves from around 7 L/100km in 2020 to around 3 L/100km in 2050 which taking fleet turnover into account results in stock-average fuel economy improving from around 9.5 L/100km in 2020 to 6 L/100km in 2050 (Figure 9.37);
- *slow shift to alternative fuel vehicles* with EVs and H2FCVs accounting for about 30% of

new vehicle sales in 2050, although hybrid electric (gasoline, diesel) are more common than ICE only by 2050;

- *very strong modal shifts* away from private car usage and towards public transportation particularly trains (as a result of urban planning, mobility demand management, infrastructure investments in both public and active modes, and other policy measures e.g., to manage congestion and air quality) but against a backdrop of rapidly rising private car stocks in the Global South;

- *rapid activity growth in aviation* from 6,722 billion p-km in 2020 to 14,340 billion p-km in 2050.

GEA Efficiency provides reference data for activity levels (billion p-km) and energy intensity (MJ/p-km) for both 2020 and 2050 (with the product of activity and intensity giving final energy demand).

GEA Efficiency data for 2020 were used as base year data (as these capture improvements in vehicle efficiency consistent with the LED scenario storyline) unless GEA Efficiency deviated significantly from near-term expectations (GEA having been published in 2012). In such cases, 2020 base year data was adjusted to fit observations and near-term projections. In particular, GEA Efficiency envisaged very low growth in activity levels for passenger transport in the Global South to 2020. Total activity across all modes in 2020 was projected to be 16,000 billion p-km (excluding international aviation) which is a factor 2 lower than recent IEA and ITF projections in the range of 33,000 to 37,000 billion p-km across a range of scenarios^{12,25,89}.

Consequently, activity levels in the Global South for the LED scenario were set equal to the ITF base scenario¹², which reports activity levels for road, bus, rail and domestic aviation. (Final energy demand from international aviation is accounted for in the LED scenario in a separate international bunker fuels category). Road p-km from the ITF scenario data were split into light duty vehicles (LDVs) and two-to-three wheelers (2W-3W) using their respective shares in 2020 in the GEA-Efficiency scenario.

Final energy demand in the Global South for the LED scenario were similarly scaled up to ensure consistency with the increased activity levels (keeping energy intensity consistent with GEA Efficiency).

Taking GEA Efficiency as a reference point (with the upward revision to activity levels and final energy demand in 2020 in the Global South noted above), we estimate the effect of the LED scenario on mobility-related energy demand in 2050 by varying the assumed levels of activity and intensity consistent with Supplementary Tables 13 and 14. Here we focus on passenger mobility; results for freight transport are set out in detail in Supplementary Note 9.

Our results are summarised in Supplementary Table 15, with panel **a** showing results for the Global North and panel **b** for the Global South. Overall energy demand for passenger mobility in the LED Scenario in 2050 relative to GEA Efficiency is 40% and 50% lower in the Global North and South respectively. The main causes are rapid electrification of all modes and switching from private to shared, public or active modes which more than offset rising activity levels particularly in the Global South. Global final energy demand for passenger mobility in 2050 is 27 EJ.

Supplementary Table 15. Impact of LED Scenario on Passenger Mobility in 2050 (compared to GEA Efficiency).

a. PASSENGER MOBILITY LED Scenario vs. GEA Efficiency Global North 2050										
PER MODE	ACTIVITY (billion p.km)			INTENSITY (MJ/p.km)			ENERGY DEMAND (EJ)			
	GEA Efficiency	LED Scenario	Δ GEA to LED 2050	GEA Efficiency	LED Scenario	Δ GEA to LED 2050	GEA Efficiency	LED Scenario	Δ GEA to LED 2050	
LDV	9639	13495	40%	2.0	0.7	-65%	19.3	9.5	-51%	
2W-3W	697	871	25%	0.9	0.3	-65%	0.6	0.3	-56%	
rail	2014	2215	10%	0.3	0.2	-10%	0.5	0.5	-1%	
bus	2901	5801	100%	0.8	0.3	-65%	2.3	1.6	-30%	
air	2714	2850	5%	1.5	1.4	-10%	4.2	3.9	-5%	
total	17964	25232	40%	1.50	0.63	-58%	26.9	15.8	-41%	
total per capita	12186	17117	<i>p.km per capita</i>				18.3	10.7	<i>GJ per capita</i>	

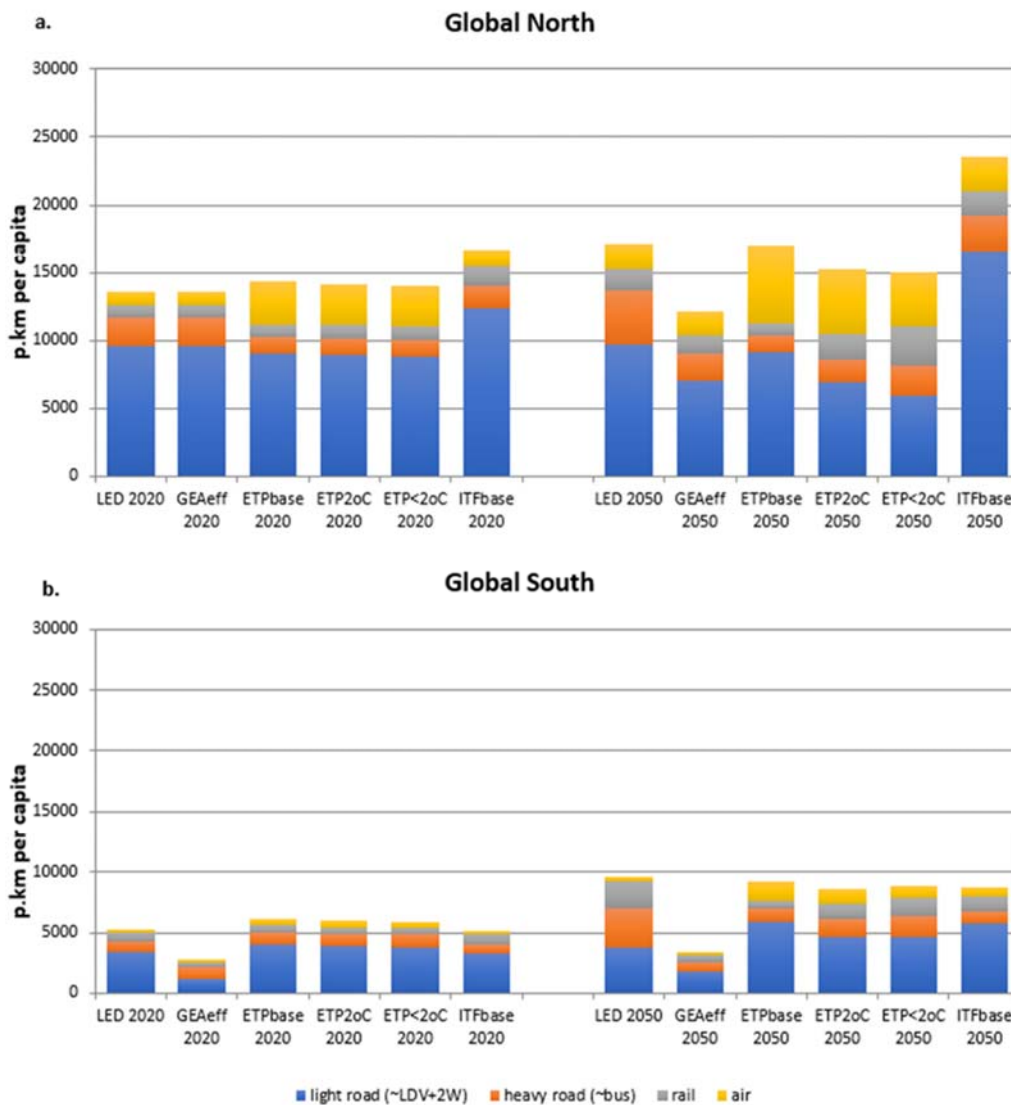
b. PASSENGER MOBILITY LED Scenario vs. GEA Efficiency Global South 2050										
PER MODE	ACTIVITY (billion p.km)			INTENSITY (MJ/p.km)			ENERGY DEMAND (EJ)			
	GEA Efficiency	LED Scenario	Δ GEA to LED 2050	GEA Efficiency	LED Scenario	Δ GEA to LED 2050	GEA Efficiency	LED Scenario	Δ GEA to LED 2050	
LDV	7762	9702	25%	1.9	0.3	-85%	14.4	2.7	-81%	
2W-3W	5544	19404	250%	0.4	0.1	-85%	2.3	1.2	-48%	
rail	4334	17338	300%	0.2	0.2	-10%	0.7	2.7	260%	
bus	6197	24787	300%	0.5	0.1	-85%	3.2	1.9	-40%	
air	2018	2220	10%	0.9	1.4	50%	1.9	3.1	65%	
total	25855	73451	184%	0.87	0.16	-82%	22.5	11.6	-49%	
total per capita	3360	9544	<i>p.km per capita</i>				2.9	1.5	<i>GJ per capita</i>	

Upstream effects of changing mobility. We also estimate upstream impacts on manufacturing, focusing on LDVs. Shared modes, higher load factors, constraints on car ownership and parking in dense urban areas, combine to yield significant reductions in the size of the global vehicle stock (Supplementary Table 16). The impacts of these changes in the global vehicle stock are picked up in the quantification of material and energy resources required for manufacturing processes in the LED scenarios (see Supplementary Note 8 on Industry).

Supplementary Table 16. Light Duty Vehicle Stock in 2050.

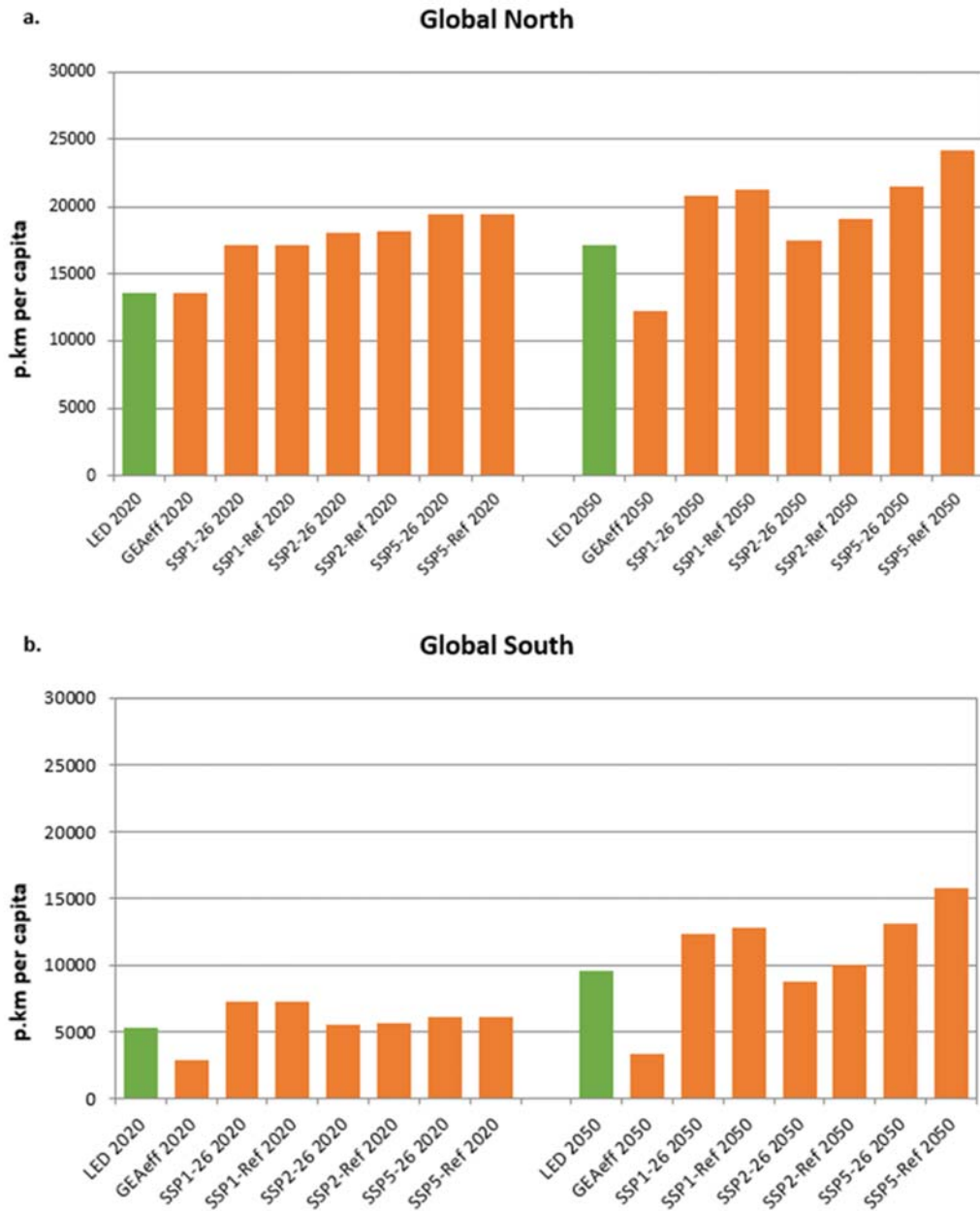
Vehicle Stocks Global North				
	GEA Eff 2020	GEAEff 2050	LED 2020	LED 2050
Vehicle stock (m LDVs)	758	759	758	532
Activity (bn p.km)	13319	9639	13319	13495
Utilisation (p.km/v)	17569	12692	17569	25383
Occupancy (p/v)	1.28	1.19		
Vehicle Stocks Global South				
	GEA 2020	GEAEff 2050	LED 2020	LED 2050
Vehicle stock (m LDVs)	280	816	809	340
Activity (bn p.km)	3928	7762	11350	9702
Utilisation (p.km/v)	14036	9509	14036	28526
Occupancy (p/v)	1.40	1.27		

Comparison of mobility in the LED scenario with the scenario literature. Supplementary Figure 19 compares activity levels (billion p-km) in 2020 and 2050 between LED, GEA Efficiency³¹, three scenarios from IEA's Energy Technology Perspectives 2017²⁵, and one base scenario from OECD-ITF Transport Outlook 2017¹². The LED scenario is included for 2050; in 2020 the LED scenario is equal to the GEA Efficiency scenario for the Global North, and the ITF base scenario for the Global South (see above for rationale). Panel **a** is for the Global North; panel **b** is for the Global South. Both panels use the same y-axis scale for comparability.



Supplementary Figure 9. Mobility per capita by mode in the LED scenario compared to GEA, ETP and ITF. Regional data are shown for (a) Global North, (b) Global South. Note: sources are from GEA³¹, IEA²⁵ and ITF¹².

Supplementary Figure 10 compares activity levels (billion p-km) in 2020 and 2050 between LED, GEA Efficiency, and select SSP scenarios (SSP1, 2 & 5 with both RCP 2.6 and Ref variants, generated by the IMAGE and REMIND models which report total activity levels but do not disaggregate by mode). The LED scenario is included for 2050; in 2020 the LED Scenario is equal to the GEA Efficiency scenario for the Global North, and the ITF base scenario for the Global South (see above for rationale).



Supplementary Figure 10. Mobility per capita in the LED scenario compared to GEA and the SSPs. Regional data are shown for (a) Global North, (b) Global South. Note: Scenario data are available in IIASA's SSP database⁹³

Supplementary Note 6

Final Energy Demand by End-Use Service – Food. The foundation of a good quality of life is good health, which also relies on adequate and appropriate nutrition. In the Global South, 815 million people are still currently undernourished by inadequate calorie intake⁹⁴. In contrast, excess calories from unhealthy foods have increased the risk of chronic diseases from obesity in the Global North and increasingly among the affluent population segments in the Global South as well. Food demand is globally expected to increase by 70 to 100 percent by 2050⁹⁵, however food security does not only rely on food supply but also on adequate food access, distribution and use. Improving food security globally therefore requires not just more production, but changes in diets towards more nutritious calories. Dietary improvements target the reduction of chronic disease risk and providing essential nutrients for human growth and development.

The LED scenario combines production intensification and evolution of diets towards nutritious food with lower GHG emission footprints. On the demand side, concerns about healthy living lead to only moderate increases in daily calorific intake. On the supply side, crop and livestock production yields are expected to continue their historical trends, reflecting the current prospects on research, development and technology adoption. The impact of climate change is also significantly mitigated in the LED scenario that limits global warming below 1.5 degrees above pre-industrial levels. Deforestation rates in LED are progressively reduced through more active policies of land protection and carbon pricing. All these changes are captured through the GLOBIOM modelling framework^{17,96} quantification of the LED scenario.

Healthy and low carbon impact diets. We follow in the LED scenario diets transition that reflect economic growth and preferences of consumers for higher standard food products. Diet preference shifts for GLOBIOM are based on the standard SSP2 assumptions^{95,97}. These assume a continuation of the historical trends in terms of overall dietary transitions, in line with other projections from FAO⁹⁸. In particular, only moderate westernisation of diets is observed in the developing world, and consumption of animal products remain notably low in India. In all regions, consumer awareness mixed with climate policy incentives also influence the composition of diets at the product level, with less rice and red meat consumption (see Frank et al.⁹⁹).

Supplementary Table 17 summarizes LEDs main trends in food consumption. By 2050, average daily calorie intake in the Global South increases to over 3,000 kcal, implying that food availability issues are solved. In the Global North, daily intake does not exceed 3,500 kcal, and meat consumption stays relatively constant despite increasing economic growth, reflecting a change in consumption habits. Economic growth, end of undernourishment and better nutrition leads to an increase in kilocalories in the South, including for animal product

calories but consumption of red meat remains low. This is due to change in consumer awareness but also to carbon taxes on the most GHG emission intensive products. A food consumption constraint is implemented in the model to ensure that these products are substituted with other food items without health impacts.

Supplementary Table 17. Food consumption in the LED scenario.

	2020		2050		2100	
	North	South	North	South	North	South
Total kCal per day per capita	3298	2768	3366	3082	3483	3400
Total meat (g) per day	335	167	349	227	367	315
Ruminant meat (g) per day	89	43	83	41	75	46

Note: based on 1400 kcal/kg of meat.

The mitigation potential of dietary changes towards lower meat consumption has been well-explored¹⁰⁰ and documented as uncertain but significant by the IPCC¹⁰¹. Perspectives on the extent to which mitigation potentials depend on dietary changes hinge on researchers' expectation of the potential to sustainably intensify agricultural production. For instance, Havlik et al.¹⁷ rely almost exclusively on ambitious intensification of livestock production. Conversely, Bajželj et al.¹⁰² demonstrate the mitigation potentials in several healthy diet scenarios that include reductions in livestock products consumption in high-income countries.

Supplementary Note 7

Energy Used in Intermediate and Upstream Sectors – Commercial and Public Buildings.

First, the upstream implications are reviewed. Supplementary Table 18 shows the composition of energy demand in commercial (e.g. retail) and public (e.g. education and health) buildings that provide economic and social services to the population. We first correct for base year differences (statistics and short-term forecasts to 2020 in LED versus the projected values to 2020 from a 2005 base year in GEA Efficiency) revising upward the original GEA Efficiency number for floorspace (from 58 to 62 billion m²) and final energy demand (from 22 to 31 EJ) for the base year 2020. For projected floorspace we largely follow the GEA Efficiency Scenario with small differences arising for the correction of 2020 base year values.

In terms of projected specific energy demand we follow the LED scenario storyline that emphasizes thermal comfort as well as increasing consumer independence which translates into improved low-energy building designs as well as novel end-use energy service provisions with economies of scope (heat pumps, fuel cells) offering further efficiency gains (lower final energy per unit of useful energy) and greater consumer control (peer-to-peer energy exchanges). As for residential buildings we also differentiate between building retrofits (that dominate commercial/public floorspace in the Global North) and new construction (that dominate in the Global South) and a corresponding achievable efficiency gradient as well as end-use service provision efficiency.

In the Global North specific energy demand in commercial and public buildings is projected to improve to some 130-140 MJ/m² (useful and final energy respectively). The difference is small, as LED assumes that the efficiency impacts of heat pump or fuel cell systems will remain more modest in building retrofits (and thus is more conservative than the GEA Efficiency Scenario resulting in a 25% higher final energy demand). In the Global South specific useful energy demand are projected to improve to some 70 MJ/m² (about half of the values of building retrofits in the Global North) that combined with the additional efficiency effects of novel end-use technologies such as heat pumps (with a comparable effect as in GEA Efficiency) translates into a final energy demand of 44 MJ/m² (almost three times lower than in GEA Efficiency).

Aggregate final energy demand in LED is 8 EJ by 2050 (5 EJ in the Global North versus 3 EJ in the Global South), corresponding to a 50% reduction in final energy demand compared to the GEA Efficiency Scenario (12 EJ globally by 2050).

Supplementary Table 18. Decomposition of drivers of thermal energy demand in commercial and public buildings in the LED scenario (and GEA Efficiency in parenthesis).

		drivers			energy demand				
		popu- lation	floor- space	floorspace/ capita	unit useful energy demand	unit final energy demand	total useful energy demand	total final energy demand	efficiency (FE/UE ratio)
		<i>billion</i>	<i>billion m²</i>	<i>m²/capita</i>	<i>MJ/m²</i>	<i>MJ/m²</i>	<i>EJ/yr</i>	<i>EJ/yr</i>	
Global	2020	1.5	24 (22)	16	538 (410)	571 (447)	13 (9)	13 (10)	1.1
North	2050	1.6	35 (34)	23	132 (153)	139 (111)	5	5 (4)	1.1 (0.7)
Global	2020	6.2	39 (35)	6	180 (170)	443 (336)	7 (6)	17 (12)	2.5 (2.0)
South	2050	7.6	68 (65)	9 (8)	71 (174)	44 (123)	5 (11)	3 (8)	0.6 (0.7)
	2020	7.6	62 (58)	8 (7)	314 (262)	491 (379)	20 (15)	31 [#] (22)	1.6 (1.4)
World	2050	9.2	104 (99)	11	96 (167)	76 (119)	10 (17)	8 (12)	0.8 (0.7)

Note: Global totals may not add up to the sum of regional totals due to independent rounding.

Supplementary Note 8

Energy Used in Intermediate and Upstream Sectors – Industry. For the quantification of the LED scenario we draw on the following principal sources: The GEA Efficiency Scenario⁸, the 2-Degree Scenario (2DS) of IEA’s Energy Technology Perspectives (ETP) 2017²⁵, the (limited literature) on material efficiency, in particular Allwood et al.¹⁰³ and Allwood and Cullen et al.¹³, and the traditional industrial (process) energy efficiency literature^{33,104,105}. Due to data limitations in the original GEA Efficiency scenario (that was formulated via aggregated energy intensity per unit industrial value added without physical material flow analysis) we use the ETP 2DS Scenario as a reference projection of industrial activity data in terms of tonnage of major industrial commodities and materials produced, and then construct the LED scenario based on assumptions with respect to materials (entering the activity variable) and energy efficiency with aggregate scenario characteristics provided in the summary Table 2 in the main text.

Whereas LED’s assumption on energy intensity of material manufacturing are representative of the recent literature exploring efficiency improvement potentials in industry (in particular the ETP 2DS scenario²⁵), the scenario departs from traditional approaches by explicitly considering options for reducing materials use using an approach similar to IEA WEO 2015¹⁰⁶.

In our baseline scenario, the commodities considered — steel, aluminium, cement, paper, petrochemicals, and feedstocks (non-energy uses of energy for fertiliser and plastics production) — add up to some 10 Gt by 2050 (compared to less than 8 Gt in 2020). Through dematerialisation, we estimate that this materials demand could be reduced by close to 4 Gt resulting in material demand in LED of a rounded 6 Gt by 2050. For Industry, we have chosen ETP 2DS as a baseline scenario, because it is comparable to the GEA Efficiency scenario as being characterised by comparable population and GDP growth assumptions as well as staying below a 2 °C climate target. In terms of industrial final energy demand the two scenarios differ slightly (by 18%) with 209 EJ (GEA Efficiency) versus 179 EJ (ETP 2DS) by 2050.

The LED scenario's industry energy demand in 2050 is 107 EJ, substantially lower compared to the 207 EJ in GEA Efficiency and 179 EJ in ETP 2DS (and the 273 and 172 EJ in the ETP Reference and “Beyond 2°C” scenarios respectively) and comparable to the 133EJ in the Greenpeace [R]evolution scenario⁵¹. IEA’s WEO 2015¹⁰⁶ “material efficiency scenario” calculated for 5 major commodities (aluminium, paper, plastics, cement and steel) an energy demand of 67 EJ (slightly below the 2013 level) for 2040. Adding 47 EJ¹⁰⁶ for other materials not covered explicitly, yields a total energy demand of 111 EJ for 2040, the projection horizon of IEA, WEO 2015, which is also quite comparable to LED in 2050 (107 EJ).

Material Goods (Industry). The LED scenario narrative affects the production of material goods (industry sector) in two major ways. First, changing demands affect the quantity, type, and quality of materials and goods manufactured by industry. The emphasis on Quality of Life, Novel Energy Services, Information Innovation (exponential info-based learning) increase consumer expectations and thus demands in term of product quality, ease of use, and extended producer responsibility globally. The aspirational trend for greater material well-being in large population segments of the Global South, results in a Middle Class standard of living for all by 2050, driving significant growth in the demands for materials and goods in the Global South. The trends described in the LED scenario narrative also affect the way industrial production and manufacturing are organised: Towards higher degrees of customisation, product co-design integrating customer specifications, quality assurance, and greater integration of all aspects of product lifecycles, including end-of life disposal (remanufacturing, repurposing, recycling) under the trends towards higher Quality of Life, multiple End-user Roles, and pervasive digitalisation often referred to in concepts such as Industry 4.0. These changes affect industrial energy demand via two principal routes: activity levels (demand for materials and goods, moderated by increases in material efficiency and by dematerialisation) and specific energy needs per unit activity (improvements of energy efficiency due to process innovations, better control, and increasing fractions of recycled materials). The corresponding assumptions of LED are documented below.

As in the other activities and sectors we begin with a scenario baseline. The original GEA Scenarios described industrial energy use via aggregate intensities, i.e. final energy use per unit of industrial activity, represented by an aggregate monetary indicator (\$ industrial value added) that is not suited for a bottom up assessment of industrial activities, either by accounting for major materials produced or by industry sub-sector. We have therefore adopted the scenarios of IEA's Energy Technology Perspectives 2017^{25,89} for our baseline as the most recent scenario study available containing industrial activity detail as well as being comparable to GEA Efficiency in terms of an intermediary population and economic growth outlook, an identical long-term climate target of limiting global warming to less than 2 degrees (IEA's ETP 2DS), and comparable industrial energy demand (GEA Efficiency: 207 EJ by 2050, IEA's ETP "two degree scenario" 2DS: 179 EJ, with a range of between 273 and 172 EJ in the ETP Reference and "Beyond 2°C" B2DS scenarios respectively, although note that B2DS results in limiting global mean temperature change at below some 1.7 degrees Celsius²⁵, i.e. substantially above the LED target of 1.5 degrees). We then perform a bottom up assessment by seven material categories reported in IEA's ETP²⁵ using a decomposition approach separating out the effects of materials efficiency improvements (affecting our activity variable) from the effects of energy efficiency improvements (affecting the specific energy per unit of activity), drawing on scenario comparisons (in particular across the three IEA ETP scenarios) as well as the work of Allwood and Cullen et al.¹³. In this decomposition, we examine the potential for improving materials efficiency by further breaking our activity

variable down into two factors: a “dematerialisation” factor representing absolute material demand reduction from increased asset utilisation (i.e sharing economy), a characteristic feature of LED; and a “material efficiency” term, which includes (mostly manufacturing-side) strategies such as longer product lifetimes, altered product designs, or remanufacturing/reuse of existing components. These two decomposition factors are formulated via a multiplier (≤ 1) acting on the activity variable (tonnes of a specific material). For steel and aluminium, we draw heavily on a detailed model presented in Allwood and Cullen et al.¹³ that examined the potentials for six different material efficiency options (less material by design, yield loss reduction, scrap diversion, reuse of components, product lifetime extensions, and use intensification) for some 25 different product types (e.g. for steel, road vehicles are disaggregated into body structure, drivetrains, and suspension, or for buildings a disaggregation into structural sections, reinforcement steel and steel sheets is performed). The “intensity of use” variable in the Allwood and Cullen et al.¹³ model has a great degree of overlap with our “dematerialization” variable. In order to avoid double counting we have set that variable parameter to 1 in the Allwood-Cullen model for those categories (e.g. vehicles) covered in our dematerialization term, i.e. assuming no further reduction potentials beyond those reported in our “dematerialization” variable. This compositional analysis is reported in Supplementary Table 19 below.

Supplementary Table 19. Decomposition analysis of final energy demand in industry by different commodity/product types. Values for the year 2050. Units: Mt= Million (metric) tons.

	reference demand ETP 2DS Mt	dematerialisation multiplier	material efficiency multiplier	material demand LED Mt	energy intensity LED GJ/ton	final energy LED EJ
Steel	2,170	0.90	0.27	533	14.0	7.5
Aluminium	252	0.69	0.45	78	42.7	3.3
Cement	5,094	1	0.8	4,075	1.7	6.9
Paper	498	0.5	1	249	9.4	2.4
Petrochemicals	1,003	0.75	1	753	15.0	11.3
Other	n.a.	1	1	n.a.		47.6
Feedstocks	1081	0.68	1	736	37.4	27.5
Total	10,098	0.89	0.72	6424	16.6	107

The assumptions underlying the energy demand for different materials are itemised below. As mentioned above, the starting point of our analysis is in each case the IEA ETP 2DS scenario reported material output as activity variable.

Steel. We assume a dematerialisation multiplier of 0.9, i.e. an absolute demand reduction for steel to represent the effects of increased asset utilisation (sharing economy) in LED.

Increasing car sharing in LED is projected to lead to a reduction in the vehicle stock from 1.6 billion (GEA Efficiency) to some 700 million (LED) by 2050 (while increasing transportation output) translating in a reduction of steel demand by 140 Mt (or 6.4% of the projected global steel output of 2.2 Gt by 2050 in IEA ETP 2DS). The combined effects of the sharing economy of global steel demand are assessed conservatively to offer at least a reduction of 10% in projected steel demand in 2050 in LED. Improving materials efficiency through lifetime extensions, light-weighting, and use intensification is assessed by Allwood and Cullen et al.¹³ to yield a maximum potential of 73% reduction in the demand for virgin steel manufacturing from iron ore (excluding recycling, reuse and remanufacturing), a value we have retained for LED. (Assuming that only 50% of this potential can be realised would increase energy use for steel by 6 EJ beyond the 7.9 EJ adopted for LED, i.e. an increase of 2% of LED's total energy demand). Contrasting this optimistic scenario assumption, we adopt a somewhat more conservative assumption for energy intensity at 14 GJ/t (derived from Allwood and Cullen et al.¹³, which is 23% higher [equivalent to 1.4 EJ energy demand] than the 11.4 GJ/t assumed in IEA's ETP 2DS). The results for LED translate into a global steel output of 533 Mt by 2050 and a final energy demand of 7.5 EJ.

Aluminium. We have adopted the following assumptions for aluminium, an energy intensive material which is however highly attractive due to its properties (light weight, non-corrosive). For the dematerialisation factor we adopt the material efficiency improvement potential as estimated by IEA ETP²⁵, in particular the difference between the ETP 2DS and B2DS scenarios, where aluminium demand is reduced by some 31%²⁵. For the materials efficiency factor we follow the Allwood-Cullen model that suggests a demand reduction potential of up to 55%, particularly through product and material lifetime extensions for which aluminium is particularly suited. Combined, material efficiency improvements could yield a reduction in the demand for virgin aluminium from 252 Mt (ETP 2DS by 2050) to 78 Mt in LED. (Again assuming that only 50% of this potential can be realised would increase energy use for aluminium by 3.5 EJ beyond the 3.3 EJ adopted for LED, i.e. an increase of 1% of LEDs total energy demand). Following our assumptions for the steel sector, which are optimistic for changes in design and patterns of materials use but more conservative (in relative terms) on process energy efficiency, we adopt a specific energy use per tonne of aluminium of 42.7 GJ/t, similar to current intensity values as electrolytic processes are already highly energy efficient. This, however, is conservative compared to the values projected by IEA ETP 2DS at 22 GJ/t, a difference corresponding to 1.6 EJ energy demand, or the energy equivalent of realising only 75% of material efficiency potential estimated by the Allwood-Cullen model. Combined, virgin aluminium accounts for an output of 78 Mt in LED and a final energy demand of 3.3 EJ by 2050 in LED, compared to 252 Mt and 5.6 EJ in IEA ETP 2DS (with a range of 4.6 to 6.7 EJ across the IEA ETP B2DS and Reference scenarios).

Cement. As the dominant use of this material is for long-lived infrastructures and buildings, most of which are either public or shared (multi-family) capital assets, we do not assume

any impacts of “dematerialisation” from the sharing economy characteristic of LED. For the materials efficiency factor we assess a potential of a 20% reduction in cement production due to demand reduction arising from an assumed extension of the lifetime of buildings of some 25% following the LED narrative of retrofits and asset re-use rather than demolition and new construction. The impact estimate adopts the values from Allwood and Cullen’s 2012 impact matrix for buildings. For energy intensity we adopt a value of 1.7 GJ/t (23% lower than ETP 2DS) following the efficiency improvement potential estimate of GEA Chapter 8 (p. 535)³³. Cement production in LED totals 4 Gt by 2050 resulting in close to 7 EJ energy demand.

Paper. We assume a 50% demand reduction in paper (“dematerialisation”) resulting from ubiquitous digitalisation, ITC convergence and the increasing substitution of virtual for physical communication (travel, letters), characterising the LED scenario storyline. Conversely, the potential for material efficiency improvements (such as thinner paper towels) is assessed to be marginal only (materials efficiency multiplier of 1). For energy intensity of paper manufacturing (9.4 GJ/t) we adopt the values from the IEA ETP B2DS scenario that aims at a slightly less stringent climate target as LED.

Petrochemicals. This material category includes a great diversity of speciality and general purpose chemicals used in industry as well as manufactured for final consumption. Detailed information by different product types is not available from IEA’s ETP 2017²⁵, which only reports aggregates. We assume that half of petrochemicals manufactured end up directly as final consumption, and that Quality of Life (health conscious consumers) in LED reduce their consumption by half in 2050 (“dematerialisation” multiplier of 0.75). Energy reductions from improvements in material efficiency for petrochemicals products (i.e plastics and fertilisers) are considered separately in the *Feedstock* section, and the materials efficiency multiplier is set to 1 here. For aggregate energy intensity we depart from the IEA ETP scenarios which are invariably conservative (in the Reference scenario even projecting higher energy intensities by 2050 than at present) and assume that energy intensities could be improved to half current values, i.e. 15 GJ/t which is close to the OECD energy intensity in 2050 (18 GJ/t) for the 2DS and B2DS IEA ETP scenarios. Together, petrochemicals in 2050 account for 753 Mt in LED and for some 11 EJ of energy inputs.

Other. This category comprises all remaining materials not assessed separately by IEA ETP²⁵ and thus our LED scenario as well and also includes energy use in manufacturing. Tonnage-based activity data are not available for this category. We assume that compared to the ETP B2DS scenario assumptions efficiency improves further by 36% (the improvement from the ETP 2DS to the B2S scenarios respectively), yielding a final energy use of some 47 EJ by 2050 in LED (compared to a range of 58 to 63 EJ in the two ETP scenarios).

Feedstocks. This product category comprises so-called “non-energy uses” of energy, i.e. where energy carriers (basically hydrocarbons) serve as raw material for the manufacturing of fertiliser, plastics, etc. This product category includes “High Value Chemicals” as reported by IEA ETP, ammonia (for fertiliser production) and other materials, not further specified in IEA’s ETP 2017²⁵. For all those categories we assume zero potential for improvements in material efficiency (as most are “consumptive” material categories). For “dematerialisation” we take a conservative approach and assume zero impacts for fertilisers (in order to maintain high levels of food production required to assure high levels of well-being and Quality of Life of the population, especially in the Global South). For plastics and other feedstock materials (e.g. lubricants, asphalt) we assume potentials for materials conservation (dematerialization multipliers) of 50% for plastics and 25% for the “other” category (dematerialisation multipliers of 0.5 and 0.75 respectively), resulting in an aggregate dematerialisation multiplier for feedstocks of 0.68 (32% dematerialisation). These assumptions reflect our interpretation of LED’s Quality of Life emphasis and corresponding reductions of wastes of a “throwaway society”. Same levels of service provision (e.g. packaging) would be provided in LED as in comparable scenarios, but with more re-useable/refillable containers. Thus, by 2050 LED returns to a comparable form of retail organisation as was prevalent before the introduction of once-through throwaway packaging 100 years earlier. The energy use for plastics and ammonia (fertilisers) can be determined simply by using their lower heating value (from GEA Chapter 8³³, Table 8.5) of 20.7 GJ/t for ammonia and some 46.5 GJ/t for plastics (based on LHV of ethylene and propylene from table 8.5 in Banerjee et al. 2012³³). For the “other category” we simply adopt the IEA ETP D2S value of 12.6 EJ energy demand, lowered by our dematerialization factor (0.75), yielding a LED total energy demand for this product category of 9.6 EJ by 2050. Combined feedstocks add up to a still significant 736 million tonnes and an energy input of 27.5 EJ by 2050 in LED (compared to 1 Gt and 43.5 EJ in IEA ETP 2DS).

Supplementary Table 20 summarizes the industry sector in terms of values and differences to the IEA ETP 2DS scenario that served as a baseline for our calculations for both the Global North and the Global South, equivalent to the scenario decomposition in other LED sectors/demand categories and summarized in Table 2 of the main text. Globally, activity levels in LED are, with 6.4 Gt by 2050, 36% lower than in the ETP 2DS scenario and energy use is, with 107 EJ, lower by some 40% compared to ETP 2DS (and by 47% compared to the GEA Efficiency Scenario for which no comparable activity data are available).

Supplementary Table 20. Decomposition of LED material goods (industry) activity levels and energy use 2020 and 2050, World and for the Global North and the Global South in comparison to IEA's ETP 2DS scenario and (for energy) also the GEA Efficiency Scenario.

		LED					GEA Efficiency					ETP 2DS				
		population		GJ/t	final energy		activity LED/ETP	final energy		FE EJ	GEA energy / ETP activity		population billion	t/capita	GJ/ton	final energy
2020	2050	billion	t/capita		EJ	Gt		%	%		%	GJ/ton				GJ/ton
North	2020	1.5	1.2	34.2	60	1.7	0	-1	18	60	34.5	1.4	1.2	29.1	51	1.7
	2050	1.6	0.7	25.3	26	1.0	-44	-52	-38	53	29.1	1.5	1.2	22.6	41	1.8
South	2020	6.2	1.0	17.1	105	6.2	0	18	3	90	14.5	6.3	1.0	16.7	103	6.2
	2050	7.6	0.7	15.1	82	5.4	-35	-45	-41	149	18.0	8.2	1.0	16.7	138	8.3
World	2020	7.6	1.0	20.9	165	7.9	0	8	7	152	19.3	7.7	1.0	19.4	154	7.9
	2050	9.2	0.7	16.6	107	6.4	-36	-47	-40	202	20.0	9.7	1.0	17.7	179	10.1

Supplementary Note 9

Energy Used in Intermediate and Upstream Sectors – Freight Transportation. The main text and Methods section summarises how the LED scenario narrative maps onto changes in the activity levels and energy intensities of mobility, affecting both passenger and freight transportation. Supplementary Note 5 provides further details on passenger mobility as an end-use service.

How the drivers of change in the LED scenario affects patterns of freight transportation for the movement of material goods is covered in Supplementary Note 5 in relation to mobility in general.

Here we provide further information on surface freight transportation (road and rail):

- Activity levels and energy intensity of freight transportation;
- Bottom-up quantification of final energy demand for freight transportation.

International shipping and aviation for freight are not covered here as they are accounted for separately as international bunker fuels in our energy demand estimates.

Activity levels and energy intensity of freight transportation. As set out in Supplementary Note 5, the impacts of the LED scenario narrative on energy demand can be decomposed into three factors: *Activity*, *Intensity* and *Upstream*.

Supplementary Table 21 summarises how the LED scenario impacts each of these three factors which determine energy demand for freight transportation. Changes are broadly similar in the Global North and the Global South.

Supplementary Table 21. Impacts of the LED Scenario on Freight Transportation.

PER MODE	ACTIVITY	INTENSITY	UPSTREAM
truck	increase in line with expanding energy-service levels, tempered by some dematerialisation as (1) convergence of consumer goods into multi-purpose products with ICT integration (2) sharing economies increasing asset utilisation rates and decreasing single purpose ownership	reduced: rapid EV introduction into truck fleets with factor 3 improvements in vehicle (powertrain) efficiency	fewer trucks (manufacturing); electrification (energy supply)
rail	increase for similar reasons (particularly in Global South) but more constrained by limited new lumpy infrastructure investments (particularly in the Global North)	reduced: all remaining rail infrastructure is electrified	electrification (energy supply)

Bottom-up quantification of final energy demand for freight transportation. As set out in Supplementary Note 5, we estimate the overall effect of these changes to activity (per mode) and intensity in both the Global North and South in 2050 using the GEA Efficiency scenario as a reference point.

*Main features of the GEA Efficiency scenario of freight transportation*⁸. Further details on future freight mobility in GEA Efficiency include:

- *rising overall activity levels in both the Global North and the Global South* as incomes and consumption rise, and supply chains become more globally integrated: on a per capita basis, activity in the Global North doubles from 8,200 t-km in 2005 to 16,000 t-km per capita by 2050, and activity in the Global South almost triples from 1,060 t-km per capita in 2005 to 2,774 t-km per capita by 2050;
- *continued dominance of international shipping* with activity levels of 88,000 billion t-km in 2020 doubling to 168,000 billion t-km by 2050;
- *strong modal shifts* away from trucks and towards rail;
- *improved overall efficiency of freight transportation* by a factor of 2 (1.3 MJ/t-km to 0.7 MJ/t-km from 2005 to 2050).

Our results are summarised in Supplementary Table 22, with panel **a** showing results for the Global North and panel **b** for the Global South. Overall energy demand for freight transportation in the LED scenario relative to GEA Efficiency is 18% and 1% lower in the Global North and the Global South respectively. The main causes are rapid electrification of rail and some road-based freight, and falling activity levels due to dematerialisation, localisation of production, and increased utilisation rates of consumer goods and assets.

Supplementary Table 22. Impact of LED Scenario on Freight Transportation (compared to GEA Efficiency).

a. FREIGHT MOBILITY | LED Scenario vs. GEA Efficiency | Global North | 2050

PER MODE	ACTIVITY (billion t-km)			INTENSITY (MJ/t-km)			ENERGY DEMAND (EJ)		
	GEA Efficiency	LED Scenario	Δ GEA to LED 2050	GEA Efficiency	LED Scenario	Δ GEA to LED 2050	GEA Efficiency	LED Scenario	Δ GEA to LED 2050
truck	10208	15822	55%	1.0	0.5	-50%	10.7	8.3	-23%
rail	13332	15331	15%	0.2	0.2	-10%	2.5	2.5	3%
shipping									
aviation									
total	23539	31153	32%				13.1	10.8	-18%
<i>total per capita</i>	<i>15969</i>	<i>21134</i>	<i>p.km per capita</i>				<i>8.9</i>	<i>7.3</i>	<i>GJ per capita</i>

b. FREIGHT MOBILITY | LED Scenario vs. GEA Efficiency | Global South | 2050

PER MODE	ACTIVITY (billion t-km)			INTENSITY (MJ/t-km)			ENERGY DEMAND (EJ)		
	GEA Efficiency	LED Scenario	Δ GEA to LED 2050	GEA Efficiency	LED Scenario	Δ GEA to LED 2050	GEA Efficiency	LED Scenario	Δ GEA to LED 2050
truck	10540	13175	25%	1.4	0.7	-50%	14.3	9.0	-38%
rail	10808	37828	250%	0.2	0.2	-10%	2.4	7.7	215%
shipping									
aviation									
total	21348	51003	139%				16.8	16.6	-1%
<i>total per capita</i>	<i>2774</i>	<i>6627</i>	<i>t.km per capita</i>				<i>2.2</i>	<i>2.2</i>	<i>GJ per capita</i>

Supplementary Note 10

Summary of Energy Demand in the LED Scenario. In this section we summarize and provide additional detail on the LED scenario's energy demand as follows:

- Use of 2020 as base year for the LED scenario;
- LED scenario expressed in per capita terms in 2050, compared to 2020;
- LED scenario compared to the GEA Efficiency scenario;
- LED scenario aggregated into three sectors and comparison with other studies;
- LED scenario described with macro-level indicators;
- Summary of LED scenario at the regional level.

Use of 2020 as base year for the LED scenario. As discussed in the main text, we have adopted 2020 as base year for LED for reasons of both salience as well as methodology. Readers should be able to assess the LED scenario not in comparison to a historical base year, but to a year as close as possible to the time of publication of this work. The methodological reason for choosing 2020 as base year is in the intertemporal, forward looking nature of the IAM framework used to assess the upstream implications of LED demands that could produce a modelling artefact of counter-factual rapid short-term (pre-2020) transitions in case an earlier base year (e.g. 2010) would have been chosen. Evidently, our 2020 base year values are affected by uncertainty, but represent our best effort and knowledge integrating most recent scenario studies, sectorial studies, as well as short-term trend extrapolation of available activity and energy statistics. Most recent statistical information available at the time of the writing of this article refer to the year 2014/2015.

Supplementary Table 23 gives an overview of the LED scenario 2020 base year data. For information we have also added alternative data sources (scenario studies or statistics) to inform readers about the degree of uncertainty surrounding our base year data.

Supplementary Table 23. 2020 base year data for LED and comparison with selected other sources.

		activity ^a		final energy demand (EJ)						
		LED	comparable data/scenario	LED	LED per sector	GEA Efficiency	IEA data in PFUDB ^b	ETP, B2DS ^{c,x}		
		2020	2015 ^d	2020	2020	2020	2014	2014	2025	
buildings	thermal comfort	North	44 x 10 ⁹ m ² ^e	47-48 x 10 ⁹ m ² ^{e,f}	30	61	52	61	60	49
	public & commercial		24 x 10 ⁹ m ² ^e		13					
	consumer goods		38 x 10 ⁹ units		18					
	thermal comfort	South	134 x 10 ⁹ m ² ^e	160-163 x 10 ⁹ m ² ^{e,f}	39	75	59	73	71	78
	public & commercial		39 x 10 ⁹ m ² ^e		17					
	consumer goods		67 x 10 ⁹ units		18					
industry		North	1.7 Gt ^h	1.5 Gt ^{h,i}	60	60	61	54	61	57
		South	6.2 Gt ^h	5.5 Gt ^{h,i}	105	105	92	96	103	113
transport	passenger	North	20 x 10 ¹² p.km ^j	18-22 x 10 ¹² p.km ^{j,x}	39	54	52	53	56	44
	freight ^l		15 x 10 ¹² t.km ^k	12-19 x 10 ¹² t.km ^{k,x}	15					
	passenger	South	33 x 10 ¹² p.km ^j	17-40 x 10 ¹² p.km ^{j,x}	28	47	43	42	41	53
	freight ^l		29 x 10 ¹² t.km ^k	21-37 x 10 ¹² t.km ^{k,x}	19					
international bunkers		-		8	8	<i>n.a.</i>	15	10 ^m	14 ^m	
Total (world)				410	410	358	395	402	409	

Notes: a - Activity level units vary per sector.

b – Primary, Final and Useful Energy Database⁴⁶, also available online¹⁰⁷,

c – IEA ETP²⁵ presents data disaggregated to OECD, non-OECD and selected countries. To increase comparability with LED, North is approximated as the sum of OECD and Russia, minus Mexico, while South as the sum of non-OECD and Mexico, minus Russia.

d – Data are for 2015, unless otherwise specified in the footnote.

e- billion m² of floorspace.

f – Data source: Gueneralp et al.¹¹ S25 scenario based on 2010 as a base year and Urge-Vorsatz et al.⁴⁴ “deep efficiency” scenario based on 2005 as a base year, decomposed using GEA ratios.

g – Data source: GEA Efficiency scenario⁸, online³⁴,

h - gigatonnes of materials,

i - data for year 2014 from IEA ETP 2017²⁵,

j - trillion passenger-kilometers,

k -trillion tonne-kilometres,

l - freight transport data (activity and energy demand) exclude shipping, which is included in bunkers.

m – Energy demand data for shipping reported in ETP is considered as bunker fuels and treated separately.

LED scenario expressed in per capita terms in 2050, compared to 2020. Table 2 in the main text summarises how the LED scenario impacts activity levels and final energy demand in 2050. Supplementary Table 24 provides the same data on a per capita basis.

Supplementary Table 24. Impact of LED Scenario on Final Energy Demand Per Capita in 2050, and change compared to 2020.

		region	% change in per capita activity levels (2020-2050)	% change in per capita energy demand (2020-2050)	activity levels per capita in 2050	energy demand per capita in 2050 (GJ/cap)	total global energy demand per capita in 2050 (GJ/cap)
end-use services	thermal comfort	North	-1	-75	29.3 m ² /cap ^a	4.9	1.8
		South	33	-83	28.6 m ² /cap ^a	1.1	
	consumer goods	North	67	-30	41.9 units/cap	8.2	4.5
		South	125	25	24.4 units/cap	3.7	
	mobility	North	21	-62	15.8 × 10 ³ p.km/cap ^b	9.9	3.0
		South	81	-67	9.7 × 10 ³ p.km/cap ^b	1.5	
	contingency reserve						
upstream	public & commercial	North	40	-66	22.0 m ² /cap ^a	3.0	0.9
		South	44	-86	9.0 m ² /cap ^a	0.4	
	industry	North	-46	-60	0.6 t/cap ^c	16.0	11.7
		South	-28	-37	0.7 t/cap ^c	10.7	
	freight transport	North	96	-32	19.5 × 10 ³ t.km/cap ^d	6.8	3.0
		South	43	-28	6.7 × 10 ³ t.km/cap ^d	2.2	
international aviation and shipping (bunker fuels)							1.1
TOTAL		North*		-56		49	27
		South*		-45		20	

* Contingency reserve of 8 EJ is allocated equally to Global North and South respectively. Bunker fuels are estimated only at the global level, consistent with current energy balances and emission accounting frameworks. Activity level units vary per end-use service and upstream sector: ^a m² of floorspace per capita; ^b passenger-kilometres per capita; ^c tonnes of materials per capita; ^d tonne-kilometres per capita.

LED scenario compared to the GEA Efficiency scenario. We have described the methodology and assumptions underlying LEDs energy demand in 2050 for LED end use and upstream demand sectors in the relevant Supplementary Notes (3 to 6 and 7 to 9). As discussed there, a major component in developing LED was to benchmark it in comparison to the GEA Efficiency scenario. Therefore, we complement Table 2 in the main text, also with a table comparing the LED and GEA Efficiency scenarios (Supplementary Table 25). Note that in certain cases GEA Efficiency data have been adapted when they deviated significantly from near-term expectations (GEA having been published in 2012). The comparisons below use these revised values.

Supplementary Table 25. Impact of LED Scenario on Final Energy Demand in 2050 in comparison to GEA Efficiency scenario.

	energy service	global energy demand (EJ)	activity levels		%Δ from GEA Efficiency		energy demand (EJ)		%Δ from GEA Efficiency	
			North	South	North	South	North	South	North	South
end-use services	thermal comfort	16	47 10 ⁹ m ² ^b	218 10 ⁹ m ² ^b	+4	+5	8	8	+30	-62
	consumer goods	41	67 10 ⁹ units	186 10 ⁹ units	-14	-2	13	28	-20	-22
	mobility	27	25 tr p.km ^a	73 tr p.km ^a	+40	+184	16	12	-41	-49
	contingency reserve	8	n.a.	n.a.	n.a.	n.a.	4	4	n.a.	n.a.
upstream	public & comm. buildings	8	35 10 ⁹ m ² ^b	68 10 ⁹ m ² ^b	+4	+5	5	3	+3	-62
	industry	107	1.0 Gton	5.4 Gton	-44 ^c	-35 ^c	26J	82	-52 ^d	-45 ^d
	freight transport	27	31 tr ton-km	51 tr ton-km	+32	+139	11	17	-18	-1
	Int. bunker fuels ^e	10	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.	n.a.
Total		245	n.a.	n.a.	n.a.	n.a.	82	153	-25	-46

n.a. not applicable

^a trillion passenger-kilometers

^b billion m² of floorspace

^c difference to ETP 2DS scenario²⁵ due to lack of data in GEA

^d difference in energy use between LED and ETP 2DS is -38% and -41% respectively.

^e Considered at the global level only in energy statistics and emission accounting (and in GEA Efficiency).

^f GEA-Efficiency global final energy use: 396 EJ. LED: -38%

LED scenario aggregated into three sectors and comparison with other studies. Final energy demand is conventionally reported in three end-use sectors: buildings, transport, and industry. These aggregations are common to many other studies including national and global energy statistics⁴³, energy projections²⁵, and mitigation pathway analysis¹⁰⁸.

To ensure comparability between the LED scenario and these other studies we aggregate our end-use services and upstream sectors into:

- buildings (other studies) = thermal comfort + consumer goods + contingency reserve (LED scenario)
- transport (other studies) = mobility + freight transport + international aviation and shipping (LED scenario)
- industry (other studies) = industry (LED scenario).

Supplementary Table 26 the aggregated 3-sector LED demands which enables a direct comparison with other scenarios that share comparable characteristics with LED (i.e. have an efficiency focus and meet also stringent climate targets).

Supplementary Table 26. Final energy (EJ) in the LED scenario aggregated to 3 sectors and compared to alternative scenarios by 2050.

Data in EJ		LED		comparable scenarios		
		2020	2050	GEA Efficiency	Greenpeace A[R]evolution ^{a 51}	ETP B2DS ^{b25}
region		2050				
buildings ^c	North	61	26	27	124	40
	South	75	40	73		79
industry	North	60	26	27	133	48
	South	105	82	153		125
transport ^d	North	54	27	55	57	25
	South	47	28	61		48
contingency reserve		-	8	-	-	-
international bunkers		8	10	n.a.	n.a.	12
total global		410	245	396	314	377

Notes:

a - Only sectoral data available.

b – IEA’s ETP 2017²⁵ presents data disaggregated to OECD, non-OECD and selected countries. To increase comparability with LEDs Global North region, the IEA data are reaggregated, where Global North is approximated as the sum of IEA OECD and Russia, minus Mexico, while the LED Global South region is approximated as the sum of IEA non-OECD and Mexico, minus Russia.

c - This category includes buildings and agriculture, forestry and fisheries.

d - Energy demand data for shipping reported in ETP is considered as bunker fuels and treated separately

LED scenario described with macro-level indicators. Lastly Supplementary Table 27 also characterizes the LED scenario in terms of macro-level indicators and also provides corresponding values for scenarios with comparable climate outcomes.

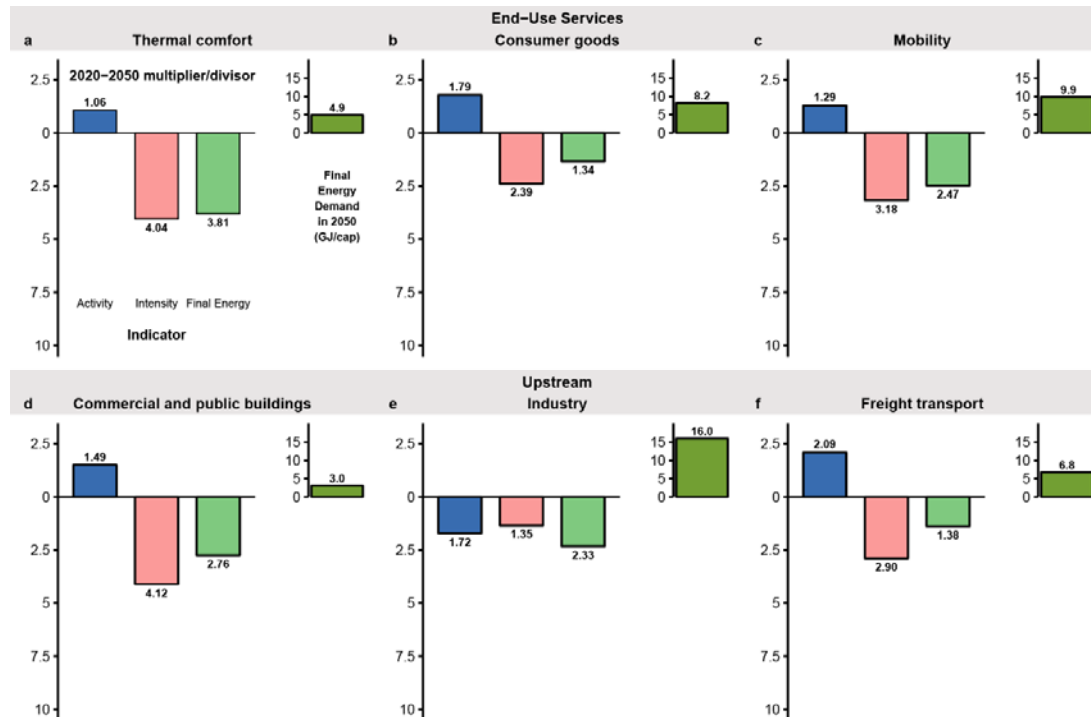
Supplementary Table 27. LED Scenario characterized by macro-level indicators. Population (millions), final energy (EJ), and final energy per capita (GJ/capita) by 2050 and average annual growth rates 2020-2050 in comparison to selected scenarios with similar climate change outcomes.

	region	LED	GEA Efficiency	SSP1-1.9	SSP2-1.9	ETP B2DS ^a	LED	GEA Efficiency	SSP1-1.9	SSP2-1.9	ETP B2DS ^a
		2050					% Δ 2020-2050				
Population (million)	North	1,556	1,474	1,563	1,556	1,373	0.2%	-0.3%	0.1%	-0.1%	0.2%
	South	7,613	7,696	6,898	7,613	8,341	0.7%	-0.7%	0.7%	-0.8%	0.4%
	World	9,169	9,170	8,461	9,169	9,714	0.6%	-0.6%	0.6%	-0.7%	0.4%
Final energy EJ/year	North	82	110	133	141	116	-2.5%	2.3%	-1.3%	1.7%	-1.1%
	South	153	287	291	297	260	-1.4%	0.8%	1.3%	-0.7%	0.7%
	World	245	396	424	438	377	-1.8%	1.3%	0.3%	0.2%	0.0%
Final energy per capita GJ/capita	North	53	75	85	91	84	-2.8%	2.6%	-1.4%	1.8%	-1.3%
	South	20	37	42	39	31	-2.1%	1.5%	0.6%	0.1%	0.3%
	World	27	43	50	48	39	-2.4%	1.9%	-0.2%	0.9%	-0.4%

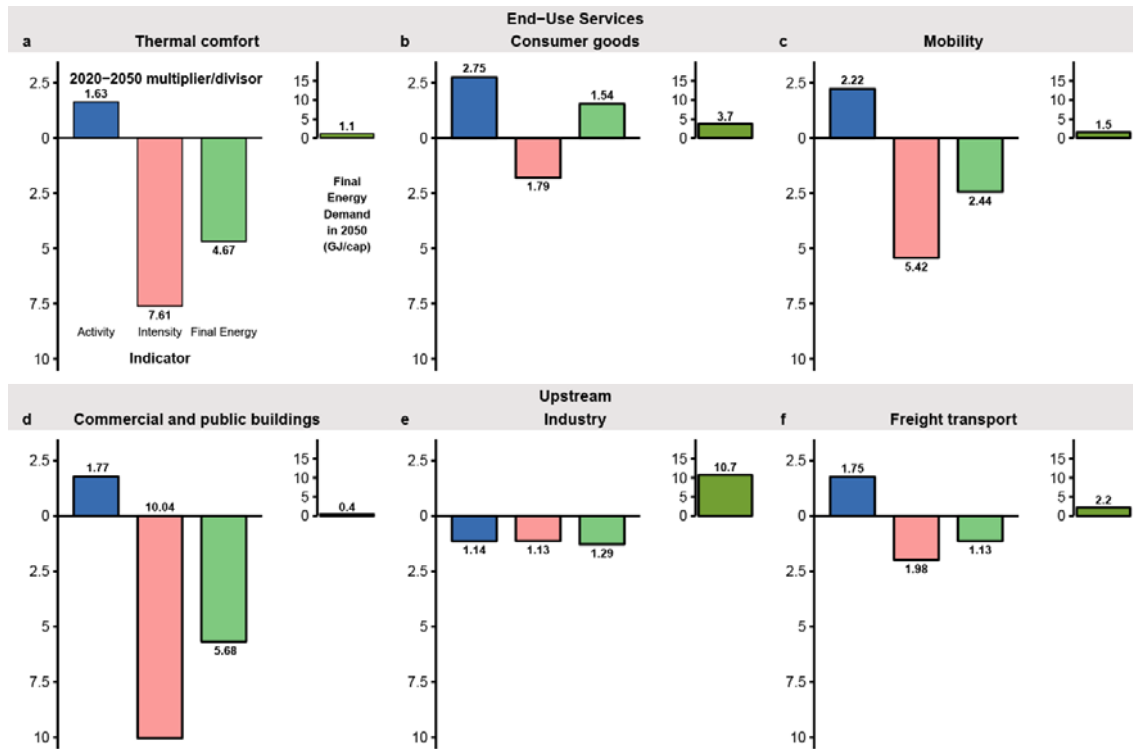
^a IEA (2017) Beyond 2 °C scenario. ETP regions have been harmonized with the regional definitions used in LED.

In terms of population, the LED scenario describes similar trends to comparable scenarios in the literature. However the LED scenario differs markedly in projecting an absolute decline in final energy use to 2050 globally. This trend is replicated by other scenarios only for the Global North. Given LED's radically different energy end-use and consumption patterns and associated structural economic shifts, as well as its bottom-up scenario development process based on physical indicators, we do not report macro-economic indicators like GDP. We consider the LED scenario consistent with a range of associated macro-economic development pathways, including those described in scenarios of comparable climate outcomes (shown in Supplementary Table 27 above). In such scenarios, global economic output increases by a factor of 2 to 3 (2.1 to 2.8) between 2020 and 2050. This corresponds to annual growth rates of between 2.5 to 3.5 %/year. Compared to LED's absolute decline in final energy use of 42% between 2020 and 2050, this indeed implies a significant and radical decoupling of absolute resource use from economic output in the LED scenario as a result of new forms of energy-service provision (e.g., sharing economy), economic organization (e.g., circular economy), and market interactions (emphasizing quality of life).

Summary of LED scenario at the regional level. In Figure 3 of the main text, we summarized the drivers of LED demand changes 2020 to 2050 in a (multiplicative) decomposition analysis. Supplementary Figures 11 and 12 provide the corresponding detail for the Global North and South respectively.



Supplementary Figure 11. Decomposition analysis of determinants of LED energy demand for end-use services and upstream sectors, Global North. Changes 2020-2050 in total regional activity, energy intensity and final energy demand (left bar chart; variable multiplier above x-axis, divisor below) and resulting per capita final energy demand (GJ/capita, right bar chart). Note that decomposition is represented by variable multipliers or divisors with direction of change also shown. These multiplicative and not additive with the final energy change being the product of the activity and intensity changes between 2020 and 2050. Panels a-c show end-use services: (a) thermal comfort, (b) consumer goods and (c) mobility. Panels d-f show upstream sectors: (d) commercial and public buildings, (e) industry and (f) freight transport. For global results see Figure 1 in main text.



Supplementary Figure 12. Decomposition analysis of determinants of LED energy demand for end-use services and upstream sectors, Global South. Changes 2020-2050 in total regional activity, energy intensity and final energy demand (left barchart; variable multiplier above x-axis, divisor below) and resulting per capita final energy demand (GJ/capita, right barchart). Note that decomposition is represented by variable multipliers or divisors with direction of change also shown. These multiplicative and not additive with the final energy change being the product of the activity and intensity changes between 2020 and 2050. Panels a-c show end-use services: (a) thermal comfort, (b) consumer goods and (c) mobility. Panels d-f show upstream sectors: (d) commercial and public buildings, (e) industry and (f) freight transport. For global results see Figure 1 in main text.

Supplementary Note 11

Supply-Side Transformations. The main text summarises how the LED scenario narrative maps onto changes in the energy supply, and how the MESSAGE-GLOBIOM modelling framework interprets these changes to generate quantitative transformation pathways.

Here we provide:

- Additional notes on the LED scenario narrative related to supply-side transformations;
- Additional results on the transformation of primary, secondary and final energy related to end-use transformations driving supply-side transformation;
- Discussion of climate policy costs (shadow carbon prices) and investment costs in the LED scenario;
- Scenario sensitivity to variations in energy demand;
- Regional disaggregation of results shown in the main text;
- Additional results and discussion on food production and land use change from the GLOBIOM model.

Additional notes on the LED scenario narrative related to supply-side transformations. For the upstream energy supply implications of LED we have used the IIASA MESSAGE model (see Methods section). Here we summarize the main input parametrizations of MESSAGE that drive the supply-side transformations in LED.

Base parametrization: SSP2. As discussed in the Methods section, we have maintained the MESSAGE SSP2 parametrizations unless specified otherwise. The reason for this lies in the fact that we wanted the LED scenario maintain its energy demand and efficiency focus and not draw attention away by making more extreme supply-side scenario assumptions. SSP2's "Middle of the Road" characteristics thus serve as a most useful reference. As outlined in the Method section, overall scenario drivers such as population and economic growth, resource availability and potentials were kept at their respective SSP2 ranges (which are available online⁹³).

LED parametrizations. LEDs supply side transformations are driven by three groups of interdependent variables: (low) energy demand (see main text and Supplementary Notes 2-10), a stringent climate constraint aimed at meeting the 1.5 °C target (that translates into cumulative emissions below 390 Gt CO₂ over 2020-2100), as well as the technology options available in LED.

Foremost, LEDs supply-side transformation is strongly shaped by the LED normative assumption that negative emissions technologies and CCS (Carbon Capture and Storage) technologies would not be available (due e.g. to innovation failure, unacceptable investment risks, public opposition, or a combination thereof). Combined with a stringent climate constraint, this drives fossil fuels and technologies out of the market. For the post-fossil technologies we have not made comparable stringent assumptions, basically allowing in principle a wide, and diverse post-fossil technology portfolio (renewables but also nuclear). But the model is guided in its technology choice by the overall LED scenario narrative.

The LED scenario emphasises energy-supply technologies that offer two distinct different features compared to traditional fossil fuel technologies: granularity and economies of scope.

Granular (small unit-scale) technologies are scalable across a variety of application scales (from household all the way up to utility-scale levels), are modular and serial and hence can benefit from significant learning and manufacturing scale economies that lead to drastic cost reductions and widening of application potentials. PV cells but also wind turbines are classical examples of such granular technologies, as are fuel cells or hydrogen electrolyzers. Economies of scope technologies such as like batteries and fuel cells are those that find multiple applications, providing "bundled" energy services, e.g. when integrated in cars, in stationary residential applications, or in distributed urban district-scale systems. Economies

of scope provide via multiple-outputs economic benefits and also offer significant potentials for technology spillover effects across sectors and applications. Conversely, conventional single-purpose technologies lose consumer appeal and are at a technological and economic disadvantage in LED. As examples, gas boilers and owned vehicles see their relative cost advantage offset by end-user preferences for heat pumps and mobility-as-a-service which offer flexibility, multiple functionality, and convenience.

Despite a clear overall trend towards granularity and decentralisation, large-scale forms of energy supply continue to play important roles particularly in serving large urban centres in the Global South. This includes nuclear, emphasising standardised replicable designs as well as modularity, and biorefineries for substituting petrochemical feedstocks and some liquid transportation fuels (e.g., aviation).

The technology portfolio choice in MESSAGE is informed by modifying particular granular and economies-of-scope technologies for the LED scenario (Supplementary Table 28) whose stationary cost trends in the original SSP2 scenario was judged non-compliant with the LED scenario storyline. All other technologies not listed in Supplementary Table 28 have been retained at their original (quite conservative) SSP2 values (e.g. for the year 2050: wind 500 \$/kW, nuclear 2600 \$/kW, biomass power plants 1200 \$/kW, etc.), an assumption in line with keeping LEDs emphasis on efficiency and demand, and granular, decentralized supply options and new organizational IT and digital economy models of combining supply and demand, e.g. in grid-to-vehicles but also vehicles-to-grids options or other distributed storage options (e.g. hydrogen based).

Supplementary Table 28. LED-scenario specific cost assumptions for granular technologies for MESSAGE supply-side transformation analysis (specific investment costs in US\$2010 per kW installed).

technology	short-term ca. 2030	medium-term ca. 2050	long-term post 2050
solar PV	500	120	50
batteries (transport & storage)	300	100	50
fuel cells	750	300	100
electrolytic hydrogen	300	200	100
solar direct heat industry	300	100	100

Notes:

solar PV - short-term: based on Haegel et al.¹⁰⁹ high deployment scenario; medium- and long-term: assuming 20% learning rate applied to IEA's ETP 2017²⁵ B2D scenario deployment rate

batteries - short-term: EPA TAG 2016¹¹⁰ (for 100%EV scenario), medium- and long-term: assuming cost reductions of 3.5%/year (manufacturing scale economies and design improvements)

fuel cells - short-term, extrapolation of Japanese residential program cost assuming 15% learning rate and global market growth to 10 million units by 2030 using Wei et al.¹¹¹ costing model

electrolysis - short-term: SSP2 scenario, medium- and long-term: assuming a cost decline of 1.6 %/year (manufacturing scale economies)

solar direct - short-term costs from IEA-ETSAP & IRENA¹¹², medium-term costs based on IEA-ETSAP & IRENA¹¹² best performing to average cost ratio

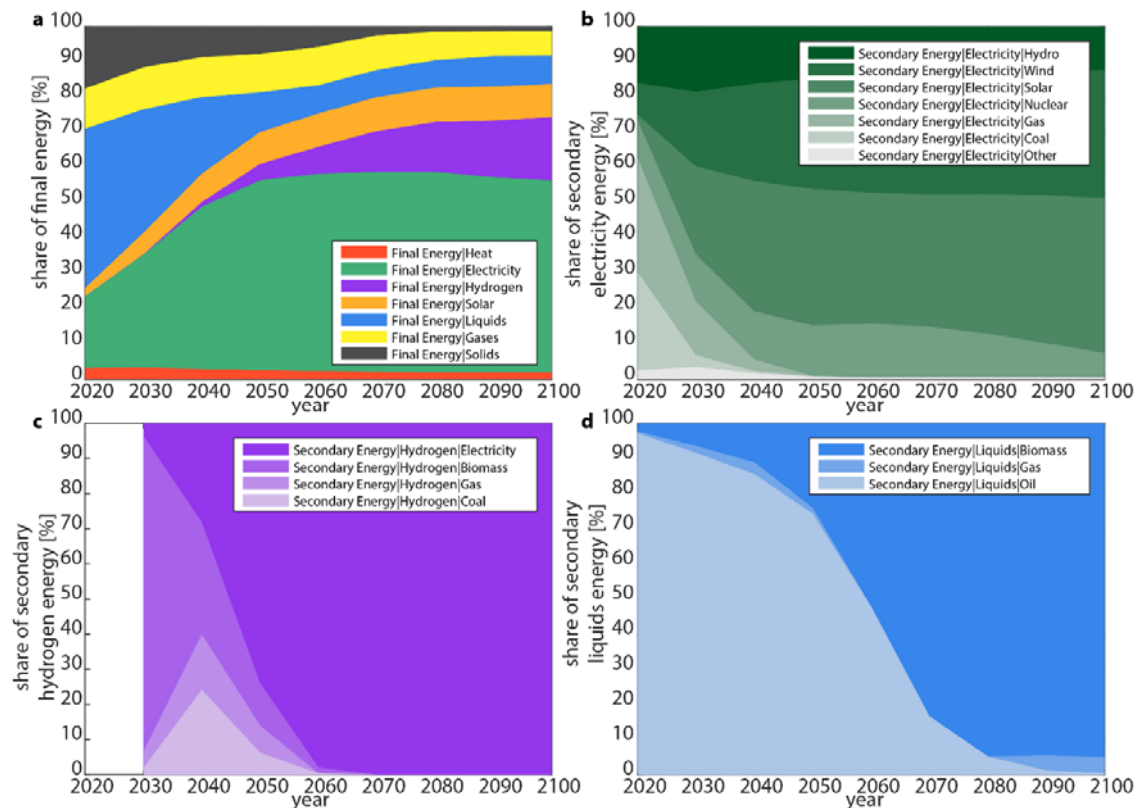
Additional results on the transformation of primary, secondary and final energy related to end-use transformations driving supply-side transformation. The fundamental transformations in energy end-use and its supporting infrastructures in the LED scenario lead to a structural shift towards “hydricity”¹¹³, a combination of electricity and hydrogen that serve as the main energy carriers to bridge changing energy demand to available energy resources. The supply-side energy system in the LED scenario is characterized by a combination of flexible, variable renewables like solar and wind, and hydrogen. Their expansion is driven by the granularity and scalability of these technology options, and resulting rapid cost declines and spillover effects. Combined with an emphasis in the LED scenario narrative on environmental quality across all scales from local air pollution to global climate change, the energy-supply system is most prominently characterized by a shift away from fossil-energy carriers (Supplementary Figure 13, panel a). However, all final energy carriers are generated in very different ways from today (Supplementary Figure 13, panel b-d).

By mid-century, no more electricity is produced from fossil energy; the contribution of coal disappears by 2040 (Supplementary Figure 13, panel b). In favouring granular technologies, decentralized energy provision and digitalization, the LED scenario allows the share of electricity produced from renewable sources to more than triple between 2020 and 2050. By 2050, roughly 85% of electricity production is supplied by hydro, wind and solar, with the remainder being covered by nuclear. The high power density and base-load characteristic of nuclear plants makes them a valuable asset supplying energy to large concentrations of energy demand in urban centres. But the technology is at a crossroads: in the near-term lifetime extensions of existing reactors and completion of already commissioned projects can maintain this traditional technology option even in the LED scenario's rapidly modernizing energy-supply system. But over the longer-term the nuclear option is only reconcilable with the LED scenario narrative under assumptions of highly standardized, reduced-complexity modular reactor designs. Should these not materialize, nuclear might turn out to be a transitional technology, ultimately replaced by renewable electricity.

Due to the low demand characteristics of the LED scenario, the expansion rates of renewable supply options is more gradual compared to the recent past which has seen strong policy-induced growth rates. Solar PV and wind output increased on average well above 20%/year (decadal averages over 1996 to 2006 and 2006 to 2016 ranged between 22 and 50%/year for wind and solar PV respectively¹¹⁴). This compares to future expansion rates to 2030 in the LED scenario of 10 and 16%/year (wind and solar PV respectively). These decline thereafter to 5%/year (2030-2040), and 2-3 %/year (2040-2050). However, due to the low (and declining) demand characteristics of the LED scenario, even these comparatively modest growth rates for renewable electricity translate into a substantial and rapid transformation of the energy system. The share of solar PV and wind in primary energy increases from some 4% of primary energy in 2020 to almost 50% by 2050. Towards

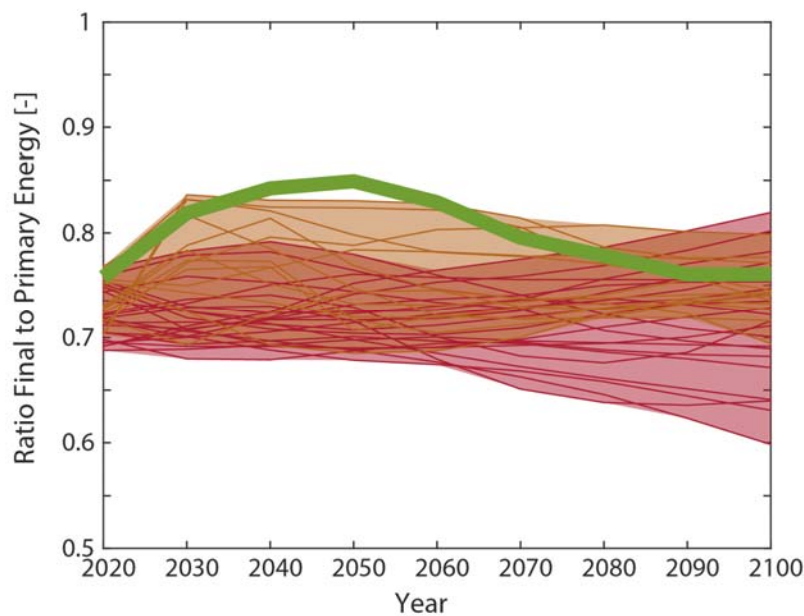
the end of the century it approaches a 60% share of primary energy. (These numbers use the more conservative direct-equivalence primary accounting convention for renewables which we use in the LED scenario).

Alongside its strong emphasis on electrification, the LED scenario also sees roles for hydrogen and liquids generation in the energy supply. In the initial stages of its deployment, hydrogen is produced from fossil energy carriers. By mid-century, hydrogen accounts for about 5% of final energy, with about three quarters produced with electricity, increasing to virtually 100% one to two decades later (Supplementary Figure 13, panel c). For the production of liquid final energy carriers, biomass plays the most prominent role. Although fossil energy carriers dominate today in the liquids sector, biomass covers 25% of the global demand for liquids by mid-century, increasing to 95% by 2100 (Supplementary Fig. 13, panel d).



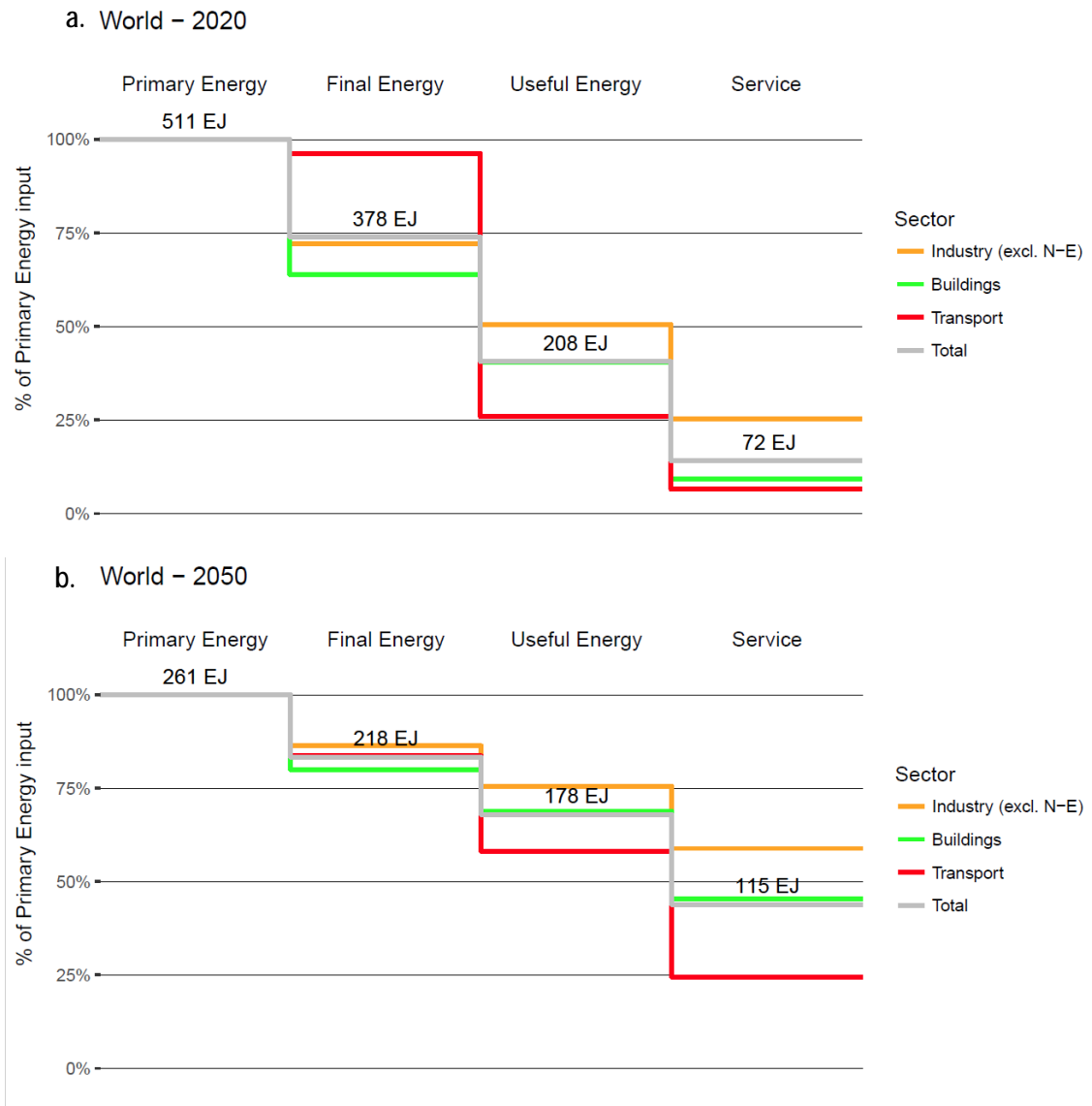
Supplementary Figure 13. Structural change in the global energy supply in the LED scenario. (a) structure of final energy over the 21st century; (b-d) structural change of primary energy per secondary energy carrier for electricity (b), hydrogen (c), and liquids (d). Relative shares for hydrogen are reported from 2030 onward as its contribution only appears by 2030. The “Other” category in panel b covers oil, geothermal, and biomass.

Shifts in the energy-system cascade from primary to secondary (carriers) to final and then useful energy also translate into shifts in the efficiency of the respective system parts. The widespread electrification of final energy is anticipated to increase the efficiency of final to useful energy conversion. At the same time, a reduction in primary to final energy efficiency is anticipated due to the conversion deepening of the supply system, i.e. energy carriers are more profoundly and pervasively converted into cleaner and more flexible forms of energy like electricity or hydrogen. Nevertheless, the primary to final energy conversion efficiency in the LED scenario is still at the high end of the range of supply-side driven stringent mitigation scenarios (Supplementary Figure 14). In part this indicates that energy losses are not as pervasive as might be assumed. However it is also in part a known artefact of energy accounting methods because ambient energy that is used in heat pumps is added to the system, but is not part of the primary energy accounting balance.



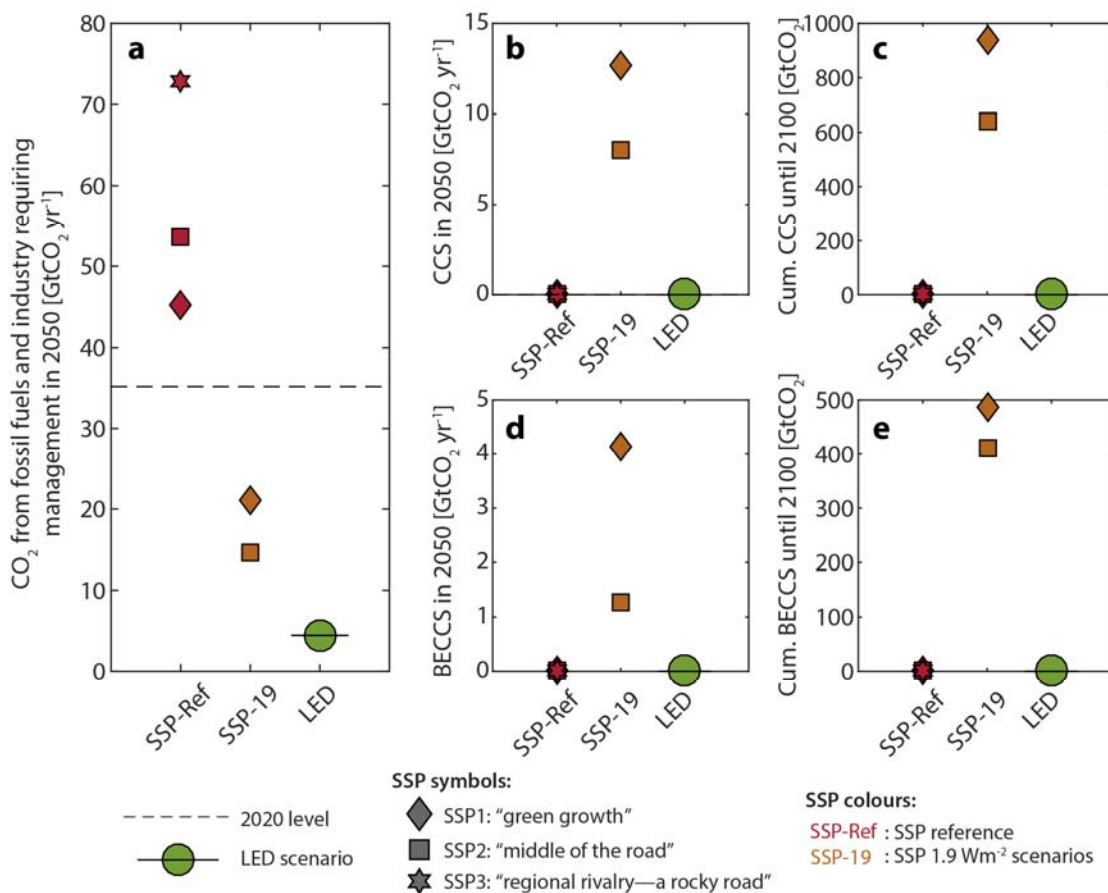
Supplementary Figure 14. Primary to final energy conversion efficiency in the LED scenario. Comparison of the LED scenario (green) with SSP baselines¹⁶ (red) and SSP 1.9 W/m² scenarios¹¹⁵ (orange).

The whole-system transformations of the LED scenario (from primary to useful energy) provide overall efficiency gains, since demand-side efficiency gains are far stronger than the minor efficiency losses in the supply systems. This is shown most clearly when including the final useful energy to energy service step. Panel **a** of Supplementary Figure 15 repeats the energy-efficiency cascade from primary energy to energy services for the global energy system in 2020 shown earlier in Supplementary Figure 1. However panel **b** of Supplementary Figure 15 shows the corresponding cascade for the LED scenario in 2050. The aggregate efficiency of the global energy system in converting primary energy into services improves by a factor of three from around 14% in 2020 (72 EJ services / 511 EJ primary energy) to around 44% in 2050 (115 EJ / 261 EJ).



Supplementary Figure 15. Energy conversion cascades in the global energy system. Lines show percent of primary energy delivered as final energy, useful energy, and services respectively for three end-use sectors (industry, residential & commercial buildings, transport) and totals for the whole energy system. **(a)** shows LED base year 2020. **(b)** shows LED scenario in 2050. Energy flows exclude non-energy feedstock uses of energy (labelled N-E). Total energy flows (EJ) are shown at each stage of the energy conversion cascade. Data sources: Current primary, final, and useful energy levels and corresponding efficiencies are from the MESSAGE model calibrated to 2020 base year data (see Supplementary Notes 10-11); service efficiencies are first-order (conservative) estimates based on Nakicenovic et al. (1990)³ and Nakicenovic et al. (1993)⁴ LED scenario energy flows and efficiencies in 2050 as modelled by MESSAGE; service efficiencies derived from Supplementary Tables 3, 16, 18, and 19.

Carbon management in the LED scenario. Stringent mitigation scenarios are typically characterized by large volumes of residual flows of CO₂ which require management, in particular flows of captured CO₂ which need to be transported and stored for carbon capture and storage (CCS) and bioenergy with CCS (BECCS) (Supplementary Figure 16). The LED scenario eliminates the deployment of CCS and BECCS and reduces the volume of CO₂ that is still produced in 2050 by roughly a factor 4 compared to traditional 1.5°C-consistent scenarios (Supplementary Figure 16, panel a). This leads to significantly lower risks of carbon leakage and lower exposure to future innovation or deployment failure for these largely unproven technologies.



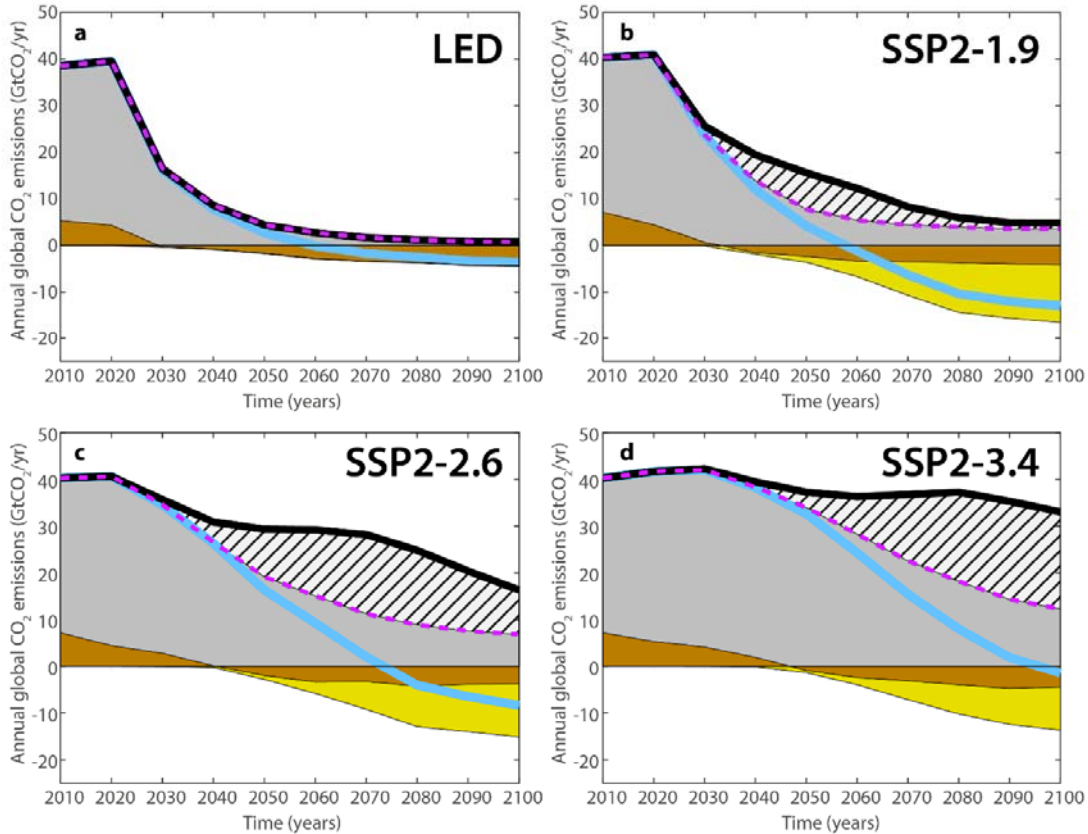
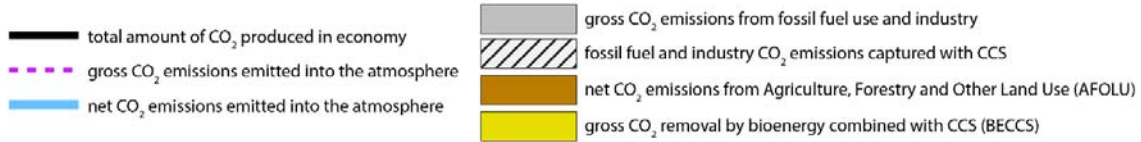
Supplementary Figure 16. Carbon management in the LED scenario. (a) the volume of annual CO₂ emissions requiring management in 2050; (b) annual amount of CO₂ sequestered by CCS in 2050; (c) cumulative amount of CO₂ sequestered by CCS from 2020 to 2100; (d) annual amount of CO₂ sequestered by BECCS in 2050; e, cumulative amount of CO₂ sequestered by BECCS from 2020 to 2100. Note that the LED scenario deploys neither BECCS nor CCS. The LED scenario is shown in green, SSP baselines¹⁶ in red and SSP 1.9 W/m² scenarios¹¹⁵ in orange. The dashed line shows the 2020 value.

Supplementary Figure 17 complements Supplementary Figure 16 in providing temporal profiles of various CO₂ emission categories between LED and various SSP2 mitigation scenarios.

The strong energy demand reductions in the LED scenario allow it to reduce the total amount of CO₂ produced in the economy until mid-century much more rapidly compared to alternative scenarios with higher demand such as the SSP2-based mitigation scenarios, SSP2-1.9. By 2050, the LED scenario reduces the total amount of CO₂ emissions to roughly a tenth of their 2020 level (i.e. a 90% reduction, Supplementary Figure 17, panel a, thick black line). In contrast, the SSP2-1.9 scenario, which achieves a comparable climate outcome, reduces the total amount of CO₂ emissions by about 60% in 2050, relative to 2020 (Supplementary Figure 17, panel b). Both scenarios achieve net zero CO₂ emissions shortly before 2060 (light blue lines in Supplementary Figure 17). However, the SSP2-1.9 scenario relies on carbon capture and storage (CCS) either to abate some of the fossil fuel and industry CO₂ emissions before being vented into the atmosphere (hatched area in Supplementary Figure 17, panel b), or to offset residual emissions through CO₂ removal by negative emissions from agriculture, forestry, and other land use changes (AFOLU) as well as bioenergy combined with CCS (BECCS).

Further into the future, during the second half of the century, the global CO₂ system configurations develop dramatically differently. The SSP2-1.9 scenario relies on large-scale deployment of BECCS to offset residual gross CO₂ emissions, and to compensate for the excess in cumulative CO₂ emissions emitted before the time of carbon neutrality. The LED scenario, on the contrary, allows gross CO₂ emissions from fossil fuel and industry use to be close to zero throughout the latter half of this century. This allows the achievement of net CO₂ removal without the application of BECCS or CCS.

Moving to weaker climate targets under the same middle-of-the-road socioeconomic assumptions of SSP2 does not necessarily result in a reduction in CCS deployment. On the contrary, due to the increasing final energy demand in these scenarios over the 21st century, these scenario still see large contributions of CCS. Due to the implied higher energy demand and corresponding larger overall energy system, a weakening of the climate target from 1.9 W/m² to 2.6 W/m² or still further to 3.4 W/m² in 2100 sees an increase in the deployment of fossil fuels with CCS that prolongs the phase out of fossil fuel-related CO₂ emissions (Supplementary Figure 17, panels b-d).



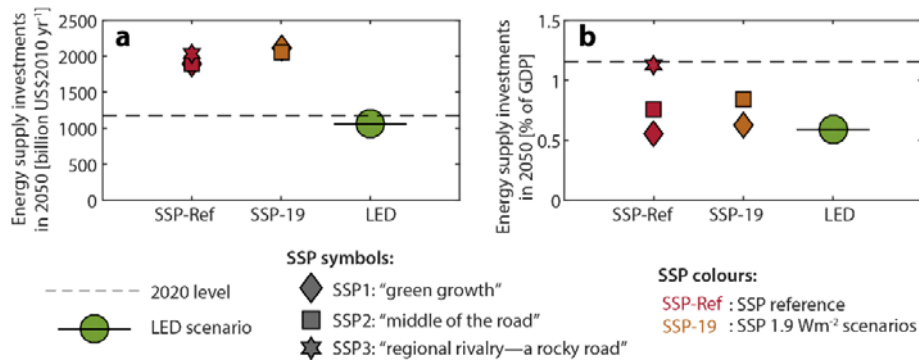
Supplementary Figure 17. Global CO₂ emissions in the LED and SSP2 scenarios. Emissions by source, use of CCS, and emissions removal by land-use change (AFOLU) and by BECCS, are shown for the LED scenario (a) and the MESSAGE-GLOBIOM SSP2-1.9 (b), the MESSAGE-GLOBIOM SSP2-2.6 (c), and the MESSAGE-GLOBIOM SSP2-3.4 (d) scenarios. Note that although net global CO₂ emissions reach zero roughly at the same time in panels a and b (light blue line), this point is reached in contrasting ways in the two scenarios. LED achieves emissions reductions until carbon neutrality through a rapid near-term decline of the total amount of CO₂ produced in the economy (thick black line), offset by a limited contribution of AFOLU removal. The standard SSP2-1.9 scenario reduces the total amount of CO₂ produced in the economy much less, and instead requires CCS both to reduce CO₂ emissions from fossil fuel and industry (hatched area) and to offset a large amount of emissions through BECCS. The SSP2-2.6 and SSP2-3.4 scenarios achieve weaker climate targets (2.6 and 3.4 W/m² of radiative forcing by 2100) yet deploy larger absolute amounts of total CCS further delaying the phase out of fossil fuel-related CO₂ emissions.

Discussion of climate policy costs (shadow carbon prices) and investment costs in the LED scenario. The following section reviews cost related features of the LED scenario, including the shadow prices of carbon, supply-side and end-use investment costs.

Shadow Prices of Carbon. The MESSAGE model used for quantifying the implications of LED for upstream supply transformation is a linear programming model. This allows us to directly quantify the cost of imposing the cumulative carbon constraint introduced for meeting the 1.5 °C target in LED, i.e. so-called carbon shadow prices. (In general equilibrium models, carbon shadow prices equate to carbon taxes, but this is not the case for models like MESSAGE).

Carbon shadow prices in the LED scenario from the MESSAGE-GLOBIOM model are 90 US\$/tCO₂ in 2030 rising to 160 US\$/tCO₂ by 2050, and then to around 700 US\$/tCO₂ by 2100 (all numbers are rounded and expressed in US\$2010/tonne CO₂). This compares to a range in the SSP2-1.9 and SSP1-1.9 scenarios¹¹⁵ of 60-400 US\$/tCO₂ by 2030, and 1000-3700 US\$/tCO₂ by 2050 (rising above 10⁴ US\$/tCO₂ by 2100) that were developed with the same model as LED. However, these scenarios used slightly different discount rates: 3% for the LED scenario (consistent with the scenario narrative of rapid transformation) compared to 5% for the SSPs. Using a lower discount rate increases carbon shadow prices in the near term (2030) but lowers them in the long-term (towards 2100), thus shifting transitions to earlier time periods. The use of an appropriate discount rate is an important scenario assumption and not a technical detail of the modelling. The slowness of energy transitions portrayed in long-term scenario studies and mitigation analyses are also the result of discount rate choices (see also Grubler & Messner¹¹⁶).

Supply-Side Investment costs. LED's supply-side transformation also implies investment costs in 2050 at a level roughly similar to today's one trillion US\$ per year (equivalent to a 40% decrease relative to GDP). In contrast, other 1.5°C scenarios require annual energy-supply investments two to three times above current levels (*Supplementary Figure 18* panels a, b). With available data it is not possible to provide similar estimates of incremental investment costs in energy end-use (see next Section for a discussion).



Supplementary Figure 18. Supply-side investments in LED in comparison to mitigation scenarios. (a) investments in 2050 (billion US\$2010); (b) 2050 supply-side investments as percent of GDP. The LED scenario is shown in green, SSP baselines¹⁶ in red and SSP 1.9 W/m² scenarios¹⁵ in orange. The dashed line shows the 2020 value.

End-Use Investment Costs. Above we provided quantitative estimates of energy-supply investments in the LED and other scenarios. Data limitations and methodological complexities prevent analogous estimates of end-use investments associated with the LED scenario. The difficulties of quantifying total end-use investments is discussed in detail in Wilson and Grubler¹¹⁷. Unlike upstream energy-conversion technologies providing a largely homogenous output (electrons, gasoline), energy end-use technologies like buildings or vehicles provide multiple functionalities beyond their narrow energy service (thermal comfort, mobility). Allocating end-use investments to different subcomponents or sub-functionalities is problematic at best, and not possible for organizational and behavioural changes associated with improvements in energy-service efficiencies (e.g., increased capacity factors of vehicles in shared or autonomous vehicle fleets).

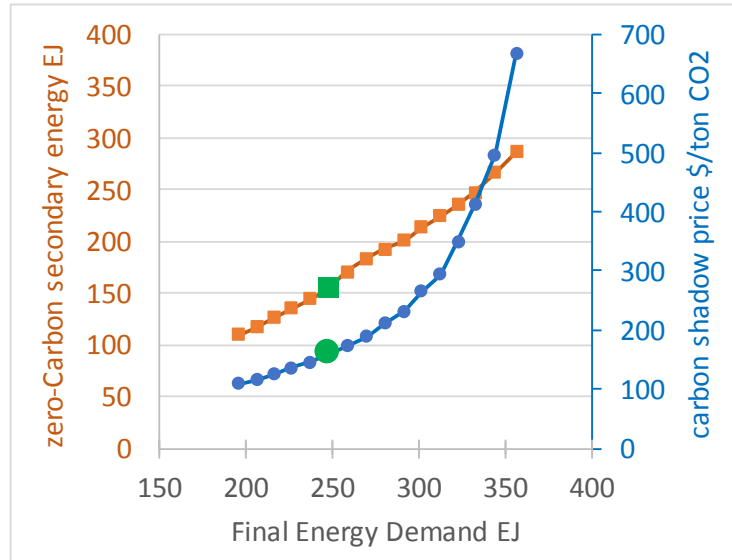
However, the supply-side investment savings of the LED scenario compared to high demand, supply-side dominated mitigation scenarios are around 1 to 2 trillion US\$/year. To put this into context, energy-end use investments were estimated in the Global Energy Assessment⁸ to range from 300 billion to 3 trillion US\$ per year (for 2005, the latest year for which an estimate was possible based on available data)¹¹⁸. The wide range reflects uncertainty in where to draw the system boundary between the energy service and the other functionality of end-use devices: around energy-conversion devices (US\$ 300 billion/year) or also including the passive systems which combine with these devices to provide useful services (US\$ 3 trillion/year). Depending on these system boundaries, the supply-side investment savings in the LED scenario (relative to other stringent mitigation scenarios) correspond to two-thirds to seven-fold of current demand-side investments. The extent to which these savings can potentially help finance demand side transformation in the LED scenario is an important area for further research.

Scenario sensitivity to variations in energy demand. Improving the efficiency of energy-service provision can reduce the effective price of energy services and lead to rebound effects by which demand for energy services increases¹¹⁹. The presence and magnitude of potential rebound effects is an important uncertainty in the LED scenario that affects future energy demand. To explore the impact of potential rebound on our main findings, we performed a scenario sensitivity analysis with the MESSAGE model by parametrically scaling final energy demand in LED through the range of -25% to +50%. Supplementary Figure 19 summarizes the results for the year 2050. Energy demand ranges from 200 to 360 EJ with associated ranges of carbon shadow prices from 60 to 680 US\$2010/tCO₂ and of zero-carbon secondary energy from 110 to 290 EG. Zero-carbon secondary energy output is approximated by the sum of electricity generation from PV and wind, plus hydrogen production from all sources.

The most important conclusion from this sensitivity analysis is that within the range of demand uncertainty explored, the LED scenario remains feasible in having a least-cost solution identifiable by MESSAGE which falls within the cumulative carbon constraint (our 1.5 °C target) and without the need for negative emissions technologies. This is even the case if demand were to rebound by 50% over and above the level in the LED scenario. This range of demand variation is sufficiently large to buffer any potential rebound effects within reported “best guess” literature ranges of up to 30%¹¹⁹⁻¹²¹.

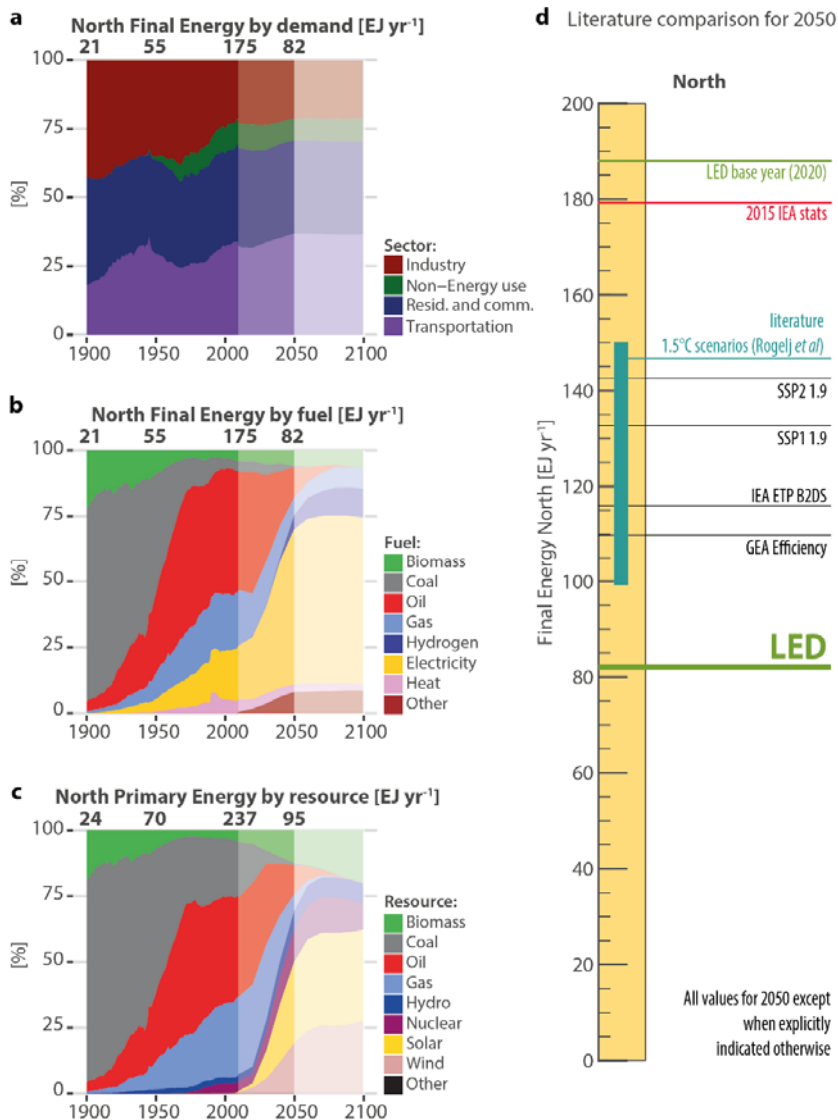
Higher energy demand would require additional deployment of zero-carbon energy resources as an almost linear function of demand variation. In contrast the impact of demand uncertainty on carbon shadow prices suggests important threshold effects. Within a ±25% variation of 200-300 EJ final energy demand in 2050, carbon shadow prices respond approximately linearly, ranging from 110 to 230 \$/tCO₂ by 2050 compared to 160 \$/tCO₂ in the LED scenario (Figure SI-6-7). If energy demand increases still further up to 300 to 350 EJ by 2050 then staying within the 1.5 °C limit becomes increasingly difficult and costly - carbon shadow prices increase close to 700 US\$/tCO₂ by 2050.

We conclude that the findings of the LED scenario can be considered highly robust with a variation of ±25% in final energy demand. Even if energy demand were to be 50% higher, the LED scenario remains able to provide significant SDG co-benefits and stay within the 1.5 °C climate target without negative emissions technologies, albeit at substantially higher costs.

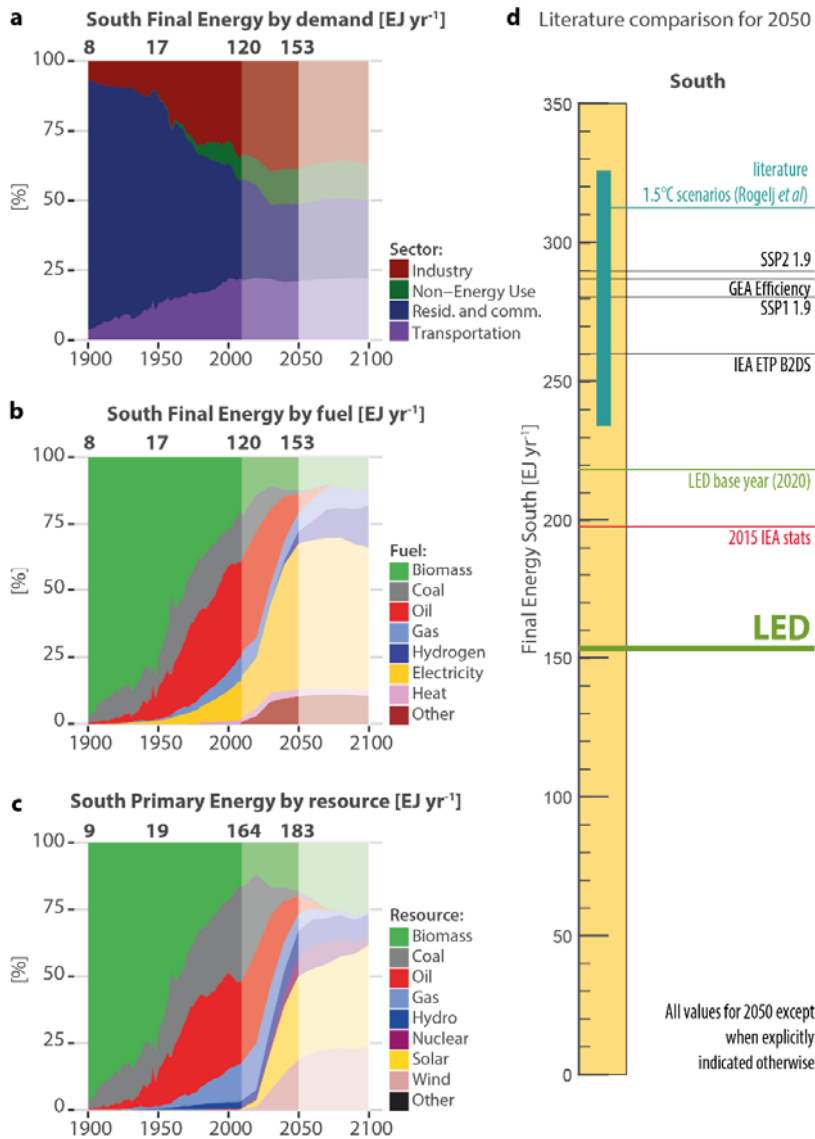


Supplementary Figure 19. Sensitivity of final energy demand in 2050 in the LED Scenario. Variations in final energy demand (EJ, x axis) as a function of zero-carbon secondary energy supply (EJ, left y-axis) and carbon shadow prices (US\$2010/tCO₂, right y-axis). The original LED scenario is denoted by green symbols.

Regional disaggregation of results shown in the main text. Energy services in the LED scenario are aggregated into three end-use sectors (transport, industry, buildings and other) to allow comparison with available historical final energy data⁴⁶ (see also discussion in Supplementary Note 10 above) and the scenario literature. Analogous to Figure 3 in the Main text, Supplementary Figure 20 and 21 show regionalized results for the LED scenario for our two macro-regions.



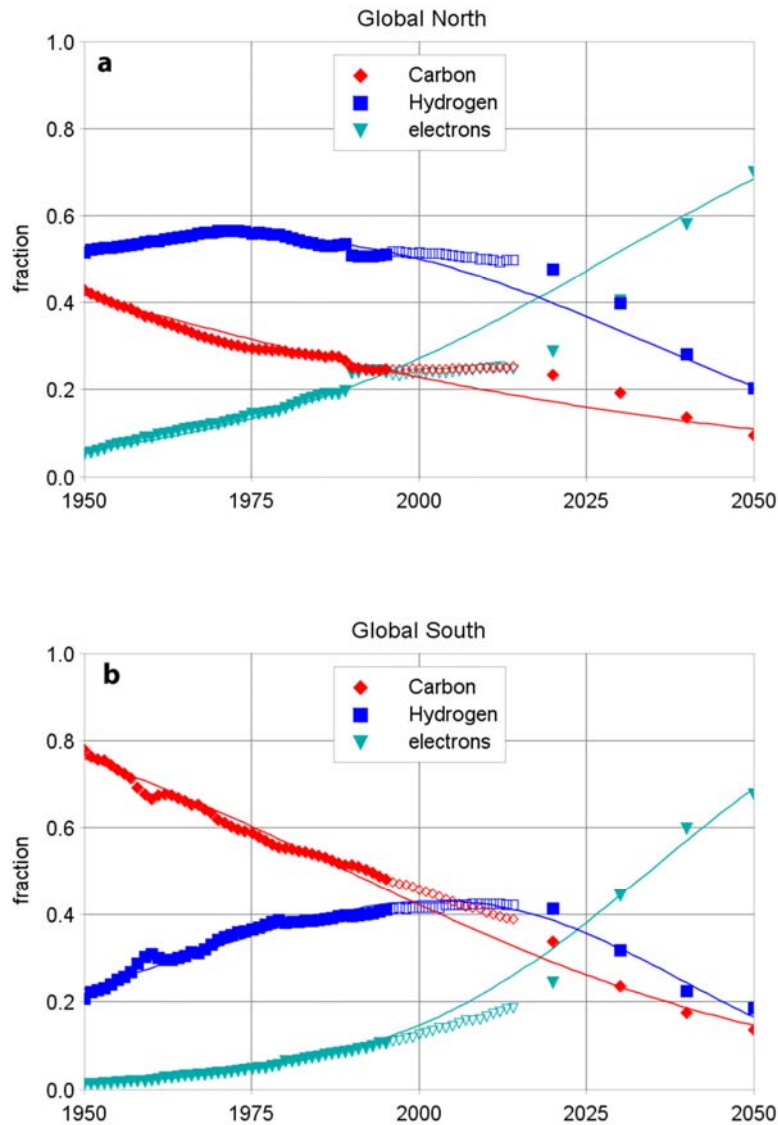
Supplementary Figure 20. LED scenario in the Global North in historical context and in comparison to the literature. Structural change in final energy shares by sector (a), final energy shares by fuel (b), and primary energy shares (c). Time period from 1900 to 2100 comprises historical data to 2014 (no shading), LED scenario to 2050 (light shading) and simplified scenario extension to 2100 (lightest shading) used for calculating climate change outcomes. Absolute levels of historical final and primary energy are indicated for key years on top of each panel. **Panel d:** final energy demand (EJ) for LED in 2050 compared to 2015 statistics, LED 2020 base year, GEA Efficiency (the starting reference point for LED), and other comparable scenarios with stringent climate mitigation for the year 2050 including the Shared Socioeconomic Pathways SSP1 and SSP2 1.9 W/m² scenarios^{42,115}, literature 1.5°C scenarios^{122 116116}, the IEA ETP Beyond 2 Degree (B2DS) scenario²⁵ as well as the Greenpeace A[R]evolution scenario⁵¹. Note: primary energy of non-combustible energy carriers is counted as the direct equivalent of secondary energy output.



Supplementary Figure 21. LED scenario in the Global South in historical context and in comparison to the literature. Structural change in final energy shares by sector (a), final energy shares by fuel (b), and primary energy shares (c).¹¹⁶²⁵⁵¹ Time period from 1900 to 2100 comprises historical data to 2014 (no shading), LED scenario to 2050 (light shading) and simplified scenario extension to 2100 (lightest shading) used for calculating climate change outcomes. Absolute levels of historical final and primary energy are indicated for key years on top of each panel. **Panel d:** final energy demand (EJ) for LED in 2050 compared to 2015 statistics, LED 2020 base year, GEA Efficiency (the starting reference point for LED), and other comparable scenarios with stringent climate mitigation for the year 2050 including the Shared Socioeconomic Pathways SSP1 and SSP2 1.9 W/m² scenarios^{42,115}, literature 1.5°C scenarios¹²², the IEA ETP Beyond 2 Degree (B2DS) scenario²⁵ as well as the Greenpeace A[R]evolution scenario⁵¹. Note: primary energy of non-combustible energy carriers is counted as the direct equivalent of secondary energy output.

Supplementary Figure 22 below also reports regional results for our consistency check of LEDs structural change in final energy structure compared to historical energy transitions for our two macro-regions analogous to Figure 4 in the main text. These transitions have first been described using a simple formal model of market substitution by Marchetti and Nakicenovic¹²³ drawing on the technological change literature where product or technology substitution¹²⁴ have been found to proceed along S-shaped market share curves, formalized by a set of coupled logistic equations akin to the generalized Lotka-Volterra interspecies competition equations in biology¹²⁵.

Instead of traditional analyses focussing on fuel shares (e.g. coal versus electricity), we analyse the transition in final energy structure by aggregating the different final energy forms into the three major sources of energy release: oxidation of carbon into CO₂, oxidation of hydrogen to H₂O, and lastly energy provided by electrons (electricity, where we also include the relatively smaller amounts of direct heat in final energy, from district heating grids or on-site solar thermal) (see also main text). This aggregation serves to simplify the exposition of the historical energy end-use transitions (moving from up to 10 different final energy carriers to just three processes) and also reflects the increasing exergetic quality in historical and future transitions from pre-industrial direct combustion of biomass (H:C ratio of 1:10) all the way to “hydricity” and electricity.



Supplementary Figure 22. Dynamics of change in final energy structure historically and in the LED scenario. Results are shown for Global North (a) and Global South (b). Fractional shares of final energy provided by (oxidation of) carbon (C, red diamonds), hydrogen (H, blue squares), and electrons (e, electricity, also including direct uses of heat, turquoise inverted triangles) analysed with a model of competing technologies/products. Hydrocarbon fuels are allocated to the respective carbon and hydrogen fractions of fuels based on stoichiometric hydrogen-carbon ratios (e.g. 4:1 in case of methane, CH_4) applied to fuel energy contents using lower heating values (LHV). Symbols represent historical (1950 to 2015) and LED scenario data (2020, 2030, 2040, 2050). Lines represent logistic substitution curves fitted to 1900-1995 historical data and 2020-2050 LED scenario data (filled symbols) omitting the 1995-2015 stagnation in observable structural change (unfilled symbols).

Additional results and discussion on food production and land use change from the GLOBIOM model are reviewed below. The findings are related to yield development, biomass supply, and land use related GHG emissions.

Yield development. The LED scenario also relies on land and feed conversion productivity increase to reduce the dependency on natural resources in line with the “grand restoration” narrative of the LED scenario storyline. Technological change for crops is based on 18 crop specific yield response functions, pegged to GDP per capita growth and estimated for different income groups using a fixed effects model. The response to GDP per capita was differentiated over four income groups oriented at World Bank’s income classification system (<1.500, 1.500-4.000, 4.000-10.000, >10.000 USD GDP per capita). Country level yield data was provided from FAOSTAT while GDP per capita was based on World Bank data (1980-2009). Fertilizer use and costs of agricultural production increase in proportion with yields. Productivity changes through technological change in the livestock sector and transition towards more efficient livestock production systems takes place in line with historic trends. The productivity trends in the LED scenario are summarized in Supplementary Table 29.

Supplementary Table 29. Crop yield change in the LED scenario compared to 2010 (2010 =1).

		2020	2050	2100
Crop sector	Wheat	1.12	1.55	1.98
	Rice	1.14	1.47	1.76
	Coarse grains	1.15	1.71	2.26
	Oilseeds	1.18	1.64	2.02
	Sugar crops	1.14	1.67	2.19

Biomass supply for bioenergy. More sustainable land resource demand patterns are not limited to agricultural products but also apply to biomass provision in general. BECCS are excluded from the LED scenarios, but land still contributes slightly to the mitigation efforts as a source of biogenic carbon to substitute fossil fuel. By the end of the century, 206 million hectares are devoted globally to bioenergy plantations. This is however much slower level than with a scenario with BECCS⁹⁷ where the contribution of bioenergy reaches 750 Mha. The effect is notably alleviated by 2050, where plantations do not exceed 81 million ha, versus 283 Mha under a typical SSP- 1.9 scenario.

As a consequence of low bioenergy provision, and lower pressure on land from the food sector, future society needs can here be achieved without endangering natural ecosystems. As illustrated in Supplementary Table 30, both areas of natural forest and other natural land increase in the LED scenario, which in addition to carbon sequestration benefits through more vegetation regrowth also implies higher levels of biodiversity protection.

Supplementary Table 30. Main non-agricultural land use categories in the LED scenario (Mha)

	2020	2050	2100
Cropland -energy crops	9	81	206
Forest managed	705	895	1116
Natural forest	3273	3398	3577
Afforestation and reforestation	123	444	858
Pasture	3462	2891	2410
Other natural land	3467	3699	3823

Land use sector GHG emissions. Emissions from the agricultural and land use sectors significantly decrease over the 21st century in LED (see Supplementary Table 31). CH₄ emissions (mainly from rice flooding and enteric fermentation emissions) are more than halved through the lower use of rice and red meat in diets, whereas N₂O emissions (mainly from fertiliser use and manure management) are decreased by a lower share, around one quarter, due to the necessity of keeping production of high yield crops and some animal proteins.

In the LED scenario, efforts to reduce deforestation and unsustainable food and material sourcing from expansion into other natural systems lead to a decrease of the land use CO₂ emission sources by 83% between 2020 and 2100. Sequestration into newly grown forested land and bioenergy plantations biomass also increases the carbon sink which leads to a net sink of CO₂ in the land sector of -4.3 GtCO₂/year by the end century. Overall, the net contribution of the land use sector decreases from emissions of 10.2 GtCO₂-eq/year down to a net sink of -0.9 GtCO₂-eq/year by 2100.

Supplementary Table 31. Agriculture and land use emissions in the LED scenario

		2020	2050	2100
CH ₄ Emissions Agriculture and LULUCF	(Mt CH ₄ /yr)	143	91	66
N ₂ O Emissions Agriculture and LULUCF	(kt N ₂ O/yr)	7631	6830	5664
CO ₂ Emissions Agriculture and LULUCF	(Mt CO ₂ /yr)	4382	-1902	-4260
Total Net GHG Emissions Agriculture and LULUCF	(Mt CO ₂ -eq/yr)	10231	2408	-922

Comparison of land use related variables with non-LED scenario. We compare the results on land use and GHG emissions with a same scenario of 1.5 degree stabilisation (RCP1.9) without Low Energy Demand, based on traditional SSP2 assumptions⁴². Differences for GLOBIOM land use results are presented in Supplementary Table 32, for the years 2050 and 2100 (LED scenario minus SSP2-RCP1.9 scenario). One can observe that the LED scenario has considerable impacts on the development of land use, in particular saving very large areas of cropland (-112 Mha by 2050) and managed forest (-523 Mha by 2050) usually dedicated to bioenergy production. As a consequence, more land can be returned to nature through natural forest (+535 Mha by 2050) and other natural land (+48 Mha). Long term results by

2100 are extrapolating these findings, with larger area savings (-1,662 Mha of managed forest less and -446 Mha of cropland). Such land use differences reduce considerably the pressure on natural resources, in particular overexploitation of forest resources.

When comparing GHG emissions, the dynamics is found different depending on the time horizon. By the mid-century, agricultural and land use change emissions are found higher by 763 MtCO₂-eq/yr in the LED scenario compared to SSP2-RCP1.9. Two reasons explain this trend. First, the LED scenario includes sustainable diet consumption, which implies in some regions higher levels of production for agricultural products compared to a traditional SSP2-RCP1.9, and higher related emissions (+281 MtCO₂-eq/yr for non-CO₂ emissions in 2050). Additionally, lower expansion of crops and forest plantations for bioenergy leads to a lower C sink compared to SSP2-RCP1.9 (sink effect is 482 MtCO₂/yr lower). However, in the longer run, the low management of forest leads to greater carbon accumulation compared to intensively managed forest, and the land use sink becomes larger by 2100 for the LED scenario (782 MtCO₂/yr larger). As a result, the LED scenario leads to lower net emissions for agriculture and land use change by 2100 (-124 MtCO₂/yr).

Supplementary Table 32. Difference between LED scenario and SSP2-RCP1.9 scenario.

LED scenario -- SSP2-RCP1.9 scenario					
Land use change (Mha)			Emissions Agriculture and LULUCF (MtCO ₂ -eq/yr)		
	2050	2100		2050	2100
Cropland -energy crops	-112	-446	CH ₄	125	275
Forest managed	-523	-1662	N ₂ O	156	383
Natural forest	535	1736	CO ₂	482	-782
Afforestation and reforestation	5	48			
Pasture	5	114	Total Agriculture and LULUCF	763	-124
Other natural land	48	107			

Supplementary Note 12

Implications of the LED Scenario for Sustainable Development Goals. The LED scenario outcomes translate into important benefits for the 17 UN Sustainable Development Goals (SDGs) especially when compared to other scenarios. The main text (Figure 6) summarises how LED scenario outcomes support SDGs on poverty, hunger, health, energy, climate and oceans, and land. Here we provide additional information on:

- SDG1: Poverty and SDG2: Hunger
- SDG1: Poverty alleviation and achieving decent living standards in the LED scenario
- SDG3: Health
- SDG7: Energy
- SDG12: Responsible Consumption and Production
- SDG13: Climate and SDG14: Ocean

SDG 1: Poverty and SDG2: Hunger. Both poverty and hunger are multi-dimensional, involving important distributional aspects which could not be addressed in LED. However LEDs quantitative scenario outcomes provide positive contributions to both SDGs. Quantitative estimates of minimum per capita requirements for 'decent living standards' in the Global South provide a robustness check of poverty-alleviation and hunger outcomes. The LED scenario meets or significantly exceeds minimum thresholds for all major activity variables including residential floor space, appliances, mobility, food and material goods (see discussion below). Resulting energy demand in the Global South is around 150 EJ in 2050, equivalent to 21 GJ/capita. This is in line with the estimated range of energy required to ensure decent living standards of 12 - 26 GJ/capita³⁹. However, the amount of energy services this level of final energy can provide would be significantly higher in the LED scenario as energy-service efficiencies are strongly improved (relative to the current technologies and practices on which the decent living standards are calculated).

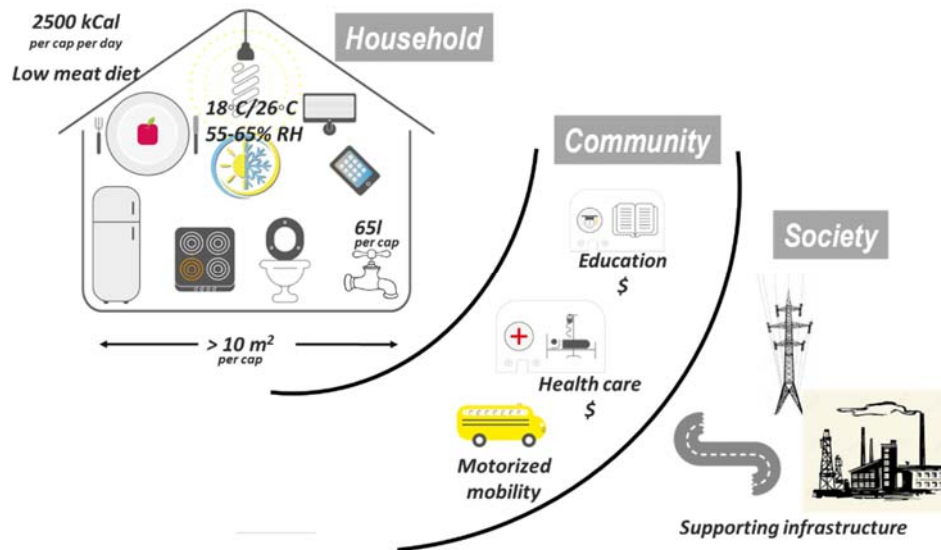
LED also assures ample 3130 kcal/day/capita food provision which is much more favourable than in comparable stringent climate mitigation scenarios (see Figure 6 panel **a** in Main text). LEDs low energy demand, coupled with structural changes in energy end-use and supply, mitigate against large-scale land-use conflict between food and bioenergy and negative emission technologies that characterize more supply-side oriented mitigation scenarios. The strong evidence of poverty and hunger alleviation in the LED scenario does not take into account potential within-country distributional inequality.

SDG1: Poverty alleviation and achieving decent living standards in the LED scenario. The LED scenario satisfies all of the minimum required activity levels associated with decent living standards (see Supplementary Note -2, and Supplementary Table 33 and Supplementary Figure 23). By 2050, households in the Global South have an average floorspace of 29 m² per capita, compared to a minimum threshold of 10 m². The pervasive diffusion of granular end-use technologies in the LED scenario lead to all households having at least one refrigerator, washing machine, and space conditioning and water heating equipment. Annual travel demand in the Global South is 9,700 km per capita, well above the minimum threshold of 7,000 km. Rapid electrification of the vehicle fleet and phase out of fossil fuels and traditional biomass reduces health risks from air pollution. The other elements of a DLS, such as education and health, are not explicitly addressed in the LED scenario, but their associated energy requirements fall within the general category of industrial energy demand.

In summary, the activity levels assumed for residential buildings in the LED scenario are sufficient to comfortably provide a DLS and more to all. The remaining question is whether the energy requirements supporting these activities are reasonable in the LED scenario.

Supplementary Table 33. Comparison of LED scenario outcomes with minimum acceptable activity levels enabling decent living standards (DLS)

	Decent living standards per capita	LED scenario outcomes per capita in the Global South by 2050
Thermal comfort	10 m ² floorspace	29 m ² floorspace
Consumer goods	fridge, TV, phone	24 devices per household
Mobility (p-km)	7,000 passenger-km per year	7,600 passenger-km per year
Food	2,500 calories per day	3,100 calories per day



Supplementary Figure 23. Decent living standard requirements. Values are suggestive. See Rao & Min³⁹ for details. Temperature and relative humidity (RH) are winter and summer comfort standards respectively.

Does energy demand in the LED scenario ensure people can afford a decent life, in accordance with the decent living standards (DLS) set out previously (see Supplementary Note 2)? In the LED scenario, building end-use demand is derived bottom-up from end-use services, and combined with projections of technological advancements in end-use appliances to give energy demand. Energy demand for appliances (television, refrigerator, cook stoves and cell phones) are by definition accounted for in the LED scenario. What remains are residential thermal comfort requirements, and the indirect (industrial) energy needs associated with: constructing and operating the ‘back-end’ infrastructure to support DLS, including residential buildings, utilities (water, sanitation, electricity), and food production systems; manufacturing the appliances, vehicles and transportation systems; and delivering DLS services outside the home, such as education and health.

Basic comfort energy needs. The energy required to keep homes within the comfort range of ~18 degrees C in winter and ~26 degrees in summer depends on prevailing weather conditions. Estimating these energy requirements would require a global bottom-up, spatially explicit calculation of heating and cooling energy for this particular comfort standard. This is beyond the scope of this study. However, in recent work, Mastrucci & Rao¹²⁶ conduct precisely this analysis to calculate cooling and heating energy requirements for India⁴². India spans five climatic zones, including hot-dry and warm-humid, the latter of which is the most energy-intensive due to the need for frequent air conditioning to reduce humidity to comfortable levels. To a rough approximation, these results bound the average space conditioning needs in the Global South. In that study, the authors estimate that cooling requires annual useful energy of about 30 MJ/m² in the warm-humid zone, and as little as ~15 MJ/m² in the cold zone. For heating a modest amount of water for bathing (30

litres/cap/day) to 40 °C every day would require an additional 0.66 GJ/cap in the cold zone and 0.4 GJ/cap in warm-humid zones¹. These results can be interpreted as 66 MJ/m² and 40 MJ/m² respectively, since each person occupies 10 m² in the DLS. Thus, in total on average approximately 100 MJ/m² of useful energy would suffice to provide space conditioning needs in a DLS for a country like India, using current technology.

In comparison, the average thermal useful energy assumed in the LED scenario for the Global South is about 52 MJ/m² (see Supplementary Notes 3 and 7), but for much larger homes (~30 m²/cap) than is minimally acceptable for DLS. One can interpret the LED scenario as comprising wealthy households that occupy large but high-tech (and therefore low-energy) homes that reduce demand to below 50 MJ/m², and lower income households that live in smaller but less insulated homes that consume 100 MJ/m², of the kind simulated in the Mastrucci & Rao¹²⁶ study using current technology and building construction methods.

For the Global North, whose space conditioning energy demand is dominated by heating, benchmarks from current standards for new buildings, such as the Energy Performance Building Directives (EPBD, 2010/31/EU) of the European Union, serve as useful comparisons. Best practices today that represent only the stock turnover can serve as a standard for the entire building stock in 2050 in an LED world.

The minimum performance requirements of the EPBD range between 238 MJ/m² to 389 MJ/m² final energy for heating and cooling. With best practice technologies, this translates to a useful energy of 216 MJ/m² to 350 MJ/m². In comparison, the LED scenario assumes useful energy levels of ~172 MJ/m² (see Supplementary Notes 3 and 7). However, total floorspace area (homes plus public and commercial buildings) in the Global North are assumed to be much larger than today (53 m²/cap vs ~41 m²/cap today). The total energy this represents would be sufficient to serve homes of the kind that are built today (both in terms of size and energy standards), or homes larger than today that have higher standards of insulation and equipment efficiency. Thus, the expectation is that the norm for buildings in 2050 in the LED scenario would be at worst that of new buildings today.

Industrial energy demand. How much energy is required to build the infrastructure to support and deliver DLS to all in the Global South, and does the LED scenario allow for that growth? In a recent study, Mastrucci & Rao¹²⁶ estimate this embodied energy for India and Brazil using lifecycle and input-output analysis, where appropriate, for each DLS component. India can be considered an average country in the Global South, while Brazil is among the richest countries, which therefore serves as a proxy for the most industrialized, and therefore energy-intensive parts of the Global South. The energy intensities of construction and energy conversion represent today's technologies, and therefore are likely to be higher

¹ Assuming an electric resistance no-storage heater with 80 percent efficiency.

than the energy needs to deliver the same services in 2050. Similarly, the transport system is assumed to have similar modal patterns as today, and therefore also overestimate energy needs in 2050.

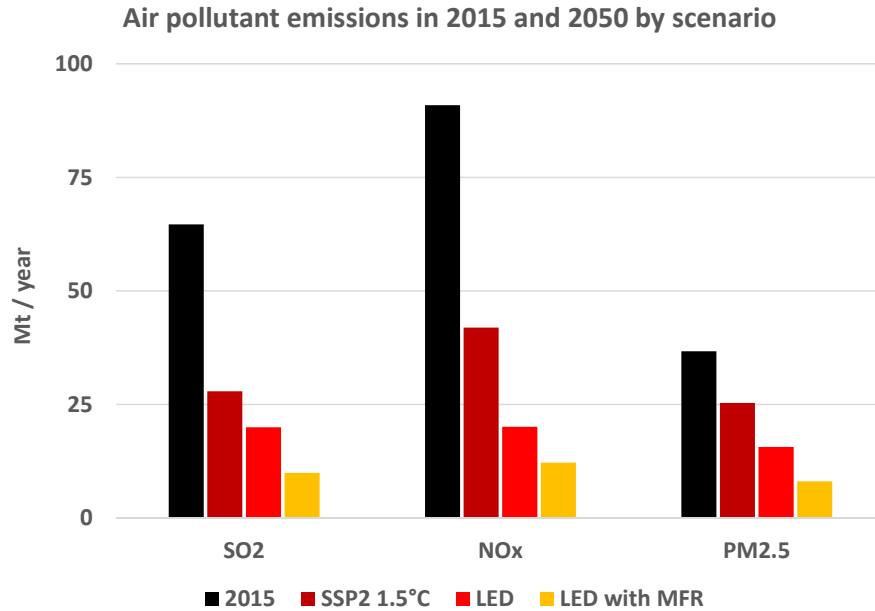
On this basis Rao, Mastrucci & Min¹²⁷ estimate that in India and Brazil respectively 12 GJ/cap and 26 GJ/capita of final energy would be required to provide DLS. This figure includes the appliance and space conditioning energy requirements discussed above. This translates to a total of 78 - 161 EJ for the population of the Global South in 2050, based on current industrial technologies. In comparison, the LED scenario estimates final energy use of about 150 EJ in the Global South. This is comparable to the extreme end of the requirement, which allows for the possibility that all countries in the Global South catch up to the leaders in terms of average living standards. Furthermore, since the LED scenario represents a more advanced, energy-efficient global economy, the services this amount of energy would deliver on average would allow for a comfortable amount of head room above basic DLS even in the most advanced economies in the Global South. As discussed earlier, this headroom is also reflected in the average size of dwellings, travel demand, and appliance ownership assumed in the LED scenario. This is realistic, since one can expect that future society would have a distribution of income that afford at least a subset of inhabitants more than the basic DLS.

SDG 3: Health. The major implications of the LED scenario for human health is a three-fold reduction in air pollutants, which is the major energy-related cause of mortality¹²⁸. Local air pollutants from indoor combustion of traditional biomass fuels are eliminated as these are completely phased out in LED by 2030. Air pollutants like black carbon or sulphates which are co-emitted during combustion processes and lead to respiratory diseases¹²⁹ are also reduced substantially with the rapid phase out of fossil fuels (see Figure 6 panels **b** and **c** in Main text).

Air quality and health impacts of LED were quantified by linking MESSAGE-GLOBIOM with the Greenhouse Gas and Air Pollution Interactions and Synergies (GAINS) model. GAINS projects emissions of air pollutants while considering air pollution policies and standards, computes the ambient concentrations of fine particles and associated premature mortality rates¹³⁰. While emissions are calculated globally, ambient concentration calculations in GAINS focus on certain geographical areas (The set regions include Asia, EU28, Other Europe, and G20 Other, the latter comprising Canada, Russian Federation, Turkey, South Africa, Brazil, Argentina, Australia, and United States of America. Each region is represented by individual countries or provinces). Covered GAINS regions represent a population of about 4.8 billion in 2015 or about two-thirds of the world population.

The significant energy demand decrease in the LED scenario in 2050 is associated with health co-benefits, in line with earlier studies^{131,132}. The major implication is that emissions of key air pollutants – fine particles (PM_{2.5}) and its precursors, e.g., black carbon (BC), sulfur dioxide (SO₂), nitrogen oxides (NO_x) - are reduced substantially due to the phase-out of combustion processes on the demand- and supply-side of the energy system (see Figure 6 panels **b** and **c** in Main text). Emissions of PM_{2.5}, the major energy-related cause of mortality¹³³, are more than halved globally between 2015 and 2050 in the LED scenario, and reduced to about one-third in case of SO₂ and NO_x. Indoor air pollution is practically eliminated as the combustion of traditional solid fuels is completely phased out in LED by 2030.

As shown in Supplementary Figure 23, low-demand strategies assumed in LED are more efficient in avoiding air pollutants than the scenario attaining the same 1.5°C climate stabilization target while focusing on a mix of supply- and demand-side solutions (SSP2 1.5°C). This 1.5°C scenario without LED assumptions is based on the SSP2 marker scenario⁴², implements current climate policy until 2020 and thereafter transitions to achieving a cost-optimal carbon budget of about 400 GtCO₂ until 2100 consistent with the 1.5°C target^{134,135}. In such case, in 2050, global emissions of SO₂, PM_{2.5} and NO_x are 1.5 to 2 times higher than in LED. If the low-demand transformations of the energy system are combined with an adoption of policies to achieve a maximum feasible reduction (MFR) of emissions, air pollutants are further reduced by 40-50%.



Supplementary Figure 24. Global air pollutant emissions in 2015 and in 2050 for selected scenarios.

Methodology for health impacts calculation. GAINS estimates ambient concentration levels of PM_{2.5} from the emissions of PM_{2.5} and its precursor pollutants using reduced form atmospheric transfer coefficients which have been developed as a linear approximation to full atmospheric chemistry transport model simulations^{130,136}. Concentrations are calculated at a resolution of 0.125° longitude × 0.0625° latitude (roughly 7×7km) for Europe, and at a resolution of 0.5° × 0.5° outside Europe. However, to reflect local concentration gradients in cities (“urban increments”), concentrations in cities >100,000 inhabitants are calculated explicitly beyond grid resolution, using a downscaling methodology which takes into account local variations of PM emissions from low-level sources such as road transport, cooking and heating.

Calculated concentration levels are combined with high-resolution gridded population data to calculate population exposure and associated health impacts. Premature deaths resulting from exposure to ambient PM_{2.5} concentrations are estimated following the methodology of the World Health Organization (WHO) for assessment of ambient air pollution for regions outside Europe¹³⁷, and the methodology recommended by WHO-Europe for Europe^{138,139}.

Premature deaths d_j in region j are estimated as

$$d_j = \frac{\sum_i p_{ji} (RR_i - 1)}{1 + \sum_i p_{ji} (RR_i - 1)}$$

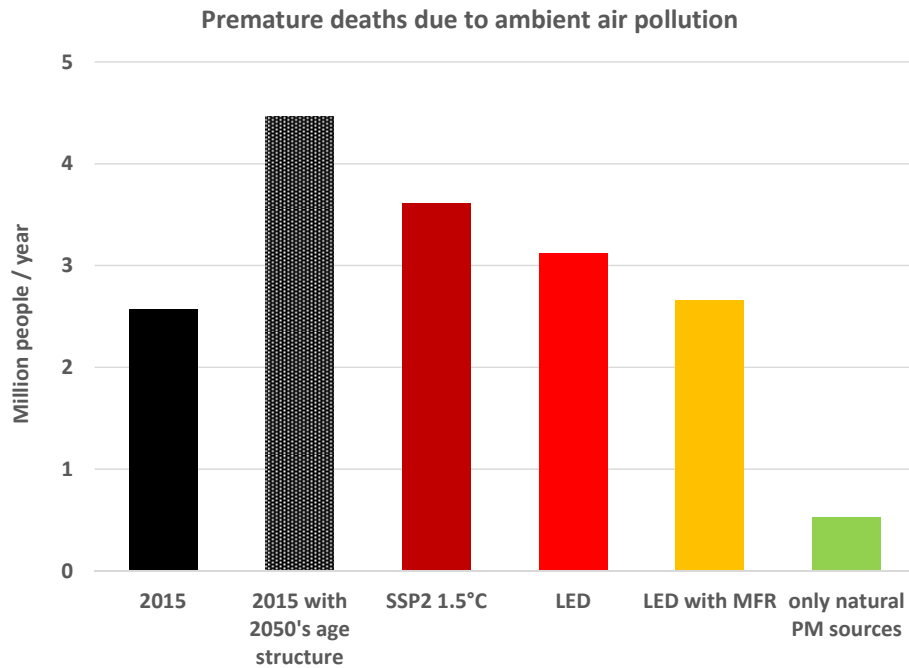
With RR_i the relative risk due to $PM_{2.5}$ in grid cell i and p_{ji} the fraction of population of region j living in grid cell i . The most significant difference between the methodologies used for Europe and non-European regions are the exposure-response relationships used to derive relative risk. While WHO-Europe recommends a linear dose-response function relating ambient $PM_{2.5}$ concentrations to all-cause mortality based on a large number of epidemiological evidence under European conditions, the integrated exposure-response functions (IERs) used for non-European regions (developed in the context of the Global Burden of Disease 2013 (GBD) study¹⁴⁰), are disease and partly age-specific and have a non-linear shape, reflecting evidence from active and passive smoking suggesting that the relative risk flattens off at higher $PM_{2.5}$ exposure levels¹⁴¹. The IERs quantify relative risk from five respiratory and cardiovascular diseases (ischemic heart disease, chronic obstructive pulmonary disease, acute lower respiratory infections, lung cancer, and stroke).

As the GBD methodology makes use of disease and age specific baseline mortality rates, our results are sensitive to demographic changes, particularly population aging. For the projection, age specific projected deaths are taken from the medium growth scenario of the UN World Population Prospects 2010¹⁴². Cause and age specific deaths for the year 2010 were obtained from the estimates of the GBD 2013¹⁴⁰. In the absence of better information, we use the assumption that the relative shares of individual causes of death within total deaths of a given age group remain unchanged in the future.

Estimates of health impacts. Due to the strong aging foreseen in population projections by 2050, the total number of annual deaths increases in the future, and so do the projected premature deaths due to air pollution, even under stabilized or decreased ambient air pollution levels in the policy scenarios (Supplementary Figure 24). In relative terms, however, reductions in air pollution imply significantly lower share of people dying because of insufficient air quality. To separate the effects of demographic changes from effects of emission changes, we construct a hypothetical case with fixed 2015 $PM_{2.5}$ levels and 2050 population structure, to which the LED scenario is compared (see Supplementary Figure 25).

Compared to this counterfactual case for constant 2015 emissions with 2050 population, the emission reductions by 2050 in the LED scenario lead to a reduction of premature deaths by 1.4 million cases per year, or roughly 30%. The reduction in premature mortality is disproportionately smaller than the reduction in emissions due to the non-linearity of the IERs, which show strong responses to concentration changes only at very low ambient PM levels. Further reductions of emissions by applying end-of-pipe control technologies to the MFR extent would further reduce the burden from ambient air pollution by more than 0.45 million premature deaths per year, or 40% of the total. Considering that $PM_{2.5}$ concentrations from natural sources are estimated to contribute more than 500,000 cases per year, the reductions in the LED scenario combined with the MFR emission controls correspond to about 50% of the total potential for health benefits associated with

reductions in anthropogenic emissions. It is also noted that the health benefits of LED are 15% larger in 2050 compared to a more supply-side climate mitigation scenario (SSP2-1.9) without the low demand characteristics of LED (SSP2 1.5°C).



Supplementary Figure 25. Premature deaths from ambient air pollution ($PM_{2.5}$) in 2015 and in selected scenarios, 2050.

SDG 7: Energy. The LED scenario meets or furthers the SDG 7 goal of universal access to clean energy and electricity and also meets the goal for the expansion of renewable energies and above all energy efficiency. Traditional biomass as household fuel is phased out completely (see Figure 6 panel **d** in Main text). Given its rapid electrification and a doubling of electricity use in the Global South between 2020 and 2050, electricity access for all can be easily provided from an energy systems perspective, but distributional and infrastructural aspects could not be examined. Insufficient data are available for assessing LED with respect to the SDG 7 goal of “affordable energy”. However, various outcomes of the LED scenario are consistent with an interpretation of affordability, including significant cost reductions in standardised, granular technologies and dramatic improvements in end-use efficiencies.

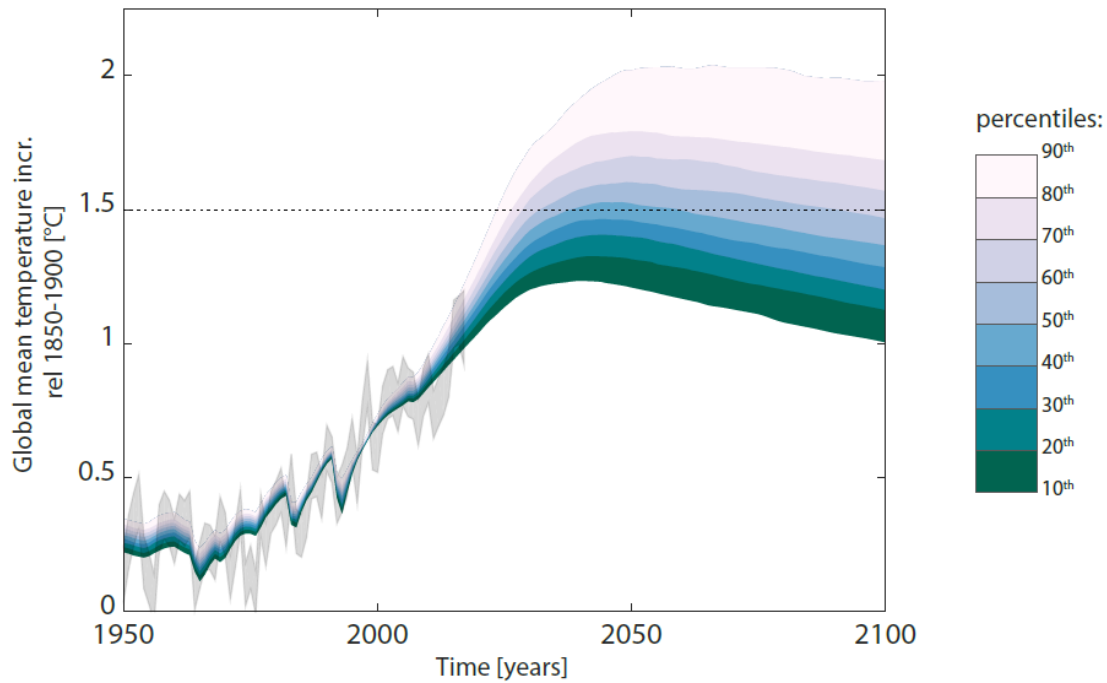
SDG 12: Responsible Consumption and Production. SDG 12 best describes the overall conceptual framing and the transformation pathways of the LED scenario as it emphasises the critical interdependence of demand and supply. The LED scenario shows clearly how transformative improvements in energy end-use services make more feasible corresponding transformations in the energy supply. The LED scenario also includes an analogous approach for materials use and production, coupling demand-side dematerialisation with more efficient industrial production.

SDG 13: Climate and SDG14: Ocean. The LED scenario keeps the increase in global mean temperature to below 1.5°C throughout the 21st century (see Supplementary Figure 6 panel e in the Main text and also separate discussion on SDG13 below) with a greater than 60% probability of staying below 1.5°C by 2100. Rapid end-use transformation and widespread deployment of granular supply technologies in the LED scenario result in rapid emission reductions to 2050, and a net negative balance between residual emissions and natural sinks thereafter. These rapid near-term emissions reductions of CO₂ lead by mid-century to atmospheric CO₂ concentrations that return roughly to present levels (see Supplementary Figure 6 panel f in Main text). This contributes to minimizing the impacts of ocean acidification, a target part of SDG 14 on ocean conservation. This is in stark contrast to other stringent mitigation scenarios which generally show an initial overshoot of the 1.5°C warming threshold, counterbalanced later-on via a massive reliance on highly uncertain large-scale negative emission technologies which face both biophysical and economic limitations (as demonstrated by Rogelj et al.¹²² and Smith et al.¹⁴³).

The low energy demand achieved in the LED scenario, allows emissions to be reduced rapidly. This leads to peak global mean temperature increase to be kept to 1.5°C relative to pre-industrial levels (here approximated by expressing warming relative to the 1850-1900 period). We use a reduced complexity carbon cycle and climate model MAGICC (see Method) in a probabilistic setup^{144,145} to assess the climatic outcomes of the LED scenario in more detail. This setup is consistent with the one used for the scenario assessment of the Working Group 3 Contribution to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change. We find that peak warming is indeed kept to 1.5°C relative to preindustrial levels in the LED scenario, with a gradual temperature decline thereafter. By 2100, global mean temperature increase is estimated at 1.4°C. This is equivalent with limiting maximum warming to below 1.5°C with a probability of about 45% (rounded to the nearest 5%, see Supplementary Figure 26) and to below 2°C with a probability of about 90%. By 2100, these probabilities increase further to 60% and 90%, for 1.5°C and 2°C, respectively. The uncertainty ranges shown here represent the spread in global mean temperature outcomes due to the systematic variation across an 82-dimensional parameter space of climate response, gas-cycle and radiative forcing parameters (see Meinshausen et al.¹⁴⁴). In Figure 6 of the main text, the median response of this distribution is reported. Other parametrisations of the MAGICC model exist, in particular, a deterministic setup which was used for the development of the Representative Concentration Pathways (RCPs)¹⁴⁶. The latter setup provides deterministic temperature projections which lie roughly at the 60th percentile of the probabilistic distribution of outcomes used to assess the climate outcomes of the LED scenario.

The assessment which MAGICC also allows to estimate the atmospheric CO₂ concentrations implied by the LED scenario. The LED scenario halts the increase in atmospheric CO₂ resulting in first a stabilization and then a decline in concentrations. Changes in atmospheric CO₂ are the dominant cause of observed changes in the chemistry of surface waters^{147,148}. By strongly

limiting the increase of atmospheric CO₂ (see Figure 6 panel f in Main text) the LED scenario contributes to the achievement of some of the targets of SDG14 on limiting the impacts of ocean acidification.



Supplementary Figure 26. Probabilistic temperature assessment of the LED scenario. Values are expressed as global mean temperature increase relative to preindustrial levels, here approximated by the 1850-1900 period. Grey shaded features are observed historical temperatures from HadCRUT4¹⁴⁹. The uncertainty ranges shown here represent the spread in global mean temperature outcomes due to the systematic variation across an 82-dimensional parameter space of climate response, gas-cycle and radiative forcing parameters (see Meinshausen et al.¹⁹).

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