



Crop intensification, land use, and on-farm energy-use efficiency during the worldwide spread of the green revolution

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We analyzed crop production, physical inputs, and land use at the country level to assess technological changes behind the threefold increase in global crop production from 1961 to 2014. We translated machinery, fuel, and fertilizer to embedded energy units that, when summed up, provided a measure of agricultural intensification (human subsidy per hectare) for crops in the 58 countries responsible for 95% of global production. Worldwide, there was a 137% increase in input use per hectare, reaching 13 EJ, or 2.6% of the world's primary energy supply, versus only a 10% increase in land use. Intensification was marked in Asia and Latin America, where input-use levels reached those that North America and Europe had in the earlier years of the period; the increase was more accentuated, irrespective of continent, for the 12 countries with mostly irrigated production. Half of the countries (28/58), mainly developed ones, had an average subsidy >5 GJ/ha/y (with fertilizers accounting for 27% in 1961 and 45% in 2014), with most of them (23/28) using about the same area or less than in 1961 (net land sparing of 31 Mha). Most of the remaining countries (24/30 with inputs <5 GJ/ha/y), mainly developing ones, increased their cropped area (net land extensification of 135 Mha). Overall, energy-use efficiency (crop output/inputs) followed a U-shaped trajectory starting at about 3 and finishing close to 4. The prospects of a more sustainable intensification are discussed, and the inadequacy of the land-sparing model expectation of protecting wilderness via intensified agriculture is highlighted.

EROI | Jevons paradox | land sharing | land sparing | water–energy–food security nexus

The type of agricultural technology developed after the Second World War, known as the “green revolution,” came under early environmental criticism (1). Besides reliance on harmful first-generation pesticides and soil deterioration caused by excessive fertilization and compaction and erosion linked to the use of heavy machinery, it was clear from the onset that the technologies required to realize the genetic potential of new crop varieties and hybrids also had a strong dependence on fossil fuels. *Eating Oil* (2) was the revealing title of a book published after the energy crisis of the 1970s (around the time of the US oil production peak). By then, the work of pioneers such as Odum (3) and Pimentel et al. (4) had already highlighted that this form of agriculture was unsustainable and was able to attain high yields only thanks to the energy subsidies represented by equipment, fuel, chemicals, and other supplies. They suggested a straightforward way of assessing the energy-use efficiency (EUE) of production systems: their output–input ratio, i.e., the relation between the solar energy fixed by crops (as chemical energy in grains and other usable products) and the input energy embedded in all human supplies, leaving sunlight aside. This metric is equivalent to the first type of energy return on investment (EROI) of Pelletier et al. (5): the energy return in human-edible food or usable product on the industrially mediated energy investment.

Early analyses showed that EUE decreased as intensification (supplies used per unit area and time) increased, as expected by the economic diminishing-return theory (6). Most of the later

work that we are aware of has focused on a particular country, product, and/or production technology, such as conventional vs. organic (e.g., refs. 7–12), and although some performed international comparisons (13–15), apparently none has searched for long-term, global trends. Otherwise, it is difficult to understand why, even when some analyses point to an increase in EUE (e.g., refs. 11 and 15–18), there are authors that keep citing early work such as Pimentel et al. (4) as the basis for claiming unavoidable larger increases in supplies' use than in production. Reviews by Woods et al. (19) and Pelletier et al. (5) covered the entire food system and highlighted a paucity of data for developing countries. Our goal was to address these gaps for crops. An analysis of livestock production was out of our reach, because it would have entailed tracking the (direct and indirect) use of plant products for fodder within as well as between countries.

Taking advantage of FAOSTAT, the global database that the United Nations Food and Agricultural Organization started in 1961 (20), complemented by the best available energy conversion factors [ECs; energy required (MJ/mass) for the production process of inputs, and the energy content of crop products], we seek to find discernible trends for on-farm crop EUE: Are there consistent patterns in the use of machinery, fuel, and supplies (translated into energetic subsidies) by continent and country? Did those countries with higher intensification (inputs per unit area per year) in fact release land from agricultural use, as predicted by Norman Borlaug's land-sparing hypothesis (21)? Did those countries that increased agricultural area (i.e., that extensified production) keep lower intensification levels along the lines of the land-sharing, wildlife-friendly farming model hypothesis (22)? How many edible (or, more generally, usable) calories are we getting out of every calorie spent in our

Significance

Global crop production tripled during the last 50 years, mainly by an increase in yield (production/area). We show that the energy embedded in the main oil-based inputs (machinery, fuel, and fertilizers) increased worldwide at a rate at first larger, but in the last decades slower, than crop production, resulting in a recent overall improved energy-use efficiency (EUE). This was explained by advances in the nitrogen fertilizer industry, irrigation, and other technologies and perhaps some environmental changes. Our results fit the “Jevons paradox”: Efficiency gains, both for EUE and land (yield), did not lead to resource savings. Just as increasing production does not guarantee alleviating hunger, technologies make land (and biodiversity) savings possible, but realizing them depends on bold political decisions.

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croplands, and how much has this ratio changed over time? We wonder whether technological change (improved genetic materials, better agronomic practices, and exploiting the synergy between the two; see ref. 23) and technology adoption were sufficiently strong to counteract the negative effects on EUE of (i) possible diminishing returns in crop energy efficiency and (ii) decreasing average soil fertility by cultivating additional sub-optimal areas and by deterioration of high-quality soils. We made an effort to factor out energy efficiency improvements in the manufacturing industry, which would have acted as a confounding force, in particular those in industrial nitrogen (N) fertilizer production (19).

Results and Discussion

Intensification: Physical Data Analysis. The use of land, machinery, and supplies increased globally during 1961–2014 but at very different rates and with large differences between continents. N fertilizer was the supply with the largest worldwide increase (ca. 955%), and the smallest change was that of land use (10%) (Table 1). As all inputs, including irrigation water, increased for each continent at a faster pace than land did, intensification was the norm. Besides, as global crop production more than tripled during the period, these rates of fertilizer-use increase imply a marked decline in crop nutrient-use efficiency, particularly for N; in other words, there were diminishing returns on a mass basis. A comparison between continents on an energy and per-area basis is included in the next section. However, from the data in Table 1 it is clear that the relative leap in input-use during the period was much smaller for North America and Europe than for the rest of the world, which we interpret as those two continents having already embraced green revolution technologies by 1961.

Fertilizer use trends differed among continents and between nutrients. N fertilizers had the lowest relative increase in Europe (threefold) and the highest in Oceania (35-fold). The average amounts applied per hectare also showed remarkable differences: Europe and North America had the highest N use at the beginning of the study period (12.3 and 13.4 kg/ha, respectively) and were outpaced by the mainly irrigated countries (MICs; see *Supporting Information*) at the end of the period; Africa and Oceania, on the other hand, had the lowest N use during all the period (0.9 and 1.3 kg/ha, respectively). Phosphorus (P) and potassium (K) fertilizers showed a smaller relative increase than N ones (three- and fivefold, respectively), but in Latin America and Asia the rate of increase (although not use per hectare) was larger than for N. P fertilizers are based on mined rock, with a foreseeable production peak just a few decades ahead (24). For Europe, the trend of fertilizer increase was far from linear: There was an initial big

increase to fight hunger after World War II, followed by a significant drop as a reaction to the emerging environmental problems (25). Fifty years later, a similar process is perhaps occurring in China (26), which in 2005 accounted for 57% (26.7 Mt) of the N used by the MIC.

Machinery stock (in mass units) and the resultant diesel fuel consumption doubled during the period and also showed large differences among continents (Table 1). Africa and Oceania had the smallest machinery stock during all the period, while North America and Europe had the largest ones. Asia and the MIC experienced the greatest increase in the machinery stock, 41-fold and 24-fold, respectively. At the global scale, the land area used for agriculture increased by 10% as the result of large increases in Latin America (111%), Africa (58%), Oceania (55%), and Asia (39%) and reductions in Europe (–18%) and North America (–12%). Irrigated land increased at a higher rate than overall land use in all regions, reflecting our classification of countries: in 2014 it was almost 50% in the MICs and less than 10% in the rest of the world as a whole.

Intensification: Energy-Based Analysis. Using the ECs detailed in *Supporting Information*, we could analyze in a common unit the contribution of fertilizers, fuel, and machinery (both construction and maintenance) to crop production for each country and continent. These inputs were generally under 5 GJ/ha/y for the beginning of the study period (except for North America) and above 5 GJ/ha/y toward the end (except for Africa) (Fig. 1). Fertilizers as a proportion of total energy input increased from 23–30% to 41–48%, and thus machinery plus fuel decreased from 70–77% to 52–59%, depending on the lifespan assumption (Fig. S1). During the 1961–2014 period, the spread of intensification was noticeable across Latin America, MICs, and Asia, while it had already happened in North America and Europe (reaching a maximum there around 1990) and has not reached Africa (Fig. 1). Oceania behaved qualitatively as North America but with much lower absolute input values because of a poorer soil endowment. Crop production increased worldwide, both on an absolute and per-area basis, but with different rates and tempos among continents compared with their growth in inputs. This led to contrasting trajectories in EUE but with generally constant or decreasing trends for those continents starting at high input levels and generally increasing trends for those starting at low input levels (Fig. 1). Thus, overall, except for Africa, EUE converged from initial values ranging between 1 and 20 toward the vicinity of 3 and 4, consistent with an almost complete globalization of agricultural inputs and practices. Our EUE estimate, translated to the common “cradle-to-gate” language,

Table 1. Agricultural land and inputs used by continent at the beginning (1961) and end (2014) of the period studied

Continent	N fertilizer, Mt		P fertilizer, Mt		K fertilizer, Mt		Machinery, Mt		Fuel, Mt		Cultivated land, Mha		Irrigated land, Mha	
	1961	2014	1961	2014	1961	2014	1961	2014	1961	2014	1961	2014	1961	2014
Africa	0.07	1.08	0.15	0.52	0.04	0.29	1.02	1.3	0.51	0.65	76	120	2	5
Asia	0.34	9.23	0.24	3.28	0.04	3.84	0.85	35.45	0.32	13.29	115	161	15	40
MIC	2.56	55.77	1.34	24.82	0.85	17.17	3.1	75.64	1.55	37.82	341	361	94	178
Europe	4.37	12.63	4.65	2.83	4.49	2.91	40.2	59.74	17.59	26.14	353	288	14	13
Latin America	0.28	7.32	0.27	6.42	0.14	6.26	2.85	14.71	1.25	6.43	83	175	5	18
North America	3.16	15.26	2.73	5.15	2.17	4.97	96.31	87.31	32.1	29.1	235	208	20	27
Oceania	0.04	1.4	0.59	0.91	0.05	0.23	4.93	5.24	1.64	1.75	30	47	1	3
Total	11	103	10	44	8	36	149	279	55	115	1,234	1,361	151	284
Rate of increase		×9		×4		×5		×2		×2		×1.1		×1.9

Continents exclude 12 MICs: Bangladesh, Chile, China, Egypt, India, Italy, Japan, Nepal, The Netherlands, Pakistan, Peru, and South Korea. Data for fertilizers, machinery for 1961, cultivated land (arable land, including irrigated land and permanent crops) are from FAOSTAT (20). Data for machinery for 2014 are from refs. 20, 53, and 54; also see *Supporting Information*. The data for diesel fuel are the authors' estimates using ref. 54; also see *Supporting Information*.

considering that many available proven technologies (including nonappropriate ones) have not been adopted yet (50, 51). (However, see ref. 52 for a concerned view on the slow rates of genetic improvement, development of farm-ready cultivars, and farmer's adoption.) It is also encouraging to see that intensification alone could be able to meet the projected food demand (e.g., ref. 37), but this would not necessarily mean alleviating hunger if waste is not reduced and, above all, if income equity remains at its current unacceptable levels (or if other means are not found to improve food distribution, ominously called "access"). Intensification will not avoid environmental impacts if we are not watchful and proactive regarding chemical, edaphic, and biological risks and if policy interventions to avoid simultaneous extensification are lacking. No matter how sustainable future gains in productivity per unit of land may be, in the current business-as-usual atmosphere they will not prevent further clearance and associated detrimental changes.

Materials and Methods

The countries listed in Fig. 4, responsible for 95% of the production of the 10 main crops (on an energy basis) in 2005, were selected for our analysis

using the FAOSTAT database (ref. 20; last accessed, May 2017). From the same database we obtained crop production, land use, machinery, and fertilizers consumption data for each of those countries during 1961–2014. The physical quantities for outputs and inputs (mass per year) were converted to energy units using ECs from the literature. A great variability among the ECs used in agricultural energy analyses was found, so we detail our choices and their rationale in *Supporting Information*. There we use sensitivity analysis to show that the most important source of uncertainty was the choice of machinery lifespan. Since we were not able to estimate ECs for irrigation, countries in which most of their 2005 production included watering (irrigated area >30%) were treated separately as MICs: Bangladesh, Chile, China, Egypt, India, Italy, Japan, Nepal, The Netherlands, Pakistan, Peru, and South Korea.

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- Carson R (1962) *Silent Spring* (Houghton Mifflin Harcourt, Boston).
- Green MB (1978) *Eating Oil* (Westview, Boulder, CO), 205 pp.
- Odum HT (1971) *Environment, Power and Society* (Wiley, New York), 336 pp.
- Pimentel D, et al. (1973) Food production and the energy crisis. *Science* 182:443–449.
- Pelletier N, et al. (2011) Energy intensity of agriculture and food systems. *Annu Rev Environ Resour* 36:223–246.
- Steinhart JS, Steinhart CE (1974) Energy use in the U.S. food system. *Science* 184:307–316.
- Alluvione F, Moretti B, Sacco D, Grignani C (2011) EUE (energy use efficiency) of cropping systems for a sustainable agriculture. *Energy* 36:4468–4481.
- Dalgaard T, Halberg N, Porter JR (2001) A model for fossil energy use in Danish agriculture used to compare organic and conventional farming. *Agric Ecosyst Environ* 87:51–65.
- Ferraro DO (2012) Energy use in cropping systems: A regional long-term exploratory analysis of energy allocation and efficiency in the inland pampa (Argentina). *Energy* 44:490–497.
- Refsgaard K, Halberg N, Kristensen ES (1998) Energy utilization in crop and dairy production in organic and conventional livestock production systems. *Agric Syst* 57:599–630.
- Uhlir H (1999) Energy productivity of technological agriculture—lessons from the transition of Swedish agriculture. *Agric Ecosyst Environ* 73:63–81.
- Guzmán GI, Alonso AM (2008) A comparison of energy use in conventional and organic olive oil production in Spain. *Agric Syst* 98:167–176.
- Arizpe N, Giampietro M, Ramos-Martin J (2011) Food security and fossil energy dependence: An international comparison of the use of fossil energy in agriculture (1991–2003). *Crit Rev Plant Sci* 30:45–63.
- Conforti P, Giampietro M (1997) Fossil energy use in agriculture: An international comparison. *Agric Ecosyst Environ* 65:231–243.
- Viglizzo EF, Frank FC (2014) Energy use in agriculture: Argentina compared with other countries. *Energy Consumption: Impacts of Human Activity, Current and Future Challenges, Environmental and Socio-Economic Effects*, ed Reiter S (NOVA Science Publishers, New York), pp 77–98.
- Bonny S (1993) Is agriculture using more and more energy? A French case study. *Agric Syst* 43:51–66.
- Swanton CJ, Murphy SD, Hume DJ, Clements DR (1996) Recent improvements in the energy efficiency of agriculture: Case studies from Ontario, Canada. *Agric Syst* 52:399–418.
- Gifford RM (1984) Energy in Australian agriculture: Inputs, outputs, and policies. *Energy and Agriculture*, ed Stanhill G (Springer, Berlin), pp 154–167.
- Woods J, Williams A, Hughes JK, Black M, Murphy R (2010) Energy and the food system. *Philos Trans R Soc Lond B Biol Sci* 365:2991–3006.
- Food and Agriculture Organization (2017) FAOSTAT online statistical service. Available at faostat.fao.org. Accessed May 15, 2017.
- Rudel TK, et al. (2009) Agricultural intensification and changes in cultivated areas, 1970–2005. *Proc Natl Acad Sci USA* 106:20675–20680.
- Fischer J, et al. (2008) Should agricultural policies encourage land sparing or wildlife-friendly farming? *Front Ecol Environ* 6:380–385.
- Fischer RA (2009) Farming systems of Australia: Exploiting the synergy between genetic improvement and agronomy. *Crop Physiology: Applications for Genetic Improvement and Agronomy*, eds Sadras VO, Calderini DF (Academic, San Diego), pp 23–54.
- Cordell D, Drangert JO, White S (2009) The story of phosphorus: Global food security and food for thought. *Glob Environ Change* 19:292–305.
- European Commission (2012) *The Common Agricultural Policy: A Story to Be Continued* (Publications Office of the European Union, Luxembourg), 24 pp.
- Vitousek PM, et al. (2009) Agriculture. Nutrient imbalances in agricultural development. *Science* 324:1519–1520.
- International Energy Agency (2007) *Tracking Industrial Energy Efficiency and CO₂ Emissions* (IEA, Paris), 321 pp.
- Jobbágy EG, Sala OE (2014) The imprint of crop choice on global nutrient needs. *Environ Res Lett* 9:084014.
- Lobell DB, Schlenker W, Costa-Roberts J (2011) Climate trends and global crop production since 1980. *Science* 333:616–620.
- Rowe H, et al. (2016) Integrating legacy soil phosphorus into sustainable nutrient management strategies for future food, bioenergy and water security. *Nutr Cycl Agroecosyst* 104:393–412.
- Audsley E, Stacey KF, Parsons DJ, Williams AG (2009) Estimation of the greenhouse gas emissions from agricultural pesticide manufacture and use (Cranfield University, Cranfield, UK), 20 pp.
- Bruinsma J (2009) The resource outlook to 2050: By how much do land, water and crop yields need to increase by 2050? (FAO, Rome).
- Perfecto I, Vandermeer J (2012) Separation or integration of biodiversity conservation: The ideology behind the “land-sharing” versus “land-sparing” debate. *Ecosistemas (Madrid)* 21:180–191.
- Ellis EC, Ramankutty N (2008) Putting people in the map: Anthropogenic biomes of the world. *Front Ecol Environ* 6:439–447.
- Lambin EF, et al. (2013) Estimating the world's potentially available cropland using a bottom-up approach. *Glob Environ Change* 23:892–901.
- Rockström J, et al. (2009) Planetary boundaries: Exploring the safe operating space for humanity. *Ecol Soc* 14:32.
- Tilman D, Balzer C, Hill J, Befort BL (2011) Global food demand and the sustainable intensification of agriculture. *Proc Natl Acad Sci USA* 108:20260–20264.
- Ejeta G (2010) African green revolution needn't be a mirage. *Science* 327:831–832.
- Stanhill G (1984) Agricultural labour: From energy source to sink. *Energy and Agriculture*, ed Stanhill G (Springer, Berlin), pp 113–130.
- Samberg LH, Gerber JS, Ramankutty N, Herrero M, West PC (2016) Subnational distribution of average farm size and smallholder contributions to global food production. *Environ Res Lett* 11:124010.
- Alcott B (2005) Jevons' paradox. *Ecol Econ* 54:9–21.
- Stevenson JR, Villoria N, Byerlee D, Kelley T, Maredia M (2013) Green revolution research saved an estimated 18 to 27 million hectares from being brought into agricultural production. *Proc Natl Acad Sci USA* 110:8363–8368.
- Millennium Ecosystem Assessment (2005) *Ecosystems and Human Well-Being: Biodiversity Synthesis* (World Resour Institute, Washington, DC).
- Newbold T, et al. (2016) Has land use pushed terrestrial biodiversity beyond the planetary boundary? A global assessment. *Science* 353:288–291.
- Brook BW, Sodhi NS, Bradshaw CJ (2008) Synergies among extinction drivers under global change. *Trends Ecol Evol* 23:453–460.
- Rosenzweig M (2003) *Win-Win Ecology* (Oxford Univ Press, Oxford).
- Kehoe L, et al. (2017) Agriculture rivals biomes in predicting global species richness. *Ecography* 40:1118–1128.
- Fernández RJ (2016) How to be a more effective environmental scientist in management and policy contexts. *Environ Sci Policy* 64:171–176.
- Crouzat E, et al. (2018) Researchers must be aware of their roles at the interface of ecosystem services science and policy. *Ambio* 47:97–105.
- Government Office for Science (2011) Foresight: The future of food and farming; (GOS, London), Final Project Report.
- Andrade FH (2016) *Los Desafíos de la Agricultura* (International Plant Nutrition Institute, Int Plant Nutr Inst, Acassuso, Argentina), 136 pp.
- Hall AJ, Richards RA (2013) Prognosis for genetic improvement of yield potential and water-limited yield of major grain crops. *Field Crops Res* 143:18–33.
- Pawlak J (2017) Regional distribution of the world's tractor stock. *AMA Agr Mech Asia Af* 48:39–44.
- Stout BA (1991) *Handbook of Energy for World Agriculture* (Elsevier, New York), 519 pp.

Supporting Information

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Country Selection

The countries responsible for 95% of the year 2005 production (energy output, e.g., grain, edible roots, and so forth) of the 10 principal crops were selected for our 1961–2014 analysis using the FAOSTAT database (ref. 1; last accessed, May 2017). Crops used for the country selection were barley, cassava, corn, palm fruit, potatoes, rice, soybean, sugar beet, sugar cane, and wheat, but then all crops were taken into account to estimate country output. An analysis by crop was beyond our reach because FAOSTAT input data are pooled at the country level. The country tally was 58–62, depending on the period. We used USSR values until 1991, and thereafter used the sum of Russia, Ukraine, Kazakhstan, Belarus, and Uzbekistan (94% of the former USSR area).

An important input for which we had very limited data was irrigation water: FAO's AQUASTAT is still developing as a worldwide long-term database for irrigated area (see ref. 2); besides, we were unable to discriminate types of irrigation (gravitational, sprinkling, or dripping) and thus were unable to resolve volume or water source (surface, deep, desalinized), and much less ECs. Therefore countries with more than 30% of their agricultural area under irrigation in 2005 were analyzed separately as MICs to avoid overestimation of EUE due to the positive effect of irrigation on crop production. Assuming that yields under irrigation at least double those with no irrigation, MICs would be countries with most of their production coming from irrigated fields. Those 12 countries are listed at the end of *Materials and Methods* and were treated as a separate "continent." Mexico was included in Latin America, instead of in North America. A permutation test [multiple response permutation procedure; MRPP; (3)] confirmed statistically significant differences in average input per hectare between the seven continents so defined as a priori groups (P value < 0.001). The list of MICs, that of main-output countries, and the identity of the 10 main crops were not influenced by the decision to use the 2005 snapshot.

Crop Production and Land Use

Data for agricultural land (arable land and permanent crops) and irrigated land were obtained from FAOSTAT and used to calculate inputs per hectare. To estimate the degree of extensification, we averaged the 2010–2014 (t_2) and the 1961–1965 (t_1) values of arable land and permanent crops and then estimated the percentage of net land cleared for agriculture as $[(t_2 - t_1)/t_1]100$. The physical amount of cereals, cocoa, coffee, fruits, mate, oil palm, pulses, rapeseed, roots and tubers, soybeans, sugar beet, sugar cane, sunflower, tea, and vegetables produced were also obtained from FAOSTAT. Crop production values (t) were multiplied by their specific energy content (MJ/t; ref. 4) and were summed to transform all crops to a single energy value of each country's annual production (output).

Inputs

The tools and supplies included in the analyses were machinery, fuel, and fertilizers. The number of machines used in each country was obtained from the sum of tractors and harvesters and threshers from the Machinery Archive in FATOSTAT. Machinery (mass units) and fuel consumption per machine for each country were estimated using the Stout (5) standards explained below. All the countries had missing machinery data after 2003, and we used Pawlak's (6) estimations for 2005 and 2010, assuming for each country (i) a linear increase or decrease between 2003–2005 and 2005–2009 and (ii) a constant value for 2010–2014.

N, P, and K fertilizer use was obtained from FAOSTAT. The FAO's metadata on fertilizers warn against the uncritical use of the two databases covering our study period (1961–2002 and 2002–2014), due to changes in methodology. We found that the differences between the two datasets in FAOSTAT for the global use of N, P, and K fertilizers in 2002 were only 2%, 3% and 15%, respectively. Since our objective was to analyze trends, rather than precise absolute values, we used both databases (starting with the new one from 2003 onwards).

ECs

The physical quantities for outputs and inputs (mass per year) were converted to energy units using ECs from the literature (Table S1). We did not include transportation of either supplies or harvested products. Our EC choices and their rationale are given below.

Machinery and Fuel. We used the coefficients proposed by Stout (5) for machinery size and fuel consumption for each region: Machinery mass of 15 t/unit for the United States, Canada, and Australia, 8 t/unit for Latin America and Europe, and 6 t/unit for Asia and Africa. For fuel consumption we used coefficients of $5 \text{ t}\cdot\text{unit}^{-1}\cdot\text{y}^{-1}$ for the United States, Canada, and Australia, $3.5 \text{ t}\cdot\text{unit}^{-1}\cdot\text{y}^{-1}$ for Latin America and Europe, and $3 \text{ t}\cdot\text{unit}^{-1}\cdot\text{y}^{-1}$ for Asia and Africa. Although these are all obvious simplifications, none of them assumes any temporal trend and thus (unlike N-fertilizer industry efficiency) they do not alter the EUE pattern shown in Fig. 2.

We were not able to find studies of energy use in the farm machinery manufacturing industry. In fact, the only ECs used in previous agricultural analyses, and apparently the only publicly available ones, are based on car industry studies (7). We used the energy needed for manufacture (80.9 GJ/t) (7) and then added 55% of it as the energy needed for repairs (44.5 GJ/t) (8). Finally, the sum of manufacture and repairing energy was divided by the estimated lifespan (10 and 30 y, see *Sensitivity Analyses* below) to transform the energy input into an annual value (Table S1). Little variability was found for fuel EC, and an average from the literature was used (Table S1).

Fertilizers. Thanks to improvements in the Haber–Bosch technology, the energy required for ammonia industrial synthesis has noticeably decreased during the analyzed period (Table S1) (9). Also, N-fertilizer ECs are country specific as a consequence of different energy sources (gas, coal, or heavy oil). We reviewed the ECs from the literature and selected gas-based ones for all countries, except for China and India, in which the coal-based (China) and heavy oil-based (India) sources demand 1.7 and 1.3 times as much energy, respectively, as a natural gas-based process (10). As there were missing years in the literature for these two countries' ammonia synthesis energy efficiency, we multiplied the gas-based values by 1.7 in China and by 1.3 in India.

For P and K fertilizers, constant values were used for the whole period. Little information about these ECs is available, but, as a consequence of the lesser amounts used (compared with N), the impact on the total energy input is low (11). We used the average of the ECs most cited in the scientific literature (Table S1).

Sensitivity Analyses

Zegada-Lizarazu et al. (11) highlighted the great variability found among the ECs used in agricultural energy analyses. To

understand how much EC choices affected estimated energy inputs, we performed a sensitivity analysis of three factors: (i) the delay in incorporating the latest industrial ammonia technology for N-fertilizer synthesis, (ii) the lifespan of farm machinery, and (iii) fuel consumption. For (i) an immediate incorporation vs. a 10-y delay was evaluated, for (ii) 10-, 20-, and 30-y lifespans, and for (iii) $\pm 10\%$, 20%, and 30%. The difference in (i) for the world average energy input was 0.73 EJ (7% summed over the 1961–2014 period), being larger for the 10-y delay in N-technology incorporation. For (ii) the difference between the 10-y and 20-y machinery lifespan was 0.5 EJ (5%), the difference between the 20-y and 30-y machinery lifespan was 1.4 EJ (14%), and the difference between the 10-y and 30-y machinery lifespan was 1.9 EJ (19%). Fuel consumption uncertainty (iii) had a relatively minor impact on overall energy use: $\pm 4\%$, 8%, and 12% for over- and underestimations of 10%, 20%, and 30%, respectively, with a negligible effect of the lifespan assumption. Results for lifespan and fuel consumption were barely affected by the delay (0–10 y) used for N-technology. We decided to work with the immediate technological incorporation (updated N-fertilizer technology) and 10 y and 30 y machinery lifespans. This allowed us to bracket input and EUE estimations in the face of the largest

uncertainty found in ECs. Additionally, for Fig. 2, we performed a graphical analysis of the effect of no progress in (i.e., the use of outdated) N-fertilizer technology.

The uncertainty for the contribution of pesticides to the energy input is large, with a range of estimates between 6% and 16% (12). Although ECs are available (e.g., refs. 12 and 13), there is no worldwide long-term database of consumption at the country level. Although the FAO's pesticide database has data starting from 1990, their developers warn against the use of these data for intercountry comparisons because of inconsistencies in reports. Thus, we estimated their overall contribution to the global energy input: Fungicides, bactericides, herbicides, and insecticides (grouped in "Pesticides") consumption for our 58 selected countries was summed for each year, and the annual energy input was calculated using ECs from ref. 12. This resulted in 364 PJ for 1990 and 565 PJ for 2014, i.e., an increase of 55%. However, the relative contribution to the agricultural inputs was between 2% and 6%, with no clear-cut temporal trend. As this input is generally considered minor in terms of energy, with the possible exception of horticulture (14), and our own estimates place it between 2% and 6% of the total energy input, we excluded it from the analysis.

1. FAO (2017) FAOSTAT online statistical service. Available at faostat.fao.org. Accessed May 15, 2017.
2. Siebert S, et al. (2005) Development and validation of the global map of irrigation areas. *Hydrol Earth Syst Sci* 9:535–547.
3. Mielke PW, Berry KJ (2001) *Permutation Methods: A Distance Function Approach*, Springer Series in Statistics (Springer, Berlin), 352 pp.
4. Food and Agriculture Organization (2001) *Food Balance Sheets. A Handbook* (Rome), 95 pp.
5. Stout BA (1991) *Handbook of Energy for World Agriculture* (Elsevier, New York), 519 pp.
6. Pawlak J (2017) Regional distribution of the world's tractor stock. *AMA Agr Mech Asia Af* 48:39–44.
7. Mikkola HJ, Ahokas J (2010) Indirect energy input of agricultural machinery in bio-energy production. *Renew Energy* 35:23–28.
8. Fluck RC (1985) Energy sequestered in repairs and maintenance of agricultural machinery. *Trans ASAE* 28:738–744.
9. Smil V (2001) Appendixes. *Enriching the Earth. Fritz Haber, Carl Bosch, and the Transformation of World Food Production* (MIT Press, London), pp 233–253.
10. International Energy Agency (2007) Chemical and petrochemical industry. *Tracking Industrial Energy Efficiency and CO₂ Emissions* (IEA, Paris), pp 59–94.
11. Zegada-Lizarazu W, Matteucci D, Monti A (2010) Critical review on energy balance of agricultural systems. *Biofuels Bioprod Biorefin* 4:423–446.
12. Audsley E, Stacey KF, Parsons DJ, Williams AG (2009) Estimation of the greenhouse gas emissions from agricultural pesticide manufacture and use (Cranfield University, Cranfield, UK), 20 pp.
13. Ferraro DO (2007) Energy cost/use in pesticide production. *Encyclopedia of Pest Management*, ed Pimentel D (Marcel Dekker, New York), pp 153–156.
14. Pelletier N, et al. (2011) Energy intensity of agriculture and food systems. *Annu Rev Environ Resour* 36:223–246.

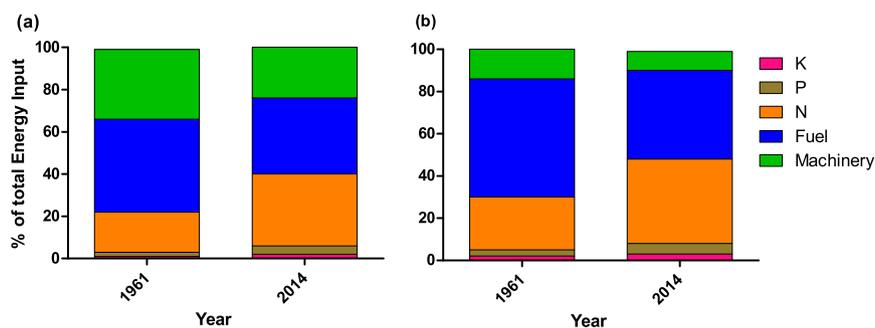


Fig. S1. Total energy input for the 58 analyzed countries classified by relative contribution of each input. (A) Ten-year machinery lifespan. (B) Thirty-year machinery lifespan.

Table S1. ECs for fertilizers, machinery, and fuel for 1961–2014

Input	Region	Period	Unit	Value	Ref(s).
N fertilizer	China	1961–1965	GJ/t N	165.24	1, 2
		1966–1979	GJ/t N	123.93	1, 2
		1980–1984	GJ/t N	88.6	3
		1985–1989	GJ/t N	69.1	3
		1990–1994	GJ/t N	66.3	3
		1995–1999	GJ/t N	61.3	3
		2000–2014	GJ/t N	40.2	3
	India	1961–1965	GJ/t N	126.36	1, 2
		1966–1978	GJ/t N	94.77	1, 2
		1979–1982	GJ/t N	75.3	4
		1983–1985	GJ/t N	71.6	4
		1986–1987	GJ/t N	68	4
		1988–1990	GJ/t N	60.7	4
		1991	GJ/t N	59.5	4
		1992–1993	GJ/t N	58.3	4
		1994	GJ/t N	55.9	4
		1995–2014	GJ/t N	55.9	4
Rest of the world	1955–1965	GJ/t N	97.2	1	
	1966–1980	GJ/t N	72.9	1	
	1981–1990	GJ/t N	60.7	1	
	1991–2000	GJ/t N	51.6	1	
	2001–2014	GJ/t N	45.5	2	
P fertilizer	World	1961–2014	GJ/t P ₂ O ₅	14.2	5–7
K fertilizer	World	1961–2014	GJ/t K ₂ O	10	5–7
Machinery (10 y)	World	1961–2014	GJ/t/y	12.5	8, 9
Machinery (30 y)	World	1961–2014	GJ/t/y	4.2	8, 9
Fuel	World	1961–2014	GJ/t	45.5	10–12

Values within parentheses in Machinery indicate machinery lifespan in years.

- Smil V (2001) Appendixes. *Enriching the Earth. Fritz Haber, Carl Bosch, and the Transformation of World Food Production* (MIT Press, London), pp. 233–253.
- International Energy Agency (2007) Chemical and petrochemical industry. *Tracking Industrial Energy Efficiency and CO₂ Emissions* (IEA, Paris), pp. 59–94.
- You CF, Xu XC (2010) Coal combustion and its pollution control in China. *Energy* 35:4467–4472.
- Schumacher K, Sathaye J (1999) *India's Fertilizer Industry: Productivity and Energy Efficiency* (Lawrence Berkeley National Laboratory, Berkeley, CA), 47 pp.
- Pimentel D, Patzek TW (2005) Ethanol production using corn, switchgrass, and wood; biodiesel production using soybean and sunflower. *Nat Resour Res* 14:65–76.
- Shapouri H, Duffield JA, McAloon A, Wang M (2004) The 2001 net energy balance of corn–ethanol. Preliminary report from Office of the Chief Economist (US Department of Agriculture, Washington, DC), 6 pp.
- Meul M, Nevens F, Reheul D, Hofman G (2007) Energy use efficiency of specialized dairy, arable and pig farms in Flanders. *Agric Ecosyst Environ* 119:135–144.
- Mikkola HJ, Ahokas J (2010) Indirect energy input of agricultural machinery in bioenergy production. *Renew Energy* 35:23–28.
- Fluck RC (1985) Energy sequestered in repairs and maintenance of agricultural machinery. *Trans ASAE* 28:738–744.
- Zegada-Lizarazu W, Matteucci D, Monti A (2010) Critical review on energy balance of agricultural systems. *Biofuels Bioprod Biorefin* 4:423–446.
- Arizpe N, Giampietro M, Ramos-Martin J (2011) Food security and fossil energy dependence: An international comparison of the use of fossil energy in agriculture (1991–2003). *Crit Rev Plant Sci* 30:45–63.
- Alluvione F, Moretti B, Sacco D, Grignani C (2011) EUE (energy use efficiency) of cropping systems for a sustainable agriculture. *Energy* 36:4468–4481.