

Preserving global land and water resources through the replacement of livestock feed crops with agricultural by-products

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ABSTRACT

While animal source foods contribute to 16% of the global food supply and are an important protein source in human diets, their production uses a disproportionately large fraction of agricultural land and water resources. Therefore, a global comprehensive understanding of the extent to which livestock production competes directly or indirectly with food crops is needed. Here, we use an agro-hydrological model combined with crop-specific yields data to investigate to what extent the replacement of some substitutable feed crops with available agricultural by-products would spare agricultural land and water resources that could be reallocated to other uses, including food crop production. We show that replacing 11-16% of energy-rich feed crops (i.e., cereals and cassava) with agricultural by-products would allow for the saving of approximately 15.4-27.8 Mha of land, 3-19.6 km³ and 74.2-137.8 km³ of blue and green water, respectively for the growth of other food crops, thus providing a suitable strategy to reduce unsustainable use of natural resources both locally or through virtual land and water trade.

MAIN TEXT

INTRODUCTION

The global cereals market is projected to increase to 3 bln tons by 2030¹, though it is currently facing severe shortages resulting from the combination of the ongoing Russia-Ukraine war, the residual effects on food supply of the Covid-19 pandemic, and the ongoing drop in grain harvest caused by increasingly frequent extreme events such as floods, droughts, and heatwaves induced by climate change²⁻⁴. The expected increase is driven mainly by higher feed use, followed by food and other uses. Furthermore, it is supposed to take place mostly in developing countries due to the fast-expanding livestock sector¹. One of the livestock production concerns is the competition for natural resources between the human food and the animal feed sectors⁵. Cereals stand out among all feed crops within this context. Currently, ruminants are still predominantly raised on permanent or temporary pastures, which account for one-fourth of Earth's landmass and 70% of the agricultural land⁶. Conversely, the production of monogastric livestock such as pigs and poultry underwent intensification through the use of feed from intensified agricultural production since the early phases of industrialization⁷. The ongoing *livestock revolution*, however, is intensifying production across the livestock sector, including ruminants⁸, leading to industrial production systems where monogastric and some beef and dairy cattle require huge amounts of primary crops to be processed into concentrated feeds^{7,9,10}. Thus feed production uses 40% of all arable land, including feed crops used as the energy source for livestock (cereals and tubers) and protein crops (oilseeds and pulses)^{6,11}. About 40% of that land is cultivated with cereal grains and accounts for one-third of global cereal production and 60-70% of the total feed crop production. To these, an additional amount of land to produce cereal and legume silage and fodder beets is consumed¹¹, which are usually not accounted for in the cereal primary production databases that include crops harvested for dry grain only. Not only land but also water use associated with meat and dairy production is high¹²⁻¹⁴. Mekonnen and Hoekstra estimated that global animal production required about 2422 km³ of water per year in the 2000s, equal to one-third of total agricultural use, and 98% of that refers to the water footprint of the feed⁹. These data combined with projections of increased demand for animal source foods (ASF) clearly show that meeting the ASF demand is one of the challenges of our century in a world where finite water, land, and other natural resources^{15,16} are often used unsustainably, (e.g., the case of unsustainable irrigation)^{17,18}, thus exceeding the planetary boundaries¹⁹.

45 Energy-rich food crops such as cereals account for almost half of the global daily calorie food intake, therefore, from the food
46 security standpoint, prioritizing crops use for direct human consumption rather as livestock feed is desirable^{20,21}. In fact, in the
47 livestock sector energy-rich crops such as cereals and tubers represent 94% of the total human-edible feed intake (i.e., the
48 food-competing feed)¹¹. The healthy reference diet proposed by the EAT-Lancet Commission recommends the consumption
49 of moderate quantities of poultry and eggs and very low amounts of red and processed meat²². Currently, in high and middle
50 income countries ASF consumption is far from meeting healthy and sustainable diet requirements²³. It is therefore necessary
51 to find additional strategies to reduce both the environmental impact of human diets and the competition for cereals between
52 the food and feed sectors through a more effective management of livestock production systems.

53 The reduction in the use of food-competing feed products and replaced by lower-impact feed seems to be a promising possible
54 strategy that fits within the circular economy frame²⁴⁻²⁷. To date, a global comprehensive study on the current environmental
55 impacts (here evaluated in terms of land and water use) of livestock production and the potential benefits of replacing food-
56 competing feed with specific amounts of theoretically available alternative feed from agricultural by-products is still missing.
57 While some specific global studies are available for the land use associated with cereal feed production up to 2010¹¹, there is
58 a large gap in the literature on the related water consumption at similar scales and resolutions. A recent comprehensive study
59 by Sandström *et al*²¹ used an extensive literature review of feed experimental studies to explore feed replacement scenarios
60 for cereal crops and cassava with agricultural by-products, which are the secondary products derived from the production
61 process of primary crops such as cereal and sugar crops. They found that such replacements could free up about 307-440×10¹²
62 kcal of energy-rich food, globally. More specifically, up to 72-103 Mton of cereals and cassava could be reallocated from the
63 livestock sector to human food use. Other studies proposed similar strategies promoting the replacement of feed types that
64 compete with food needs with alternative lower-impact and low-cost products such as food waste^{24,28-30}, agricultural co- and
65 by-products and residues^{20,31-34}, foodstuff discarded by food manufacturing companies (former food)^{35,36}, and slaughter by-
66 products^{31,37}. However, most of them simulate hypothetical replacement scenarios without ensuring compliance with the
67 current food and feed laws or availability of the alternative feedstuffs. They also tend to focus on local or regional scales
68 rather than the global scale.

69 In this study, we assess the land and water (both green and blue) used for the production of energy-rich feed crops (i.e., cereals
70 and cassava) in the 2016-18 period and the potential resource-saving that could be achieved by replacing these feed crops
71 with by-products from the food system, including cereal bran, sugar beet pulp, molasses, distiller's grains and citrus pulp. We
72 combined country data on feed use from the FAOSTAT database⁶ with estimates of regional by-product availability and an
73 analysis of suitable replacement criteria from Sandström *et al*²¹. We first reconstructed the global material feed flow associated
74 with consumption and trade patterns. We then calculated the land and water resources used in the production of these feed
75 types and their (virtual) transfer associated to these flows using crop- and country-specific yield data and a physically based
76 and spatially distributed agro-hydrological model. We include a comprehensive and detailed trade analysis for the global
77 cereal and cassava feed market, which enables a distinction between local and external cereal and cassava production and the
78 quantification of the related virtual land and water trade. Lastly, we evaluated the land and water savings (and their geographic
79 location) that would result from the replacement of feed based on cereals and cassava with by-products from the food system,
80 introducing an allocation method to go beyond the mere assumption that such by-products have no additional environmental
81 cost.

82

83 **RESULTS**

84 **Current Scenario of Energy-Rich Crops Feed Use and Trade.** On average, in the three-year period 2016-18 almost 980
85 million tons (802 Mtons of dry matter, DM) of cereals and cassava (hereafter referred to as 'energy-rich feed crops') were
86 used annually as animal feed, which is about one-third of the global energy-rich crop production as reported by FAOSTAT⁶.
87 In agreement with previous studies^{6,21}, maize is by far the most common energy-rich crop used as feed (64%), mainly in the
88 Americas and in Asia, followed by wheat (13%), which is used as feed mainly in Europe and Oceania. Barley accounts for
89 9% of cereal consumption as feed, mainly in Europe and Western Asia, cassava for 9% (mainly in Africa), rice for 4% (mostly
90 in Southern and South-East Asia), and finally Sorghum for 2% (mainly used in the Americas). These six crops cover 95% of
91 the energy-rich crops used as feed. The major consumers of these crops can be found in Eastern Asia (27%), Europe (19%),

92 and North America (16%). Because Southern Asia produces (and consumes) mainly dairy products from grazing ruminants
93 and South America produces beef on extensive farms, the consumption of energy-rich feed is lower than in regions with
94 growing monogastric or intensive ruminant livestock production (Fig. 1). Cereals and cassava are less traded than other crops
95 such as oilseeds (soybean and oil palm); in fact, only 20% of these energy-rich crops used as feed do not come from local
96 production. However, there are some exceptions such as the Caribbean, Northern Africa, and Western Asia, where the import
97 share of energy-rich crops is higher than the domestic production (Fig. 1).

98 As a consequence of this complex trade system, the distribution of natural resource consumption by the livestock sector is
99 uneven across regions, with large producer countries dominating the global scenario. Global feed trade is associated with lack
100 of self-sufficiency (i.e., trade-dependence), virtual trade of natural resources such as land and water, and environmental
101 impacts (e.g., pollution) (Fig. 2).

102
103 **Current Scenario of Land and Water Resources Use for Energy-Rich Feed Crops.** Cereal products and cassava fed to
104 livestock required on average an annual use of 185.2 ± 7.0 Mha of agricultural land and 944.3 ± 39.8 km³ of total water
105 resources (Fig. 3, Table 1). While maize accounts for approximately 67% of energy-rich crop feed use, its production accounts
106 for 54% of land used by energy-rich feed production and 45% of green water (GW) consumption by energy-rich feed crops.
107 This is caused by the high use of agricultural inputs and efficient management practices associated with maize production,
108 which achieves low yield gaps (10-15%) in the main producer countries such as the US, Brazil, and European countries³⁸ (Fig.
109 3, Figure S5, S6). Cereal and cassava production is relocated through trade and the associated virtual land flows. Eastern
110 Europe, Northern America, and South America are net land exporters (Fig. 3, colored bars exceed dotted ones), while Eastern
111 and Western Asia and Southern Europe are net importers (Fig. 3, dotted bars exceed colored ones). Western Europe, instead,
112 stands out as both an importer and exporter region through virtual land trade (Fig. 2, Supplementary Figure S1).

113 Of the water volumes contributing to energy-rich feed crop production, just 81 km³ (9%) come from irrigation water (or ‘blue
114 water’, BW, withdrawn from surface water bodies and groundwater reservoirs), while the remaining 863.5 km³ (91%) come
115 from precipitation (‘green water’, GW, use). The geographic patterns of BW use for feed production are dictated by the
116 distribution of irrigation infrastructures (Fig. 4, Supplementary Figure S2). In fact, Asia accounts for more than 70% of the
117 total cereal irrigated area, across Eastern (72% of cereal fields are irrigated), Southern (58%), and South-Eastern (38%) Asia.
118 Interestingly, BW tends to be less traded (8%) compared to land and GW (20%) (Fig. 2-3). In fact, rice, which accounts for
119 50% of cereal irrigated area, tends to be used as animal feed only in the areas where it is locally produced.

120 **Potential Land and Water Savings with Energy-Rich Crop Replacement.** The replacement of 88 Mton of energy-rich
121 feed crop dry matter (or 111 Mton of fresh matter) as estimated by Sandrström *et al*²¹ with available agricultural by-products
122 suitable for livestock diets could save on average 21.6 ± 1.1 Mha of agricultural land, 106 ± 5.5 km³ of GW and 11.3 ± 0.8
123 km³ of BW, with no reduction livestock production (Table 1). However, because these by-products have an economic value
124 and an environmental cost, we account for the fact that 2.8 – 5.1 Mha of land, 15.3 – 26.3 km³ of GW, and 4 – 7.5 km³ of BW
125 are allocated to their production and processing from the primary crops they are derived from. In that case, slightly lower
126 savings would be achieved (Table 1, Fig. 3-4).

127 Eastern Asia and North America would greatly reduce their energy-rich feed crops consumption (Fig. 3). In the case of Eastern
128 Asia this big reduction is explained by the fact that this region (particularly China) is a major producer of animal source foods
129 and therefore exhibits high rates of total feed demand. While Eastern Asian savings would take place both domestically and
130 on imports, North America would mostly achieve high levels of saving in domestic cereal production since the United States
131 and Canada are major cereal producers with limited dependence on imports. However, this pattern changes when it comes to
132 the saved land and water resources. In fact, as far as land and GW savings are concerned, the regions that would most benefit
133 from the use of agricultural by-products would be Southern, Eastern and South-Eastern Asia, and Eastern Europe. These
134 regions still have relatively low agricultural yields compared to Northern America and Western Europe, where the yield gap
135 is smaller, especially for cereals³⁸ (Fig. 4, Figure S5-S6). BW savings are expected to occur in Asia, where cereal production
136 is traditionally irrigated (Fig. 4, Supplementary Figure S2-S3).

137

138 **DISCUSSION**

139 Livestock consumed annually about 980 Mton of fresh energy-rich crops on average in the three-year period 2016-18. The
140 production of the energy-rich feed needed to meet this demand required 185.2 Mha of agricultural land. This area represents
141 one-fourth of the global area harvested with energy feed crops and 13% of all arable land⁶. At the same time, 80.9 km³ and
142 863.5 km³ of BW and GW, respectively, were needed to grow these feed crops. These volumes represent 8% of total BW use
143 in agriculture and 15% of total GW use for crop production worldwide, as estimated with the WATNEEDS model for 2016³⁹
144 (see Methods). The results of this effort can be compared with the few existing studies on this subject (Table 2). Looking at
145 land use, both FAO and Steinfeld⁷ and Mottet *et al*¹¹ estimated that 211 Mha of land is devoted to cereal feed production,
146 which is slight higher than our estimate (185 Mha). The difference can be a result of the fact that we included just the five
147 main cereals used as feed and cassava (95% of total energy feed crop production) which are also the ones with the lowest
148 yield gaps, the different time period analyzed, and thus, the use of up-to-date agricultural yields. In fact, the GAEZ v4 database
149 shows a crop yield achievement in several regions compared to the first decade of the century³⁸. To compare our estimates of
150 water use for energy-rich feed production to published data, we applied shares of feed use from FAOSTAT⁶ to total water use
151 estimates from other studies^{9,14,39,40} for the six crop included in our study (Table 2). Our results are in line with these other
152 studies, with a slight increase in water use for all crops, except sorghum. This increase is consistent with the estimated increase
153 in the shares of production used as feed and in agricultural harvested area in the last few years.

154 Agricultural by-products are typically low-value commodities from local production or intra-regional trade, while concentrate
155 feeds used both as whole grain and as meal often undergo inter-regional trade. Even though cereals are much less traded than
156 other crops such as oilseed and sugar crops⁶ their trade contributes to a global displacement of the environmental impacts of
157 livestock production. Because global trade data are only available at the country scale aggregating food and feed uses, this
158 study assumed that cereals used for food and feed purposes are traded in the same proportions and following the same trade
159 paths. However, the European Feed Manufacturers' Federation (FEFAC) reported that cereals grown specifically for animal
160 feed purposes are usually of lower quality compared to that grown for human consumption⁴¹, suggesting that cereal feed are
161 most likely less traded compared to cereals directly consumed as food.

162 Cereals are the feed crops that compete the most with the human food sector. While cereals do not account for a large fraction
163 of the diet of ruminants, they are used as feed supplement and as the main energy source for feedlot or dairy production diets.
164 Conversely, cereals represent at least 60% (up to 90%) of the diet for monogastric livestock^{42,43}.

165 In a world with limited land and water resources for agriculture, food availability is strongly affected by the competition of
166 the livestock sector that uses a substantial amount of cereals as feed¹¹. Interestingly, even if some leftovers from the
167 agricultural sector can also be used for bioenergy and other purposes, their use as livestock feed appears to be the most
168 valuable and sustainable option⁴⁴. However, biogas production can potentially compete with the livestock sector for by-
169 products such as beet pulp and molasses included in this analysis, particularly as a result of financial incentive to mitigate the
170 recent energy crisis⁴⁵. On the other hand, biofuel industry is even able to produce a large amount of distiller's grains, which
171 are products usable as animal feed. Furthermore, resource savings and avoidance of competition between food and other uses
172 are also strictly dependent on geographic distribution of production, availability, and demand for agricultural by-products. In
173 regions where both the demand for livestock feed and bioenergy use is high, these other uses of energy-rich feed crops and
174 by-products can typically rely on a relatively wider range of available substitute products, as in Northern America and Eastern
175 Asia. At the same time, while by-product availability is generally high in regions with relatively high demand for livestock
176 and energy-rich feeds (Northern America and Eastern Asia), there are other regions such as South America, Southern Asia
177 and South-Eastern Asia where by-product availability is high, but livestock are still predominantly raised in extensive grazing
178 systems. In such regions, to date, the demand for energy-rich feeds is relatively lower compared to other regions, making
179 more by-products available for other uses such as bioenergy.

180 By-product availability, in fact, can be seen as an encouraging factor in regions where they are abundant. However, they also
181 represent a limiting factor in other regions, depending both on their local production and their current use in the livestock
182 sector. As reported by Sandrström *et al*²¹, molasses and cereal bran turn out to be the most available products because cereals

183 and sugar crops (i.e., sugar cane or sugar beet) are produced everywhere. On the other hand, beet and citrus pulps are restricted
184 to the main sugar beet and citrus producer regions, while distiller's grains are restricted to the main biofuel producer regions,
185 thus potentially limiting the potential replacement of animal feed with agricultural by-products in several regions.

186 This study investigated the effects of the substitution of cereal- and cassava-based feed with agricultural by-products from the
187 food system. We found that such substitutions can offer a winning strategy to reconcile the competing needs of the staple food
188 and livestock sectors. Indeed, because these energy-rich feed crops account for 60-70% of feed consumption, substitution
189 strategies focusing on these feed types may lead to larger land and water savings than scenarios concentrating on other less-
190 common feed crops such as tubers, oilseeds or pulses that account for lower shares of animal diets, regardless of the fact that
191 these less used feed crops typically allow for higher savings per unit mass of product replaced (because of their higher land
192 and GW requirements and higher yields gap). As far as blue water consumption is concerned, on the other hand, the decrease
193 in cereal feed use among the crops used as feed would have the strongest reduction in irrigation water use in the agricultural
194 sector because it is the most frequently irrigated crops (mainly rice and wheat) with respect to tubers (potato and sweet potato)
195 and many oilseeds used as livestock feed (e.g., soybeans) which are often rainfed (South America).

196 The replacement of other feed types that compete with food used for direct human consumption such as oilseed co-products
197 (i.e., soybean and palm kernel cakes) would be a winning strategy to reduce human pressure on the environment because
198 oilseed production is a major driver of land use change, large scale deforestation, biodiversity losses and GHG emissions.
199 Specifically, soybean is the most widely used protein source for livestock globally, mainly in the monogastric sector^{42,43}.
200 Approximately 85% of soybeans are processed annually to obtain two co-products: oil and cake. Soybean oil has different
201 uses, in the food, industrial and energy sector, while soybean cake is consumed almost entirely in the livestock sector because
202 it is not edible by humans. Nevertheless, soybean cake is often considered among feed types that compete with the food system
203 because it is the main driver of soybean production, which contributes to deforestation in the Amazon, and in other regions
204 competes for fertile land with food crops^{42,43}. However, soybean replacement is not included in the analysis since, as it is now,
205 the most suitable replacements are other oilseed meals (from rape and canola, sunflower, cotton) that already almost entirely
206 used as feed²¹. Animal by-products seem to be another viable alternative, but their use often undergoes strict regulations due
207 to the associated risk of pathogen transmissions. Thus, soybean cake is not easily replaceable with other agricultural by-
208 products with similarly high protein content and efficiency as protein source for livestock, particularly monogastric species.
209 Agricultural by-products are just an example of a wide range of "alternative feed" that can be introduced into animal diets
210 both to reduce the feed-food competition and natural resource consumption. Former food products defined by the EU law as
211 safe and nutritious products coming from the food industry since are not marketable anymore for several reasons^{28,35,46}, food
212 waste^{24,29}, plant by-products²⁸, but also insects could be used as feed substitutes. In fact, insect meal seems to be an attractive
213 alternative to soybeans, as protein source both as food and feed⁴⁷⁻⁴⁹, and should future studies confirm its environmental and
214 socio-economic benefits.

215 However, while the use of low-impact feed ingredients can reduce the rate of natural resource consumption and cross-sectoral
216 competition, a decrease in ASF consumption – as suggested by the EAT-Lancet recommendations – remains the most effective
217 strategy in this regard. Furthermore, the strategies applied to the livestock sector have to be accompanied by measures and
218 solutions aiming to reduce the unsustainable water consumption associated with irrigation in the whole agricultural sector.
219 Figure S3, in fact, shows that BW savings, despite being of small-scale, concentrate in regions (mainly Southern and Eastern
220 Asia, followed by Northern America) where water consumption for irrigation is unsustainable because it exceeds water
221 availability and therefore entails losses of groundwater stocks and environmental flows. Furthermore, Rosa *et al*¹⁸ reported
222 that our six selected crops accounted for 55% of the global unsustainable water use for irrigation in 2015, with rice (38%) and
223 wheat (34%) appearing as major cereals contributors to this unsustainable use. Being the usage of maize more widespread
224 (67%) as energy source in animal feed compared to wheat (14%) and rice (4%), the potential reduction in unsustainable water
225 use is limited (Figure S3). Hence, the coupling of strategies as the one suggested in the analysis with measures that improve
226 water use efficiency are crucial to ensure both water and food security.

227 Our results shed light on the role of Eastern Europe as a breadbasket not only of Europe, but the world. Europe's agro-food
228 sector plays an important role in the global geopolitics of food security⁵⁰. Eastern Europe accounts for 24% of cereals traded

229 for livestock feed purposes. Indeed, Southern and Western Europe, Western Asia and Northern Africa are heavily dependent
 230 on Eastern Europe's production, as they meet more than 35% of their cereal feed demand with imports from this region.
 231 Ukraine contributes to 8% of global cereal exports, specifically, 12% of maize's exports, 10% of barley's and 8% of wheat's⁶.
 232 At the same time, Russia accounts for another 8% of cereal exports (9% of barley and 15% of wheat exports)⁶. The Russia-
 233 Ukraine war is already undermining the world's cereal supplies and stocks, both for the food and the livestock feed sectors.
 234 This crisis threatens global food security, especially in vulnerable trade-dependent countries. Thus, the implementation of
 235 new strategies to reduce cereal demand in the livestock sector and dependence on international trade would enhance the
 236 resilience of the global food system also in sight of future pandemics such as Covid19 or other disruptions that could limit the
 237 food and feed supply chain, as it has already happened in recent years.

238

239 CONCLUSIONS

240 Livestock consumes about 980 Mton of energy-rich crops as feed per year, which come back to humans as meat and dairy
 241 products contributing to 16% of global food supply (8×10^{12} kcal) and 33% of global protein supply (73×10^{12} g of protein).
 242 The production of these feed crops requires the use of valuable natural resources such as freshwater (81 km³) and fertile land
 243 (185 Mha) suitable for human food production. We demonstrated that not only can more efficient use of food system's by-
 244 products in livestock diet reduce the feed-food competition and increase the global food supply²¹, but also decrease the
 245 pressure on land and water resources which are increasingly scarce. In fact, the substitution of these crops with estimated
 246 available by-products could potentially make room for 17.6-25.4 Mha of fertile land and provide about 8.5-13.6 km³ of
 247 freshwater. An additional volume of 87-124 km³ of green water would be available for the growth of other food crops. The
 248 EAT-Lancet Commission recommends reducing the consumption of all kinds of ASF, to improve human health while
 249 lowering the environmental impact of human diets. Indeed, the reduction of ASF consumption remains the most efficient way
 250 to make our food system more sustainable. However, as the demand for livestock products is expected to grow over the next
 251 half-century, any strategy aimed at curbing the demand for primary commodities has the benefit of reducing environmental
 252 impacts on both locally and in distant areas of the world while reducing the trade-dependency of importer countries, in a time
 253 where global food security is threatened by several factors.

254

255 METHODS

256 Regional-scale energy-rich feed crop production and material flow of animal feed use were mapped to investigate the existing international feed trade
 257 framework and the associated use of natural resources (i.e., land, green water, blue water), both locally and globally. Current conditions were used as
 258 a baseline to evaluate potential changes in material flows resulting from a hypothetical scenario in which energy feeds are replaced by available
 259 agricultural by-products from the global food system. Changes in feed demand and flows would lead to savings in the natural resources used by the
 260 livestock sector.

261 The analysis was performed for a three-year average of 2016-2018 and for the 19 FAO world's regions⁶ (Table S1) to be consistent with data on the
 262 regional availability of by-products in the livestock sector from Sandström *et al*²¹.

263

264 **Current Feed Use and Feed Trade Matrix.** We collected *feed use* data from the Food Balance Sheets (FBS) from the Food and Agriculture
 265 Organization of the United Nations (FAOSTAT)⁶ for the energy crops that are most consumed as feed in the livestock sector worldwide (i.e., barley,
 266 cassava, maize, rice, sorghum, and wheat, which account for 95% of energy feed demand). Cassava was included in the cereal feed analysis despite
 267 being a *tuber* because it is also substitutable with by-products from the food system, consistent with data from Sandström *et al*²¹.

268 For each crop c , and region r , we quantified (1) the percentage of the consumption of crop c that in that region is used as feed (including all uses) (see
 269 Eq 1), (2) the percentage of crop feed use that is contributed by that specific crop c (see Eq 2).

270

$$270 \quad q_{c,r} [\%] = \frac{Feed\ use_{c,r}}{Domestic\ consumption_{c,r}} \times 100 \quad (1)$$

271

272

$$272 \quad p_{c,r} [\%] = \frac{Feed\ use_{c,r}}{\sum_{c \in C} Feed\ use_{c,r}} \times 100 \quad (2)$$

273

274 where $C = \{\text{barley, cassava, maize, rice, sorghum, wheat}\}$, *Feed use* and *Domestic consumption* are from FAOSTAT⁶ of the crop c , in region r .
 275 Feed demand is rarely completely met by domestic production in a country or region. Therefore, feed imports are usually required. Due to gaps in
 276 existing datasets or global estimates on cereal-specific trends on feed trade among regions, the same trade and production shares of cereal food
 277 commodities were assumed as already done in other studies³¹⁻³³. Import and domestic shares of crop feed consumption are, thus, calculated as follows:

277

$$277 \quad i_{c,r} [\%] = \frac{Import_{c,r}}{Domestic\ consumption_{c,r}} \times 100 \quad (3)$$

278
$$d_{c,r} [\%] = 100 \% - i_{c,r} \quad (4)$$

279 where *Import* data are from FAOSTAT⁶ of the crop *c*, in region *r*.

280 Regional crop feed use was then subdivided into domestic and import feed as a combination of Eq (1), (3), and (4).

281
$$imp_{c,r} [ton] = Feed\ use_{c,r} \times i_{c,r} \times DM_c \quad (5)$$

282
$$dom_{c,r} [ton] = Feed\ use_{c,r} \times DM_c - imp_{c,r} \quad (6)$$

283 DM_c indicates the global mean value (as percentage) of dry matter content of crop *c* from Feedtables⁵⁴.

284 To trace the origin of cereals and cassava consumed in a specific region, data from the Detailed Trade Matrix (DTM) for 208 countries were taken
285 from FAO⁶ and then aggregated for the 19 world regions, according to FAO⁶ and consistent with regional data from Sandström *et al*²¹ (Table S1). DTM
286 data were downloaded for cereals and cassava traded both as raw material and as a by-product available to be used as feed. Specific conversion factors
287 from FAO⁵⁵ and DM content from INRAE, CIRAD & AFZ⁵⁴ were used to obtain material flows on a dry matter basis. Furthermore, the data treatment
288 approach by Kastner *et al*⁵⁶ was applied to DTM data to identify crop producer and final consumer countries, avoiding double-accounting of re-import
289 and re-export.

290 **By-Product Substitution in Animal Feed and New Feed Flows.** Data on the potential replacements of cereal feed and cassava with by-products from
291 the food system and their availability were taken from Sandström *et al*²¹ and used to evaluate the potential reduction in energy-rich crop feed demand.
292 Sandström *et al*²¹ suggested two cases for cereal and cassava replacement, one considering the replacement just with available agricultural by-products
293 (cereal bran, sugar beet pulp, molasses, distiller's grains and citrus pulp) that did not have an impact on livestock productivity, and a second case where
294 they added the replacement of crop residues to agricultural by-products. This second case was not included in our analysis because it would lead to a
295 40-80% decrease in ruminant productivity and compete with bioenergy uses of crop residues²¹. Data on the replacement potential, given nutritional
296 replacement constraints and regional availability of by-products were taken from Sandström *et al*²¹. The values were reported as the median, 5th
297 percentile, and 95th percentile of the uncertainty range the authors obtained with Monte Carlo simulations for the input data. Because Sandström *et al*²¹
298 reported no crop-specific values for cereals feed replacement for the 19 world regions, shares calculated with Eq (2) were applied to obtain crop-
299 specific cereal and cassava substitutions.

300
$$crop_subs_{c,r} [ton] = Pot_replacement_r \times p_{c,r} \quad (7)$$

301 where $Pot_replacement_r$ indicates data of potential energy-rich feed replacement from Sandström *et al*²¹.

302 These data were then subtracted from the current baseline conditions of cereal and cassava feed use. It was assumed that the domestic and the import
303 shares of each crop would be reduced proportionally. New feed material flows were then obtained.

305 **Current Land and Water Use for Feed.** Livestock production draws heavily on natural resources, especially when it comes to intensive animal
306 farming systems requiring high amounts of concentrate feeds, including any feed containing relatively low fiber (< 20%) and high total digestible
307 nutrients (> 60%), rich in energy and/or protein, as cereals and oil meals. Land and water resources are essential for the production of primary
308 commodities such as cereals. We hereby evaluated the land and water resources involved in the production of cereals and cassava for feed purposes.
309 The cropland area needed to produce these feeds was calculated using crop-specific and region-specific agricultural yields (fresh matter yields) from
310 FAO⁶. Land use linked to the consumption of a specific crop in a certain region was split into two components: land consumed domestically (local
311 yield) (LL) and land virtually transferred from other regions through feed trade (yield of the exporter region) (VL).

312
$$LL_{c,r} [ha] = \frac{dom_{c,r}}{yield_{c,r}} \quad (8)$$

313
$$VL_{c,r} [ha] = \sum_{r \in E} \frac{imp_{c,r}}{yield_{c,r}} \quad (9)$$

314 where *yield* data are from FAOSTAT⁶ of the crop *c*, in region $r \in E$ {exporting regions}.

315 Subsequently, agricultural water consumption associated with crop feed production was computed with the WATNEEDS model³⁹. The model solves
316 the vertical soil water balance at a 5 arc-min resolution to return a spatially distributed crop-specific monthly analysis of green (GW) and blue water
317 (BW) requirement. The model runs on irrigated and rainfed global distributions of crop-specific cultivated areas from the MIRCA2000 dataset⁵⁷. The
318 monthly outputs- of crop GW and BW requirement obtained with climate and soil gridded data were averaged to obtain mean regional values, then
319 multiplied by the amount of land cultivated with that specific crop, in that specific region. As for the land use, both GW and BW use components were
320 split into local water (LGW, LBW) and virtual water trade (VGW, VBW).

321
$$LGW_{c,r} [km^3] = (GW_{c,r} \times 10 \times LL_{c,r} \times Rainf_{c,r} + GW_{c,r} \times 10 \times LL_{c,r} \times Irrig_{c,r}) \times 10^{-9} \quad (10)$$

322
$$LBW_{c,r} [km^3] = (GW_{c,r} \times 10 \times LL_{c,r} \times Irrig_{c,r}) \times 10^{-9} \quad (11)$$

323
$$VGW_{c,r} [km^3] = \sum_{r \in E} (GW_{c,r} \times 10 \times LL_{c,r} \times Rainf_{c,r} + GW_{c,r} \times 10 \times LL_{c,r} \times Irrig_{c,r}) \times 10^{-9} \quad (12)$$

324
$$VBW_{c,r} [km^3] = \sum_{r \in E} (GW_{c,r} \times 10 \times LL_{c,r} \times Irrig_{c,r}) \times 10^{-9} \quad (13)$$

325 where *GW* and *BW* represent the water [mm] needed to grow the crop *c*, in region *r*, as output of the model, while *Rainf* and *Irrig* are the percentages
326 of each crop that is cultivated as rainfed or irrigated in each region⁵⁷.

327 The results are shown in Figure 3, in two different ways: firstly, the resources consumed and obtained as the sum of the resources domestically
 328 consumed in the region and the resources virtually imported from other regions (importer/consumer use), secondly the resources consumed both for
 329 domestic use in the region but also virtually exported to other regions (exporter/producer use).

330 **Potential Land and Water Savings with Replacement.** Land and water savings that are potentially achievable by replacing part of the cereal feed
 331 use with by-products of the food system are calculated as the difference between the land and water use in the current baseline condition and the
 332 substitution scenario.

333 However, the environmental impact of by-products included in the replacement scenario cannot be neglected and assumed equal to zero, thus an
 334 allocation method adapted from Gerber *et al*^{53,58}, and already used in similar studies^{11,42}, was used. This method allowed to assign the share of land
 335 ($L_{bp,r}$ see Eq. 15) and water use ($GW_{bp,r}$ and $BW_{bp,r}$ see Eq. 16, 17) attributable to each by-product by referring to the agricultural yield and the water
 336 demand of its primary crop. The allocation was based on the relative mass, economic and feed use fractions. Because Sandström *et al*²¹ reported no
 337 by-product-specific values for energy-rich feed replacement for the 19 world regions, shares were calculated by applying their method for the estimate
 338 of the replacement potential. This was done starting from the reported data on current feed use of each by-product, their potential production and the
 339 replacement constraints²¹. In this way the regional amount of each by-product replaced was obtained ($byprod_subs_{bp,r}$ see Eq. 14, and subject to the
 340 allocation method. By-products are presumed not to be traded among regions, but only intra-regional trade was assumed, as data from FAO Supply
 341 Utilization Accounts reported that less than 4% of cereal bran produced globally was traded in 2016-18, and less than 10% for molasses⁶. Thus, no
 342 distinction between local and virtual natural resource use is reported for by-products.

$$343 \quad byprod_subs_{bp,r} [ton] = Pot_replacement_r \times byprod_replacement_{bp,r} \quad (14)$$

344 where $byprod_replacement_{bp,r}$ indicates the share [%] of each by-product bp that replaces the energy-rich feed crops in region r .

345 Concerning by-products composition, several assumptions were made on the primary crop they refer to. First, cereal bran composition include bran
 346 from barley, maize, millet, oats, rice, rye, sorghum and wheat, according to regional production data from FAO Supply Utilization Accounts⁶; second,
 347 molasses from sugar processing is subdivided between sugar beet and sugar cane as primary crop according to regional processing data from FAO
 348 Supply Utilization Accounts⁶; third, sugar beet pulp originates entirely from sugar beet processed into sugar; fourth, citrus pulp composition include
 349 pulp production from lemon and limes, oranges, and tangerines, mandarins, and clementines according to regional processing data from FAO Supply
 350 Utilization Accounts⁶; as last, distiller's grains include brewer's grain from beer brewing (barley as primary crop) and spent grains from corn ethanol
 351 production (maize as primary crop), according to regional data from FAO Supply Utilization Accounts⁶ and data from Iram *et al*⁵⁹ for the main corn
 352 ethanol producer countries, according to Sandström *et al*²¹.

353 Land, GW, and BW associated with the energy-rich crops substituted with by-products ($LL_{subs,c,r}$, $VL_{subs,c,r}$, $LGW_{subs,c,r}$, $VGW_{subs,c,r}$, $LBW_{subs,c,r}$, $VBW_{subs,c,r}$) were computed with the same methods as for the current conditions, with equations from (8) to (13).

354 The land and water use allocated to agricultural by-products are calculated as follows:

$$356 \quad L_{bp,r} [ha] = \frac{byprod_subs_{bp,r}}{yield_{pc, bp,r} \times FUF_{bp}} \times \frac{EFA_{bp}}{MFA_{bp}} \quad (15)$$

$$357 \quad GW_{bp,r} [km^3] = (GW_{pc, bp,r} \times 10 \times L_{bp,r} \times Rainf_{pc, bp,r} + GW_{pc, bp,r} \times 10 \times L_{bp,r} \times Irrig_{pc, bp,r}) \times 10^{-9} \quad (16)$$

$$358 \quad BW_{bp,r} [km^3] = (GW_{pc, bp,r} \times 10 \times L_{c,r} \times Irrig_{pc, bp,r}) \times 10^{-9} \quad (17)$$

359 where the subscript pc bp refer to the yield, GW, BW, rainfed and irrigation shares of the primary crop pc processed into the specific by-product bp
 360 in region r , while FUF, EFA, and MFA indicates the feed use, economic and mass fraction of each by-product.

361 Potential resource savings are obtained from the sum of the local and virtual resource use to produce the amount of energy-rich feed crops replaced
 362 with by-products, then removing the resource use allocated to these by-products, as follows:

$$363 \quad Land_saving_r [ha] = \sum_{c \in C} LL_{subs,c,r} + \sum_{c \in C} VL_{subs,c,r} - \sum_{bp \in B} L_{bp,r} \quad (18)$$

$$364 \quad GW_saving_r [km^3] = \sum_{c \in C} LGW_{subs,c,r} + \sum_{c \in C} VGW_{subs,c,r} - \sum_{bp \in B} GW_{bp,r} \quad (19)$$

$$365 \quad BW_saving_r [km^3] = \sum_{c \in C} LBW_{subs,c,r} + \sum_{c \in C} VBW_{subs,c,r} - \sum_{bp \in B} BW_{bp,r} \quad (20)$$

366 where $B = \{\text{cereal bran, sugar beet pulp, molasses, distiller's grains, citrus pulp}\}$.

367 **Uncertainty Analysis.** Sandström *et al*²¹ reported their potential replacement scenarios with the median, 5th percentile and 95th percentile values of the
 368 uncertainty range. However, the assessment of the natural resources associated with energy-rich feed use and the potential replacement is subjected to
 369 additional uncertainties. Hence, uncertainty propagates at each step of the analysis when new uncertain variables are involved. The uncertainty is here
 370 estimated in terms of the standard deviation, σ , from the mean value, \bar{X} ($\sigma \pm \bar{X}$).

371 Concerning land, we performed Monte Carlo simulations for the agricultural yields. To do so, we collected crop-specific agricultural yields from
 372 FAOSTAT⁶ for 187 countries from 2014 to 2020. These data were aggregated to the 19 world regions to obtain the regional weighted mean and the
 373 relative standard deviation for each crop. We then used the mean and standard deviation to generate 500 random values of potential yields assuming a
 374 truncated normal distribution ranges from 0 and the maximum yield value achieved by the crop in each region (Supplementary Material, Figure S3,
 375 S4, and S5).

376 Concerning water, a sensitivity analysis was conducted on the WATNEEDS model on the initial conditions and the kc values as described in Chiarelli
 377 *et al*³⁹. A technical validation showed a discrepancy lower than 3% comparing the cumulative results from WATNEEDS with the ones from Siebert

378 and Döll⁴⁰, while a crop-by-crop pixel-by-pixel comparison showed a difference lower than 20% for 90% of the harvested area between the two
379 dataset³⁹.

380 After estimating the independency of the variables that come into play with the Kendall's τ coefficient (two-sided test, p-value=0.2669, $\tau=0.1930$),
381 we evaluated with standard methods the propagation of the uncertainty⁶⁰ as

$$382 \quad \sigma_{L_{replac_{c,r}}} \approx \left[\sqrt{\left(\frac{\sigma_{R_{c,r}}}{|crop_subs_{c,r}|}\right)^2 + \left(\frac{\sigma_{Y_{c,r}}}{|yield_{c,r}|}\right)^2} \right] \times \left| \frac{crop_subs_{c,r}}{yield_{c,r}} \right| \quad (21)$$

$$383 \quad \sigma_{L_{replac}} \approx \sqrt{\sum_{r \in R} \sum_{c \in C} (\sigma_{L_{c,r}})^2} \quad (22)$$

384 where σ represents the standard deviation of the replacement ($\sigma_{R_{c,r}}$), the yield ($\sigma_{Y_{c,r}}$), and the land saved with the replacement ($\sigma_{L_{replac_{c,r}}}$), for
385 each crop $c \in C$, and region $r \in R = \{\text{Caribbean, Central America, Central Asia, Eastern Africa, Eastern Asia, Eastern Europe, Middle Africa,}$
386 $\text{Northern Africa, Northern America, Northern Europe, Oceania, South-Eastern Asia, South America, Southern Africa, Southern Asia, Southern}$
387 $\text{Europe, Western Africa, Western Asia, Western Europe}\}$.

388 The same equations were used to evaluate the propagation of the uncertainty for the current cereal and cassava feed use, the related current land use,
389 and the water calculations for the current conditions and the replacement scenario. Eq. 21 was used for product or fraction relations between variables,
390 while Eq. 22 for sum or difference.

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392 **Data Availability**

393 All data inputs to the analysis in this study were retrieved from publicly available sources that are cited in the manuscript
394 (e.g., FAOSTAT, Sandstrom et al 2022, Chiarelli et al 2020) and that are described in the main text and/or methods section.

395 Results that are additional to those provided in the text and in the supplementary materials are available from the authors upon
396 reasonable request.

397 **Code Availability**

398 The algorithm used for this study is available in the Methods and the Supplementary Material. The Arcgis Pro and Matlab
399 codes, as well as Excel files, however, are available from the authors upon reasonable request.

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404 manuscript.

405 **Author Contribution Statement**

406 C.G., M.C.R., and L.P. designed the research, C.G. performed the analysis, C.G. and P.D. drafted the article, M.C.R., P.D.
407 and L.P. conducted review and editing.

408 **Competing Interests Statement**

409 The authors declare no competing interests.

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Table 1 | Current scenario and potential savings with energy-rich feed crop replacement

Feed use	Raw material	Land use	GW use	BW use
	<i>DM Mton</i>	<i>Mha</i>	<i>km³</i>	<i>km³</i>
Current use	802.5	185.2 ± 7.0	863.5 ± 36.9	80.8 ± 2.9
Replacement – potential saving	88 ± 3.4	21.6 ± 1.1*	106.0 ± 5.5*	11.3 ± 0.8*
By-products	72-103	2.8-5.1	15.3-26.3	4-7.5

The results are presented with their associated uncertainty (standard deviation, see Methods).

*Potential savings estimated without accounting for the resource use allocated to by-products production. The actual savings would be lower if we subtract the allocated by-products' resource use reported in the table.

By-products resource use refers to the land and water used for these by-products, accounting for their mass fraction used as feed, and associated economic value with respect to the whole crop they are derived from (see Methods).

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Table 2 | Comparison with other studies

Reference study and authors	Our study, 2023	Mottet <i>et al</i> , 2017	FAO and Steinfeld, 2006	Mekonnen & Hoekstra, 2012	Siebert & Döll, 2010	Chiarelli <i>et al</i> , 2020	Heinke <i>et al</i> , 2020	
Reference year	2016-18	2010	2002	1996-05	1998-02	2016*	1998-02	
Energy-rich crop, feed use (<i>Mton DM</i>)	803	858	680					
Land use for energy-rich feed (<i>Mha</i>)	185	211	211					
GW use for energy-rich feed (<i>km³</i>)	Barley	125			92	95		
	Cassava	85			44	40		
	Maize	389			336	329	352	
	Rice	67			33	31	31	
	Sorghum	34				62	59	
BW use for energy-rich feed (<i>km³</i>)	Wheat	165			112	120		
	Barley	5			7	6		
	Cassava	0			0	0		
	Maize	43			29	41	43	
	Rice	17			10	15	13	
Total water use for energy-rich feed (<i>km³</i>)	Sorghum	2			4	4		
	Wheat	14			35	36	34	
	Barley	130			123	99	101	96
	Cassava	85				44	40	
	Maize	432			365	370	395	458
Total water use for energy-rich feed (<i>km³</i>)	Rice	84			43	46	44	
	Sorghum	36				66	63	
	Wheat	179			166	148	154	117

*climate data refers to the year 2016, but harvested area to the MIRCA2000 dataset⁵⁷.

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Fig. 1 | Global map of livestock production and energy-rich crop replacement, including their origin. Global distribution of protein production, including meat and dairy products, adapted from FAO⁶ combined with data on region-specific energy-rich feed crop replacement from Sandström *et al.*²¹ and shares of cereal and cassava feed use coming from domestic production or imports (see Methods). World regions are taken from FAO⁶, adapted from country borders retrieved from GADM⁶¹ (<https://gadm.org/>) (Table S1). Credits: Basemap sources: Esri, HERE, Garmin, FAO, NOAA, USGS, © OpenStreetMap contributors, and the GIS User Community⁶².

Fig. 2 | Net trade of energy-rich crops for feed purposes and the associated virtual land and water trade. Flows of raw material (DM, dry matter) for feed use (a) (sum of the six crops considered in the analysis) traded between the 19 world regions and the related diagrams of virtual land (b), green water (c) and blue water (d) trade. The double color of the lines indicates the flow direction, from the exporting (orange) to the importing regions (blue). Here reported the estimated mean values. Feed use include maize, wheat, barley, rice, sorghum, cassava. Region abbreviations reported in Table S1.

Fig. 3 | Global use of natural resources to produce energy-rich feed crops and the associated potential savings achievable with their replacement. The barplot shows the current land, green and blue water use for the major energy-rich crops in the 19 world regions. The resource use is shown both from the point of view of the exporter (colored column) and importer (dotted column) region. The land, green water and blue water currently used for energy-rich feed crop production and the ones potentially savable are presented, including the added resource use allocated to the by-products. The error bars represent the uncertainty range (standard deviation, see Methods). “Added by-products” resource use refers to the land and water used for the production of by-products replacing cereals and cassava, accounting for their mass fraction used as feed, and associated economic value with respect to the whole crop they are derived from (see Methods).
Importer/consumer point of view: the regions where cereals and cassava are actually used to feed livestock, independently of whether they come from local production or feed imports; this means that demand from these regions drives the production of these crops, the importer region is therefore responsible for the associated land and water consumption.
Exporter/producer point of view: the regions where cereals and cassava are actually produced, either for domestic use or for exports; this means that land and water resources are actually consumed in those regions to produce cereals and cassava even if a portion of these crops is exported to feed livestock in other regions as “virtual land and water trade”.

Fig. 4 | Geographic distribution of natural resource savings and their interplay with the drivers. The regional land, green and blue water savings are mainly influenced by feed replacement, feed export, agricultural yield (for land and GW) and irrigated area (for BW). The values of all variables were normalized (range 0-1) according to the maximum and minimum median regional values shown in Table S2. Region abbreviations are reported in Table S1.

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