

Modelling dynamic effects of multi-scale institutions on land use change: Electronic Supplementary Material 1

Regional Environmental Change

Sascha Holzhauer^{*a,b}, Calum Brown^{a,c}, Mark Rounsevell^{a,c}

^aSchool of GeoSciences, University of Edinburgh, Edinburgh EH8 9XP, United Kingdom.

^bUniversity of Kassel, Integrated Energy Systems Group, Department of Electrical Engineering and Computer Science, Wilhelmshöher Allee 73, 34121 Kassel, Germany.

^cKarlsruhe Institute of Technology, Institute of Meteorology and Climate Research, Atmospheric Environmental Research (IMK-IFU), Kreuzeckbahnstr. 19, 82467 Garmisch-Partenkirchen, Germany. Email: *firstname.lastname@kit.edu*

*Corresponding author. Email: sascha.holzhauer@uni-kassel.de; telephone no.: +49 (0) 561 804 6513; Fax: +49 (0) 561 804 6027

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Model Regions

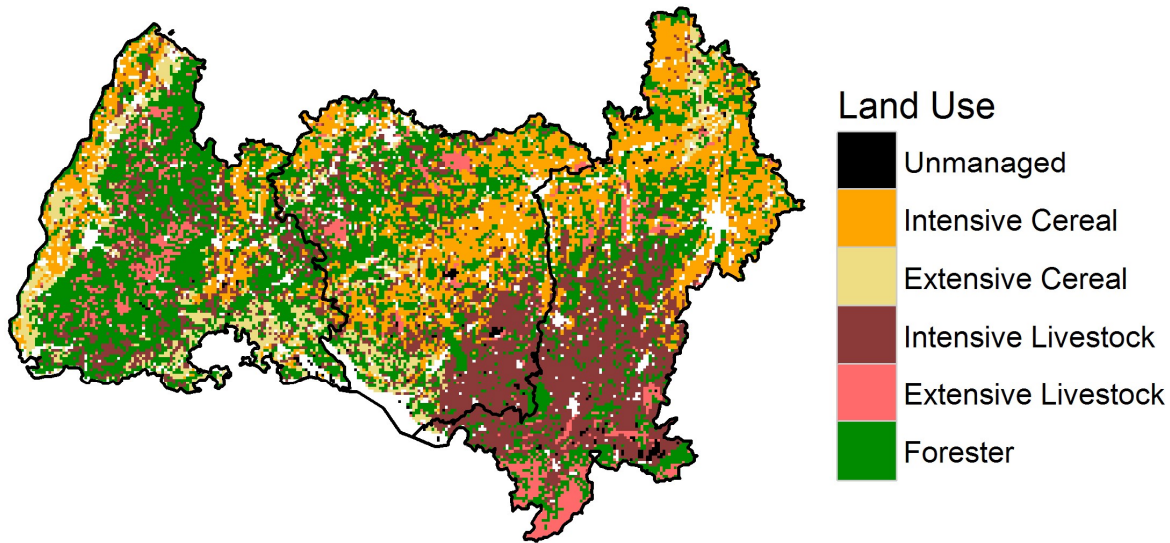


Figure 1: Model region with initial land use. Region A is on the left, Region B in the middle, and Region C on the right (divided by black lines on map).

Agent Functional Types (AFT) Parameters

AFT	GI	GI DistMean	GI DistSD	GU	GU DistMean	GU DistSD	Noise
C_Cereal	0.1	0.1	0.3	0	0	0.3	0.1
NC_Cereal	1.0	1.0	0.3	0	0	0.3	0.1
C_Livestock	0.1	0.1	0.3	0	0	0.3	0.1
NC_Livestock	1.0	1.0	0.3	0	0	0.3	0.1
Forester	1.0	1.0	0.3	0	0	0.3	0.1

Table 1: AFT parameters. GU is Giving up, GI is giving in. Noise describes the maximum value of a uniform distribution (of mean 'DistMean' and standard deviation 'DistSD') which is added to the AFT's default optimal production.

Agent Functional Types (AFT) Production

C_Cereal

X	Cprod	Fprod	Infra	Lprod	Nat	Econ	Production
Meat	0.0	0.0	0.0	0.0	0	0.0	0.000000
Cereal	0.8	0.2	0.5	0.2	0	0.5	1.229431
Timber	0.0	0.0	0.0	0.0	0	0.0	0.000000

Table 2 Capital sensitivities and productivities for AFT C_Cereal (intensive cereal farming)

NC_Cereal

X	Cprod	Fprod	Infra	Lprod	Nat	Econ	Production
Meat	0.0	0.0	0.0	0.0	0.00	0.0	0.0000000
Cereal	0.5	0.1	0.3	0.1	0.05	0.2	0.7376588
Timber	0.0	0.0	0.0	0.0	0.00	0.0	0.0000000

Table 3: Capital sensitivities and productivities for AFT NC_Cereal (extensive cereal farming)

C_Livestock

X	Cprod	Fprod	Infra	Lprod	Nat	Econ	Production
Meat	0.6	0.2	0.4	0.5	0	0.4	0.8124785
Cereal	0.0	0.0	0.0	0.0	0	0.0	0.0000000
Timber	0.0	0.0	0.0	0.0	0	0.0	0.0000000

Table 4: Capital sensitivities and productivities for AFT C_Livestock

NC_Livestock

X	Cprod	Fprod	Infra	Lprod	Nat	Econ	Production
Meat	0.3	0.1	0.2	0.4	0.05	0.1	0.4874871
Cereal	0.0	0.0	0.0	0.0	0.00	0.0	0.0000000
Timber	0.0	0.0	0.0	0.0	0.00	0.0	0.0000000

Table 5: Capital sensitivities and productivities for AFT NC_Livestock

Forester

X	Cprod	Fprod	Infra	Lprod	Nat	Econ	Production
Meat	0.0	0.0	0.0	0.0	0.00	0.0	0.0000
Cereal	0.0	0.0	0.0	0.0	0.00	0.0	0.0000
Timber	0.2	0.6	0.1	0.2	0.05	0.1	8.4190

Table 6: Capital sensitivities and productivities for AFT Forester

Capitals

Capital	Identifier	Data source
Crop productivity	Cprod	DynaCLUE (Verburg and Overmars 2009)– Cropland productivity
Livestock productivity	Lprod	DynaCLUE (Verburg and Overmars 2009) – Grassland productivity
Forest productivity	Fprod	CLIMSAVE Integrated Assessment Platform (Harrison et al. 2015) – Potential wood yield
Infrastructure	Infra	DynaCLUE (Verburg and Overmars 2009) – Infrastructure
Economic	Econ	DynaCLUE (Verburg and Overmars 2009) – Economic capital
Natural capital	Nat	CLIMSAVE Integrated Assessment Platform (Harrison et al. 2015) – Natural capital

Table 7: Capitals, their identifiers, and data source.

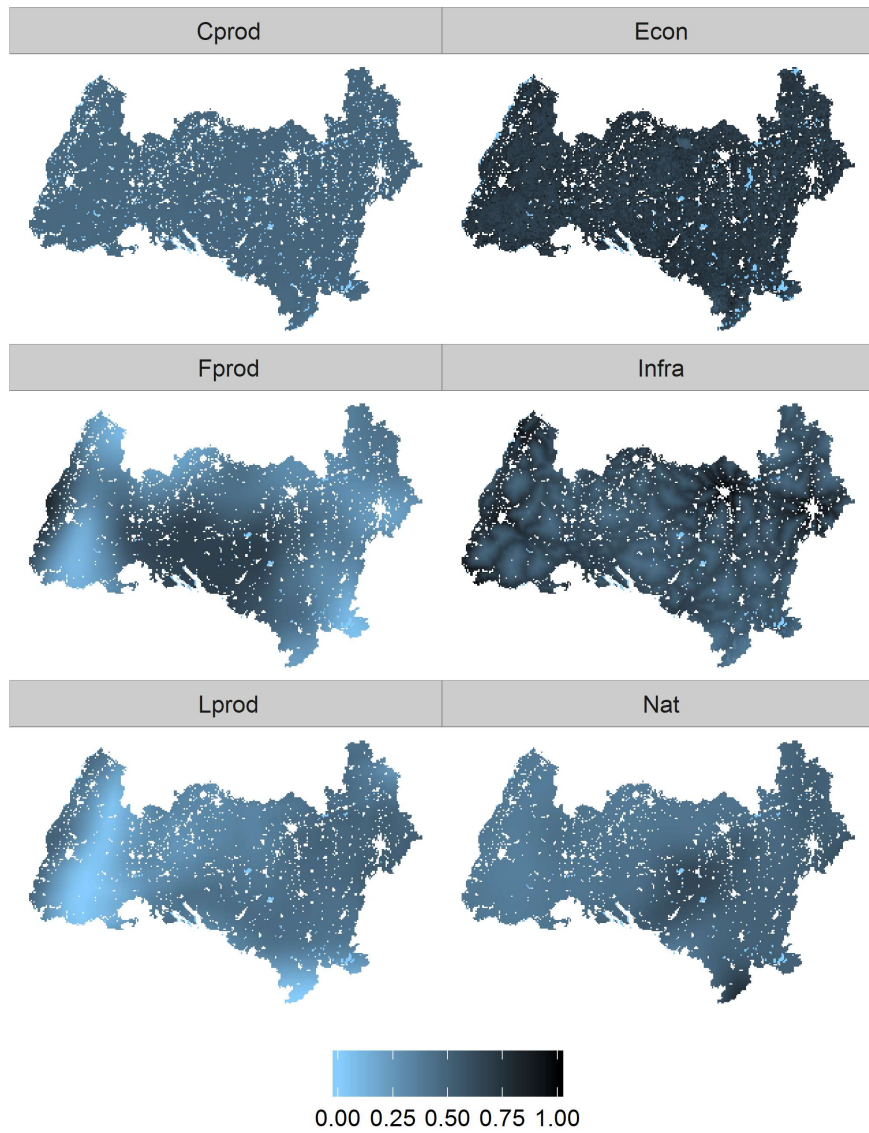


Figure 2: Initial levels of capitals. See Table 7 for description and data sources.

Benefit Functions

Service	Function
Meat	$5.90x + 0.014$
Cereal	$3.26x + 0.025$
Timber	$1.0x + 0$

Table 8: Benefit functions (of linear form $ax + b$) for each considered service.

Service Demands

Service demands for each region were set to roughly match service supply of the initial land use (based on given production functions in Table 2 to Table 6 and capitals data in Figure 2) and change over time in response to a set of scenario assumptions based on the Intergovernmental Panel on Climate Change (IPCC) Special Report on Emissions Scenarios (SRES) B1.

Region A

Tick	Region	Cereal	Meat	Timber
2010	A	1300.000	330.0000	9000.000
2011	A	1283.988	323.1846	9058.054
2012	A	1267.976	316.3693	9116.107
2013	A	1251.964	309.5539	9174.161
2014	A	1235.952	302.7386	9232.215
2015	A	1219.940	295.9232	9290.268
2016	A	1203.927	289.1079	9348.322
2017	A	1187.915	282.2925	9406.375
2018	A	1171.903	275.4771	9464.429
2019	A	1155.891	268.6618	9522.483
2020	A	1139.879	261.8464	9580.536
2021	A	1136.270	265.1137	9594.993
2022	A	1132.661	268.3809	9609.451
2023	A	1129.051	271.6481	9623.908
2024	A	1125.442	274.9154	9638.365
2025	A	1121.833	278.1826	9652.822
2026	A	1118.224	281.4498	9667.279
2027	A	1114.614	284.7170	9681.736
2028	A	1111.005	287.9843	9696.193
2029	A	1107.396	291.2515	9710.651
2030	A	1103.787	294.5187	9725.108
2031	A	1102.616	292.5863	9725.510
2032	A	1101.446	290.6539	9725.912
2033	A	1100.275	288.7215	9726.314
2034	A	1099.105	286.7891	9726.716
2035	A	1097.934	284.8567	9727.118
2036	A	1096.763	282.9243	9727.520
2037	A	1095.593	280.9919	9727.921
2038	A	1094.422	279.0595	9728.323
2039	A	1093.252	277.1271	9728.725
2040	A	1092.081	275.1947	9729.127

Table 9: Demands for Services per year in region A. Values for 2010 are chosen to approach the supply of initial land use, and trends resemble those of IPCC scenario B1.

Region B

Tick	Region	Cereal	Meat	Timber
2010	B	950.0000	550.0000	9400.000
2011	B	938.2989	538.6411	9460.634
2012	B	926.5977	527.2821	9521.268
2013	B	914.8966	515.9232	9581.901
2014	B	903.1954	504.5643	9642.535
2015	B	891.4943	493.2054	9703.169
2016	B	879.7932	481.8464	9763.803
2017	B	868.0920	470.4875	9824.437
2018	B	856.3909	459.1286	9885.070
2019	B	844.6898	447.7696	9945.704
2020	B	832.9886	436.4107	10006.338
2021	B	830.3511	441.8561	10021.438
2022	B	827.7136	447.3015	10036.537
2023	B	825.0761	452.7469	10051.637
2024	B	822.4385	458.1923	10066.737
2025	B	819.8010	463.6376	10081.836
2026	B	817.1635	469.0830	10096.936
2027	B	814.5260	474.5284	10112.036
2028	B	811.8885	479.9738	10127.135
2029	B	809.2509	485.4192	10142.235
2030	B	806.6134	490.8646	10157.335
2031	B	805.7580	487.6439	10157.755
2032	B	804.9026	484.4232	10158.174
2033	B	804.0472	481.2026	10158.594
2034	B	803.1918	477.9819	10159.014
2035	B	802.3364	474.7612	10159.434
2036	B	801.4810	471.5406	10159.854
2037	B	800.6256	468.3199	10160.274
2038	B	799.7702	465.0992	10160.693
2039	B	798.9148	461.8786	10161.113
2040	B	798.0594	458.6579	10161.533

Table 10: Demands for Services per year in region B. Values for 2010 are chosen to approach the supply of initial land use, and trends resemble those of IPCC scenario B1.

Region C

Tick	Region	Cereal	Meat	Timber
2010	C	950.0000	630.0000	10000.00
2011	C	938.2989	616.9889	10064.50
2012	C	926.5977	603.9777	10129.01
2013	C	914.8966	590.9666	10193.51
2014	C	903.1954	577.9555	10258.02
2015	C	891.4943	564.9443	10322.52
2016	C	879.7932	551.9332	10387.02
2017	C	868.0920	538.9221	10451.53
2018	C	856.3909	525.9109	10516.03
2019	C	844.6898	512.8998	10580.54
2020	C	832.9886	499.8886	10645.04
2021	C	830.3511	506.1261	10661.10
2022	C	827.7136	512.3635	10677.17
2023	C	825.0761	518.6010	10693.23
2024	C	822.4385	524.8384	10709.29
2025	C	819.8010	531.0758	10725.36
2026	C	817.1635	537.3133	10741.42
2027	C	814.5260	543.5507	10757.48
2028	C	811.8885	549.7882	10773.55
2029	C	809.2509	556.0256	10789.61
2030	C	806.6134	562.2630	10805.68
2031	C	805.7580	558.5739	10806.12
2032	C	804.9026	554.8848	10806.57
2033	C	804.0472	551.1957	10807.02
2034	C	803.1918	547.5065	10807.46
2035	C	802.3364	543.8174	10807.91
2036	C	801.4810	540.1283	10808.36
2037	C	800.6256	536.4392	10808.80
2038	C	799.7702	532.7500	10809.25
2039	C	798.9148	529.0609	10809.69
2040	C	798.0594	525.3718	10810.14

Table 11: Demands for Services per year in region C. Values for 2010 are chosen to approach the supply of initial land use, and trends resemble those of IPCC scenario B1.

Institutional Preferences

	Institution's preference weight	Regional Institution's preference weight
LOW_COST	0.4	0.5
GLOBAL_DEMAND_MATCHING	1.0	1.0
SOCIAL_APPROVAL	0.9	0.9

Table 12: Institutional agents' preference weights.

Actions

Action	Effect	Preferences	Calculation	Annotations
GlobalSubsidyPa (_Cereal / _Clivestock / _NCCereal / _NCLivestock / _Forester)	Increase all land managers competitiveness by {subsidy rate}	LOW_COST	0.5 / 0.5 / 0.3 / 0.3 / 0.5	Fixed
		GLOBAL_DEMAND_MATCHING	$\frac{1}{ S_{sub} } \sum_{s \in S_{sub}} w_{pc} \frac{n_{pc}}{n_g} + \left(\frac{d_s^g - s_s^g}{d_s^g \max_{z \in S} \left(\frac{d_z^g - s_z^g}{d_z^g} \right)} \right) c_s^{sub} f^{sub} \frac{\sum_{f \in FR_{sub}} p_s^f}{\sum_{f \in FR} p_s^f}$	Average of subsidised services of proportion of all cells that potentially could take over when subsidised (reach) plus demand supply gap (importance) times subsidies times proportion of optimal production of subsidised (effect)
		SOCIAL_APP ROVAL	$\min \left(1, \frac{n_{pc}}{n_w} \right) \{0.5/0.7/0.5/0.7/0.5\}$	The more land manager benefit, the higher, multiplied by AFT-specific factor
RegionalSubsidyPa (_Cereal / _Clivestock / _NCCereal / _NCLivestock / _Forester)	Increase regional land managers competitiveness by {subsidy rate}	LOW_COST	0.6	Fixed
		REGIONAL_DEMAND_MATCHING	$\frac{1}{ S_{sub} } \sum_{s \in S_{sub}} w_{pc} \frac{n_{pc}}{n_R} + \left(\frac{d_s^r - s_s^r}{d_s^r \max_{z \in S} \left(\frac{d_z^r - s_z^r}{d_z^r} \right)} \right) c_s^{sub} f^{sub} \frac{\sum_{f \in FR} p_s^f}{\sum_{f \in F_r} p_s^f}$	Average of subsidised services of proportion of regional cells that potentially could take over when subsidised plus demand supply gap times subsidies times proportion of optimal production of subsidised FR
		SOCIAL_APP ROVAL	$\min \left(1, \frac{n_{pc}}{n_w} \right) 0.5$	The more land manager benefit, the higher
DoNothing	No effect	LOW_COST	1	Fixed
		REGIONAL_DEMAND_MATCHING	0	Fixed
		SOCIAL_APP ROVAL	0.4 (global) / 0.3 (regional)	Fixed

Table 13: Institutions' potential actions, the action's effect when performed, the way their utilities towards institutions' preferences are calculated, and according explanation. Terms in parenthesis in the first column indicate that there is one action for each term, in these cases functional roles of land managers.

Evaluation of Potential Actions

	Institution's preference weight	Global Subsidy (int. Cereal)		Global Subsidy (ext. Cereal)	
		Current utility	Weighted utility	Current utility	Weighted utility
LOW_COST	0.4	0.400	0.160	0.300	0.120
GLOBAL_DEMAND_MATCHING	1.0	0.868	0.868	0.697	0.697
SOCIAL_APPROVAL	0.9	0.181	0.162	0.687	0.618
Sum			1.190		1.435

Table 14: Example evaluation of two potential actions. For each preference, the actions' current utility is multiplied by the institution's preference weight. The column sum represents the actions' scores.

Parameter Overview

1st RunID	Last RunID	Random seeds	Experiment
743	743	0-99	Coefficient of variance
720	735	0-19	DoE: Triggering threshold, subsidy rate, action runtime, precedence
740	780	0-19	Sensitivity analysis for subsidies rate (0 to 1.0)
800	824	0-19	Sensitivity analysis for triggering threshold (0.01/.02/.03/.04/.05/.06/.07/.08/.1/.11/.12/.13/.14/.15/.16/.17/.18/.19/.2/.22/.24/.26/.28/0.3)

Table 15: All parameters and input data are available at https://bitbucket.org/geoslurg/pub_serios. RunIDs specify which runs were conducted for particular experiments reported in the paper.

Metrics

Key	Ref.	Description	Interpretation	craftyR function	Aggregation
Number of LU changes	-	Number of changes in land use (if a cell changes multiple times it is counted several times)	Variability: Area under change	metric_rasters_changedcells	sum of all ticks
Number of LU changed cells	-	Number of cells whose land uses changes somewhen during simulation	Variability: Volatility in land use	metric_rasters_changes metric_cellldata_changes	sum of all ticks
Maximum undersupply (% demand)	-	Maximum value of demand-supply gap during simulation when supply falls short of demand [MAX(0,demand – supply)], relative to each service's demand	Service supply: Severity of worst mismatch	metric_agg_supplydemand_maximum	maximum of ticks
Maximum oversupply (% demand)	-	Maximum value of demand-supply gap during simulation when supply exceeds demand [MAX(0, supply – demand)], relative to each service's demand	Service supply: Severity of worst mismatch	metric_agg_supplydemand_maximum	maximum of ticks
Mean undersupply (% demand)	-	Demand for cereals/meat/ timber minus the amount that is supplied when under-	Service supply: Average mismatch	metric_agg_supplydemand_percentage	mean of all ticks

cereal/meat/timber)		supplied, given as percentage relative to demand. Oversupply is considered 0.			
Mean reg. undersupply (% demand cereal)	-	Regional demand for cereals/ meat/timber minus the amount that is regionally supplied when undersupplied, given as percentage relative to demand. Oversupply is considered 0. Averaged across regions.	Service supply: Average mismatch per region	metric_agg_supplydemand_percentage	mean of all ticks
Mean oversupply (% demand cereal/meat/timber)	-	Supply for cereals/meat/timber minus the demand when oversupplied, given as percentage relative to demand. Undersupply is counted as 0.	Service supply: Average mismatch	metric_agg_supplydemand_percentage	mean of all ticks
Mean reg. oversupply (% demand cereal)	-	Regional supply for cereals/ meat/timber minus the regional demand when oversupplied, given as percentage relative to demand. Undersupply is considered 0. Averaged across regions.	Service supply: Average mismatch per region	metric_agg_supplydemand_percentage	mean of all ticks
Number of ext. managed patches	Hijmans (2016)	Number of patches (cells connected via at least one of their 8 (Moore) neighbours) whose cells are managed extensively.	Conservation: Landscape connectivity of land uses	metric_rasters_global_patches	mean of all ticks
Proportion of ext. managed cells	Brown et al. (2016)	Simple proportion of extensively managed cells in all cells	Conservation: Extent of conservation	metric_aggaft_proportions	mean of all ticks
Connectivity of ext. land uses	Brown et al. (2016)	Mean proportion of neighbouring cells (Moore neighbourhood) that are managed by the same type. Cells with fewer neighbours are excluded.	Conservation: Micro connectivity of land uses	metric_cell_data_connectivity_global	mean of all ticks
Number of performed actions	-	Number of all actions that are performed by any institution during a simulation. In case of action runtimes > 1, actions are counted for each tick.	Efficiency: Number of interventions	metrics_agg_actions_number	sum of all ticks
Number of performed ext. LU targeted actions	-	Number of all actions which subsidise extensive land uses that are performed by any institution during a simulation. In case of	Efficiency: Number of interventions that support extensive land use	metrics_agg_actions_number	sum of all ticks

		action runtimes > 1, actions are counted for each tick.			
Supply consistency across regions	Brown et al. (2016) and Simpson (1949)	Proportions of each service in total landscape-scale service supply across landscapes. Maximum if each landscapes produces the same level $\frac{1}{ R } \sum_{r \in R} \left(1 - \sum_{s \in S} \left(\frac{p_r^s}{\sum_{s \in S} p_r^s} \right)^2 \right)$	Diversity: Similarity of service delivery levels across regions	metric_agg_supplyaccrossreg_simpson	mean of all ticks of all services
Shannon Diversity Index	Caillault et al. (2013) and O'Neill et al. (1988)	Negated sum of proportions of land use multiplied by ln(proportion). Alternative to Level of landscape-scale ecosystem service delivery	Diversity: Measures: diversity in land uses	metric_agggaft_diversity_shannon	
Regional supply diversity	Brown et al. (2016) and Simpson (1949)	Simpson's Index of Diversity to combine level and evenness of service delivery per landscape. Maximum if each landscapes produces all services equally $1 - \sum_{s \in S} \left(\frac{p_s}{\sum_{s \in S} p_s} \right)^2$	Diversity: Level of delivery of all services at regions	metric_agg_supplyperreg_simpson	mean of all ticks of all regions
Regional LU diversity	Brown et al. (2016) and Simpson (1949)	Diversity per region defined via Simpson's Index to take account of diversity and evenness. Maximised where many land uses are practiced, each in the same number of cells $\frac{1}{ S } \sum_{s \in S} \left(1 - \sum_{r \in R} \left(\frac{p_r^s}{\sum_{r \in R} p_r^s} \right)^2 \right)$	Diversity: Number and evenness of land uses	metric_agggaft_diversity_simpson	mean of all ticks of all regions
Service delivery efficiency	Brown et al. (2016)	For each service, the mean of non-zero quantities produced across all cells divided by the mean under initial conditions (at start of simulation).	Efficiency: Change in mean per-cell production of given service	metric_agg_regionalsupply_efficiency	mean of all ticks of all services

Table 16: Metrics applied by the simulation to characterise land use dynamics. craftyr is an R package for the post-processing of CRAFTY results and can be installed with R commands 'devtools::install_bitbucket("S-Holzhauser/shbasic")' and 'devtools::install_bitbucket("geoslurg/craftyr@sirios_rec1")' (see package's vignettes for further information).

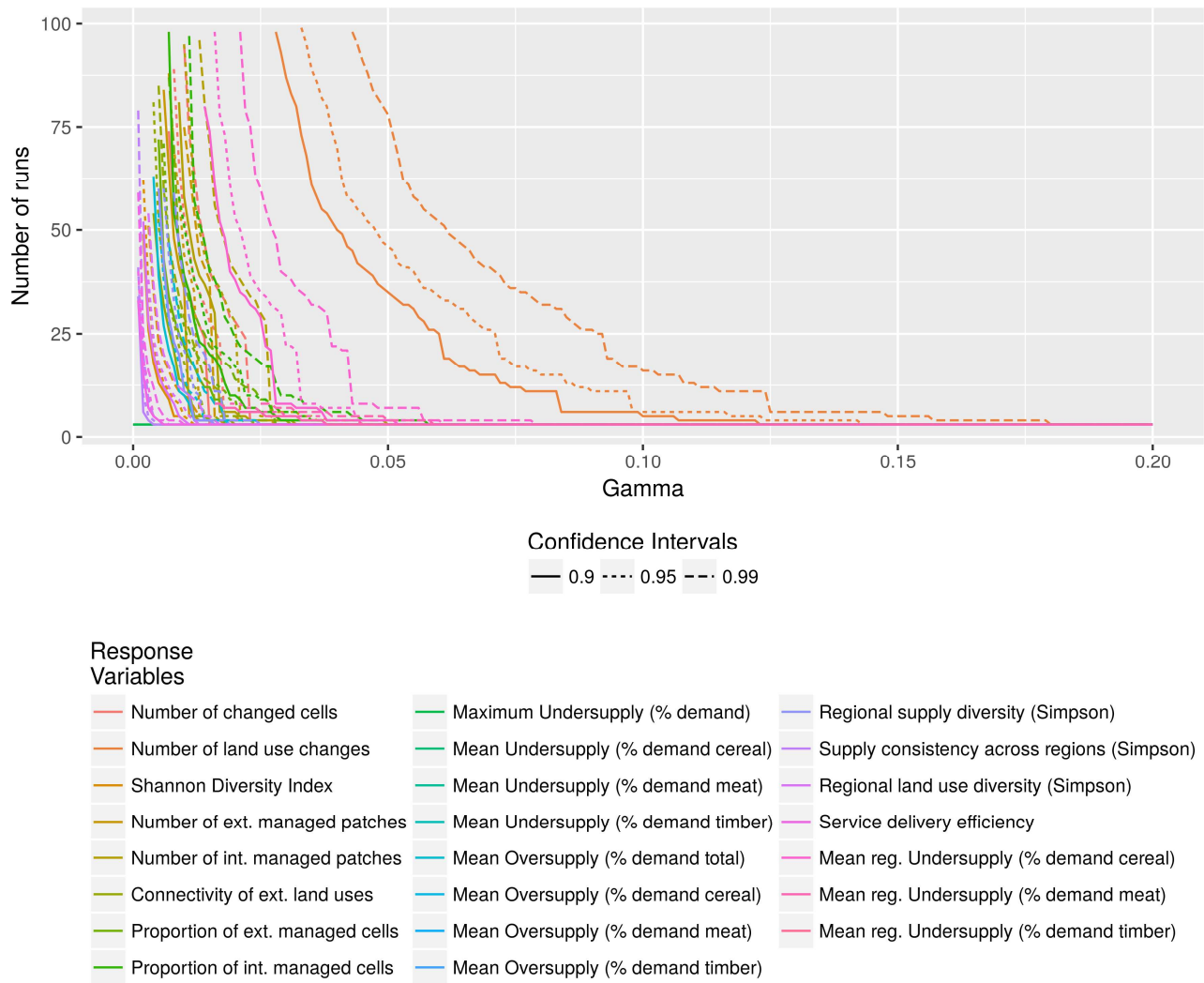


Figure 3: Required number of runs based on the coefficient of variance for confidence intervals .9/.95/.99 for each response variable. The y axis gives the number of runs which are required to keep the response variable within the confidence interval with an error denoted at the x axis.

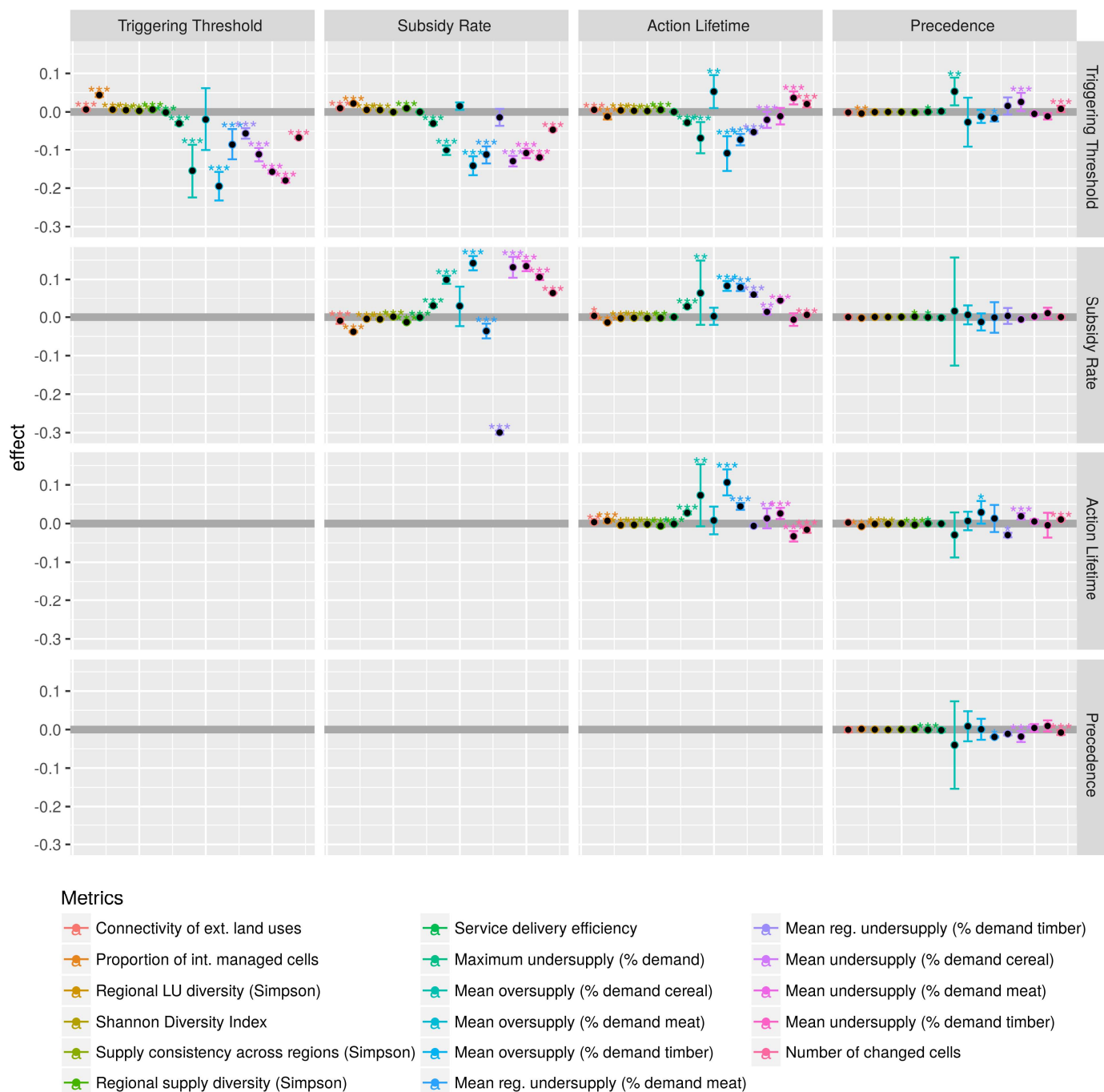
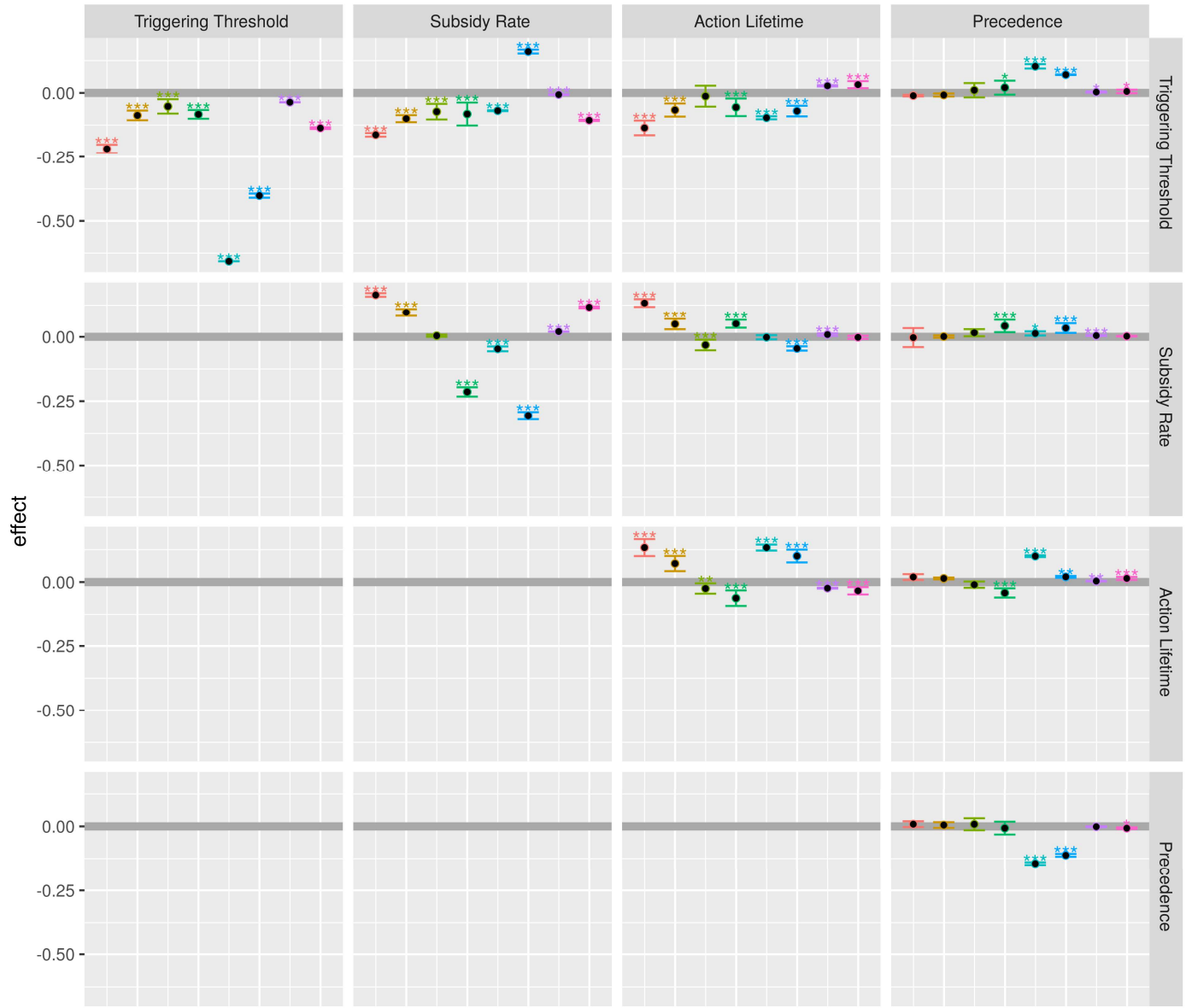


Figure 4: Effects of four parameters (triggering threshold determines when institutions act, the subsidy rate represents the magnitude of subsidies, action lifetime is how long actions are in place, when precedence is on global institutions act first, followed by regional institutions the next time step) on a set of land use metrics from Design of Experiments runs (see article) including interaction effects. Error bars show the 90% confidence interval. Stars above error bars denote levels of significance: *** $\Rightarrow$ 0.001; ** $\Rightarrow$ 0.01; * $\Rightarrow$ 0.05.



Metrics

- Maximum oversupply (% demand) Mean reg. undersupply (% demand cereal) Proportion of ext. managed cells
- Mean oversupply (% demand total) Number of performed actions Number of LU changes
- Mean undersupply (% demand total) Number of performed ext. LU targeted actions

Figure 5: Effects of four parameters (triggering threshold determines when institutions act, the subsidy rate represents the magnitude of subsidies, action lifetime is how long actions are in place, when precedence is on global institutions act first, followed by regional institutions the next time step) on another set of land use metrics from Design of Experiments runs (see article) including interaction effects. Error bars show the 90% confidence interval. Stars above error bars denote levels of significance: *** $\Rightarrow$ 0.001; ** $\Rightarrow$ 0.01; * $\Rightarrow$ 0.05.

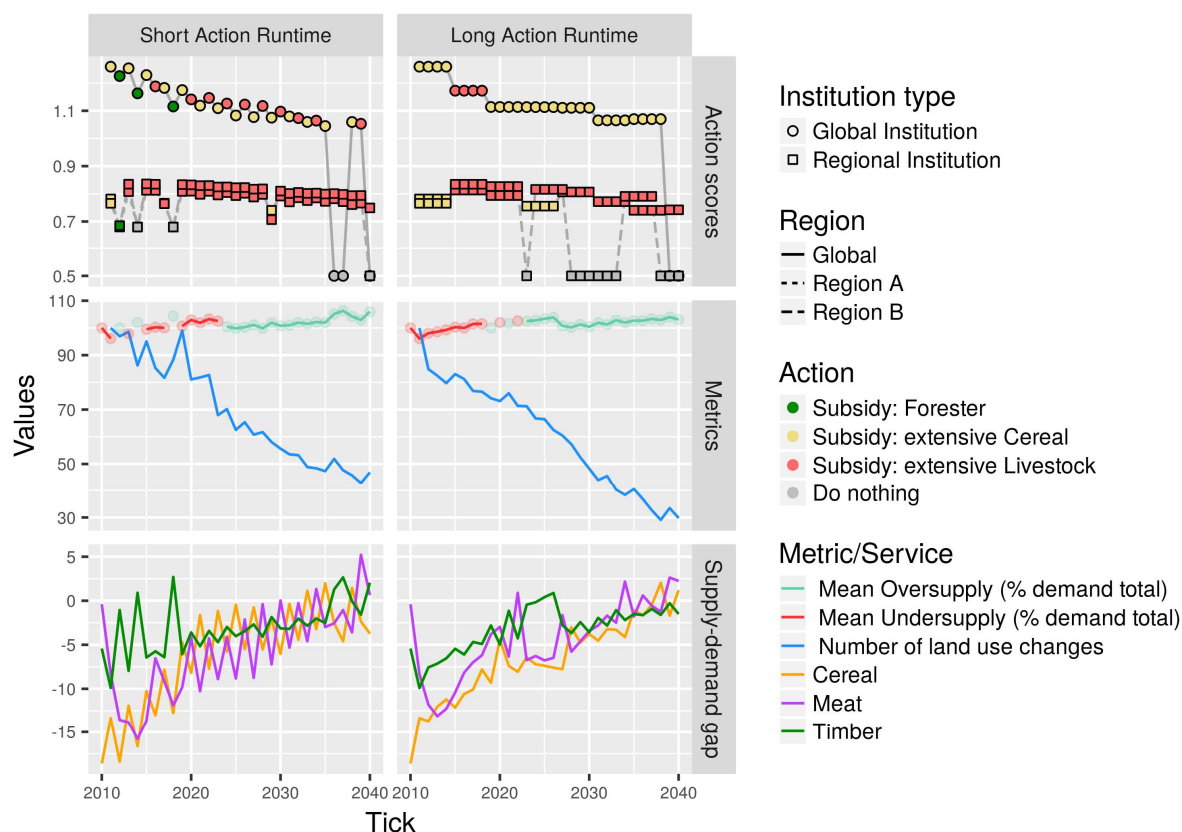


Figure 6: Performed actions and their score (upper panels), mean oversupply, mean undersupply, and number of land use changes (middle panels), as well as global supply demand gaps for cereal, meat and timber (in percentage of their demand levels; bottom panels) for a single run with short actions lifetime (1 time step) compared to a run with long action lifetimes (4 time steps). Subsidies rate is 0.2 (low), triggering threshold is 0.06 (low), and there is no precedence between institutions. Dots show actions performed by the global institutions, squares the ones performed by regional institutions. For reasons of clarity only two of three regions are presented (upper panels). Metrics are divided by their initial value (middle panels).

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