

SESS

#### SESS, Socio-Ecological Systems Simulation centre formed : 2020 with 8 staff, now, 16+ staff over 100 articles, including in Nature & Science

Chris Topping : centre leader, ALMaSS programmer since 1998

Yoko : bee ecology

Jordan : species & environment modelling

Jamie & Geoff : static landscape modelling



Xiaodong : modelling, scripting, ML, HPC, parallel programming

Sara: modelling, SOME Astrid : scenarios

computing

Trine : environmental modelling

Ela : species and environment modelling Peet : species modelling

- Bjarke : modelling, scripting, HPC NN: social scientist
- AARHUS UNIVERSITY

ECOSCIENCE

Luna : admin, modelling, computing

James & Natasha : socio-economics

uCloud : ca. ½ M Genome : ca. 1 M LUMI : ca. 1 M

**GPU** core hours per

EAST.

20 K

CPU

20 K (world's 3rd most powerful HPC)

vear

https://projects.au.dk/sess//

+ Collaborators in : Poland, Portugal, Italy, Germany, The Netherlands, Belgium, UK, Finland, France, Ireland, Spain

The other "team members" : the scripts ... Static landcape models : python, ESRI / OpenGIS Landscape dynamics, species models : C++ ca. 120K lines of code : Windows, Linux, OpenSource, Gitlab, GitKraken, VScommunity, MiDox, Cmake, QT, ...

The other "team members" : the HPCs ...

WHY? **ENVIRONMENTAL RISK** Pesticide regulations, non-target organism effects, multiple stressors, multiple exposure, the recovery fallacy, ... **BIODIVERSITY LOSS Pollinator** issues Mitigation measures, e.g. organic farming practices WILDLIFE ECOLOGY Species management, hare, goose, etc. population ecology needs reliable predictive models that are alternatives to the the common thread : fundamentally analytical & reductionist approaches, e.g. density dependence ALMaSS : Systems based approach with complex modelling HOW? emergent & dynamic structures simula responsive to input changes, with high predictive powers **European Commission** Horizon2020, HorizonEurope ... 5 projects, 3 as lead FOR National Agencies and Research Programmes Danish-EPA, GUDP, ICROFS, LBST, ICØL, Agri Agency, WHOM? Dutch EPA, German Environmental Agency (UBA) EFSA roadmaps e.g. Partnership for Environmental European Food Safety Authority (EFSA) : **Risk Assessment (PERA)** 



AARHUS UNIVERSITY ECOSCIENCE 7 major projects completed since 2020 each of > 3 M kr 10 current projects each of > 3 M kr



ALMaSS and "alternatives to fundamentally analytical & reductionist approaches"

Charles J. Krebs stated "density-dependent relationships occur often but are not repeatable and are an unreliable basis for a predictive ecology"

... but expressed fears that complex hypotheses without rigorous (i.e. type I, false-positive error resistant) scientific constraints could reduce ecologists to storytellers

#### ALMaSS :

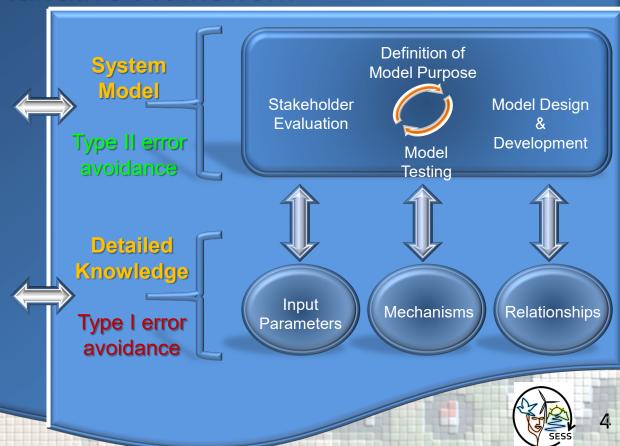
#### No!... story-telling is exactly what is needed

The **narrative frames** the **model** in terms of its context within the system it represents:

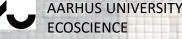
- what to include + what to exclude
- model results affect the narrative changes in the narrative alter the model

replicates baseline x x x x x ... scenario 1 🖈 🛪 🛪 🫪 🦛 ... scenario 2 🖈 🖈 🤺 🤺 ...

#### Narrative Framework









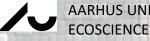
Some of the species modelled in ALMaSS

Each represented as a very highly detailed mechanistic model



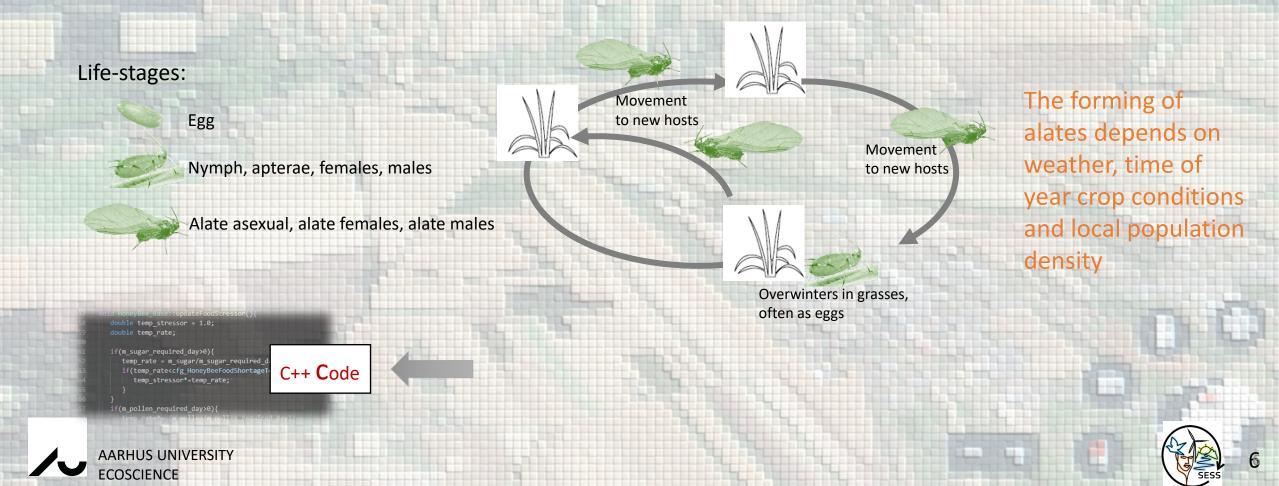
also People (the "M" in ALMaSS), e.g. farmers, hunters ... their socio-economics, motivations, aspirations, knowledge, possibilities, networks, etc.





An example ...

The pea aphid (*Acyrthosiphon pisum*) and grain aphid (*Sitobion arvenae*). Their life-cycles is relatively simple as far as aphids go, but still have very complex spatial dynamics.



Another example ...

#### ApisRAM

- ... the ALMaSS model of the honey bee
- a key pollinator
- with a complex ecology, inside and outside of the colony

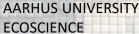


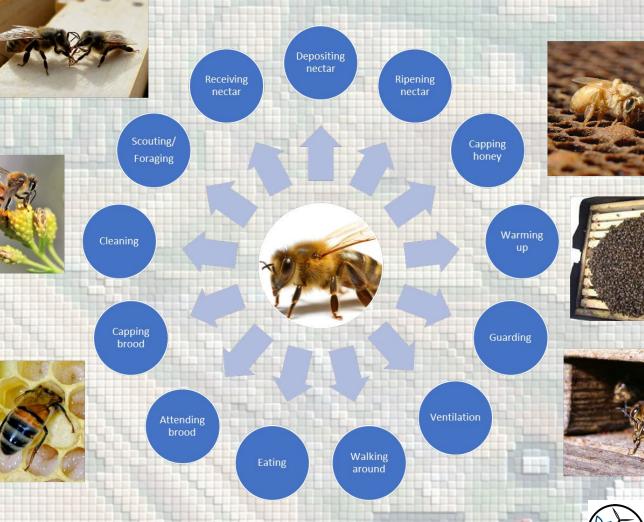
if(m\_sugar\_required\_day>0){
 temp\_rate = m\_sugar/m\_sugar\_required\_
 if(temp\_rate<cfg\_HoneyBeeFoodShortage'
 temp\_stressor\*=temp\_rate;</pre>



if(m\_pollen\_required\_day>0){





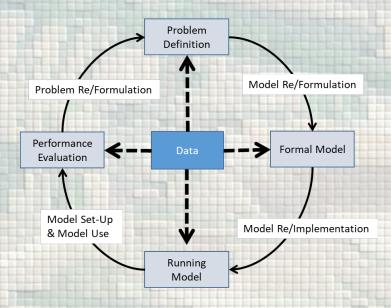




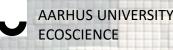
#### **PRODUCTION OF AN ALMASS SPECIES MODEL**

Each species model involves :

- production of a formal model
- creation the 'agent life story'
- how to represent this in code
- model testing
- sensitivity analysis
- uncertainty analysis



- There are many steps, many of which are iterative
- Requires skills in programming, modelling and the agent ecology and behaviour
- A team approach

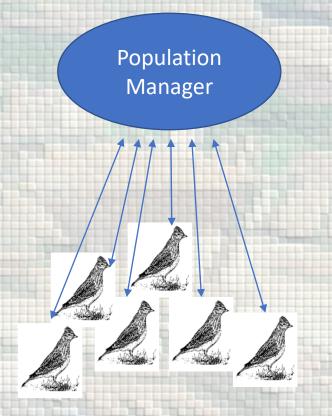


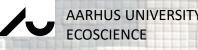




#### PUTTING AN ALMaSS SPECIES MODEL INTO ALMaSS :

- potentially millions of agents operating at once
   e.g. 48 million concurrent beetle agents have been recorded
- their behaviours, counts etc. are controlled by the population manager
- the population manager is an 'instance' of a 'class' and exists as an 'object' in the ALMaSS code
- the population manager is like an administrator for the agent models
- · the population manager controls agent activity at each 'timestep'







**PUTTING AN ALMASS SPECIES MODEL INTO ALMASS :** 

Time – one of the big challenges

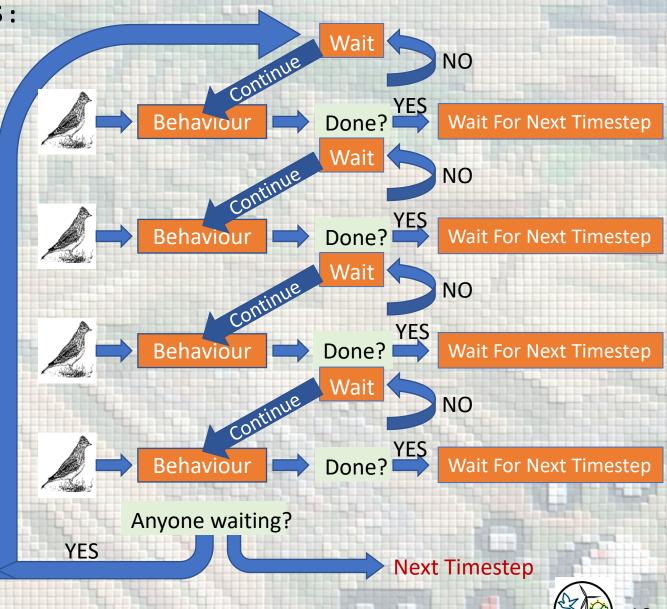
"Timesteps" :

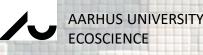
- the landscape model : 1 day timesteps
- for agents, as necessary, e.g. 10 mins for bees

Timestep integration is constrained by serial computing

It is possible for an agent to exhibit many behaviours during a timestep

ALMaSS deals with this using 'step' functions



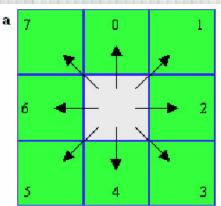


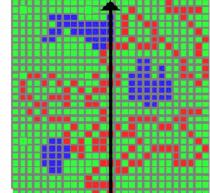
#### PUTTING AN ALMaSS SPECIES MODEL INTO ALMaSS :

Agent movement in space – the other big challenge

- real organisms perceive their surroundings in highly complex ways
- replicating this in the model is impossible
- so ALMaSS uses proxies

- E.g. : vole movement design :
  - represent different types of movement
  - some more directed than others
  - but always avoiding unsuitable habitats

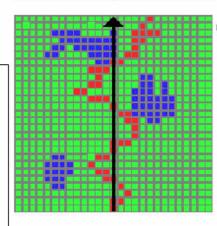


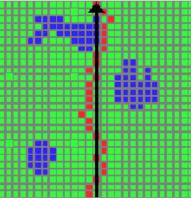


## Figure 1. Movement in the vole.

Green squares are suitable habitat, blue are totally unsuitable. The arrow indicates direction of preferred movement, and the red squares indicate the path taken.

- a The 8 directions possible for each step
- b Standard vole movement, with a weight of 1
- c Intermediate movement
- d Movement used in dispersal with a weight of 3





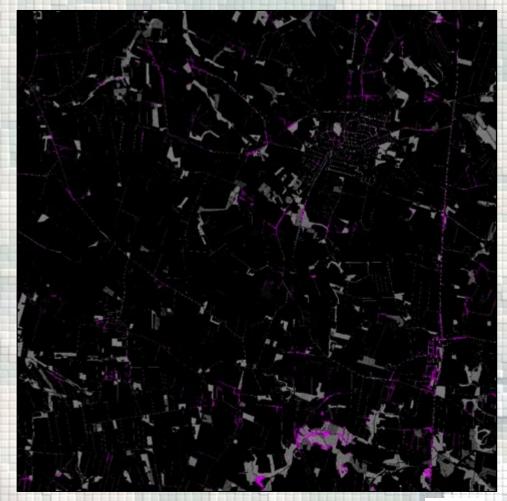


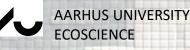


Species interactions  $\rightarrow$  parallel programming



- ladybird and two species of aphid simulated together
- individuals of each species interact in time and space much as in the real world
- requires a parallel programming approach to ALMaSS









COSCIENCE

#### A static component :

essentially a landuse / landcover category map model of all relevant landscape components **including individual fields** 

- a 1x1 m raster of each contiguous LS part as a "parcel"
- a 10x10 km landscape typically has 50 K ightarrow 100 K parcels

with per parcel information on :

- unique ID, type, parcel size (i.e. number of raster cells)
- field parcel → farm linkage (anonymised farm "ID")
- parcel majority soil type (texture categories)
  - parcel pollen and nectar production related factors

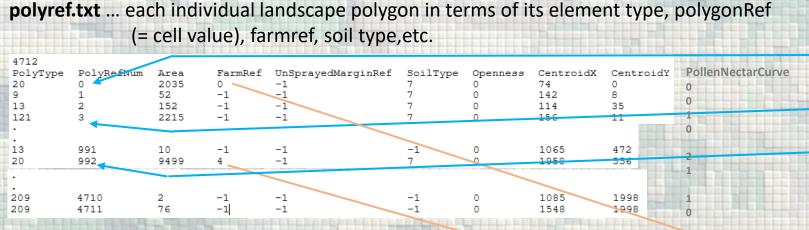
#### That drives, in an ALMaSS run, dynamic simulation of :

- arable field parcel crop type
- field parcel crop management
- landscape parcel biomass
- field parcel pesticide application / LS parcel pesticide drift
  parcel pollen and nectar production
- all relative to field farm type (8 conventional, 8 organic + other) and driven by hourly / daily ERA5 weather data

And all synced together with the lives of the species organism agents

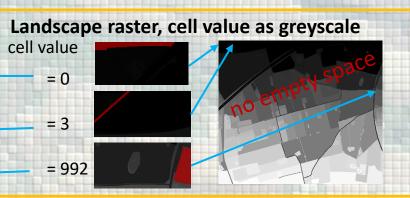


#### THE STATIC LANDSCAPE MODEL



This file, this example, tells an ALMaSS run that

- there are 4712 individual polygons in this landscape window
- the polygon that is described by the pixels with pixel value "0" is :
  - a landscape element type 20 polygon, which is one of the farm field element types
  - comprises 2035 pixels is a field of the farm with the farm reference 0
  - has soil type 7 as its majority soil type etc. etc.
- the polygon that is described by the pixels with pixel value "3" is :
  - a landscape element type 121 polygon, which is "Large Road"
  - comprises 2215 pixels etc. etc.
- the polygon that is described by the pixels with pixel value "992" is :
  - a landscape element type 20 polygon, which is one of the farm field element types
  - comprises 9499 pixels is a field of the farm with the farm reference 4
  - has soil type 7 as its majority soil type
     etc. etc.



**farmref.txt** ... that relates the farm field polygons in the landscape window to their farm type code, via the FarmRef (= ID)

17			
D 1	32 32	This	s file tells an ALMaSS run that :
2	34	$\succ$	the fields in this LS window belong
3 4	34 32		to 17 different farms
5	33	$\triangleright$	the LS polygons with farmref value
6 7	34 34		"0", "1", "4", are part of farms of
8 9	34 33		ALMaSS farmtype 32
10	32	$\triangleright$	the LS polygons with farmref value
11 12	38 34		"2", "3", "6", are part of farms of
13 14	33 33		ALMaSS farmtype 34
15	35	$\succ$	etc.
16	34		



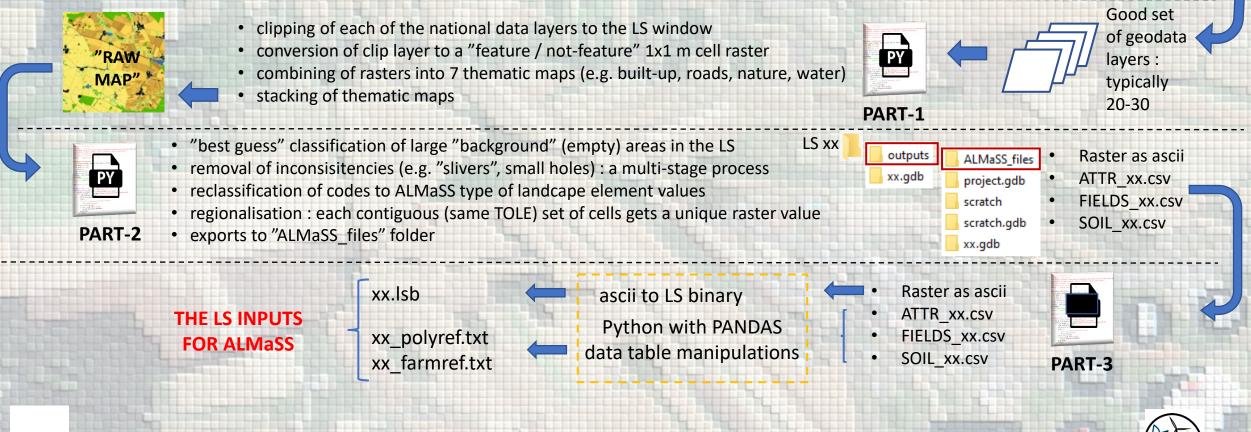


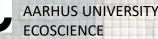
#### **PRODUCTION OF THE STATIC LANDSCAPE MODELS**

Scripted sequence of raster and vector GIS processing steps + table data processing Same overall sequence for all LS windows, but inner-details vary associated with national source data differences • Digital topographical databases (SDFE Geodanmark)

- Data on protected areas / habitats (Arealinformation)
- Additional geodata data e.g. BaseMap
- LBST Internet Field Map ("marker", "oekologiske arealer")
- Animal Identification and Registration System (CHR)

PART-0 : pre-processing of raw GIS geodata, as needed ; may include use of additional data to <u>determine field farm ID and farm type</u>; analysis of crops per farm type to determine farm type crop rotations; done per LS window or national





#### **INCLUSION OF LANDSCAPE DYNAMICS : CROP MANAGEMENT**



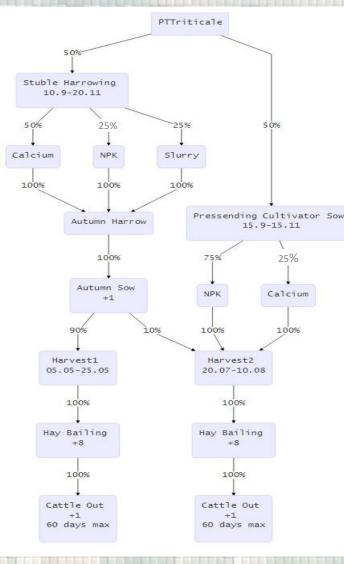
#### Crop management • Farmer's advisors • Farmer's associations • Farmers (field management records)

### Interviews / Enquires

talks to the LS via the lsb, polyref, ALMaSS run farmref file triplet

#### double temp\_stressor = 1.0; double temp\_rate; if(m\_sugar\_required\_day>0){ temp\_rate = m\_sugar/m\_sugar\_required\_d if(temp\_rate<cfg\_HoneyBeeFoodShortageT. temp\_stressor\*=temp\_rate; } }

if(m\_pollen\_required\_day>0){

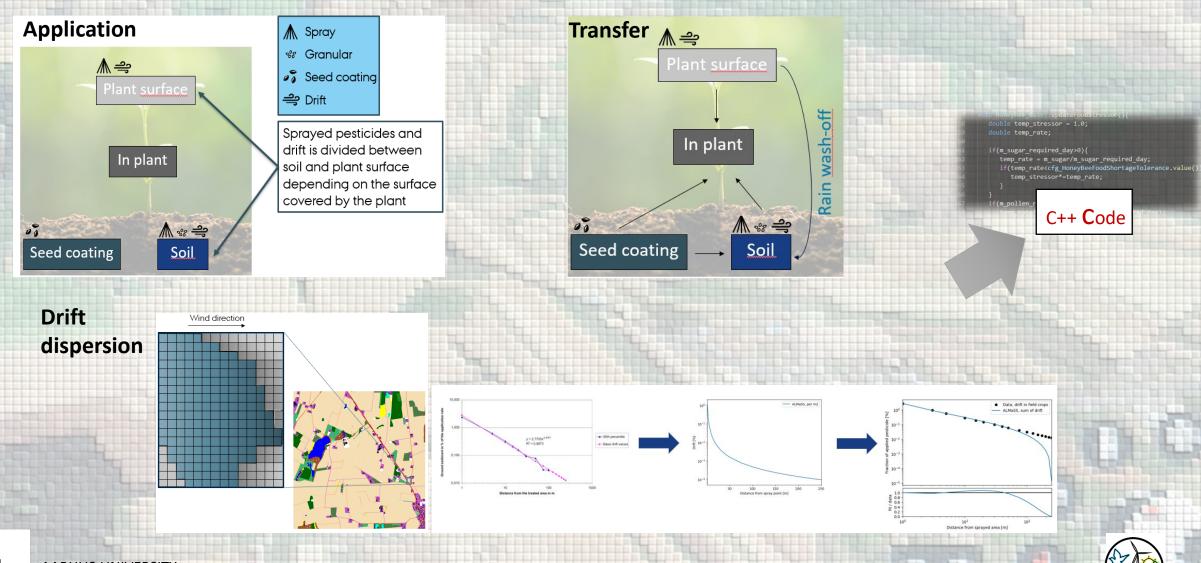


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ALMaSS includes Crop Management code for > 300 crops



**INCLUSION OF LANDSCAPE DYNAMICS : PESTICIDE APPLICATION, COMPARTMENT TRANSFER AND DISPERSION** 

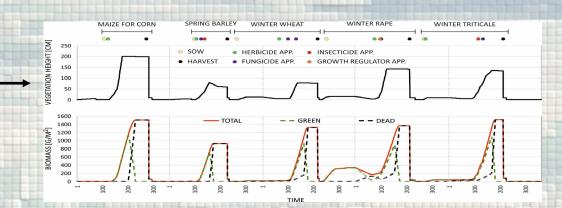


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#### + DYNAMIC LANDSCAPE MODELLING OF :

Vegetation biomass Pollen and nectar qualities and quantities Grazing patterns



#### + INCLUSION OF LANDSCAPE CHANGE SCENARIOS

Farming with addition of uncultivated field boundaries, flower strips, hedge banks, field strips, field patches, set-aside, etc. - The GUDP ICROFS Organic RDD+ project **Organic+** 





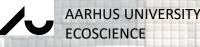


Baseline landscape (ALMaSS LS model) ALMaSS run scenario 1: Set-aside, 10 % by area



ALMaSS run scenario 2: Field strips 6 m, 7% by area





#### back to ... PRODUCTION OF THE STATIC LANDSCAPE MODELS

THE LS INPUTS FOR ALMaSS xx.lsb xx\_polyref.txt xx\_farmref.txt WHY NOT USE ESRI FORMAT OR SOME OTHER EXISTING GIS DATA MODEL?





Yes, ALMaSS can run on a PC in Windows

#### **Reality : SCALING-UP**

model testing, validations, results runs ... dozens of landscapes, multiple species, multiple senarios, 30+ year runs, many replications

ALMaSS is coded to make **highly efficient** use of core memory, including bit addressing



xx\_polyref.txt xx\_farmref.txt

xx.lsb





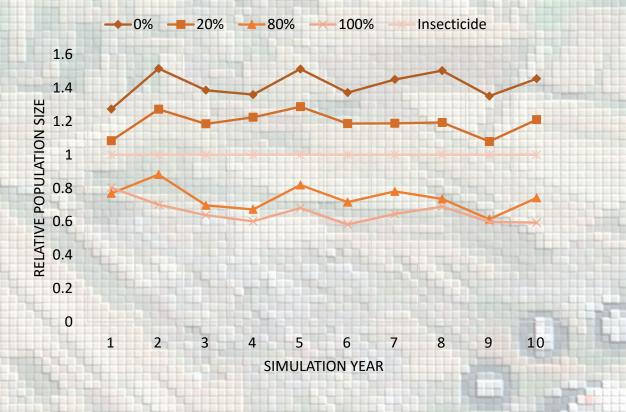
#### **ALMaSS : some results examples**

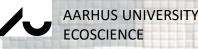
ALMaSS as a virtual ("in silico") laboratory – to test scenarios for impact

a single species (spider)

a single management action (application of biopesticide) with different levels:

**Erigone atra** population size under four assumptions of double application of biopesticide (0-100%) mortality compared to a single insecticide application (80% Mortality) in monoculture





+



#### **ALMaSS : some results examples**

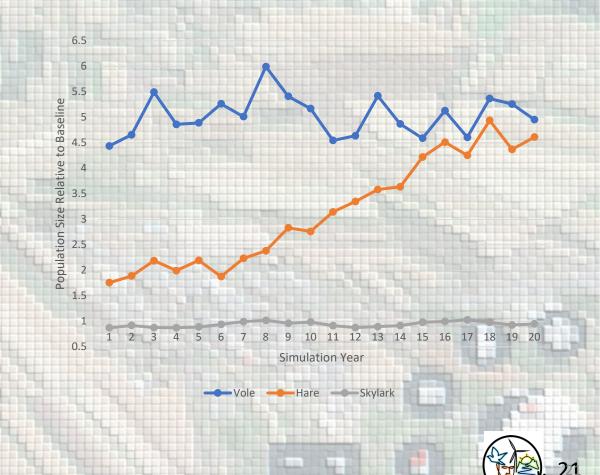
Stacking and optimising managements (client : Horizon2020, EcoStack)

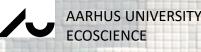
stack managements and test across different species:

- e.g. a combined management scenario of :
- biocide
- field margin grass/flowers
- diversified rotation
- set-aside

compared to baseline

Relative population size of three vertebrate species after the application of stacked management scenarios





#### **ALMaSS : some results examples**

#### Mapping bat pesticide exposure risk

... coincidence of bat activity and high pesticide application in orchards and bush fruit fields (client : Danish Environment Protection Agency)

#### organic field

orch	ard / bush fruit				
Modelled bat activity (BA April to September					
log (sum of AMJJAS modBA)					
0.9265 - 1.090	1.439 - 1.501				
1.091 - 1.181	1.502 - 1.565				
1.182 - 1.254	1.566 - 1.631				
1.255 - 1.322	1.632 - 1.691				
1.323 - 1.379	1.892 - 1.747				
1.380 - 1.438	1.748 - 1.835				

BA : high PA: low (organic) **BA**: low

PA : medio

BA : high PA : high (conventional orchard)

**BA**: medio PA: medio



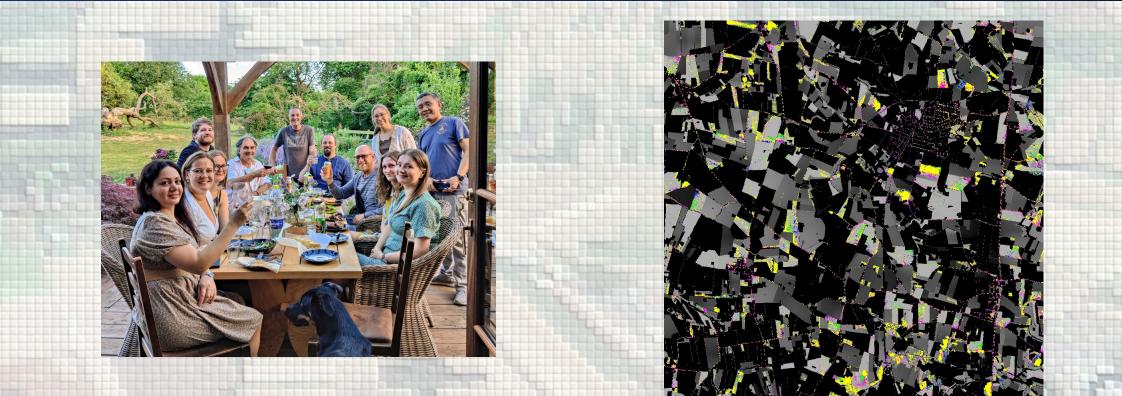
#### ALMaSS simulated pesticide application (PA) April to September log (sum of AMJJAS simF) 8021-0.9109 9110 - 1.220 221 - 1.529 30 - 1.837



-2.148

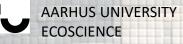
2 km

# Interested in SESS / ALMaSS – please contact me or the SESS team

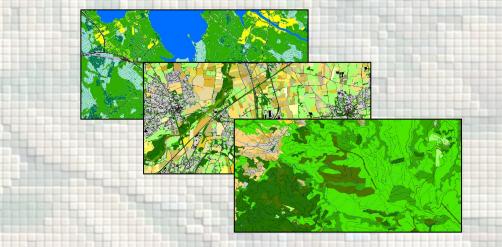


ALMaSS is run as a collaborative science project – we are happy to help if you want to use it or develop new models





## Thank you for your attention



- Website: <u>www.sess.au.dk</u>
- LinkedIn: <u>https://www.linkedin.com/company/the-social-</u> ecological-systems-simulation-sess-centre-aarhus-university
- <u>X: https://twitter.com/sess\_au?s=21&t=UWY7hlmN\_FKoJKGdIliyxA</u>
- Instagram: SESS CENTRE
- Wikipedia, YouTube: ... work-in-progress

