Bundled measures for China's food system transformation

2 reveal social and environmental co-benefits

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Abstract

- 26 Food systems are essential for the achievement of the UN Sustainable Development Goals in China.
- 27 Using an integrated assessment modeling framework that considers country-driven pathways and
- 28 covers 18 indicators, we find that most social and environmental targets for the Chinese food
- 29 system under current trends are not aligned with the UN Agenda 2030. We further quantify the
- 30 impacts of multiple measures, revealing potential trade-offs in pursuing strategies aimed at public
- 31 health, environmental sustainability, and livelihood improvement in isolation. Among the
- 32 individual packages of measures, a shift towards healthy diets exhibits the lowest level of trade-
- 33 offs, leading to improvements in nutrition, health, environment and livelihoods. In contrast,
- 34 focusing efforts on climate change mitigation and ecological conservation, or promoting faster
- 35 socio-economic development alone, have trade-offs between social and environmental
- outcomes. These trade-offs could be minimized by bundling all three aspects of measures.

37 Main

China's unprecedented economic growth over the past decades has lifted millions of people out of 38 39 poverty and hunger while reshaping its food system¹. The rapid change of the country's food system poses pressing challenges to public health, the environment, and livelihoods¹⁻³. Overall 40 dietary quality remains suboptimal, responsible for 51% of all cardiometabolic deaths and 21% of 41 42 total deaths between 2010 and 2012⁴. Environmentally, with increasing concern about the overuse 43 of nitrogen (N) fertilizer, the country's efforts are particularly devoted to enhancing N use efficiency (NUE)². Food systems and the economy are closely interlinked^{1,5}. Malnutrition results 44 in substantial economic losses at the individual and societal levels. Individuals are estimated to 45 46 suffer productivity losses amounting to over 10% of their lifetime earnings, while the gross 47 domestic product (GDP) lost to malnutrition can range from 2% to 3%⁶. The inefficient food 48 system creates 19% of food losses⁷, suggesting that 4%–5% of China's workforce work in vain^{8,9}.

49 The global development agenda recognizes the imperative of comprehensively transforming the food system for sustainable development^{10–13}, and policymakers in China acknowledge this 50 necessity^{1,2}. Achieving a sustainable food system transformation, framed as green agriculture with 51 52 high-quality development in the Chinese context, requires high standards not only for sustainable 53 agricultural production but also in terms of food consumption and public health^{1,5}. However, the 54 feasibility of achieving future targets for the Chinese food system is yet understood, and trade-offs and co-benefits need to be unveiled¹⁴. The existing studies often neglect socioeconomic and 55 biophysical dynamics on which the food system hinges and focus on selective policy measures, 56 57 such as nutrient management³ and dietary changes⁴.

Here, we examine potential pathways for the sustainable development of the Chinese food system.
Our systematic approach aligns with a global sustainable food system transformation 15,16 to assess

60 the combined health, environmental, and socioeconomic dynamics under multiple future scenarios

of the Chinese food system (Table 1).

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We begin the assessment with a baseline scenario (BASE_{SSP2}) that is constructed from the middleof-the-road Shared Socioeconomic Pathway SSP2^{17,18} and incorporates the Chinese food system status quo. We then consider three package scenarios that correspond to three respective sets of sustainable transformation measures of the food system based on China-specific data and conditions (Extended Data Fig. 1 and Extended Data Table 1). Set A (Diets scenario) entails transitioning towards dietary recommendations of the EAT-Lancet Commission¹², while incorporating Eastern healthy dietary patterns proposed by the Chinese Dietary Guidelines (CDG)¹⁹ for China, along with targets to reduce food waste, overcome undernutrition and halve overnutrition by 2050. These ambitious targets align with recent developments in China, including updates of CDG and the release of the Healthy China 2030 Plan²⁰, which emphasize responsible and healthy diets to promote public and planetary health. Set B (SustEnvironment scenario) prioritizes sustainable agriculture management and land use, along with strengthened ecological conservation and climate change mitigation. This aligns with China's environmental protection goals for soil²¹, air²², and water²³. China's recent pledge for climate neutrality by 2060 underscores its commitment to reduce greenhouse gas (GHG) emissions¹. Biodiversity conservation and regeneration are also high priorities, exemplified by CBD COP 15²⁴. Set C (*Livelihoods* scenario) prioritizes socioeconomic progress and lifestyle transformation within and beyond the food system, aiming for livelihood improvement. This is a key objective of the food system transformation, acknowledging the challenges faced by the impoverished producers and consumers who are the

most economically vulnerable groups in society since their livelihoods heavily depend on agriculture and are often influenced by social and environmental factors^{15,25–29}. We further integrate all measures from sets A-C into a combined scenario, that is, the Chinese food system transformation pathway (FST_{SDP China}) to reveal the impacts and the interactions of sets A-C.

This study builds on an analysis of a global food system transformation pathway¹⁶ that employs the same benchmark methodology and integrated assessment framework (details in Methods). This ensures that the transformation pathway of the Chinese food system aligns with sustainable development objectives on the global scale while taking into account country-driven multiobjective pathways^{30,31}. The core of this integrated modeling framework is MAgPIE-China (a China version of Model of Agricultural Production and its Impact on the Environment)^{2,32–35}, linked with several sectoral models to cover health and livelihood aspects^{13,25}. MAgPIE-China is an agro-economic land system model designed to minimize costs while satisfying the demand for agricultural products. Key assumptions of this modeling analysis include that income drives food waste and productivity increase drives reduction in labor requirement. More details about the assumptions can be found in Extended Data Table 1 and Supplementary Information. We analyze model results from 2020 to 2050 and combine a validation phase from 1995 to 2015 for model quality checks. In addition to health and environmental indicators, we incorporate the aspect of livelihoods to broaden our understanding of the impacts related to social progress, which is measured in terms of agricultural expenditure, population in poverty, agricultural employment, agricultural wage, bioeconomy supply, and production costs.

Our study quantifies the social and environmental impacts of the Chinese food system in five scenarios (Table 1). For each scenario, we estimate the outcomes in terms of 18 indicators, highlighting domains requiring urgent changes. These 18 outcome indicators are selected from a condensed Sustainable Development Goals (SDGs) target space^{1,15,16,36} that are intrinsically related to social and environmental impacts of food system transformation (Supplementary Table 1) and belong to three categories: 1) scenario targets, 2) endogenous outcomes from the modeling framework, and 3) results from downstream models. A comprehensive (though incomplete) set of indicators aligned with the SDGs^{16,36} is developed to monitor progress in the Chinese food system. We examine the joint impacts of multiple measures, revealing potential trade-offs in pursuing strategies aimed at public health, environmental sustainability, and livelihoods in isolation during the transformation of the Chinese food system. Promoting a comprehensive food system transformation can maximize co-benefits and minimize trade-offs. This sheds light on areas needing substantial efforts and coordinated governance and implies the importance of synergizing measures in the Chinese food system transformation for enhanced social and environmental progress.

Results

We first assess the social and environmental impacts of the Chinese food system in the BASE_{SSP2} scenario. Under current trends, we project that China's public health would continually face challenges related to malnutrition. The underweight population will approximately halve to 25 million in 2050 relative to 2020, while the prevalence of obesity will increase to 202 million people (Fig. 1). The double burden of malnutrition³⁷ is inextricably linked to suboptimal diets, which are among the top five risk factors that are strongly associated with health and longevity⁵. Animal-sourced and empty-calorie foods account for 52% of daily calorie intake in 2050 (Fig. 3a), leading

- 125 to poorer dietary quality in terms of the Chinese Healthy Eating Index (CHEI) and EAT-Lancet
- 126 Diet Index (EATDI) relative to 2020 (details in Methods). The projected premature mortality
- 127 attributed to suboptimal diets in China will fall by 2 million in 2050 compared to 2020, but still
- 128 amount to 38 million years of life lost (YLLs) annually, equivalent to an economic loss of 966
- 129 billion USD_{17ppp} per year and 1.4% of the country's projected GDP in 2050 (details in
- 130 Supplementary Information).
- 131 The food system is projected to remain a major driver of environmental damage in the BASE_{SSP2}
- scenario assuming no additional measures are implemented, rendering the UN Agenda 2030 for 132
- 133 SDGs and Paris Climate Agreement unachievable even by 2050 (Fig. 1). The projected
- 134 biodiversity intactness index (BII) for all land types (details in Methods) slightly increases in 2050
- by 0.4 points from 73.9 in 2020, even in the absence of specific measures addressing biodiversity 135
- issues. However, the biodiversity hotspot areas in Northern China would remain at lower BII levels 136
- 137 (Fig. 2a). This is largely due to the afforestation driven by the Nationally Determined
- 138 Contributions (NDCs) and the reduction in other natural vegetation (Supplementary Fig. 1).
- 139 Northwest China has even lower crop diversity, measured as Shannon Index (Fig. 2b). Yet, crop
- 140 diversity is crucial for enhancing agricultural resilience and adaptability in the face of changing
- 141 environmental conditions. Annual GHG emissions from agriculture, forestry, and other land use
- (AFOLU) in 2050 would only decrease to 0.7 Gt CO₂eg/yr (Supplementary Fig. 2), indicating that 142
- 143 more ambitions are required to meet the climate neutrality target of 1.5 °C. With inefficient
- 144 fertilizer use and nutrient management, we project a high N surplus of 35 Mt N/yr in 2050, 145
- overshooting the country's N planetary boundary of 26 Mt N/yr^{2,38} and thus exacerbating air and
- water pollution³, particularly in the North China Plain and the Taihu Basin where agricultural 146
- 147 production is concentrated (Fig. 2c). The cumulative N-related emissions from 2020 to 2050 would
- amount to 625 Mt N (Supplementary Fig. 3), of which N₂O emissions constitute 11 Gt CO₂eq. The 148
- 149 violation of environmental water flow requirements is projected to further deteriorate to excessive
- 150 withdrawals of 23 km³/yr (+44%) in 2050, with water scarcity still prevailing in North China (Fig.
- 151 2d).
- 152 With increasing labor productivity, agricultural employment is projected to decline by 93 million
- agricultural workers in 2050 compared to 2020, with 47 million jobs remaining in primary 153
- agricultural production (Fig. 1). Daily food waste would further increase to 927 kcal/capita in 2050 154
- 155 due to increasing income (Fig. 3b), amounting to a total food waste of 126 million tons. This is
- equivalent to 18% of agricultural labor bound to unproductive activities, indicating the large 156
- inefficiency of the food system¹. The population size within the low-income group (i.e., below 157
- 3.65 USD_{17PPP}/capita/day) is projected to decrease by 94% between 2020 and 2050 (Fig. 1). 158
- 159 Despite this substantial improvement, the remaining poor are particularly vulnerable to external
- shocks^{39–41}, highlighting the need for inclusive food system transformation. 160

Co-benefits of China's sustainable food system transformation 161

- 162 To assess the potential benefits and challenges associated with food system transformation in
- 163 China, we examine changes in key indicators within the FST_{SDP} China scenario, compared to the
- 164 BASE_{SSP2} scenario. The FST_{SDP China} scenario represents a pathway towards sustainable
- 165 development of the Chinese food system.
- 166 Regarding public health, the sustainable transformation of the Chinese food system is projected to
- have large benefits in terms of a 76% decrease in premature mortality in 2050 compared to the 167
- 168 BASE_{SSP2} scenario, avoiding a 1% loss of the country's 2050 GDP. Based on our exogenous

169 dietary assumption in accordance with the CDG, the intake of animal-based foods is partly 170 substituted by plant-based foods with a high share of nutritious and healthy vegetables and fruits. The daily intake of animal-based foods (including ruminant meat, pork, poultry, eggs, milk, and 171 172 fish) would be 290 kcal/capita in 2050, a 62% reduction compared with the BASE_{SSP2} scenario. The slightly lower CHEI in 2050 relative to 2020 is mainly attributed to the reduced intake of eggs 173 174 (Supplementary Fig. 4). While our dietary scenario and CHEI both align with CDG 175 recommendations, there is a distinction between the two in terms of their approach. In our scenario, 176 we have established an upper limit on egg intake, whereas CHEI promotes egg consumption 177 without imposing any upper bound. The per capita daily intake of sugar and alcohol would also 178 decrease by 28% and 75%, respectively (Fig. 3a). In contrast, the intake of plant-based foods with 179 high nutrient density would substantially increase. The intake of pulses and oilseeds including 180 soybeans and nuts will increase to 261 kcal/capita/day in 2050, and the intake of vegetables and 181 fruits will increase to 484 kcal/capita/day (Supplementary Fig. 5). The finding corroborates 182 existing studies about the potential health benefits of adopting healthy plant-based diets⁵.

183 Environmentally, in the FST_{SDP China} scenario, natural land with high biodiversity intensity is 184 restored, leading to an overall increase in BII to 75.5 in 2050, while the overall crop area diversity remains unimproved compared to the BASE_{SSP2} scenario (Fig. 1). Spatially, there are substantial 185 186 improvements in BII in Southwest China where biodiversity hotspots are located (Fig. 2a). Crop 187 area diversity in Central and Northeast China would also improve, which are the major areas of 188 grain production (Fig. 2b). In contrast, it would become worse in South China. Land-use change 189 in 2050 compared to the BASE_{SSP2} scenario is featured with decreasing total areas of cropland and 190 pasture by 68 Mha and increasing forest areas of 30 Mha and natural land areas of 37 Mha (Supplementary Fig. 6). The N surplus can be decreased by 46% (16 Mt N/yr) in 2050 compared 191 192 to the BASE_{SSP2} scenario (Fig. 2c) and be operated well below the country's N planetary boundary^{3,38}. Cumulative N-related emissions from 2020 to 2050 can be reduced by 51% 193 194 compared to the BASE_{SSP2} scenario, of which N₂O emissions decrease by 49% (Supplementary 195 Fig. 3). This is largely due to further NUE improvement via fertilization standards for different 196 regions and crops, promoting high-efficiency fertilizers, and adopting new fertilization methods² 197 (Extended Data Fig. 2). The negative annual GHG emissions of 0.6 Gt CO₂eq/yr in 2050 suggest 198 that China can achieve climate neutrality in its AFOLU sector, which is critical for the country's 199 overall climate neutrality target in 2060¹. The eradication of excessive water withdrawals in 2050 200 is feasible in the sustainable transformation pathway (Fig. 2d) where stringent water conservation 201 is introduced jointly with a shift towards healthy diets.

202 For the livelihoods, the food system sustainable transformation in China would lift a large fraction 203 of the population out of the income group below 3.65 USD_{17PPP}/capita/day, by 87% decrease to 204 1.4 million people compared to the BASE_{SSP2} scenario, of which 0.2 million live below the income 205 level of 2.15 USD_{17PPP}/capita/day. This is largely due to the rapid economic growth in China 206 projected by the sustainable development pathway following SSP1. The income inequality is 207 decreased given that there is a decrease in the ratio of mean over median income (Supplementary 208 Fig. 7). The annual expenditure for agricultural commodities is almost halved to 459 USD/capita 209 in 2050 compared to the BASE_{SSP2} scenario, resulting from increased intake of healthy and 210 nutritious foods that are more affordable.

Overall employment in agricultural production is projected to shrink by 32% compared to the 2050

212 BASE_{SSP2} scenario (Fig. 1 and Fig. 3c), indicating the enhanced efficiency of the food system and

213 a structural change. The sustainable transformation pathway entails a 64% increase in labor

214 productivity and assumes 36% higher agricultural wages relative to the 2050 BASE_{SSP2} scenario 215 (Supplementary Fig. 8 and Supplementary Fig. 23). The improvement in labor productivity is 216 accompanied by increased use of capital in agricultural production (e.g., in the form of agricultural 217 machinery). The share of capital costs of total production factor costs is 4% higher than BASE_{SSP2} 218 scenario (Supplementary Fig. 9), suggesting a capital-augmenting and labor-saving technological 219 change. The decrease in production of food crops and livestock products, partly due to the dietary 220 shift towards the recommended food intake target, is another major driver for the reduction in 221 agricultural employment (Supplementary Fig. 10). Additionally, a 49% reduction in food waste 222 relative to the 2050 BASE_{SSP2} (Fig. 3b) frees up 5 million people employed in the labor force 223 otherwise bound to unproductive activities (Extended Data Fig. 2 and Supplementary Fig. 10), 224 indicating an improvement in the overall efficiency of the food system and facilitating labor 225 mobility towards more lucrative sectors^{1,42}. Along with a transition towards a more sustainable 226 energy system, expansion in bio-energy production from 9 to 581 Mt DM provides 5 million 227 additional jobs (15% of total agricultural employment in 2050 FST_{SDP China}) relative to the 2050 BASE_{SSP2} scenario (Fig. 3c) to partly offset the jobs lost in crop and livestock production 228 229 (Extended Data Fig. 2). The proportion of agricultural employment in the total population is 230 expected to decrease by 1.2 percentage points relative to the 2050 BASE_{SSP2} scenario, whereas the share of agricultural employment in rural areas would increase from 11.8% to 12.4% due to high 231 232 rates of urbanization (Fig. 3d). With an aging population in China, despite a decrease of 11.1 233 percentage points in the proportion of agricultural employment in rural areas, there will be an 234 additional 13.9 percentage points of agricultural employment over the age of 55 in 2050 relative 235 to 2020 (Fig. 3c).

236 Trade-offs and co-benefits between public health, the environment, and

237 livelihoods

China's food system transformation pathway (FST_{SDP_China}) generates substantial co-benefits for public health, the environment, and livelihoods. However, policy measures in China are often initiated and implemented by individual sectors and ministries, leading to less coordinated transformations. To understand the effects of these sector-specific measures, we also examine the package scenarios of *Diets*, *SustEnvironment*, and *Livelihoods*. This approach provides evidence of the co-benefits and trade-offs in the absence of fully coordinated transformation pathways (Fig.

4 and Extended Data Fig. 3).

245 The scenario *Diets* exhibits the highest level of co-benefits in terms of outcomes among the three 246 sets of measures (Extended Data Fig. 3b). Moving towards diets better aligned with the CDG synergistically improves nutrition and health outcomes (Fig. 4c) can reduce poverty (Fig. 4c) and 247 agricultural employment (Fig. 4g), and has positive impacts on the environmental outcomes (Fig. 248 249 4b, d). The transition to diets with higher intake of plant-based foods entails GHG emissions 250 reductions within the AFOLU sector (Fig. 4d). Crop area diversity increases compared to the 2050 251 BASE_{SSP2} scenario (Fig. 4b), in particular for most of China's major grain production areas 252 (Supplementary Fig. 11b). Improving diets leads to a 29% decrease in agricultural employment in 253 2050 relative to the BASE_{SSP2} scenario (Fig. 4g), as the primary contributor to structural transformation and efficiency enhancement of the food system. With regards to the three individual 254 255 measures in the *Diets* scenario, the reduction in per capita daily total calorie intake in this scenario 256 results in a 0.9% decline in agricultural employment (Supplementary Fig. 10). The reduction in food waste reduces agricultural employment by 10% while shifting Chinese diets in concert with 257 258 the dietary guideline contributes to a 19% reduction of agricultural employment. Animal-sourced 259 food consumption (i.e., food intake and waste) will reduce by 64% in 2050 compared to the 260 baseline level, leading to a 58% (15 million) reduction in employment in livestock production and 77% decline in feed production (from 7.2 million to 1.6 million) (Supplementary Fig. 12). Despite 261 262 the overall downward trend of agricultural employment, it is worth noting that shifting food consumption in accordance with the dietary guideline increases consumption of plant-based foods 263 264 including vegetables, fruits, pulses, and nuts, which is expected to employ an additional 4.1 million 265 people.

In the SustEnvironment scenario, there are substantial environmental benefits but trade-offs with 266 livelihoods. Indicators related to biodiversity are improved since land use is the most dominant direct driver of anthropogenic biodiversity loss and the set of measures leads to targeted restoration of areas with high biodiversity along with a decrease in cropland and pasture areas (Supplementary 270 Fig. 11). The targeted protection of environmental water flow requirements does not have major adverse impacts on the other environment indicators (Extended Data Fig. 3c). The reform of China's fertilizer policies, including the imposition of stringent fertilizer prices and the improvement of NUE, reduces nitrogen pollution and supports the restoration of natural lands and 274 reduction of agricultural water use and N surplus (Supplementary Fig. 11). Our model results indicate that there are slightly negative impacts on livelihoods when improving environmental sustainability (Fig. 4f, h, i). Maintaining the same level of agricultural wage, there would be an increase in both low-income population and agricultural employment compared to the BASE_{SSP2} scenario in 2050. This is largely due to two specific measures, namely, AgroMitigation and NitrogenEfficiency, which generate higher production costs and expenditure on agricultural 280 products (Extended Data Fig. 2), thus enlarging the agricultural economy. Within the environmental protection domain, crop area diversity (Fig. 4e) is negatively affected, indicating internal trade-offs within the environmental protection domain. This is partly due to the stringent biodiversity and GHG Mitigation measures leading to more intensified crop production which may 284 unintentionally limit crop diversification (Supplementary Fig. 11b).

The Livelihoods scenario prioritizes enhancing livelihoods, characterized by higher agricultural wages, increased labor productivity, rapid economic growth, and low population growth. The assumed increase in agricultural wages plays a crucial role in supporting the income growth of agricultural workers. The population in the low-income group below 3.65 USD_{17PPP} per capita per day in China would decrease to 1.4 million people even though agricultural employment faces a sharp decline (Fig. 4i). It is worth noting that the emphasis on social outcomes can have mixed impacts on public health and environmental sustainability. There are both decreases in the underweight population and premature mortality in 2050 (Fig. 4a), while the number of people with obesity is projected to increase to 227 million in 2050 due to the persistence of suboptimal diets along with the growing income, characterized by a high consumption of red meat (Extended Data Fig. 3d). Concerning the environmental outcomes, GHGs emitted in the AFOLU sector would decrease by 354 Mt CO₂eq mainly due to the external energy transition in the context of overall sustainable development (Fig. 4f). However, biodiversity (Fig. 4h), crop area diversity (Fig. 4e), and water scarcity (Fig 1) are expected to further deteriorate relative to the baseline level. The expansion of bioenergy production could lead to more severe water scarcity and a decrease in crop area diversity due to the cultivation of bioenergy crops. To provide materials for the bioplastic and construction industries, there would be a decrease in BII due to the growing timber demand (Extended Data Fig. 2).

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Discussion

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- 305 Our model results underscore that most outcomes in the BASE_{SSP2} scenario, even by 2050, are not aligned with the UN Agenda 2030 for SDGs and the Paris Climate Agreement. Under current 306 307 trends, the Chinese food system is expected to continuously pose nutrition and health challenges. 308 Specifically, the double burden of malnutrition due to poor dietary quality persists, with diet-309 related premature mortality amounting to 1.4% of the country's projected GDP in 2050. The 310 environment further degrades, including deteriorating environmental water flows, overshooting 311 the N planetary boundary, and increased GHG emissions. Meanwhile, 18% of the country's 312 agricultural employment is still bound to activities that produce waste and 10.5 million people 313 would live below the income level of 3.65 USD_{17PPP}/capita/day in 2050.
- 314 Substantial social and environmental progress in the Chinese food system is contingent on the joint implementation of multiple measures spanning public health, the environment, and livelihoods. 315 Our model results highlight the need for a comprehensive and coordinated approach, such as the 316 food system transformation pathway, to address these interlinked challenges in the Chinese food 317 318 system. Achieving SDG 2 (Zero Hunger) and SDG 3 (Good Health and Well-being) is feasible by 319 eliminating undernutrition and halving the prevalence of obesity through the shift towards healthier diets in accordance with the recommended dietary guidelines^{12,19}. Efforts in climate 320 mitigation and ecological conservation not only improve overall biodiversity and critical 321 322 ecosystem services but also contribute to net zero GHG emissions in the AFOLU sector, resonating 323 with SDG 6 (Clean Water and Sanitation), SDG 13 (Climate Action) and SDG 15 (Life on Land). 324 Progress in socioeconomic development and lifestyle transformations acts as catalysts for income growth and employment restructuring, which are closely associated with SDG 1 (No Poverty), 325 326 SDG 8 (Decent Work and Economic Growth), and SDG 10 (Reduced Inequalities).

Reconciling trade-offs in China's food system transformation

328 Trade-offs and co-benefits arise in the proposed food system transformation in China. For instance, 329 stringent biodiversity and GHG mitigation efforts in the SustEnvironment scenario may 330 unintentionally reduce crop diversification and exacerbate poverty, impacting low-income populations who rely on diverse crops for dietary quality⁴⁴ (Extended Data Fig. 2). In the 331 332 Livelihoods scenario, measures for energy transition and capital substitution may adversely affect 333 crop area diversity and the adherence to regional nitrogen surplus boundaries (Extended Data Fig. 334 2). The Diets Scenario emphasizing changing food consumption is found to be the most synergistic 335 among the three package scenarios (Extended Data Fig. 3). Particularly, adhering to the recommended dietary guidelines is a crucial lever for transforming the Chinese food system 336 towards sustainability^{1,12,13,31}. In line with the existing studies on dietary transformation^{13,15}, 337 338 dietary shift has the potential to generate substantial positive impacts on multiple indicators related 339 to the sustainability of the food system, such as reducing GHG emissions, improving public health 340 outcomes, and preserving natural land and water resources.

Addressing negative impacts requires a combination of measures that reconcile trade-offs across public health, the environment, and livelihoods. Our model results indicate that the integration of these three package scenarios shows large improvements across all indicators, confirming the effectiveness of coordinated policy approaches. The agricultural sector faces a decline, with employment projected to decrease to 2.4% of the total population by 2050, similar to trends in the United States (0.8%) and Japan (1.7%) in 2020⁴⁵. An aging agricultural workforce with 51% of its workforce over the age of 55 by 2050, yet younger than Japan's current average age of 66.8 years⁴⁶.

348 The exit of smallholder farmers can facilitate land consolidation and agricultural mechanization,

349 supporting our expectations of continued growth in agricultural wages and labor productivity.

350 However, additional policy measures are necessary to support both the sector and farmers.

351 Agriculture support in terms of subsidies in China increased from 9.5% of production value in

352 2000–2002 to 17.6% in 2019–2021⁴⁶, but distortions due to subsidies suggest a need for

353 reallocation towards infrastructure investment, research on nutritious and sustainable food

354 alternatives⁴⁷, and safety nets for vulnerable groups in rural areas^{34,48}. The EU Common

355 Agricultural Policy serves as a model for smoothing transitions, emphasizing direct payments,

investments in research and development, training for unskilled labor, and rural development.

357 Potential new employment opportunities are emerging in other sectors such as bioenergy

production. Bioenergy with Carbon Capture and Storage (BECCS) could offset part of the negative

359 impacts of the food system transition on employment and also contribute to GHG emissions

360 reduction⁴⁹. Moreover, broadening the scope has the potential to transform the nutrition and health

industry into a powerful driver of both health improvement and livelihoods. This holistic approach

362 considers not only the health outcomes but also the environmental and livelihood issues, creating

363 new employment opportunities across various sectors, including caregiving, nursing, medical

services, and food and nutrition education¹.

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A guiding pathway to support evidence-based policymaking

366 This study provides a detailed analysis of potential measures for transforming the Chinese food system and identifies domains where urgent changes are needed. By doing so, we offer model-367 368 based insights on where significant efforts should be devoted, where coordinated governance is 369 required, and which combined measures are needed. A sustainable food system can only be 370 reached through coordinated governance because of the wide range of social and environmental 371 problems connected to the food system. The food system needs diverse and varied policy 372 instruments due to its greater complexity compared to the energy system, and a single measure 373 like GHG pricing alone is insufficient¹. Our findings support the establishment of a monitoring 374 framework to inform future actions and policies for the Chinese food system transformation

375 towards achieving the UN Agenda 2030^{16,42}.

376 Changing dietary behaviors is essential yet challenging, requiring large shifts in individual and societal practices^{1,50}. Educational programs, information provision^{51,52}, and behavioral nudges can 377 raise awareness of food choices⁵³, while regulations or taxation can provide economic incentives 378 to promote sustainable food choices⁵⁴. In the distinct context of Chinese food culture, refining the 379 national dietary guidelines to incorporate the Eastern healthy dietary pattern¹⁹, the planetary health 380 381 diet¹², and elements of Chinese cuisine specialty can help navigate the food system transformation. 382 Technological innovations in cold-chain logistics, high-barrier packaging, and blockchain can further reduce food loss and waste, enhancing food safety and quality⁵⁵. Financial support, income 383 transfers, and investments in infrastructure and technological innovation are crucial for the 384 385 adoption of green technologies and the enhancement of human capital. These efforts not only 386 contribute to productivity growth and sustainable agriculture but can alleviate poverty^{15,25}.

Policy measures are under the responsibility of various governmental branches and their success can hinge on coordination with other measures. While understanding individual measures is crucial for implementing transformation pathways, coordinating policies to balance sustainability aspects is equally important. A coordinated governance system is necessary to align policies for cobenefits and minimize trade-offs, which is particularly challenging in China's sector-specific policy environment. A rigorous, science-based monitoring framework can facilitate evidencebased policymaking and hold key actors accountable during the transformation process^{1,42}. Moreover, the country's localized initiatives can have a substantial impact on the global food system through the international market. By adopting eco-labeling and certification schemes, China can foster environmentally friendly practices among its trade partners⁵⁶. As a major importer of agricultural products, the monitoring framework of China's food system transformation can better facilitate global food system transformation.

399 Several caveats should be considered when interpreting our results. While we cover a broad range 400 of indicators, it addresses a subset of the potential social and environmental impacts of China's 401 food system transformation. Future research should aim to include a more comprehensive 402 representation of SDG indicators. Employing a globally consistent poverty model, we analyze 403 poverty and inequality at the country level, but future research can incorporate more national 404 datasets for a deeper understanding. We recognize the need to consider uncertainty in model results. 405 This study extends the assessment scope by including livelihoods, in addition to health and environmental impacts, which increases the complexity of conducting a systematic sensitivity 406 407 analysis. Therefore, we conduct a sensitivity analysis based on different combinations of socioeconomic and climate change pathways, and different poverty lines, detailed in the 408 409 Supplementary Information. A comprehensive uncertainty analysis, while beyond the scope of this 410 study, can be considered for future research.

411 Methods

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412 MAgPIE-China

413 The cornerstone of this analysis relies on the MAgPIE (Model of Agricultural Production and its 414 impact on the Environment) partial equilibrium model³², which is an agro-economic land system model designed to minimize costs while satisfying the demand for agricultural products. The 415 416 model is developed to describe the land and food sectors and assess the associated consequences 417 for sustainable development under different future scenarios. A more detailed description of the 418 MAgPIE model can be found in the Supplementary Information. To facilitate the study of China's 419 food system transformation pathways, we further develop a China-specific version of the MAgPIE land system modeling framework (MAgPIE-China) to incorporate China-specific data and 420 421 conditions. Taking into account China's fertilizer policy reform, we estimate the changes in N 422 fertilizer price and the efficiency of agricultural nutrient management induced by the reform and 423 introduce them into the MAgPIE model². For specific water protection measures in China, we set 424 an upper limit on agricultural freshwater use. Further, we calibrate China's agricultural irrigation 425 efficiency using Chinese official data (0.536 in 2015, 0.565 in 2020) and targets (0.58 for 2025, 0.6 for 2035)³⁵. We also consider the policy of maintaining minimum cropland³⁴ in the model with 426 427 a threshold of 120 million hectares. These China-specific measures are applied across all scenarios 428 in this study. The model runs in a dynamic recursive manner from 2020 to 2050 with a five-year 429 interval. This study uses a mapping of 16 world regions and 200 simulation units (Supplementary 430 Fig. 13) according to their geo-economic conditions. The regional environmental outcomes are 431 further disaggregated to 0.5-degree resolution.

In accordance with the food system modeling framework applied in the analysis of a global food system transformation pathway¹⁶, MAgPIE-China is linked to several models to cover health, environmental, and livelihoods outcomes. The food intake and food waste are estimated based on a food demand model, driven by demographic composition of the population, physical activity level, body height distribution, and income⁴⁷. Dietary composition shifts are projected for four major food categories: animal-sourced foods (including ruminant meat, pork, poultry, eggs, milk, and fish); empty-calorie foods (including oils, sugar, and alcoholic beverages); vegetables, fruits, and nuts; and staple foods. The four groups are then further divided into 25 food items based on the relative share of individual food products within major food groups. The biophysical information including crop yields, water requirements, carbon stocks, and water availability are input from a vegetation, crop, and hydrology model LPJmL (Lund-Potsdam-Jena model with managed Land)⁵⁷. The terrestrial biodiversity is assessed using BII^{58,59}, which measures net changes of organism abundance based on the loss of forest, non-forest vegetation, and age-class vegetation. A poverty model²⁵ is run as a post-processing of the MAgPIE-China model results. The macro-economy and energy model REMIND⁶⁰ provides bioenergy demands and GHGs prices. Furthermore, the food demand model is linked with a health model to estimate the health impacts of dietary transition⁶¹.

Health model

- We employ a comparative risk assessment (CRA) method⁶¹, which links changes in risk factors such as high consumption of red meat, reduced consumption of fruits and vegetables, being underweight, and overweight to changes in cause-specific mortality. The endpoint diseases
- 453 considered in this study include coronary heart disease (CHD), stroke, type-2 diabetes mellitus

454 (T2DM), cancer (in aggregate and as colon and rectum cancers), and respiratory disease. The 455 baseline body weight distribution and the corresponding energy intake are projected based on a 456 regression model using country, sex, and age-specific anthropometric data⁴⁷. The relative risk 457 estimates are adopted from a meta-analysis of prospective cohort studies^{62–66}. The age-specific

458 mortality and population data are adopted from the Global Burden of Disease project⁶².

459 Two dietary indices, the Chinese Healthy Eating Index (CHEI) and the EAT-Lancet Diet Index (EATDI) are calculated to understand the overall dietary quality across scenarios. The CHEI is 460 developed based on the CDG and Chinese dietary habits^{67,68}. In China, the intake of 12 food groups 461 462 (total grains, whole grain, mixed beans, tubers, total vegetables, dark vegetables, fruits, dairy, 463 soybean, fish and seafood, poultry, eggs, seeds, and nuts) should be increased, while the intake of five food groups (red meat, cooking oils, sodium, added sugar, and alcohol) should be decreased 464 465 to reach a moderate level. Higher scores on the CHEI indicate better adherence to the CDG. As the MAgPIE-China model does not consider whole grain, mixed beans, and sodium, these groups 466 are excluded from our calculation. A detailed scoring standard of the CHEI can be found in Yuan 467 468 et al.⁶⁷. The EATDI is a metric for gauging how closely people adhere to the EAT-Lancet diet⁶⁹. 469 The index consists of 14 food groups, including seven emphasized food groups (vegetables, fruits, 470 unsaturated oils and palm oil, legumes, nuts, whole grains, and fish) and seven limited groups (beef 471 and lamb, pork, poultry, eggs, dairy, potatoes, and added sugar). Each food group is given a score 472 of 0-3, and a higher score indicates higher adherence to the intake target. Since the index is based 473 on an energy intake of 2500 kcal/capita/day, we rescale the intake of each group according to total 474 calories across scenarios when calculating the EATDI.

Poverty model

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To project the income distribution, we apply an inequality and poverty post-processing model built 476 originally for global REMIND-MAgPIE scenarios²⁵ to the MAgPIE-China scenarios. Starting 477 from scenarios of the Gini coefficient for the Shared Socioeconomic Pathways (SSPs)⁷⁰, we 478 479 account for food expenditure changes due to food system measure implementations by calculating 480 their impacts on real incomes and inequality levels. Future poverty headcounts under different 481 poverty lines are estimated using the new average income and Gini coefficients, with a regression 482 model fit to recent World Bank poverty and inequality data of around 130 countries. We notice 483 that this globally calibrated model may underestimate the pace of poverty reduction in China in 484 recent years (i.e., reporting higher poverty headcounts than the latest historical data). An exact 485 comparison is complicated by the effects of the COVID-19 pandemic. We also implement a 486 redistribution of tax revenue to the population in scenarios with CO₂ taxes, where the increased 487 production costs lead to higher expenditure on agricultural products and lower real income. Further, 488 a redistribution without changing the level of inequality to the entire population is assumed in the 489 MinWage scenario as we cannot specify the agricultural income and income from other sources in our data¹⁶. 490

Scenario design

We explore the sustainable development pathways of the Chinese food system by adopting a systematic approach aligned with a global sustainable food system transformation while explicitly considering impacts with regard to public health, the environment, and livelihoods^{15,16}. Additionally, we consider three sets of food system measures representing distinct transformation pathways that prioritize public health, the environment, and livelihoods, respectively, to understand the co-benefits and trade-offs among proposed indicators. Based on the policy

- 498 background of China, we implement specific measures on diet, nitrogen, water, and cropland
- 499 management for China, while the rest of the world still follows general settings in each scenario
- that is in accordance with the global study^{15,16}. 500

501 BASE_{SSP2}

- 502 The BASE_{SSP2} scenario is the baseline for our study. We use the Shared Socioeconomic Pathway
- (SSP) projections for regional development of GDP, population, physical activity level, etc. The 503
- BASE_{SSP2} scenario follows the *middle-of-the road* (SSP2) path which projects no significant shift 504
- 505 from historical patterns. Meanwhile, climate change impacts are taken into account in the
- 506 projections of yields, water demand and availability, carbon, and land dynamics. To reflect
- regional efforts on combating climate change, the NDCs are adopted for future afforestation. Food 507
- 508 demand and waste are modelled endogenously, driven by socioeconomic factors and demographic
- 509 trends derived from historical data, calibrated to align with regional food demand reported in
- FAOSTAT⁷¹. All mapped regions follow these settings in this baseline scenario. 510

511 Food System Transformation in the Context of a Sustainable Development Pathway in China

512 (FST_{SDP China})

- 513 The FST_{SDP China} scenario incorporates targeted efforts in China to promote healthy diets, improve
- nitrogen management, and enhance water management, alongside global actions for a 514
- comprehensive transformation of the sustainable food system (FST_{SDP})¹⁶. For diets and food 515
- 516 demand, divergent from the baseline level determined endogenously in BASE_{SSP2}, this scenario
- 517 follows a convergent transition from 2020 to 2050, aligning with the dietary intake targets
- 518 exogenously set in accordance with the CDG¹⁹. With respect to nitrogen, we first employ a
- 519 difference-in-differences (DID) econometric method and country-representative household-level
- 520 survey data in China to estimate the effects of the policy of "Zero Growth in Synthetic Fertilizer
- 521 Use" on fertilizer use and yields. We then incorporate the changes in nitrogen inputs and outputs
- 522 into the nitrogen budget to estimate the changes in soil nitrogen uptake efficiency (SNUpE), which
- 523 is used as a parameter for the improvement of agricultural nutrient management efficiency in the
- 524 model. Detailed information about the parametrization of SNUpE is documented in Wang et al.².
- 525 For the whole world, a comprehensive food system transformation scheme is adopted from
- Bodirsky et al. 16. The food system transformation aims at global sustainable development and 526
- 527 simultaneously implements policy measures concerning healthy diet, environment protection, and
- 528 livelihood improvement. While China gradually follows the CDG, we assume the dietary structure
- 529 of countries and regions except China's transition towards diets proposed by the EAT-Lancet
- Commission¹². Compared with the baseline scenario, a food waste target is proposed which begins 530
- 531 in 2020 and achieves in 2050 with a linear convergence speed. Further, a no underweight and half
- 532 overweight target is included for all regions.
- 533 The socioeconomic drivers follow the Sustainability pathway (SSP1). The trade barriers are
- 534 reduced and a global wage lower bound is set. Similar to countries with high capital intensity
- worldwide, the substitution ratio of labor by capital in China is also assumed to be capped. Biomass 535
- demand rises due to increased use in bioplastic production, and a greater quantity of wood is 536
- 537 utilized as the construction material. Sustainable development in the energy sector also impacts
- 538 the food system.
- 539 Regarding land management, 30% of the global land area will be under protection by 2030, and
- global afforestation is limited to a maximum of 500 Mha in only tropical area⁷². Simultaneously, 540

- the NDC targets (138 Mha of afforestation areas for China by 2030) remain valid at the regional
- level. Longer crop rotations are incentivized with payments. The non-agricultural water demand
- 543 follows the SSP1 projection. Regarding GHG pricing, carbon pricing is included with a budget of
- 544 900 Gt CO2eq to disincentivize CO2 emissions from land-use change, and to incentivize
- re/afforestation or peatland rewetting. Technical mitigation measures for methane mitigation of
- respective emission sources are introduced via feedback on abatement costs. For biodiversity, zero
- 547 reduction of aggregated BII in all biomes of each biogeographic realm in each world region is
- 548 implemented after 2020.
- 549 Three respective sets of food system transformation measures (*Diets*, *SustEnvironment*, and
- 550 *Livelihoods* scenarios)

- Three measure sets, Diets, SustEnvironment, and Livelihoods are singled out from FST_{SDP_China} as
- 552 individual transformation schemes focusing on fostering improvements in public health, the
- environment, and livelihoods, respectively (Extended Data Table 1). Diets focuses on improving
- 554 public health by promoting a shift towards sustainable and health-conscious dietary patterns in line
- with CDG and EAT-Lancet guidelines, while also striving to cut food waste to 20% of food intake
- 556 levels by 2050. SustEnvironment is dedicated to addressing environmental concerns,
- encompassing measures of emission pricing, preserving land, crop rotation, water conservation,
- maintaining biodiversity, mitigating agricultural emissions, enhancing nitrogen use efficiency, and
- 559 protecting landscapes. Livelihoods aims to improve livelihoods, incorporating the strategic
- 560 involvement of national institutions and governance measures including adopting sustainable
- socioeconomic pathways, supporting liberalized trade, advancing energy transition, providing
- agricultural materials for bioplastic, and using more wood for construction materials.

564 Code availability

- The MAgPIE code, including the food demand model, is available under the GNU Affero General
- Public License, version 3 (AGPLv3) via GitHub (https://github.com/magpiemodel/magpie). The
- 567 release (version 4.6.5) used in this paper can be found via Zenodo
- 568 (https://doi.org/10.5281/zenodo.7782037). The technical model documentation is available at
- 569 https://rse.pik-potsdam.de/doc/magpie/4.6.5/). Additional codes and details for all the
- 570 participating models tailored to China can be provided upon reasonable request. Data analysis was
- 571 conducted using R (version 4.1.3), GAMS (version 38.3.0), and the libraries of Potsdam Integrated
- Assessment Modelling (PIAM) (https://github.com/pik-piam).

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585 Contributions

- 586 X.W., B.L.B., M.St. and H.L.-C. conceptualized the study. X.W., H.Ca., J.X., R.D., B.L., B.L.B.,
- 587 M.St., C.Y., M.C., F.B., M.X., H.Ch., M.Sp., D.L., D.M.-C.C., F.H., P.v.J., B.S., J.P.D., C.M.,
- A.P. and H.L.-C. contributed data and devised the methodology, X.W., H.Ca., J.X., R.D., B.L.,
- 589 B.L.B., M.St. and H.L.-C. performed the analysis and interpreted the results. H.Ca., J.X., R.D.,
- 590 M.C. and X.W. produced the visualizations, X.W. and H.L.-C. acquired the funding, X.W., M.St.,
- 591 Q.C. and H.L.-C. managed the project administration. X.W., H.Ca., J.X., R.D., B.L. and L.Y.
- 592 wrote the original draft. X.W., H.Ca., J.X., R.D., B.L., B.L.B., M.St., C.Y., L.Y., M.C., D.M.-C.C.,
- 593 S.F., B.S., J.P.D., C.M., A.P. and H.L.-C. participated in discussing the results. All authors
- 594 contributed to reviewing and editing the manuscript.

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598 Competing interests

The authors declare no competing interests.

Table 1. Key attributes and assumptions of the scenarios considered in this study.

Scenarios	Socioeconomic pathway	Key attributes
BASE _{SSP2}	SSP2	Current trends following SSP2
Diets	SSP2	A transition towards healthy and nature-positive diets along with reducing food waste
SustEnvironment	SSP2	Strong efforts on climate mitigation and ecological conservation in the AFOLU sector
Livelihoods	SSP2	Faster socio-economic development and progress on sustainable and shared growth
FST _{SDP_China}	SSP1	A holistic food system transformation in the context of a sustainable development pathway in China. Policy measures in three package scenarios are jointly implemented.



Fig. 1. Health, environmental, and livelihood indicators associated with the Chinese food system under the BASEssp2, FSTsdp_china, and three package scenarios. The color schemes indicate positive (green) and negative (red) impacts on indicators relative to the values in the 2050 BASEssp2 scenario. Grey cells with values indicate that these output indicators are not affected by the policy measures of the respective scenarios.

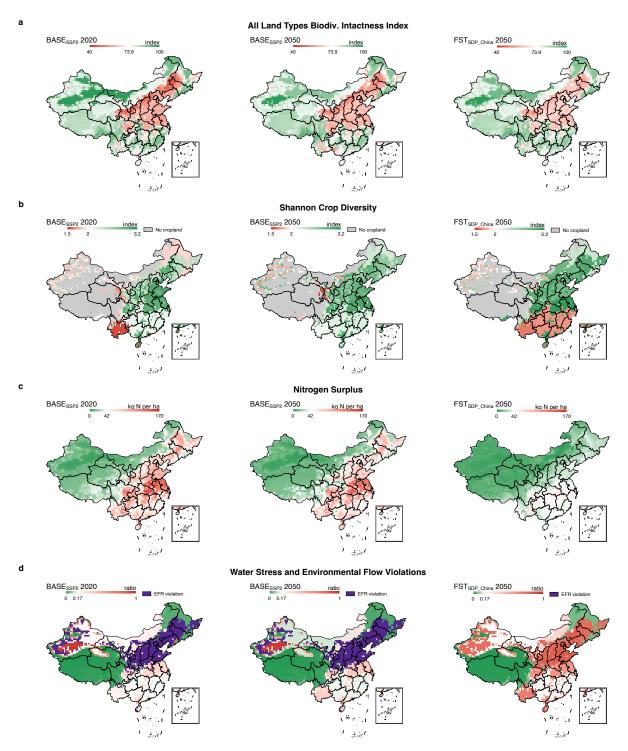


Fig. 2. Spatially explicit environmental indicators in the BASEssp2 scenario for the years 2020 and 2050, and in the FSTsdp_China scenario for the year 2050. (a) Biodiversity Intactness Index for All Types of Land. (b) Shannon Index of Crop Area Diversity. (c) Nitrogen Surplus. (d) Water Stress and Environmental Water Flow Violations. Green color refers to a better status, while red color refers to a worse status. In panel b, grids without cropland are filled with grey color. In panel d, purple color refers to areas where there are violations of environmental flow requirements. The cut-off numbers for panels in all columns correspond to the average values in 2020 BASEssp2 scenario.

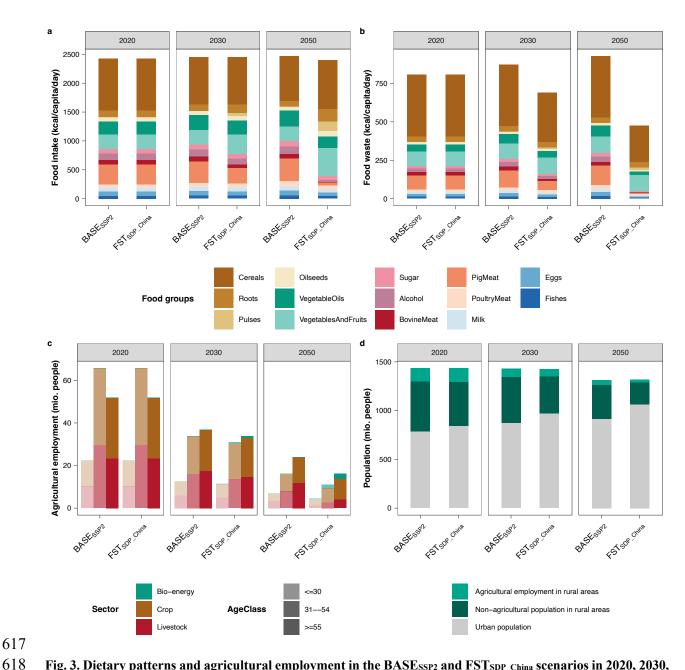


Fig. 3. Dietary patterns and agricultural employment in the BASE_{SSP2} and FST_{SDP_China} scenarios in 2020, 2030, and 2050. (a) Intake of specific food groups. (b) Amounts of food waste by food groups. (c) Agricultural employment in bio-energy, crop, and livestock production across the age classes. (d) Distribution between urban and rural population and distribution between agricultural employment and non-agricultural population in rural areas.

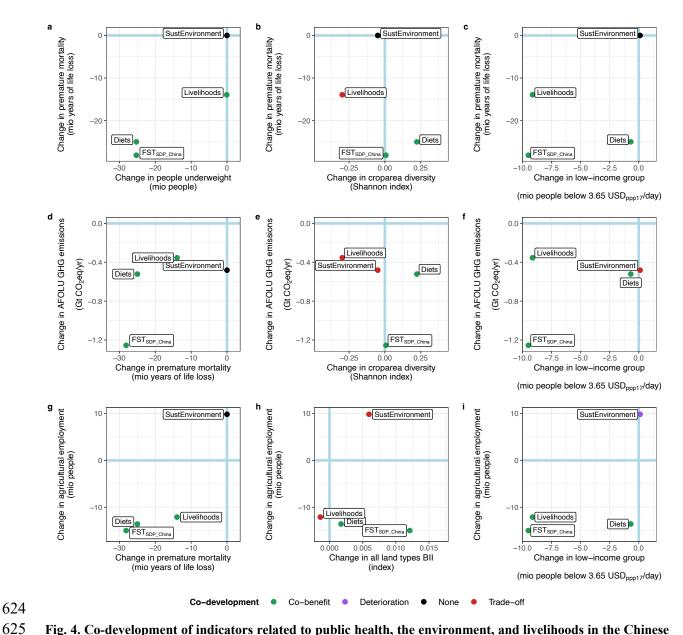


Fig. 4. Co-development of indicators related to public health, the environment, and livelihoods in the Chinese food system. Each panel illustrates the changes in two indicators compared to their baseline levels in 2050. One indicator is plotted on the y-axis (label on the left-hand side) and the other indicator is on the x-axis (label at the bottom). The light-blue vertical line in each panel shows the reference level in 2050 for the x-axis indicator, and the light-blue horizontal line shows the reference level in 2050 for the y-axis indicator. The co-development status of each pair of indicators is represented by the color of the point. A purple point represents both indicators deteriorating together in the respective scenarios. The black color indicates no co-development for the pair of indicators. The green color shows a co-benefit between the two indicators, while the red color refers to a trade

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