# **Supplementary information**

# A meta-analysis of projected global food demand and population at risk of hunger for the period 2010–2050

In the format provided by the authors and unedited

# A meta-analysis of global food demand and population at risk of hunger projections for the period 2010-2050 - Supplementary Information

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### A Construction of Global Food Security Projections Database

### A.1 Harvesting of global food security projections

As part of the systematic literature review, we identified which global food security indicators were quantitatively assessed by the selected studies. In line with previous research (Dijk and Meijerink 2014), global food security assessments mainly covered four food security indicators: food demand (measured in kcal/cap/day), population at risk of hunger (measured as number or share of persons being undernourished), food prices (for maize, rice and wheat) and childhood undernutrition (measured as the number or share of children being undernourished). A few studies provided projections for comparable indicators but defined at a different scales (e.g. total food price instead of crop specific prices or demand expressed in value instead of energy terms) as well as other indicators, such as stunting (Lloyd et al. 2011; Ishida et al. 2014) and protein consumption (Billen, Lassaletta, and Garnier 2015; Msangi and Batka 2015; Medek, Schwartz, and Myers 2017). Figure S1 shows the coverage of the four main indicators by the selected studies. For practical reasons we decided to focus on the two indicators with the highest coverage: Per capita food demand (65%) and population at risk of hunger (37%).

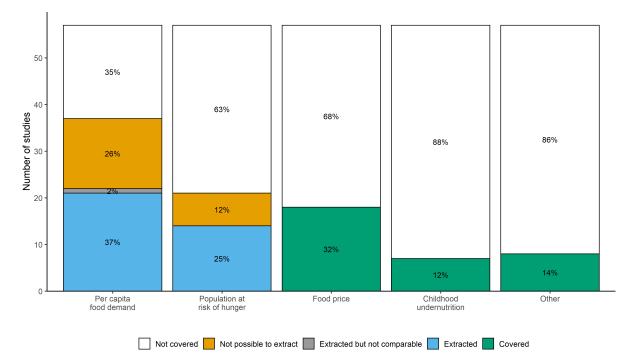


Figure S1: Coverage of the main food security indicators by the 57 selected studies from the systematic literature review. Only for food demand (expressed in kcal/cap/day) and population at risk of hunger (measured as number or share of persons being undernourished) an effort was made to extract the data and therefore a decomposition of the coverage into (1) Not possible to extract, (2) Extracted but no comparable and (3) Extracted is presented. For food price (for maize, rice and wheat), childhood undernutrition (measured as the number or share of children being undernourished) and a number of other indicators only the total number of studies that covered these indicators is presented but no further actions were undertaken to harvest the data.

Where possible we harvested data from the supplementary information and from the main paper itself. In a few cases, we were able to use the WebPlotDititizer tool (https://automeris.io/WebPlotDigitizer/) to extract information that was only presented in the form of charts. If data was still missing, we also tried to contact the authors, who sometimes provided additional information. Out of the 57 selected studies, we were able to extract relevant information from 26 studies (46%), including 21 (38%) for per capita food demand and 14 (25%) for population at risk of hunger (Figure S2).

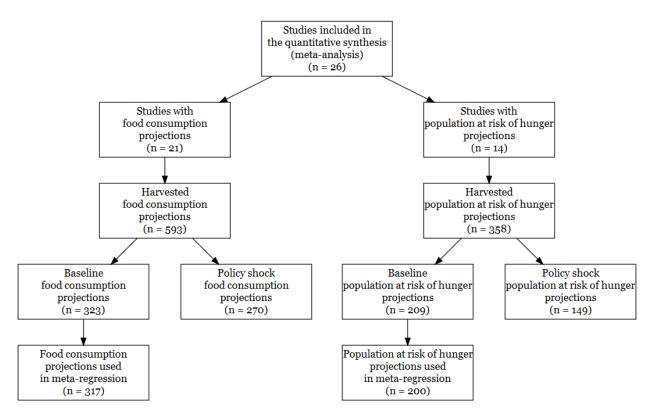


Figure S2: Selection of studies and projections for quantitative synthesis and meta-regression. Several studies present projections for per capita food consumption as well as population at risk of hunger. A small number of baseline projections could not be mapped to the SSPs/RCPs (Figure S4) or were considered as outliers (see text) and were therefore excluded from the meta-regression.

Figure S3 shows for each of the 26 studies, which indicators could be extracted. The following reasons prevented us from extracting data from all studies:

- 1. *Indicator not presented*. Not all studies presented projections for per capita demand and population at risk of hunger.
- 2. Incomplete quantitative information. In many cases only growth figures were presented, while base year information was missing.
- 3. Not possible to digitize information. Sometimes the data was only provided in the form of maps or charts from which it was impossible to extract information
- 4. Not possible to map projections to the SSPs or RCPs. Due to different assumptions, several projections could not be mapped to one of the SSPs or RCPs.
- 5. Differences in the definition of an indicator. In a few cases, the harvested data appeared not to be comparable with data from other studies due to differences in definition. This was the for instance the case for Tilman et al. (2011), who presented food demand projections in kcal/cap/day but also appear to include the demand for feed, resulting in much larger values.

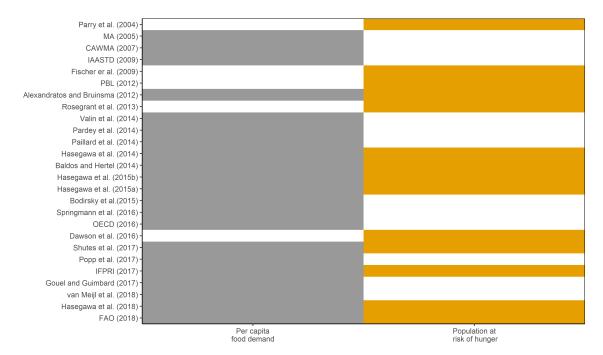


Figure S3: Coverage of per capita food demand and population at risk of hunger

### A.2 Mapping to the SSPs and RCPs

We were able to harvest data for 593 per capita food demand and 358 population at risk of hunger projections (Figure S2). To make the projections comparable across studies we mapped the scenario assumptions underlying the projections to the Shared Socio-economic Pathways (SSPs). The SSPs are a set of five storylines that describe potential but realistic global futures: Sustainability (SSP1), Middle of the Road (SSP2), Regional Rivalry (SSP3), Inequality (SSP4) and Fossil-fueled Development (SSP5) (Vuuren et al. 2017; O'Neill et al. 2017). They were designed for climate change assessments but are increasingly used for the evaluation of other global issues. Around 88-90% of the harvested projections were already based on the SSP framework (Figure S4).

For the remaining studies, we used Vuuren et al. (2012) and Vuuren and Carter (2014), who demonstrated that assumptions of many global socio-economic scenarios (including the SSPs) are comparable and can be classified into five archetypal scenario 'families.' We assumed that projections based on the SSPs and projections based on scenarios with the same characteristics (i.e. belonging to the same 'family') can be directly compared. In all other cases, we reviewed the storylines and assumptions underlying the projections and allocated them to the SSPs with comparable characteristics. We labeled all projections that were produced using the SSP storylines as 'Pure' SSP projections. Projections that were based on different storylines and/or drivers but belonged to the same scenario family as one of the SSPs were labeled as 'Derived' SSP projections. In a few cases, we were not able to categorize the projections and therefore labeled them as 'No Class' (Table S1)

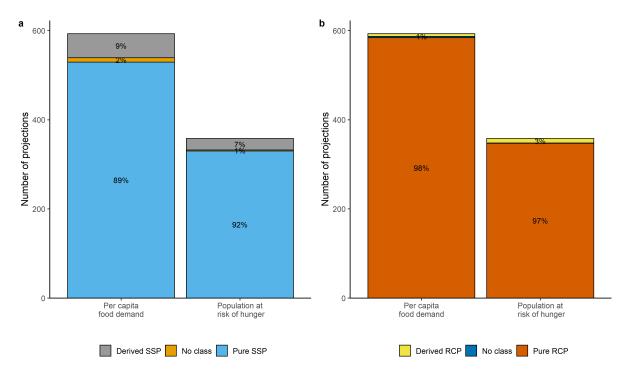


Figure S4: Mapping of projections (including baseline and policy shock types) to the SSPs (a) and RCPs (b). Pure SSPs/RCPs are projections that use the SSP/RCP framework. Derived SSPs/RCPs are projections that were mapped to the SSPs/RCPs using. No class refers to projections that could not be mapped to the SSPs/RCP.

We used the Representative Concentration Pathways (RCPs) framework to compare different climate change scenarios. The RCPs are a set of scenarios to reflect different potential climate outcomes used in recent IPCC climate assessment reports (Vuuren et al. 2011). They were designed to be combined with the SSPs as part of a scenario 'matrix' that encompasses the full spectrum of future socio-economic and climate change pathways (Vuuren et al. 2014). Already around 97-98% of the projections use the RCPs as input (Figure S4). Similar to the SSP mapping, we distinguished between 'Pure,' 'Derived' and 'No class' RCPs. Drawing upon Vuuren and Carter (2014) and our own analysis, we mapped the majority of climate change projections to the RCPs (Table S2).

Study	SSP1	SSP2	SSP3	SSP4	SSP5	No class
Alexandratos and Bruinsma (2012) Baldos and Hertel (2014) Bodirsky et al.(2015)	B1	Baseline baseline, co2_fert, demand_only, no_co2 B2	A2		A1	
CAWMA (2007) Dawson et al. (2016)		A1B_ccsm30, A1B_cgcm31, A1B_echam5,				Pessimistic rainfed
FAO (2018)	Toward Sustainability	A1B_hadcm3, A1B_ipsl, A1B_nocc Business As Usual		Stratified Societies		
Fischer er al. (2009) Gouel and Guimbard (2017) IAASTD (2009)		trend Reference	REF-01			High AKST,
MA (2005)	TechnoGarden	scenario	Order from			High AKST High, Low AKST, Low AKST Low Adapting
			Strength			Mosaic, Global Orchestration
OECD (2016)	Sust_GrnC, Sust_Infr, Sust_Irrg, Sust_none, Sust_RobV, Sust_TrdC			RegG_GrnC, RegG_Infr, RegG_Irrg, RegG_none, RegG_RobV, RegG_TrdC	Glob_GrnC, Glob_Infr, Glob_Irrg, Glob_none, Glob_RobV, Glob_TrdC	Orcnestration
Paillard et al. (2014) Pardey et al. (2014) Parry et al. (2004)	Agrimonde 1 B1	midline B2	A2	-	A1F2	Agrimonde GO
PBL (2012) Shutes et al. (2017)	ECO	Trend	TLTL		FFANF	ONEPW

Table S1: Mapping of projections (including baseline and policy shock types) to the SSPs based on Vuuren et al. (2012) and Vuuren and Carter (2014) and authors' analysis. The table shows the mapping of Derived SSPs as well as No class scenarios that could not be mapped to the SSPs.

Study	RCP2.6	RCP4.5	RCP6.0	RCP8.5	No class
Baldos and Hertel (2014)				no_co2	co2_fert
Bodirsky et al. $(2015)$		B1	B2	A1, A2	
CAWMA (2007)					
Dawson et al. $(2016)$			A1B_ccsm30,		
			A1B_cgcm31,		
			A1B_echam5,	,	
			A1B_hadcm3	,	
			A1B_ipsl		
Paillard et al. $(2014)$	Agrimonde 1				Agrimonde GO
Parry et al. $(2004)$		B1	A1F2, B2	A2	

Table S2: Mapping of projections (including baseline and policy shock types) in the Global Food Security Projections Database to the RCPs based on Vuuren and Carter (2014) and authors' analysis. The table only shows the mapping for Derived RCPs as well as No class scenarios that could not be mapped to the RCPs.

### A.3 Baseline and policy shock projections

We divided the projections into two types: baseline and policy shock projections (S5. The first type is based on the assumptions of baseline scenarios, which assume that socio-economic development, including global food security will be determined by future changes in the socioeconomic drivers (and associated major policy changes that can regarded as exogenous to the analysis) (Dellink, Mensbrugghe, and Saveyn 2020). The SSPs are considered as baseline scenarios. The second type are baseline scenarios extended with assumptions on additional policies to investigate the impact of those policies on global food security. The difference between the baseline and policy shock projection is a measure of policy impact (Börjeson et al. 2006).

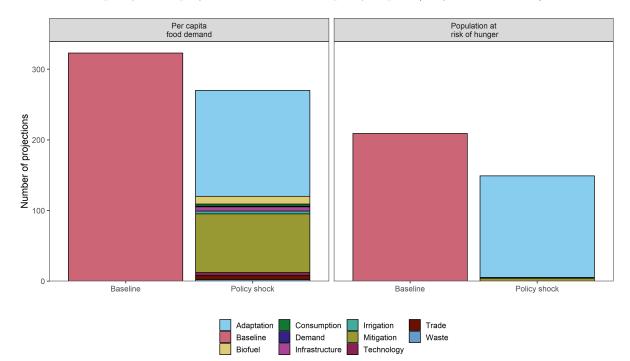


Figure S5: Number of baseline and policy shock projections.

### A.4 Further harmonization

After the SSP and RCP mapping, we made additional adjustments to the data to make them comparable. First, we used simple linear interpolation to impute missing data, e.g. in cases where the data was only available for the base year and a few intermediate years up to 2050. Second, we calculated global food demand (in 1e15 kcal) by multiplying food demand per capita with study- and projection-specific population projections. Where possible, we took the population projections from the selected studies. If these were not available we used population data from the source that was referenced. Three sources of population projections were used in the selected studies: the Shared Socio-economic Pathways (SSP Database 2016), the Special Report on Emissions Scenarios (SRES) (Nakicenovic et al. 2000) and the UN World Population Prospects (https://population.un.org/wpp). Third, where needed we converted prevalence of undernourishment projections into population at risk of hunger series using the collected information on population projections. Finally, we converted all projections in an index with base year 2010 and subsequently multiplied with 3-year average base year variables from FAO (2020) to create the final series.

### **B** Meta analysis

We separately analyzed the baseline and policy shock projections in our database. The baseline projections can relatively easily be compared using a meta-regression approach as the underlying assumptions are comparable. The policy shock projections, on the other hand, use a wide number of assumptions to assess the impact of a large number of different policies and are therefore much harder to compare. For this reason, we started by analyzing the plausible bandwidth of the baseline projections and, subsequently, compare this with the range of policy shock projections (Figure S8).

For each of the three food security indicators and including only baseline projections that could be mapped to the SSPs/RCPs (Figure S2), we ran a mixed model meta-regression function including a combination of fixed and random effects to derive SSP- and RCP-specific point estimates and confidence intervals (see Methods in main manuscript). We added random effects for both study and model as we assume that, although comparable, outcomes will vary both across studies and models because of differences in study and model design. The projections in our sample can be regarded as random samples of all projections that could have been observed. Under these assumptions a random effects model (as opposed to a fixed effects model) is recommended for meta-analysis (Borenstein et al. 2009). We also included fixed effects for all SSP-RCP combinations and dummy variables for pure (as opposed to derived) SSP and RCP scenarios. The latter account for the differences between projections that use the SSP drivers and storylines as input and projections that use comparable but not identical assumptions. Using information from our analysis of the selected studies and used methodologies, we also investigated the impact of additional projection and study-level determinants. At the projection level, we included the base year of the model and the methodology (CGE, PE, other model, statistical extrapolation and expert input). At the study level, we added type of publication (journal article, book (chapter) and working paper/report), year of publication and single or multi-model study.

To select the models with the best fit, we applied the step-down strategy, which starts with a model that includes all fixed and random effects, followed by the stepwise removal of fixed effects with a p-value larger than 0.1 and random effects with a p-value larger then 0.1 (Diggle et al. 2002; Zuur et al. 2009; Kuznetsova, Brockhoff, and Christensen 2017). The results show that models with only random effects for study and model, and fixed effects for pure SSP and pure RCP have the best fit. Depending on the food security indicator, one of the random and fixed effects was sometimes dropped. All other explanatory variables were always dropped, independent of the indicator. For model comparability and from a theoretical perspective, we decided to select the same model for all three variables, including random effects for study and model and fixed effects for pure SSP and pure RCP.

Table S3 shows the details of the estimated models. We decided to exclude the population at risk of hunger projections from Dawson, Perryman, and Osborne (2016) from the meta-analysis. The model used by Dawson, Perryman, and Osborne (2016) is not able to incorporate the impact of technological change and trade on population at risk of hunger, resulting in extreme values (i.e. more than 40 times above  $q_{0.75} + IQR$ , whereas above 3 is already considered as an extreme outlier). Including these observations resulted in biased model estimates.

Figure S6 and Figure S7 depict pairwise p-value plots to bilaterally compare the difference between SSP-NOCC estimated means and between NOCC and RCP8.5 estimated means. Pairwise p-value plots for bilateral comparison of SSP-NOCC estimated means. Pairwise comparisons were performed with the emmeans R package (Russel 2020), using the Satterthwaite's degrees of freedom method and the Tukey adjustment for p-values. Each comparison is associated with a vertical line segment whose horizontal position is determined by the p-value of that comparison. SSPs/NOCC and RCP8.5 are plotted on the vertical scale, and p-values are plotted on the horizontal scale. The p-value scale is nonlinear, stretching out smaller p values and compressing larger ones. A large number of pairwise SSP-NOCC comparisons have p-values lower than 0.05, which indicates that the difference between the estimated means is 'significant.' In contrast, nearly all NOCC-RCP8.5 have p-values around 1, which suggests that there is no statistical difference in the estimated means of no climate change and extreme climate change projections.

	P.c. food demand	T. food demand	Pop. at risk of hunger
Constant	$18.15^{***}$	59.28***	$-69.41^{***}$
	(2.75)	(4.22)	(11.36)
SSP1.NOCC	0.60	$-9.68^{***}$	$-11.06^{***}$
	(0.76)	(1.13)	(2.04)
SSP3.NOCC	$-7.98^{***}$	0.01	45.85***
	(0.67)	(0.98)	(2.04)
SSP4.NOCC	$-4.89^{***}$	$-7.28^{***}$	39.89***
	(1.31)	(1.94)	(5.55)
SSP5.NOCC	3.58***	$-3.84^{*}$	$-13.94^{***}$
	(1.08)	(1.63)	(3.66)
SSP1.RCP2.6	3.02***	$-8.29^{***}$	$-14.50^{***}$
	(0.87)	(1.31)	(2.85)
SSP2.RCP2.6	$-0.78^{-0.78}$	-0.91	3.08
	(0.88)	(1.31)	(2.78)
SSP3.RCP2.6	$-8.02^{***}$	2.22	49.45***
	(0.90)	(1.34)	(2.85)
SSP1.RCP4.5	1.91*	-9.10***	$-13.51^{***}$
	(0.95)	(1.42)	(2.82)
SSP2.RCP4.5	-1.27	-1.65	5.19
	(0.99)	(1.47)	(2.85)
SSP3.RCP4.5	-8.36***	1.97	52.97***
551 01101 110	(0.99)	(1.47)	(2.85)
SSP4.RCP4.5	$-5.35^{*}$	2.53	(2.00)
551 11001 110	(2.12)	(3.45)	
SSP1.RCP6.0	2.56**	$-8.56^{***}$	$-14.64^{***}$
551 1.1(01 0.0	(0.88)	(1.31)	(2.85)
SSP2.RCP6.0	-0.93	-1.53	4.28
551 2.1(01 0.0	(0.86)	(1.29)	(2.82)
SSP3.RCP6.0	-8.31***	1.79	49.39***
551 5.1(01 0.0	(0.88)	(1.31)	(2.85)
SSP5.RCP6.0	(0.00)	(1.01)	(2.85) -10.36
551 5.1(01 0.0			(6.11)
SSP1.RCP8.5	1.72	$-9.78^{***}$	(0.11) $-11.56^{***}$
55F1.RCF8.5			
CCD9 DCD9 F	(0.99) -1.19	(1.47) $-2.05^*$	(2.85)
SSP2.RCP8.5			$6.98^{**}$
CCD2 DCD2 F	(0.64)	(0.96)	(2.68)
SSP3.RCP8.5	-8.48***	2.53	55.61***
SSP4.RCP8.5	(0.97)	(1.44)	(2.84)
55F4.hCF8.5	-3.60	$-10.59^{*}$	65.43***
	(3.27)	(4.69)	(6.41)
SSP5.RCP8.5	2.31	-1.21	
CCD CCD	(1.79)	(2.84)	10.02
Pure SSP	$-1.83^{*}$	-2.51	10.03
D D CD	(0.92)	(2.00)	(13.87)
Pure RCP	$-4.55^{*}$	-6.42	3.12
	(1.83)	(3.66)	(7.06)
AIC	1581.02	1801.26	1222.85
BIC	1674.99	1895.24	1302.01
Log Likelihood	-765.51	-875.63	-587.43
Num. obs.	317	317	200
Num. groups: study_short	20	20	13
Num. groups: model	18	18	13
Var: study_short (Intercept)	0.33	10.24	532.70
Var: model (Intercept)	83.37	107.09	129.67
Var: Residual	6.82	14.04	22.87

 $\hline & ***p < 0.001; \ **p < 0.01; \ *p < 0.05 \\ \hline & \\$ 

Table S3: Meta-regression models for percentage change in per capita food consumption, total food consumption and population at risk of hunger for the period 2010-2050. SSP2.NOCC is used as reference for the SSP.RCP interactions.

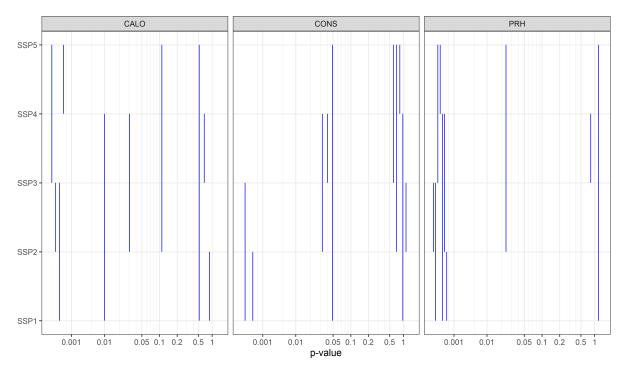


Figure S6: Pairwise p-value plots for bilateral comparison of NOCC-SSP estimated means per food security indicator. P-values are bounded by 1 but are slightly spread to avoid overplotting.

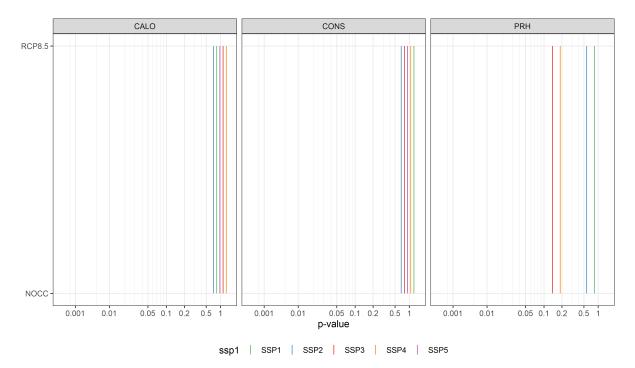


Figure S7: Pairwise p-value plots for bilateral comparison of NOCC and RCP8.5 estimated means for each SSP per food security indicator. P-values are bounded by 1 but are slightly spread to avoid overplotting.

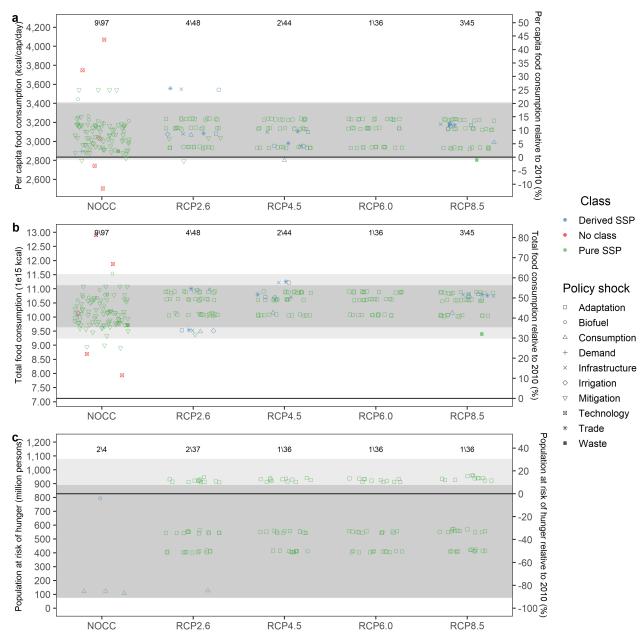


Figure S8: Comparison of baseline and policy shock projections with the derived plausible range of projections. a per capita food demand, b total food demand and c population at risk of hunger. The numbers on top refer to the number of studies/number of projections in the figure. The dark and light grey shaded areas demarcate the plausible range of projections using the 95% confidence interval across all NOCC SSP and all RCP SSP projections, respectively. See Manuscript for details.

### C Impact of methodology on projections

Table S4 formally compares the impact of methodology on the size and direction of global food security projections. We distinguished between five different approaches: (1) computable general equilibrium (CGE) model (reference), (2) partial equilibrium (PE) model, (3), other model, (4) statistical extrapolation and (5) expert input. Other model include biophysical (Agribiom), econometric models (iAP) and integrated assessment (IMAGE) models. Apart from the other model group in the estimation for per capita food demand, there is no evidence that methodology has an impact.

	Per capita food demand	Total food demand	Pop. at risk of hunger
Constant	24.53***	66.01***	$-67.60^{***}$
	(3.99)	(5.78)	(13.72)
PE model	-6.13	-5.22	-5.88
	(4.83)	(5.90)	(9.89)
Other model	$-15.43^{*}$	-14.29	2.70
	(6.26)	(7.85)	(15.27)
Statistical extrapolation	-7.50	-8.35	
-	(9.35)	(11.67)	
Expert input	-11.02	-14.82	5.52
	(9.70)	(12.38)	(30.67)
SSP.RCP interaction	Yes	Yes	Yes
Pure SSP	Yes	Yes	Yes
Pure RCP	Yes	Yes	Yes
AIC	1559.87	1780.60	1206.22
BIC	1668.88	1889.61	1295.27
Log Likelihood	-750.93	-861.30	-576.11
Num. obs.	317	317	200
Num. groups: study short	20	20	13
Num. groups: model	18	18	13
Var: study_short (Intercept)	0.22	9.61	604.12
Var: model (Intercept)	73.63	107.56	155.04
Var: Residual	6.84	14.07	22.86

 $\fbox{****}{p < 0.001; ***p < 0.01; *p < 0.05}$ 

Table S4: Meta-regression models for percentage change in per capita food consumption, total food consumption and population at risk of hunger for the period 2010-2050, including dummy variables to test for the impact of methodology on projections.

### D Selection bias

Our study might have been affected by two types of selection bias. The first is publication bias, which is of major concern in systematic literature reviews and meta-analysis. It generally refers to the bias that is introduced when the selected studies mostly include scientific studies that are published in journals, which tend to present 'significant' findings, while working papers and reports (i.e. unpublished studies) with contrasting results are not sufficiently covered (Borenstein et al. 2009).

Many global food security assessments are produced by international institutions such as the International Food Policy Research Institute (IFPRI) (Nelson et al. 2010), The Food and Agriculture Organization (FAO) (Alexandratos and Bruinsma 2012), the International Water Management Institute (IWMI) (Comprehensive Assessment of Water Management in Agriculture 2007) and the United Nations Environment Programme (UNEP) (UNEP 2007, 2012) that tend to release their findings in policy reports. For this reason, we searched extensively for grey literature in the search phase of the systematic literature review. Out of the 57 selected studies 18 (32%), were unpublished at the time of our analysis.

To formally test if there were differences in the direction and size of published and unpublished global food security projections, we added a dummy variable to our meta-analytical model that distinguishes between both groups of studies. As several reports were published by scientific publishers (e.g. Millennium Ecosystem Assessment 2005; IAASTD 2009; UNEP 2012), we separately tested for differences with journal articles only and the combination of journal articles and book (chapters) (Table S5). The coefficients of all dummy variables are relatively small and insignificant, which indicates that publication bias probably did not affect our analysis.

Apart from selection bias, another potential source of bias is the possibility of non-randomness in the selection of studies for which quantitative information was extracted (Figure S1). To investigate this we compared the characteristics of these studies with those for which data was missing. Figure S9 shows the differences for methodology, single or multi-model study, published or unpublished study, study year and scenario type, which are the variables for which we collected information as part of the systematic literature review. The comparison suggests that the two groups of studies are broadly comparable and do not provide evidence for potential selection bias related to the extraction of projections. Finally, we also summarized the main outcomes of studies that presented per capita demand and population at hunger projections but for which data could not be extracted (Table S6 and Table S7). A comparison shows considerable overlap between the results of these studies and our estimated plausible range of projections, confirming our main findings.

		Journal only			Journal and book		
	P.c. food demand	T. food demand	Pop. at risk of hunger	p.c food demand	T. food demand	Pop. at risk of hunger	
Constant	17.80***	55.91***	$-67.35^{***}$	16.87***	56.01***	$-67.35^{***}$	
	(3.01)	(4.58)	(13.03)	(2.97)	(4.77)	(13.03)	
Published in journal	-0.07	4.00	-6.11				
	(0.88)	(2.24)	(17.38)				
Published in journal or book				0.83	3.21	-6.11	
				(0.83)	(2.11)	(17.38)	
SSP.RCP interaction	Yes	Yes	Yes	Yes	Yes	Yes	
Pure SSP	No	Yes	Yes	No	Yes	Yes	
Pure RCP	Yes	Yes	Yes	Yes	Yes	Yes	
AIC	1585.10	1796.71	1217.21	1584.15	1797.71	1217.21	
BIC	1679.08	1894.45	1299.67	1678.12	1895.44	1299.67	
Log Likelihood	-767.55	-872.36	-583.61	-767.08	-872.86	-583.61	
Num. obs.	317	317	200	317	317	200	
Num. groups: study_short	20	20	13	20	20	13	
Num. groups: model	18	18	13	18	18	13	
Var: study_short (Intercept)	0.60	8.76	578.35	0.14	8.40	578.35	
Var: model (Intercept)	79.21	100.59	131.29	78.36	104.96	131.29	
Var: Residual	6.89	14.06	22.87	6.96	14.09	22.87	

 $^{***}p < 0.001; \ ^{**}p < 0.01; \ ^{*}p < 0.05$ 

Table S5: Meta-regression models for percentage change in per capita food consumption, total food consumption and population at risk of hunger for the period 2010-2050, including dummy variables to test for the impact of (un)published studies on projections. Pure SSP dummy was removed from per capita food demand models to avoid singularity issues.

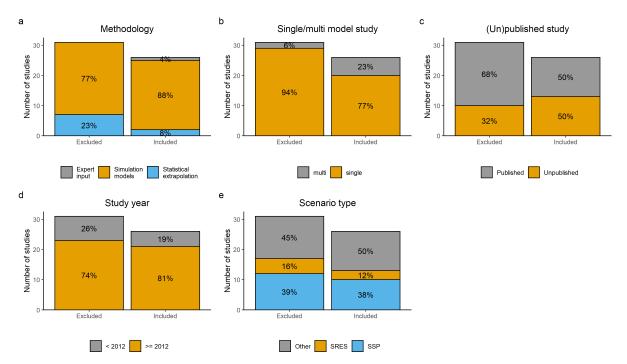


Figure S9: Comparison of characteristics between studies for which projections are in/excluded in the Global Food Security Projections Database. Published studies consists of journal articles and books or book chapters. Published studies include journal articles and book (chapters), unpublished studies include working papers, reports and conference proceedings.

Study	Data availability	Scenarios	Results	Analysis
Bijl et al. (2017)	Projections only presented in graphical format	SSP1-3	Global kcal/cap/day is~3500 (SSP1), ~3200 (SSP2) and ~3100 (SSP3)	Within 95% SSP1-3 range apart from SSP1, which is slightly higher
CAWMA (2007)	Policy shock projections only	UN population projections and	Cannot be assessed	Cannot be assessed
Fujimori et al. (2018)	Projections only presented in graphical format and in relative	variations SSP1-3	Cannot be assessed	Cannot be assessed
Havlik et al. (2015)	form Projections only presented in graphical format and in relative	SSP4-5, RCP2.6-8.5	Global per capita food consumption in SSP4-5 decreases to $\sim 0.5$ -1.5%	Cannot be assessed
Keating and Carberry (2010)	form Base year values not presented	UN population projections and variations	for the period 2000-2050 Global per capita food consumption is between 2775-3590 kcal/cap/day in 2050	Overlapping with 95% SSP1-5 range but higher maximum value
Kii et al. (2013)	Projections not presented	SRES	Cannot be assessed	Cannot be assessed
Laborde (2017)	Projections only presented in graphical format and in relative	FOODSECURE	Cannot be assessed	Cannot be assessed
Millennium Institute (2013)	form Base year values not presented	UN population projections and variations	Global per capita food consumption is ~3100 kcal/cap/day in 2050	Within 95% SSP2 range
Mosnier et al. (2014)	Projections only presented in graphical format and in relative	SRES	Cannot be assessed	Cannot be assessed
Msangi and Rosegrant (2009)	form Projections only presented in graphical format and in relative	SRES	Cannot be assessed	Cannot be assessed
Nelson et al. $(2010)$	form Projections only presented in relative format	SRES	Cannot be assessed	Cannot be assessed
Obersteiner et al. (2016)	Projections only presented in graphical format	SSP1-3	Global per capita food consumption is ~2250 kcal/cap/day (SSP1), ~2500 kcal/cap/day (SSP2) and ~2400 kcal/cap/day (SSP3) in	Outside 95% SSP1-3 range, do not seem comparable
Odegard and Van der Voet (2014)	Base year values not presented	SRES	2050 Global per capita food consumptionis between 2800-2900 kcal/cap/day	Within 95% SSP1-5 range
Tilman et al. (2011)	Calorie consumption is expressed in total crop	UN population projections	in 2050 100–110% increase in total calorie demand	Cannot be assessed
UNEP (2007)	calories, including feed Projections only presented in graphical format	GEO4 scenarios	Global per capita food availability is ~3000-4000	Outside 95% SSP1-3 range, do not seem comparable
UNEP (2012)	Projections only presented in graphical format	GEO5 scenarios	kcal/cap/day in 2050 Global per capita food availability is ~2700-4000	Overlapping with 95% SSP1-5 range but highe maximum value
Valin et al. (2013)	Projections only presented in graphical format and in relative form	SSP2 and variations	kcal/cap/day in 2050 Cannot be assessed	Cannot be assessed

Table S6: Narrative analysis of studies for which per capita food demand could not be extracted.

Study	Data availability	Scenarios	Results	Analysis
Baldos and Hertel	Projections only	SSPs, various climate	Cannot be assessed	Cannot be assessed
(2015)	presented in relative	change scenarios		
Bijl et al. (2017)	format Projections only	SSP1-3	Total population at risk	Within 95% SSP1-3
Diff et al. $(2017)$	presented in graphical	551 1-5	of hunger in SSP1-3	range
	format		decreases to ~250 million	Tungo
			people in 2050	
Fischer at al. (2005)	Projections only	SRES	Total population at risk	Within $95\%$ SSP1-5
	presented in graphical		of hunger decreases to	range
	format and for		$\sim 200-700$ million people	
	developing country		in 2050	
Fujimori et al. (2018)	group Projections only	SSP2, various climate	Total population at risk	Within 95% SSP2 range
Fujinon et al. (2018)	presented in graphical	change scenarios	of hunger in SSP2	Within 95% 55r 2 lange
	format and/or in	change scenarios	decreases to $\sim 238$ million	
	relative form		people in 2050	
Hertel and Baldos	Projections only	SSPs	Cannot be assessed	Cannot be assessed
(2016)	presented in graphical			
	format and/or in			
	relative form			
Millennium Institute	Base year values not	UN population	% total population at	Within 95% SSP2 range
(2013)	presented	projections and	risk of hunger decreases	
Parry et al. (2005)	Base year values not	variations UN population	to 3.6% in 2050 Total population at risk	Somewhat higher than
• • • /	presented and results	projections, various	of hunger decreases to	the 95% SSP2 range
	largly presented in	climate change scenarios	641 million people in	0
	graphical format	0	2050	

Table S7: Narrative analysis of studies for which population at risk of hunger could not be extracted.

Finally, we investigated if the four projections (one implemented by two models) for which data was extracted but could not be mapped to the SSPs/RCPs were in line with our findings. Figure S10 compares these No class projections with the plausible range of projections based on the 95% confidence interval from the meta-analysis for the year 2050. Only Global Orchestration (IMPACT) for per capita food consumption is a clear outlier as it is somewhat higher that the maximum range. Also ONEWP (GLOBIOM) can be considered as an outlier as it assumes no climate change but is positioned outside the no climate change bandwidth. The rest of the observations are located within the estimated bandwidth of projections for the three food security indicators.

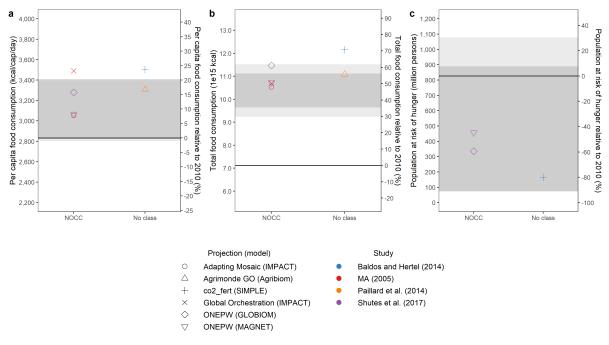


Figure S10: Comparison of No class SSP and/or RCP projections with the derived plausible range of projections. a per capita food demand, b total food demand and c population at risk of hunger. The dark and light grey shaded areas demarcate the plausible range of projections using the 95% confidence interval across all NOCC SSP and all RCP SSP projections, respectively. See Manuscript for details.

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# G Systematic literature review protocol

# A Systematic Review of Global Food Security Projections up to 2050: Protocol

# September 2017, updated December 2020<sup>1</sup>

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### **Roles and responsibilities**

Marie Luise Rau led the systematic literature review. She organized the study design, drafted the protocol, maintained contacts with the library and students that provided research support and contributed to the review, screening and coding of the studies. She holds a Master-level certificate Research Synthesis for Policy and Practice from the University of London/England and has considerable experience in conducting systematic literature reviews. Michiel van Dijk contributed to designing and writing the research protocol, the design of the coding framework and the review and screening of the studies. Yashar Saghai provided input to the design of the review. The systematic review will be supported by information specialists from the Wageningen University and Research (WUR) library, who have experience with conducting and supporting systematic literature reviews. In addition, students from the university will be involved to support the screening of the studies.

### Funding

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# **1** Introduction

Ending hunger and achieve food security and improved nutrition at global level is one of the United Nations' 17 Sustainable Development Goals (SDGs). To achieve this goal policy-makers need to have insights in future pathways of global food security and their main drivers. The most cited study that provides long-run projections on agricultural production and demand is the "World agriculture towards 2030/2050" report, conducted by the FAO. The interim report (FAO, 2006) found that global agricultural production volume would need to be increased by 70% in 2050 to meet the projected global demand for food. This number was subsequently scaled down to 60% in the 2012 revision of the report (Alexandratos & Bruinsma, 2012).

To estimate the 60% increase in agricultural production needed, the WAT2050 combined expert opinions on the expected improvements of future yield with global population projections and expected changes in diets. A number of other studies have used econometric approaches (Tilman & Clark, 2014) or global integrated assessment models (Ishida et al., 2014) to conduct similar analysis. In contrast to the WAT2050, which only provides one 'business as usual' scenario, these studies often consider multiple scenarios to capture the uncertainty associated with key drivers, in particular income and population growth, and technological change, and present projections on other global food security outcomes such as food prices, calorie consumption and people at risk of hunger.

Surprisingly, research that systematically compares global assessments of food security is limited. Such research would help to answer questions like: What are relevant indicators for global food security? What is a plausible range of values for these global food security indicators in the future? Which factors are drivers of global food security? Which drivers are mainly addressed in projections of global food security? Which methods or measurements are used and what is the impact on food security outcomes? In previous work (van Dijk & Meijerink, 2014), we tried to answer these questions for 12 well-known studies about global food security. Since then, a substantial number of new studies have appeared that are not covered in our first study.

The aim of this project is to conduct a systematic review on global food security and modelling studies in order to (1) provide insights on the bandwidth of key global food security projections and (2) provide explanations on why the results of the projections may differ. As part of the review, data on global food security drivers and outcomes will be harvested from selected studies and further processed to allow for cross comparison. Following the approach used in climate change research, which also heavily relies on scenario analysis and modelling, all data will be stored in the Global Food Security Projections database that can be used to benchmark upcoming global food security scenario studies.

In order to identify and map the existing literature on the topic, we conduct a systematic review by following the guidelines for the qualified application of systematic review by the Evidence for Policy and Practice Information and Co-ordinating Centre (EPPI centre, University of London).

This protocol will be used as the guiding document throughout the entire process of conducting the systematic on global food security projections.

# 2 Objective and specific goals

The objective of the research is to conduct a systematic literature review of recent global food security projection and quantitative scenario studies that provide trends to 2050. The systematic review is used to answer the following research questions:

- What is the bandwidth of quantitative findings regarding future food security?
- What are the (main) characteristics of global food modelling scenarios that have been developed since 2000 (e.g. methodologies, drivers, scenarios and indicators?
- Why do these studies arrive at different outcomes?

We will use the conventional definition of food security as a reference: "food security exists when all people, at all times, have physical and economic access to sufficient safe and nutritious food that meets their dietary needs and food preferences for an active and healthy life" (FAO, 1996). This definition covers the four dimensions of food security: (1) food availability, (2) food accessibility; (3) food stability and (4) food utilization.

We will draw upon the experience from previous research (in particular van Dijk & Meijerink, 2014) to demarcate the study selection and to structure the information retrieval. Relevant findings from Van Dijk and Meijerink (2014) include (1) the observation that no relevant global food security modelling studies have been published prior to the year 2000; (2) socio-economic scenarios that determine the food security outcomes can be grouped into a limited number of scenario families; (3) a list of major drivers that are used as input by most global food security projection studies; and (4) a list of main indicators that are used to capture the dimensions of food security, in particular, food consumption, food price, child malnutrition and undernourishment. If sufficient (quantitative) information on global food security drivers and outcomes can be harvested from the studies in the systematic review, a meta-analysis will be conducted that aims to explain the differences in results between the studies.

# **3** Research question

The specific research question addressed in this review is: What is the range of projections of future global food security with a time horizon of up to 2050? As the projections are determined by the approach that is used to create the projections (e.g. type of simulation model or statistical approach) as well as the driving forces that determine the direction of the projections, we also use the results of the systematic review to answer the following sub-questions: Which approaches have been used in the modelling studies and which drivers have been considered in the projections of global food security?

# 4 Selection criteria

We use the following criteria to select the studies:

- **Exclusion on topic.** To implement the search, we will use several key words that describe the most common indicators to measure the dimensions of food security, such as food consumption, food supply, food production, undernourishment and food prices that capture the four dimensions of food security.
- **Exclusion on geography.** The focus of the review is on global studies and therefore country and regional studies will be excluded.
- **Exclusion on date.** Studies published prior to 2000 will be excluded.
- Exclusion on language. Studies written in another language than English will be excluded.
- **Exclusion on quantification.** Studies that do not include a quantification of food security projections or scenarios will be excluded;
- **Exclusion on projection horizon.** Only studies with a projection horizon up to 2050 or beyond will be included for data extraction;
- **Exclusion on repetition.** In case updates are available of the same study or report (e.g. the FAO World Agriculture Towards 2050 (WAT) studies), only the most recent version will be included in order to avoid repletion and ensure that the latest data will be collected.

# 5 Search strategy

The search strategy follows several steps. We will first search for studies by using combinations of search terms, as described further below in this section. Note that we will also consider the references of the studies that are identified as relevant and that are thus included in the assessment of the systematic review (snowballing). This will complement the list of studies found in the searches.

Several data sources will be searched, including searches of the grey literature. Searching for grey literature is expected to be challenging. For the grey literature, we will use the results of grey literature of other searches on the topic of global food security and will complement the list with studies that we have identified in our own searches of the grey literature. These grey literature searches on the one hand relies on the information about projects with unpublished reports by experts and key researchers but on the other hand would also include Google searches, i.e. best hits in Google (scholar). The search results will be reported in a PRISMA flow chart that illustrates the number of records found and accounts for the various steps of the search process in a transparent manner.

### 5.1 Data sources and searching approaches

In the search, various sources of information mentioned below will be used in order to identify relevant studies. In particular,

#### Journal articles and other publications registered in bibliographic scientific databases

Electronic search engines of bibliographic databases will be searched by using the combinations of search terms defined below. Among the bibliographic databases are Science Direct, as well as Scopus and ISI Web of Knowledge (Social Sciences Citation Index subset) all of which allow for conducting full text but also specialized searches on indexed subheadings and/or keywords with a possible thesaurus option to use synonyms of the search terms applied. Wageningen UR library experts will support the search. The library has access to the following bibliographic databases: Scopus, Cab Abstracts, Agris (FAO database), Econlit, Google Scholar, ABI/Inform, AgEcon search. Search databases will be refined and set-up in cooperation with Wageningen UR library experts.

#### Grey literature

- Specific electronic search engines online databases: In addition to bibliographic searches
  delivering references of peer-reviewed journal articles as well as other referenced material, we
  will use other search engines for identifying grey literature. These searches involve systematic
  online search as well as hand searches, depending on the search engines. For Google scholar, the
  best hits (first two pages) will be considered for the search. The searches will deliver links to
  newsletters, working papers, conference contributions and possibly other formats of the grey
  literature.
- Specialist websites of organizations and institutes hand search: the websites of organizations and institutes involved in global food security analysis will be used to identify the grey literature (e.g. FAO, IFPRI and IIASA). The grey literature is potentially rather broad with detailed information about existing projects and hopefully more detailed analysis.
- *Contact with experts:* Entry into some potentially relevant studies is achieved by consulting with experts working on the topic.

#### Snowballing exercise:

A 'snowballing' exercise will be conducted on all references given by the studies that present or summarize global food security reviews as they are assumed to bring together important literature. For this purpose, a list of reviews studies was prepared by the team (Annex A).

### 5.2 Search terms and combinations

Following our earlier review (van Dijk & Meijerink, 2014), we derived search terms for conducting the literature searches, in particular the literature searches of bibliographic scientific databases and specific search engines and databases. Table 1 lists the groups of search terms, corresponding with the selection criteria. The groups of search terms will be combined with 'AND', while we use 'OR' within the groups of search terms

Criteria	Search terms
Topic: Food security	food OR nutrition
Topic: Projection and/or scenario	future OR prospect OR projection* OR scenario* OR foresight OR forecast OR transition
Topic: Quantitative approach	Model* OR regression OR "CGE" OR "PE" OR "computable general equilibrium" OR "partial equilibrium" OR quantitative OR trend* OR quantification
Global coverage	Global OR global-scale OR "developing countries" OR Asia OR "Latin America" OR "South America" OR Africa OR world*
Food security indicators	Feed* OR Food consumption OR Food demand OR Food production OR Food regime OR Food security OR Food supply OR Food system OR Undernutrition OR Underweight OR undernourishment OR calor* OR Diet* OR land use OR people at risk of hunger OR price OR Protein OR Stunting OR Wasting
Year of publication	2030 OR 2050 OR 2100 OR long-term OR long term
Additional: Model*	globiom OR impact OR aglink OR magpie OR aim OR farm OR gtem OR gcam OR magnet OR mirage OR gtap OR envisage OR eppa

\*Only used for google scholar search.

### 5.3 Screening and selection of studies

The searches generate lists of potentially relevant studies on global food security that will be merged and stored into Endnote (digital library). After removing duplicates, the studies found in the searches will be screened by title, abstract and text. For the screening we will transfer the list of relevant studies to the Evidence for Policy and Practice Information and Co-ordinating Centre (EPPI) tool, which is a specialized software for systematic literature reviews and particularly useful for the screening and coding of the studies under review. The literature screening will consist of two phases. A first selection will be made by screening the title and abstract, followed by a full text screening for studies that are identified as being relevant. In case of doubt, the study under review will be evaluated by a second reviewer. If needed, the research team will discuss the details of the respective study. This means that we do not consider cross-checking or screening by pairs of reviewers for all records due to constraints of time and budget. Discussing the relevance of studies in case of doubt is expected to be sufficient to ensure a high-quality outcome of the screening. The screening of abstracts will be supported by one or two Master students of Wageningen University and Research (WUR).

The inclusion/exclusion criteria will be applied in the screening in order to ensure that relevant studies are identified for being included in the database. This means that only those studies meeting the inclusion criteria will be considered in the full text assessment of the systematic review.

## 6 Data extraction

### 6.1 Study-level information

We will build a questionnaire in the EPPI tool to systematically extract and code the following information from the studies selected in the screening process (see Annex B for a draft version):

- Meta information: Author, publication date, publication type, author affiliation
- Which methodology is used (e.g. type of model, statistical approach) in the study?
- Which scenarios are looked at (e.g. SRES, SSPs or other)?
- Which food security indicators are considered (e.g. for food demand, food supply, undernourishment, etc.) in the study?
- Which drivers are considered (e.g. GDP, population and technical change) in the study?

In general, the code should be rigorous but flexible enough to allow for the possibility of adding and open questions, rather than determine and thus presume answers or categories of questions. Using the key wording and coding, a high-level understanding about the nature and contribution of the research can be achieved.

In the data extraction, we will assess in detail those studies that are identified as relevant and thus are included in the systematic review. The data information asked for by the code/questionnaire will be extracted, entered and stored in the coding tool provided with the EPPI tool. The coding of information will be supported by one or two Master students of Wageningen University and Research (WUR).

### 6.2 Model projections

As the key objective of our systematic review is to assess the bandwidth of global food security projections, we will make an effort to harvest all detailed information about the global food security projections from the studies. Similar to our previous study (van Dijk & Meijerink, 2014), we will use the R software (R Core Team, 2018) to process and analyze the data so comparison can be made, where possible. If the necessary data is not available or incomplete, we will try to contact the authors for additional information. Finally, all data will be stored in a Global Food Security Projections Database that contains comparable data on all global food security projection studies published in the year 2000 and onwards. For each of the studies the following information will be stored: (1) basic information (e.g. authors, institution and year); (2) design (e.g. type of model); (3) drivers (e.g. yield, GDP and population growth) and (4) global food security scenario results (e.g. calorie availability, food prices and people at risk of hunger). The database will be used as a basis for descriptive and visual analysis, among others showing the bandwidth and distribution of assumptions on key drivers and various food security output indicators. The database will be become open source and published at the same time with a scientific article that summarizes the main results of the systematic review.

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### Annex A: Global food security review studies

Bourgeois, R. (2016). Food insecurity: The future challenge. *IDS Bulletin*, *47*(4), 71–84. <u>https://doi.org/10.19088/1968-2016.156</u>

Dijk, M. van, & Meijerink, G. (2014). A review of global food security scenario and assessment studies: Results, gaps and research priorities. *Global Food Security*, *3*(3-4), 227–238. https://doi.org/10.1016/j.gfs.2014.09.004

Godfray, H. C. J., Beddington, J. R., Crute, I. R., Haddad, L., Lawrence, D., Muir, J. F., ... Toulmin, C. (2010). Food security: the challenge of feeding 9 billion people. *Science (New York, N.Y.)*, *327*(5967), 812–818. <u>https://doi.org/10.1126/science.1185383</u>

Godfray, H. C. J., & Robinson, S. (2015). Contrasting approaches to projecting long-run global food security. *Oxford Review of Economic Policy*, *31*(1), 26–44. <u>https://doi.org/10.1093/oxrep/grv006</u>

Hertel, T. W. (2011). The global supply and demand for agricultural land in 2050: A perfect storm in the making? *American Journal of Agricultural Economics*. <u>https://doi.org/10.1093/ajae/aaq189</u>

Hertel, T. W., Baldos, U. L. C., & Mensbrugghe, D. van der. (2016). Predicting Long-Term Food Demand, Cropland Use, and Prices. *Annual Review of Resource Economics*, 8(1), 417–441. https://doi.org/10.1146/annurev-resource-100815-095333

Hubert, B., Rosegrant, M., Boekel, M. A. J. S. van, Ortiz, R., C.M. Jolly, D. Aggarwal, ... U. Kulkar. (2010). The Future of Food: Scenarios for 2050. *Crop Science*, *50*(Supplement\_1), S-33. <u>https://doi.org/10.2135/cropsci2009.09.0530</u>

Keating, B. A., Herrero, M., Carberry, P. S., Gardner, J., & Cole, M. B. (2014). Food wedges: Framing the global food demand and supply challenge towards 2050. *Global Food Security*, *3*(3-4), 125–132. <u>https://doi.org/10.1016/j.gfs.2014.08.004</u>

Le Mouël, C., & Forslund, A. (2017). How can we feed the world in 2050? A review of the responses from global scenario studies. *European Review of Agricultural Economics*, 10(8), 1–51. <u>https://doi.org/10.1093/erae/jbx006</u>

McNeill, K., Macdonald, K., Singh, A., & Binns, A. D. (2017). Food and water security: Analysis of integrated modeling platforms. *Agricultural Water Management*, *194*, 100–112. <u>https://doi.org/10.1016/j.agwat.2017.09.001</u>

Reilly, M., & Willenbockel, D. (2010). Managing uncertainty: a review of food system scenario analysis and modelling. *Philosophical Transactions of the Royal Society B*, *365*(1554), 3049–3063. https://doi.org/10.1098/rstb.2010.0141

Wood, S., Ericksen, P., Stewart, B., Thornton, P. K., & Anderson, M. (2010). Lessons learned from international assessments. In J. Ingram, P. Erickson, & D. Liverman (Eds.), *Food security and global environmental change* (pp. 46–62). London: Earthscan.

Zurek, M. (2006). A short review of global scenarios for food systems analysis.

# Annex B: EPPI Tool Questionnaire V1.0

- A\_Meta information (ID = 4289037) [Not selectable (no checkbox)] Some info on the study, background
  - A.1\_Name of the key institutions that facilitated the study (ID = 4289038) [Not selectable (no checkbox)]
    - World Bank (ID = 4289039) [Selectable (show checkbox)]
    - IFPRI (ID = 4289040) [Selectable (show checkbox)]
    - IIASA (ID = 4289041) [Selectable (show checkbox)]
    - JRC/EU (ID = 4289042) [Selectable (show checkbox)]
    - FAO (ID = 4289043) [Selectable (show checkbox)]
    - OECD (ID = 4289044) [Selectable (show checkbox)]
    - PBL (ID = 4297340) [Selectable (show checkbox)]
    - UNEP (ID = 4297341) [Selectable (show checkbox)]
    - academic (ID = 4297342) [Selectable (show checkbox)]
    - Other, please specify in info box (ID = 4289045) [Selectable (show checkbox)]
    - Unknown (ID = 4289046) [Selectable (show checkbox)]
  - A.2\_Main topic of the study food security effect of .... (ID = 4164196) [Not selectable (no checkbox)]
    - Food demand (ID = 4164197) [Selectable (show checkbox)]
    - Food supply/availability (ID = 4164198) [Selectable (show checkbox)]
    - Climate change (ID = 4164199) [Selectable (show checkbox)]
    - Environment (biodiversity) (ID = 4164200) [Selectable (show checkbox)]
    - Food prices (ID = 4164201) [Selectable (show checkbox)]
    - Water (ID = 4164202) [Selectable (show checkbox)]
    - Other please specify in the info box. (ID = 4164203) [Selectable (show checkbox)]
  - A.3\_Aim of the study please mark the text (ID = 4164206) [Not selectable (no checkbox)]
- B\_Methodology (ID = 4164193) [Not selectable (no checkbox)]
  - B.1\_Which quantitative methodology is used to make the food security projections? (ID = 4164194) [Not selectable (no checkbox)]
    - Simulation models (GTAP, integrated assessment models...) (ID = 4289070) [Selectable (show checkbox)]
    - Statistical models, estimation/regression (ID = 4289071) [Selectable (show checkbox)]
    - Expert inputs (ID = 4289072) [Selectable (show checkbox)]
    - Combined methods, please specify (ID = 4289073) [Selectable (show checkbox)]
    - Other, please specify (ID = 4289092) [Selectable (show checkbox)]
    - B.2\_For simulation models... (ID = 4164195) [Not selectable (no checkbox)]
    - B.2.1\_What is the key/most important model used? (ID = 4289074) [Not selectable (no checkbox)]
      - ABARES (ID = 4297343) [Selectable (show checkbox)]
      - agLINK (ID = 4297344) [Selectable (show checkbox)]
      - Agrobiom (ID = 4297345) [Selectable (show checkbox)]
      - AIM (ID = 4297346) [Selectable (show checkbox)]
      - CAPRI (ID = 4297347) [Selectable (show checkbox)]
      - ENVISAGE (ID = 4297348) [Selectable (show checkbox)]
      - EPPA (ID = 4297349) [Selectable (show checkbox)]
      - FARM (ID = 4297350) [Selectable (show checkbox)]
      - GCAM (ID = 4297351) [Selectable (show checkbox)]
      - GLOBE (ID = 4297352) [Selectable (show checkbox)]
      - GLOBIOM (ID = 4297353) [Selectable (show checkbox)]
      - GTAP (ID = 4297354) [Selectable (show checkbox)]
      - GTEM (ID = 4297355) [Selectable (show checkbox)]
      - IMAGE (ID = 4297356) [Selectable (show checkbox)]
      - IMPACT (ID = 4297357) [Selectable (show checkbox)]
      - MAGNET (ID = 4289075) [Selectable (show checkbox)]
      - MAgPIE (ID = 4297358) [Selectable (show checkbox)]

- MIRAGE (ID = 4297359) [Selectable (show checkbox)]
- SIMPLE (ID = 4297360) [Selectable (show checkbox)]
- Watersim (ID = 4297361) [Selectable (show checkbox)]
- WFS (ID = 4297362) [Selectable (show checkbox)]
- Others, please specify (ID = 4289076) [Selectable (show checkbox)]
- B.2.2\_Which kind of model is used (key/most important model)? (ID = 4289081) [Not selectable (no checkbox)]
  - General equilibrium model (ID = 4289082) [Selectable (show checkbox)]
  - Partial equilibrium model (ID = 4289083) [Selectable (show checkbox)]
  - Bio-physical/biomass model (ID = 4289084) [Selectable (show checkbox)]
  - Integrated assessment model (ID = 4289085) [Selectable (show checkbox)]
  - Other, please specify if possible (ID = 4289086) [Selectable (show checkbox)]
- B.2.3\_Which other models are used? Please specify by marking the text. (ID = 4289077) [Not selectable (no checkbox)]
- B.3\_For statistical models... (ID = 4289087) [Not selectable (no checkbox)]
  - B.3.1\_Which approach is taken? (ID = 4289088) [Not selectable (no checkbox)]
    - Accounting identity (ID = 4289089) [Selectable (show checkbox)]
      - Regression (ID = 4289090) [Selectable (show checkbox)]
      - Other, please specify by marking the text. (ID = 4289091) [Selectable (show checkbox)]
- For expert input (ID = 4289093) [Not selectable (no checkbox)]
  - B.4.1\_Please describe the approach marking in the text. (ID = 4289094) [Not selectable (no checkbox)]
- B.5\_For mixed methods (ID = 4289095) [Not selectable (no checkbox)]
  - B.5.1\_Please describe how methods are mixed marking the text (ID = 4289096) [Not selectable (no checkbox)]
- C\_Geographic coverage (ID = 4289097) [Not selectable (no checkbox)]
  - C.1\_Which countries/regions are covered? (ID = 4289160) [Not selectable (no checkbox)]
    - Global (ID = 4289162) [Selectable (show checkbox)]
    - Regional: developed countries in general (ID = 4289167) [Selectable (show checkbox)]
    - Regional: developing countries in general (ID = 4289163) [Selectable (show checkbox)]
    - Regional: Asia (ID = 4289164) [Selectable (show checkbox)]
    - Regional: Africa (ID = 4289165) [Selectable (show checkbox)]
    - Regional: Latin America (ID = 4289166) [Selectable (show checkbox)]
    - Others, please specify (ID = 4297387) [Selectable (show checkbox)]
- D\_Sectoral coverage (ID = 4297364) [Not selectable (no checkbox)]
  - D.1\_Which sectors, commodities are covered? (ID = 4297386) [Not selectable (no checkbox)]
    - Food (ID = 4298958) [Selectable (show checkbox)]
    - Agriculture (ID = 4298957) [Selectable (show checkbox)]
    - Total cereals (ID = 4297365) [Selectable (show checkbox)]
    - Total crops/plant products (ID = 4297366) [Selectable (show checkbox)]
    - Maize (ID = 4297367) [Selectable (show checkbox)]
    - Wheat (ID = 4297368) [Selectable (show checkbox)]
    - Rice (ID = 4297369) [Selectable (show checkbox)]
    - Livestock/animal products (ID = 4297370) [Selectable (show checkbox)]
    - Others, please specify (ID = 4297371) [Selectable (show checkbox)]
  - E\_Food security indicators (ID = 4289109) [Not selectable (no checkbox)]
  - E.1\_Which indicators? Please describe how they are computed by marking the text. (ID = 4289110) [Not selectable (no checkbox)]
    - Agricultural production (ID = 4298959) [Selectable (show checkbox)]
    - Food production (ID = 4298960) [Selectable (show checkbox)]
    - Food prices (ID = 4289111) [Selectable (show checkbox)]
    - Undernourishment (ID = 4289113) [Selectable (show checkbox)]
    - Child malnutrition (ID = 4289114) [Selectable (show checkbox)]
    - Other, please specify. (ID = 4289115) [Selectable (show checkbox)]
  - F\_Scenarios (ID = 4289116) [Not selectable (no checkbox)]

- F.1\_How many scenarios are analysed, Please specify in text box and mark text (ID = 4289157) [Selectable (show checkbox)]
- F.2\_Start year of projection, please state in info box (ID = 4289158) [Selectable (show checkbox)]
- F.3\_End year of projection, please state in info box (ID = 4289159) [Selectable (show checkbox)]
- F.4\_Characterisation of scenario approach (ID = 4289117) [Not selectable (no checkbox)]
  - Explorative scenario analysis (ID = 4289118) [Selectable (show checkbox)]
    - Projections what if? (ID = 4289119) [Selectable (show checkbox)]
  - Normative analysis (ID = 4289120) [Selectable (show checkbox)]
  - Mixture of scenarios (ID = 4289121) [Selectable (show checkbox)]
  - Others, please specify in info box and marking the text (ID = 4309995) [Selectable (show checkbox)]
- F.5\_Which SSP scenarios are modelled? Please tick and mark text. (ID = 4297372) [Not selectable (no checkbox)]
  - none (ID = 4309996) [Selectable (show checkbox)]
  - SSP1 (ID = 4297373) [Selectable (show checkbox)]
  - SSP2 (ID = 4297374) [Selectable (show checkbox)]
  - SSP3 (ID = 4297375) [Selectable (show checkbox)]
  - SSP4 (ID = 4297376) [Selectable (show checkbox)]
  - SSP5 (ID = 4298961) [Selectable (show checkbox)]
  - A1 (SRES) (ID = 4297377) [Selectable (show checkbox)]
  - A2 (SRES) (ID = 4297378) [Selectable (show checkbox)]
  - B1 (SRES) (ID = 4297379) [Selectable (show checkbox)]
  - B2 (SRES) (ID = 4297380) [Selectable (show checkbox)]
  - Others, please mark in the text. (ID = 4297381) [Selectable (show checkbox)]
- G\_Drivers (ID = 4289126) [Not selectable (no checkbox)]
  - G.1\_Which key drivers are considered on the supply side? Please tick and mark the text. (ID = 4289128) [Not selectable (no checkbox)]

Definiton and reasoning by marking text.

- Technical change (via changes in yields, total factor productivity...) (ID = 4289136) [Selectable (show checkbox)]
- Climate change (ID = 4289137) [Selectable (show checkbox)]
- Land (degradation) (ID = 4289140) [Selectable (show checkbox)]
- Water (scarcity) (ID = 4289141) [Selectable (show checkbox)]
- Ecosystem services (ID = 4289142) [Selectable (show checkbox)]
- Aquaculture (ID = 4289143) [Selectable (show checkbox)]
- Post harvest losses and storage (ID = 4289144) [Selectable (show checkbox)]
- Alternative sources of supply (insects, algae...) (ID = 4289145) [Selectable (show checkbox)]
- Others, please specify. (ID = 4289146) [Selectable (show checkbox)]
- G.2\_Which key drivers are considered on the demand side? Please tick and mark the text. (ID = 4289127) [Not selectable (no checkbox)]
  - Definition and reasoning by marking text.
  - Population growth (ID = 4289129) [Selectable (show checkbox)]
  - Economic growth (ID = 4289130) [Selectable (show checkbox)]
  - Biofuels & bioeconomy (ID = 4289131) [Selectable (show checkbox)]
  - Diet and changes in consumer preferences (ID = 4289132) [Selectable (show checkbox)]
  - Urbanisation (ID = 4289133) [Selectable (show checkbox)]
  - Poverty and inequality (ID = 4289134) [Selectable (show checkbox)]
  - Food waste (ID = 4289135) [Selectable (show checkbox)]
- Others, please specify. (ID = 4289147) [Selectable (show checkbox)]
- H\_Results (ID = 4297385) [Not selectable (no checkbox)]
  - H.1\_Results for which food security indicators? Please tick and mark the text. (ID = 4289150) [Not selectable (no checkbox)]
    - Availbale and where to find them (marking the text)
    - Food prices (ID = 4289152) [Selectable (show checkbox)]

- Agri-food production in kcal/cap/day (ID = 4289153) [Selectable (show checkbox)]
- Child malnutrition (ID = 4289155) [Selectable (show checkbox)]
- Undernourishment (ID = 4289154) [Selectable (show checkbox)]
- Other, please specify (ID = 4289156) [Selectable (show checkbox)]
- G.1\_Which key drivers are considered on the supply side? Please tick and mark the text. (ID = 4316287) [Not selectable (no checkbox)]
- H.2\_Results for which supply side drivers? Please tick and mark the text. (ID = 4316286) [Not selectable (no checkbox)]

Availbale and where to find them (marking the text)

- Ecosystem services (ID = 4316295) [Selectable (show checkbox)]
- Water (scarcity) (ID = 4316294) [Selectable (show checkbox)]
- Alternative sources of supply (insects, algae...) (ID = 4316301) [Selectable (show checkbox)]
- Post harvest losses and storage (ID = 4316299) [Selectable (show checkbox)]
- Land (degradation) (ID = 4316293) [Selectable (show checkbox)]
- Technical change (via changes in yields, total factor productivity...) (ID = 4316291)
   [Selectable (show checkbox)]
- Climate change (ID = 4316292) [Selectable (show checkbox)]
- Aquaculture (ID = 4316297) [Selectable (show checkbox)]
- Others, please specify. (ID = 4316304) [Selectable (show checkbox)]
- H.3\_Results for demand side drivers? Please tick and mark the text. (ID = 4316288) [Not selectable (no checkbox)]

Available and where to find them?

- Population growth (ID = 4316302) [Selectable (show checkbox)]
- Economic growth (ID = 4316303) [Selectable (show checkbox)]
- Biofuels & bioeconomy (ID = 4316305) [Selectable (show checkbox)]
- Diet and changes in consumer preferences (ID = 4316296) [Selectable (show checkbox)]
- Urbanisation (ID = 4316289) [Selectable (show checkbox)]
- Poverty and inequality (ID = 4316290) [Selectable (show checkbox)]
- Food waste (ID = 4316298) [Selectable (show checkbox)]
- Others, please specify. (ID = 4316300) [Selectable (show checkbox)]
- H.4\_Is there an annex with data? Please mark in the text. (ID = 4297383) [Selectable (show checkbox)]
  - Yes, please state where to find the data (web link) and/or mark the text. (ID = 4289170) [Selectable (show checkbox)]
  - No (ID = 4289169) [Selectable (show checkbox)]
  - Unknown (ID = 4289171) [Selectable (show checkbox)]