

Role of landscape composition and aggregation on trade-off between food production and conservation of biodiversity

Case of the crop-weed-pollinators system

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ANR *project AGROBIOSE*



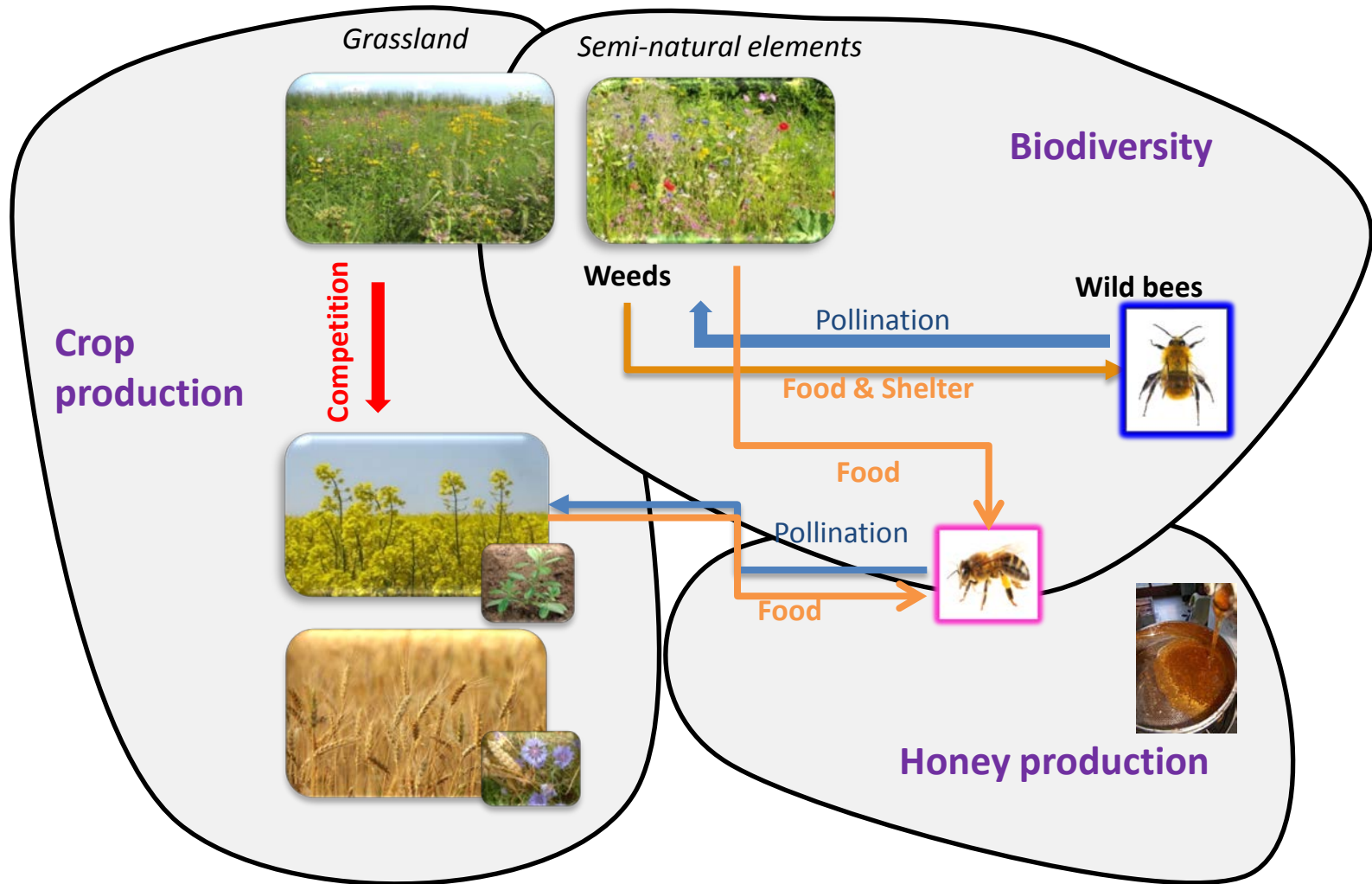
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The crop-weeds-pollinators system



Adapted from Bretagnolle & Gaba 2015

Which farmland landscape can promote the best outcomes for biodiversity & production?

Objective of the study

1. We assess how landscape composition (proportion of crops fields and grasslands) and structure (the level of spatial aggregation) affect crop/honey production and biodiversity.
2. We investigate which landscape composition and structure enable to reach a trade-off between crop/honey production and biodiversity.

The stochastic spatio-temporal model:
a dynamic Bayesian network model

Assumptions



Weeds :

- can be present in crop fields and grassland
- can reduce crop production in oilseed rape and winter wheat due to competition for resources
- no competition between weed species



Honey bees:

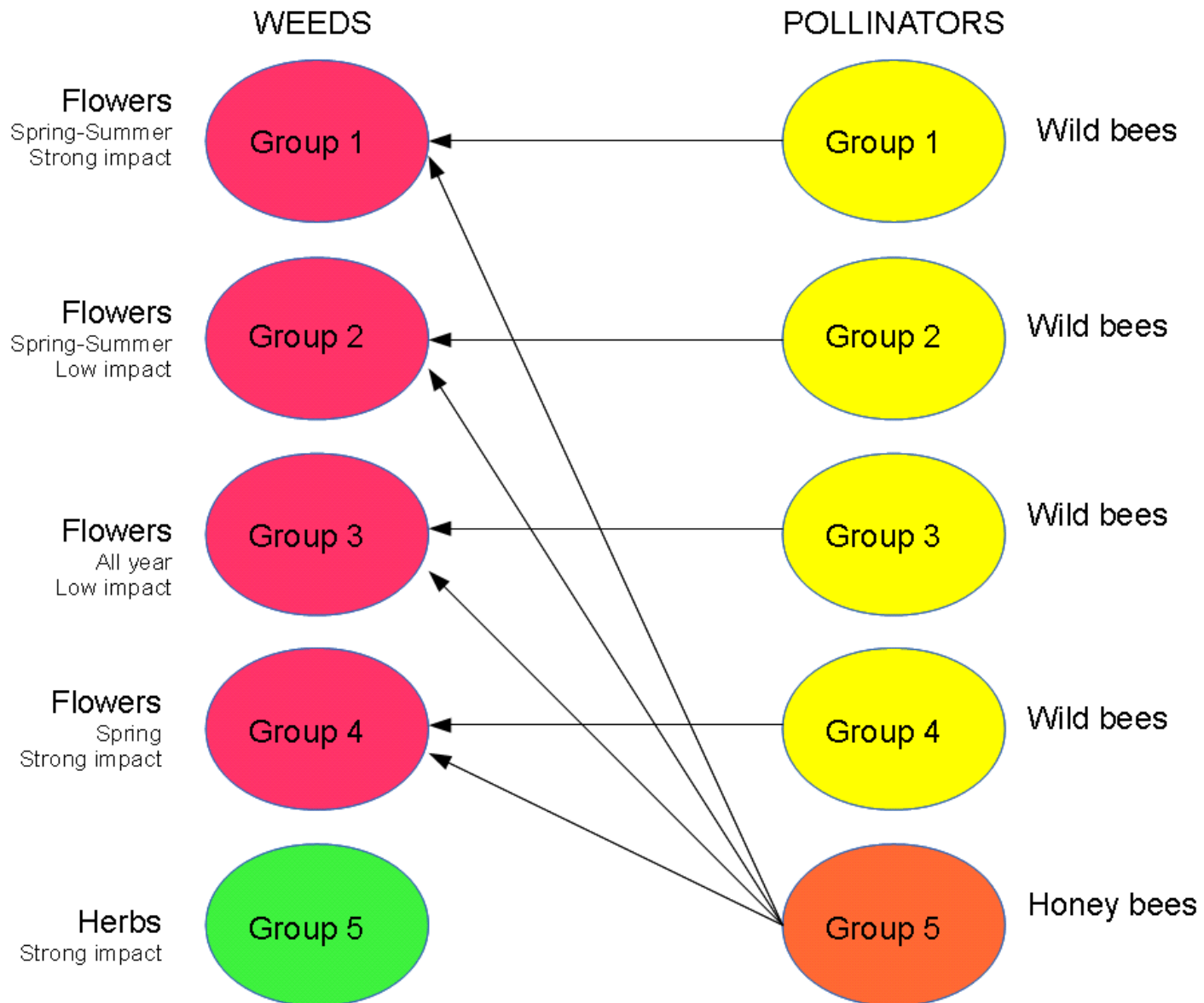
- forage on weed and rape flowers.
- are directly related to honey production.
- can increase oilseed rape production.



Wild bees:

- forage on weed flowers.
- reproduce in grassland habitats.
- pollinate weeds in grassland

Weeds-Pollinators food web






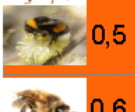





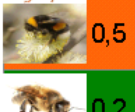








Weeds, bees and wild pollinators spatio-temporal dynamics

Presence-absence of the 5 weed groups

10001	00101	10001
10101	11111	00000
00101	00001	00001

t=0

Quantification
of pollinators
(deterministic)

 0,1	 0,1	 0,1
 0,5	 0,6	 0,6
 0,6	 0,4	 0,1
 0,5	 0,6	 0,3
 0,2	 0,2	 0,2
 0,3	 0,3	 0,3

Total : 2 4




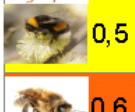
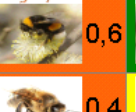
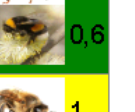




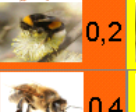





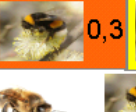

WEED
DYNAMICS
(stochastic)

Presence-absence of the 5 weed groups

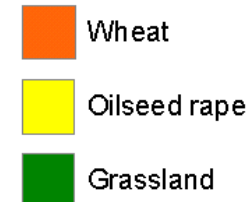
00101	00001	11001
00101	11001	00100
10111	00001	00001

t=1

Quantification
of pollinators
(deterministic)

 0,9	 0,1	 0,1
 0,5	 0,6	 0,6
 0,6	 0,4	 1
 0,5	 0,2	 0,3
 0,2	 0,4	 0,2
 0,5	 0,3	 0,5

Total : 3,9 4





















Abundance score of pollinators

Presence-absence of the 5 weed groups

10001	00101	10001
10101	11111	00000
00101	00001	00001




t=0

Quantification
of pollinators
(deterministic)

 0,1	 0,1	 0,1
 0,5	 0,6	 0,6
 0,6	 0,4	 0,1
 0,5	 0,6	 0,3
 0,2	 0,2	 0,2
 0,3	 0,3	 0,3



Total : 2 4

	Wheat
	Oilseed rape
	Grassland

Based on the notions of habitability score and floral resources score of a field (inspired from Lonsdorf et al. 2009)

➤ score in $[0,1]$ to interpret as a probability to visit field p at time t

➤ the more habitat and the more floral resources in the neighbourhood of p , the larger the score

➤ importance of neighbourhood fields decreases exponentially with distance to field p

Abundance score of pollinators



Habitat
score

Always 1
Assumption of
Unlimited access to beehives

1 for grassland
0 for wheat and oilseed rape

Floral
ressources
score

Depend on season

1 if the weed group foraged by
the wild pollinator
0 otherwise

A dynamic Bayesian network model for weeds dynamics

Probability of presence of weed species s in field p at time t depends on informations in field p and neighbouring fields at $t-1$

- Presence of species s
- Culture choice
- Honey/wild bees scores



Model: generalisation of Dorazio et al. 2000

- Bernoulli distribution
- Take into account local persistence and local colonization

Simulation study

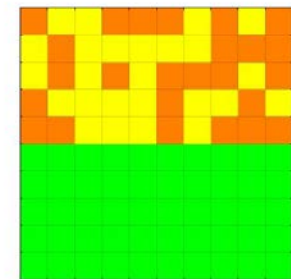
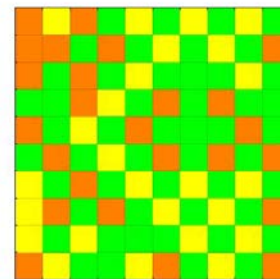
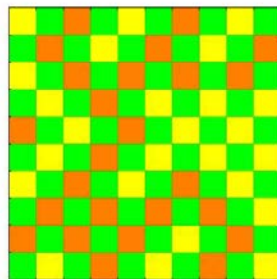
Characterization of landscape characteristics

A landscape

- ⇒ a regular grid of 10 by 10 fields
- ⇒ a composition: proportion of wheat/rape/grassland fields
- ⇒ a structure defined by spatial aggregation using the **AI measure**

AI = ratio between the number of borders shared by fields of the same crop and the maximal number of borders possible for the same number of fields.

(He et al. 2000)



AI global	0	0.17	1
AI oilseed rape-wheat	0	0.22	1
AI grassland	0	0.2	1

Nine landscape compositions

Nb	Oilseed rape	Wheat	Grassland
1	30	70	0
2	50	50	0
3	70	30	0
4	25	50	25
5	37	37	26
6	50	25	25
7	15	35	50
8	25	25	50
9	35	15	50

Increasing
proportion of
grasslands



Model parameters: a possible scenario (among others)

❖ Weeds dynamics:



❖ Competition between weeds and cereal production:

20% (10%) of production loss for weeds with strong (low) impact

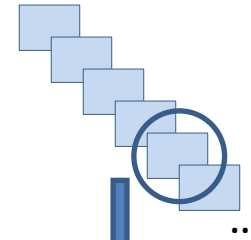
❖ Influence of honey bees of rape production:

Without honey bees, only 70% of the maximal margin can be reached

Simulation study

N°	Oilseed rape	Wheat	Grassland
1	30	70	0
2	50	50	0
3	70	30	0
4	25	50	25
5	37	37	26
6	50	25	25
7	15	35	50
8	25	25	50
9	35	15	50

Between 40 and 100
landscapes with
varying AI generated
using Multiland



40 trajectories
of length 20
simulated

Computation of
average spatio-
temporal scores
over the last 6
time steps

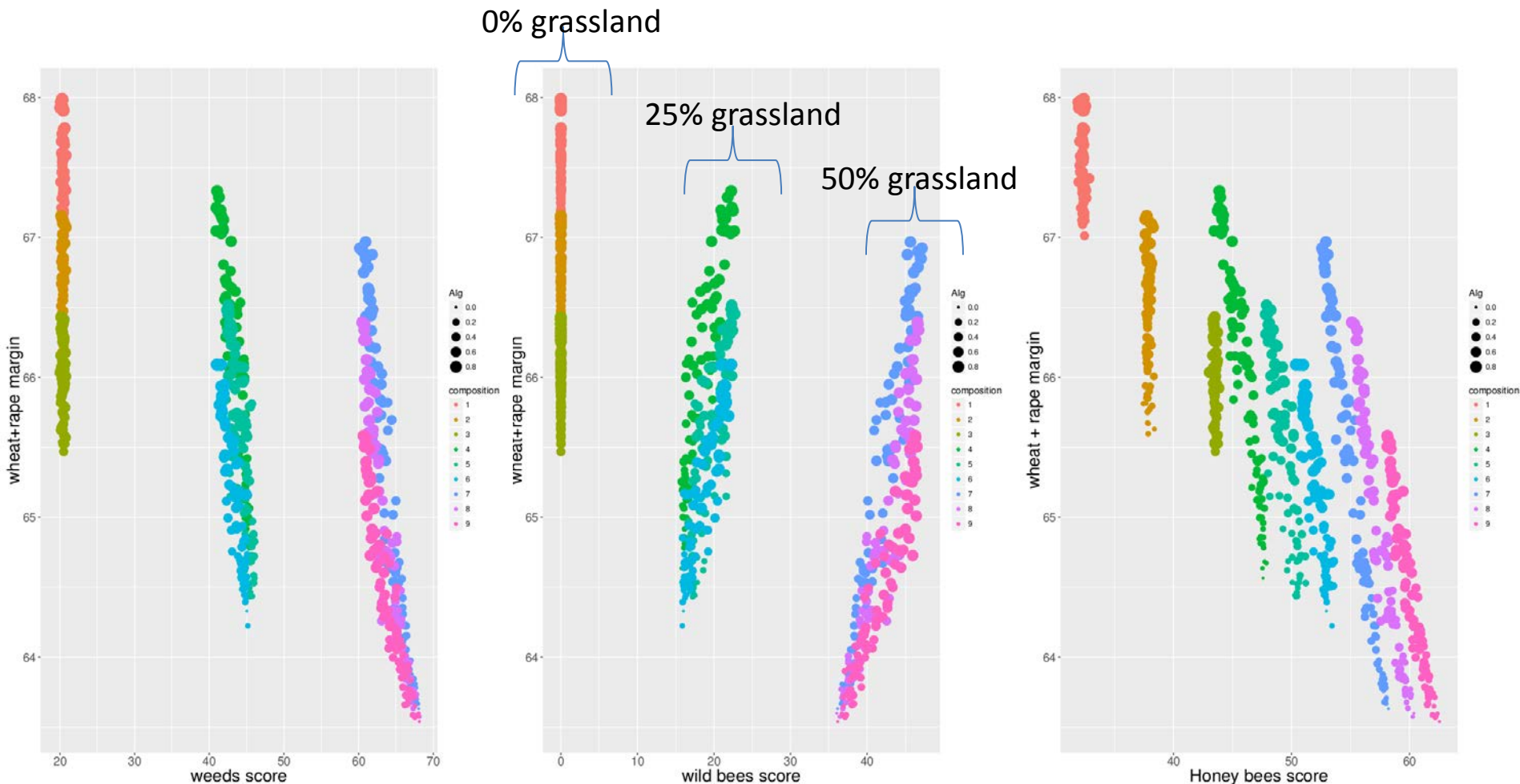
Results

Landscape composition or landscape aggregation: which one impacts more crop/honey production and biodiversity?

answer:
landscape composition →

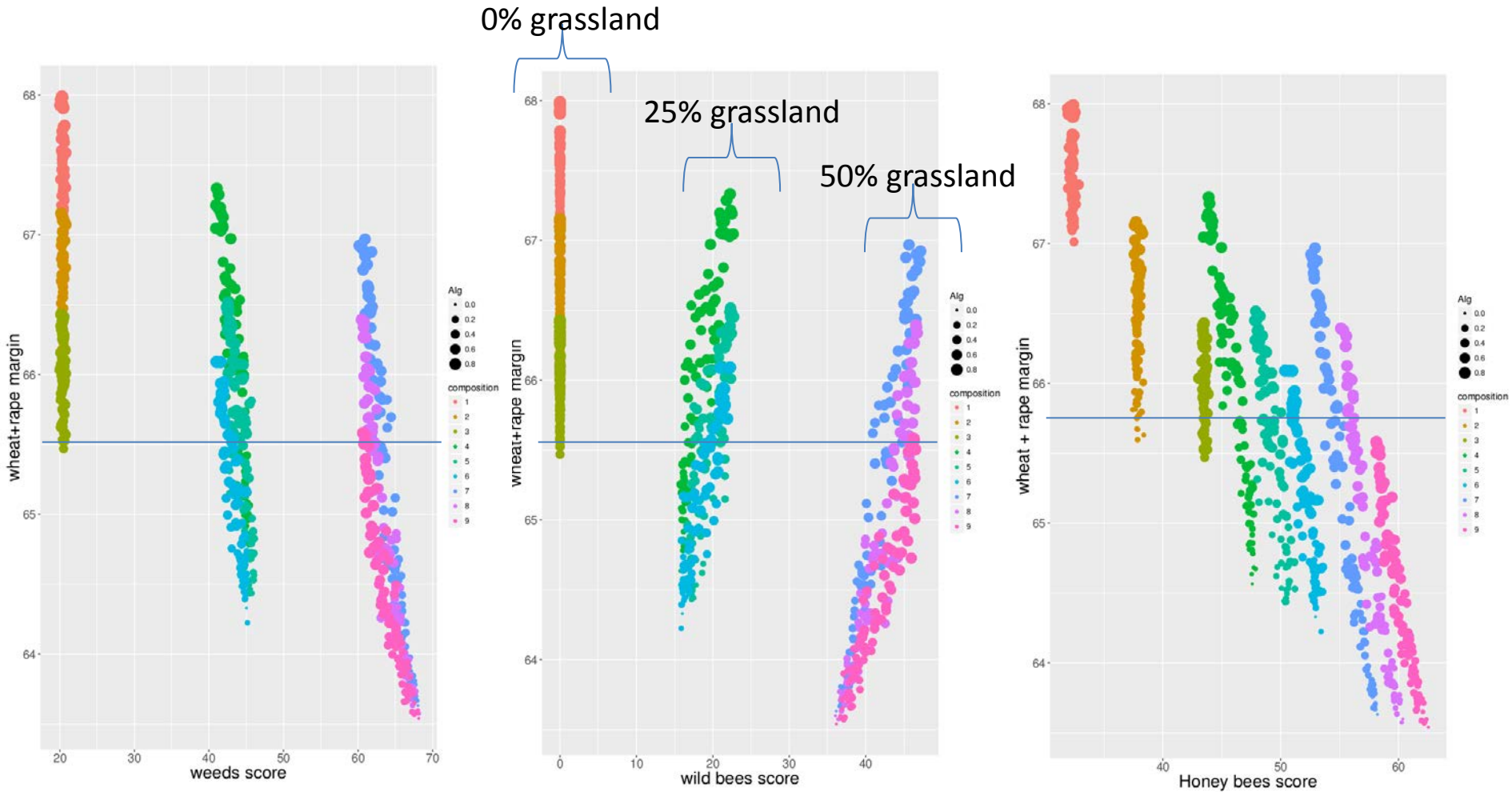
Score	Linear model	quality (R ²)	AIC
Wheat margin	Full	0.99	74921
	Grassland	0.99	93184
	AI	0.21	112726
Oil seed rape margin	Full	0.99	63113
	Grassland	0.99	79991
	AI	0.35	67177
Honey abundance	Full	0.99	149247
	Grassland	0.99	152597
	AI	0.061	208183
Wild bee abundance	Full	0.99	78391
	Grassland	0.99	135123
	AI	0.0008	249594
Weeds occurrence	Full	0.99	95208
	Grassland	0.99	135123
	AI	0.05	249594

Which composition x structure leads to the best trade-off? (1)



➤ For a given composition, larger AI leads to better trade-off, in the Pareto sense.

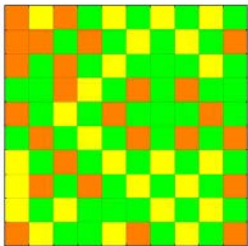
Which composition x structure leads to the best trade-off? (2)



- It is possible to replace rape/wheat field by grassland and to maintain the **per field** margin, if increasing the AI

Conclusions

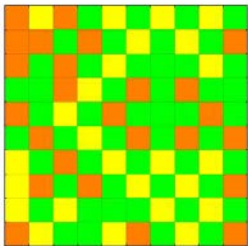
- On the modeling approach:
 - First study on food production/biodiversity conservation trade-off in a landscape with an explicit representation of space and spatio-temporal dependencies
- On the simulation study
 - The proportion of grassland in the landscape seems to be the most influent of the two landscape characteristics
 - For a given proportion of grassland, larger AI leads to better trade-off



Conclusions

But ... conclusions derived under several assumptions

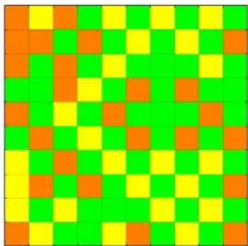
- Influence of model parameters values? (work in progress)
- Realism of some assumptions?
 - Honey and wild bee scores are potential scores, if bees are there.
 - There is not explicit modeling of the weed seed bank dynamics
 - No crop rotation: the landscape remains the same at each time step
 - No competitions between weed species



Perspective

Can we do optimization instead of simulation?

- An original approach : Combining Integer Linear Programming and interactive multi-objective optimization methods
- Agreenskills post-doc proposal of Yann Dujardin, in collaboration with DYNAFOR (INRA Toulouse) and CSIRO-UQ (Brisbane)



Bibliography

- Bretagnolle V., Gaba S. (2015) *Weeds for bees? A review*. Agronomy for Sustainable Development, 35, (3), 891-909
- Dorazio R., Kéry M., Royle J., and Plattner M. (2010). *Models for inference in dynamic metacommunity systems*. Ecology, 91(8) :2466–2475.
- Foley, J.A., Ramankutty, N., Brauman, K.A., Cassidy, E.S., Gerber, J.S., Johnston, M. et al. (2011) *Solutions for a cultivated planet*. Nature, 478, 337–342.
- Green, R.E., Cornell, S.J., Scharlemann, J.P. & Balmford, A. (2005) *Farming and the fate of wild nature*. Science, 307, 550–555.
- He H.S., DeZonia B.E., Mladenoff D.J. (2000). *An aggregation index (AI) to quantify spatial patterns of landscapes*. Landscape Ecol 15(7):591–601.
- Hoffmann, M., Hilton-Taylor, C., Angulo, A., Böhm, M., Brooks, T.M., Butchart, S.H. et al. (2010) *The impact of conservation on the status of the world's vertebrates*. Science, 330, 1503–1509.
- Law E. and Wilson K. (2015). *Providing context for the land-sharing and land-sparing debate*. Conservation Letters, 8(6): 403-413
- Lonsdorf E., Kremen C., Ricketts T., Winfree R., Williams N., and Greenleaf S. (2009). *Modelling pollination services across agricultural landscapes*. Annals of Botany, 103:1589-1600.
- Multiland : <http://informatique-mia.inra.fr/biosp/MULTILAND> / Roques, L. and Stoica R. (2007). *Species persistence decreases with habitat fragmentation: an analysis in periodic stochastic environments*. J Math Biol 55 (2), 189-205.
- Radoszycki J. (2015) *Résolution de processus décisionnels de Markov à espace d'état et d'action factorisés - Application en agroécologie*. Thèse INSA.

How landscape composition and structure affect crop/honey production and biodiversity?

Score	AI	Grassland	Interaction	quality (R ²)
Wheat margin	-0.24	-11.52	9.67	0.78
Rape margin	3.72	2.97	-5.00	0.43(*)
Honey abundance	-0.99	43.94	-9.70	0.87
Wild bee abundance	-0.63	94.31	15.57	0.99
Weeds	1.61	73.60	21.53	0.99

Coefficients of linear model

- The proportion of grassland in the landscape is the most influential of the two landscape characteristics

Which composition x structure leads to the best trade-off? (3)

Situation A:
grassland connected to
arable fields

25% wheat
25% rape
50% grassland

25% wheat
25% rape
50% grassland

Situation B:
grassland separated from
arable fields

50% wheat
50% rape

100%
grassland

Which composition x structure leads to the best trade-off? (3)

- Slight advantage to separated areas for grassland and for cereal fields

