

# Individual-based modeling to discover the ecological importance of tree networks

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## tree networks via root connections

indirect

direct

mycorrhiza

grafting  
clonal growth



New  
Phytologist

Research

Architecture of the wood-wide web: *Rhizopogon* spp.  
genets link multiple Douglas-fir cohorts

Kevin J. Beiler<sup>1,2</sup>, Daniel M. Durall<sup>1</sup>, Suzanne W. Simard<sup>2</sup>, Sheri A. Maxwell<sup>3</sup> and Annette M. Kretzer<sup>4</sup>

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FOREST ECOLOGY

## Belowground carbon trade among tall trees in a temperate forest

Tamir Klein,<sup>1\*†</sup> Rolf T. W. Siegwolf,<sup>2</sup> Christian Körner<sup>1</sup>

## tree networks via root connections

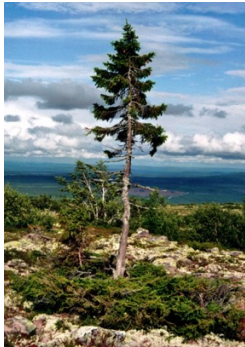


indirect

mycorrhiza

direct

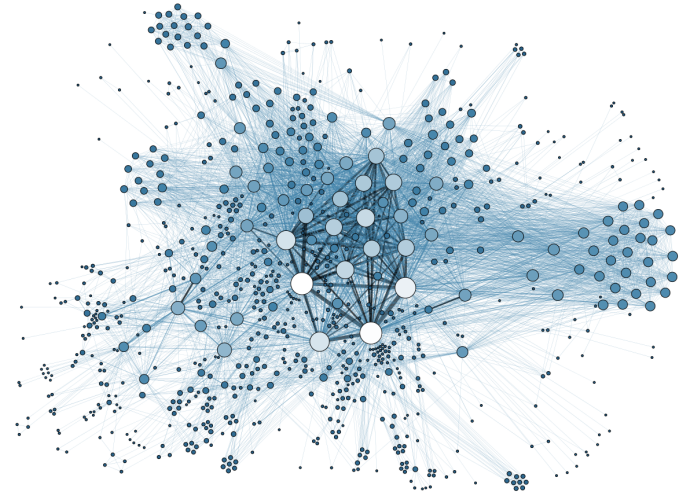
grafting  
clonal growth



**Old Tikjo**  
(Spruce) Sweden



**Pando**  
(Aspen, USA)



- Exchange of resources
- Long living (9550 & 80,000 yrs)

## tree networks via root connections



indirect

direct

mycorrhiza

clonal growth  
grafting



## NATURAL ROOT GRAFTS

B. F. GRAHAM, JR.

*Biology Department, Grinnell College, Grinnell, Iowa*  
and

F. H. BORMANN

*School of Forestry, Yale University, New Haven, Connecticut*

Already 150! species listed in 1966

## Why should trees have natural root grafts? FREE

Simcha Lev-Yadun ✉, Douglas Sprugel

*Tree Physiology*, Volume 31, Issue 6, June 2011, Pages 575–578, <https://doi.org/10.1093/treephys/tpr061>

**Published:** 01 June 2011   **Article history** ▼

- Support of resources
- Parasitism
- Better anchorage
- ..

## Natural root grafting in *Picea mariana* to cope with spruce budworm outbreaks

Roberto L. Salomón, Emilie Tarroux, and Annie DesRochers

frontiers in  
**PLANT SCIENCE**

**REVIEW ARTICLE**  
published: 17 December 2014  
doi: 10.3389/fpls.2014.00727



## Plant grafting: new mechanisms, evolutionary implications

**Eliezer E. Goldschmidt\***

*The Robert H. Smith Institute of Plant Sciences and Genetics in Agriculture, Faculty of Agriculture, Food and Environment, The Hebrew University of Jerusalem, Rehovot, Israel*

VOL. 178, NO. 1 THE AMERICAN NATURALIST JULY 2011

## Facilitation within Species: A Possible Origin of Group-Selected Superorganisms

Eliot J. B. McIntire<sup>1,\*</sup> and Alex Fajardo<sup>2</sup>

## Question

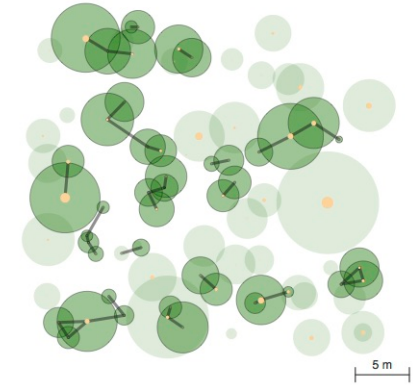
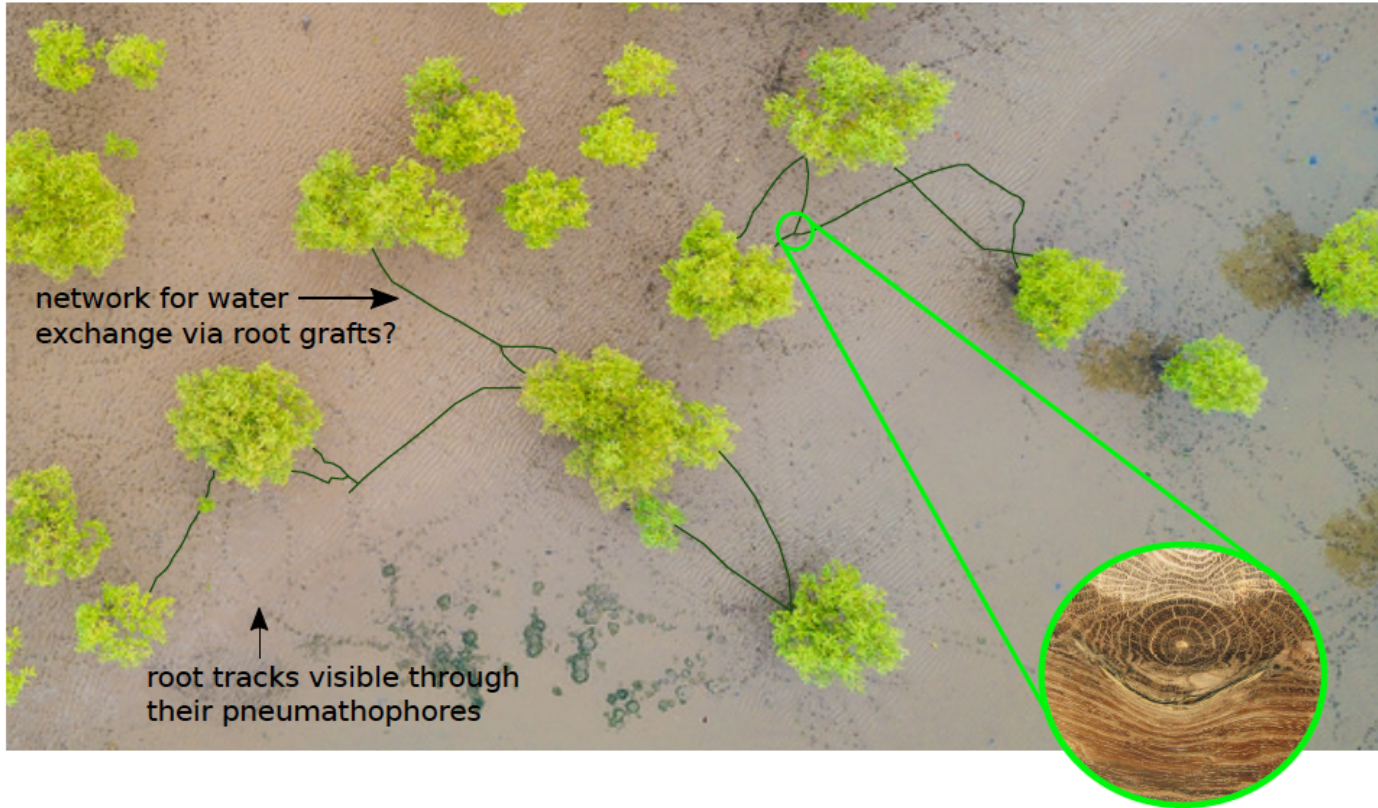
Ecological importance of root grafting for individuals, and on stand level?

## Challenges

- measurements of resource exchange only “bi-treeal”
- roots not (easily) accessible

**Except mangroves:**



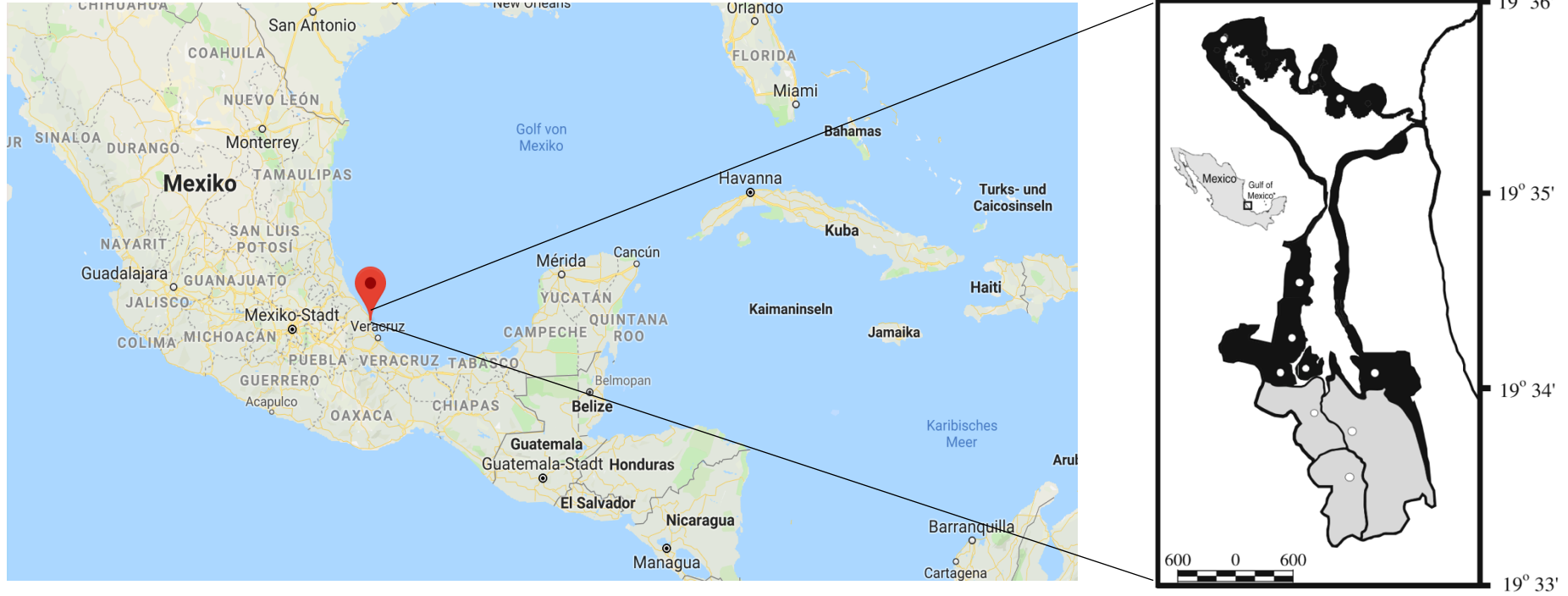


- **Root grafting**  
(*Avicennia germinans*)

### Possible explanation of root grafting

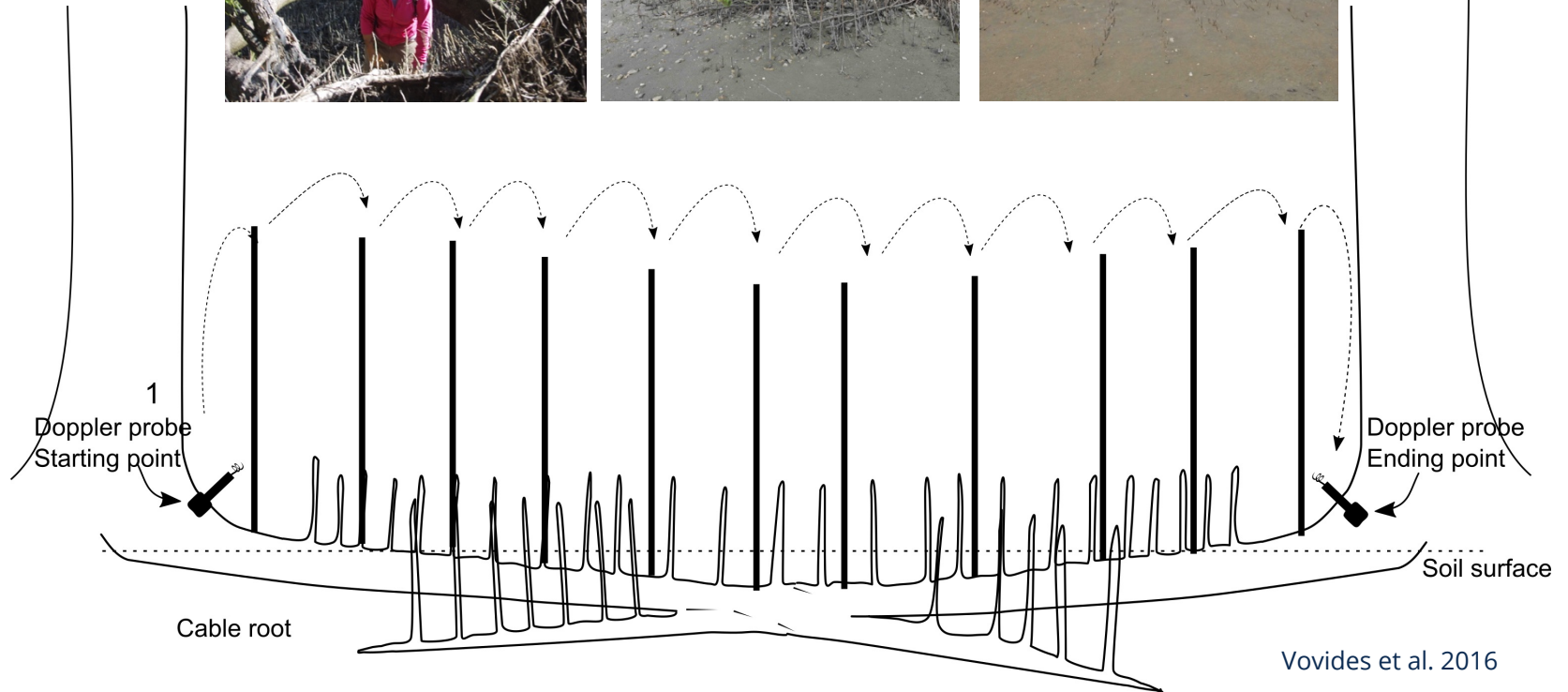
- Randomness
- Water sharing

# Study site – La Mancha Lagoon, Veracruz, Mexico



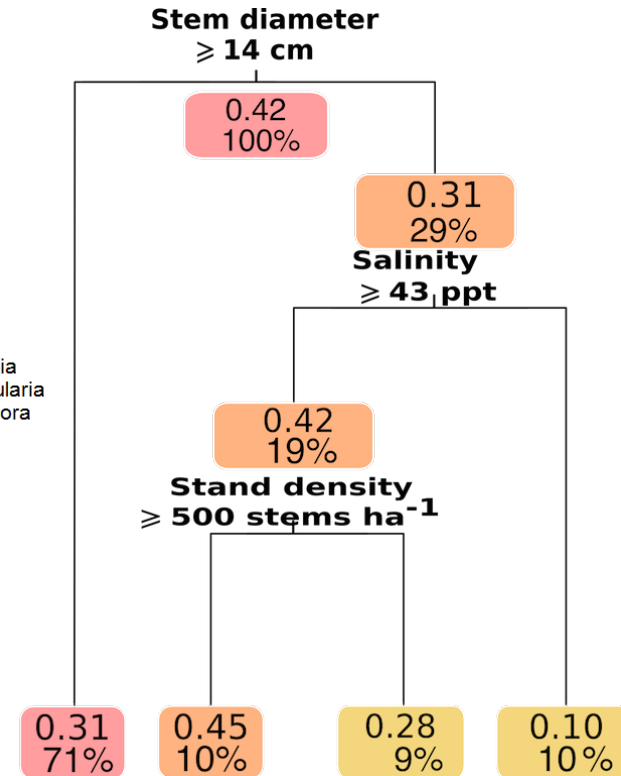
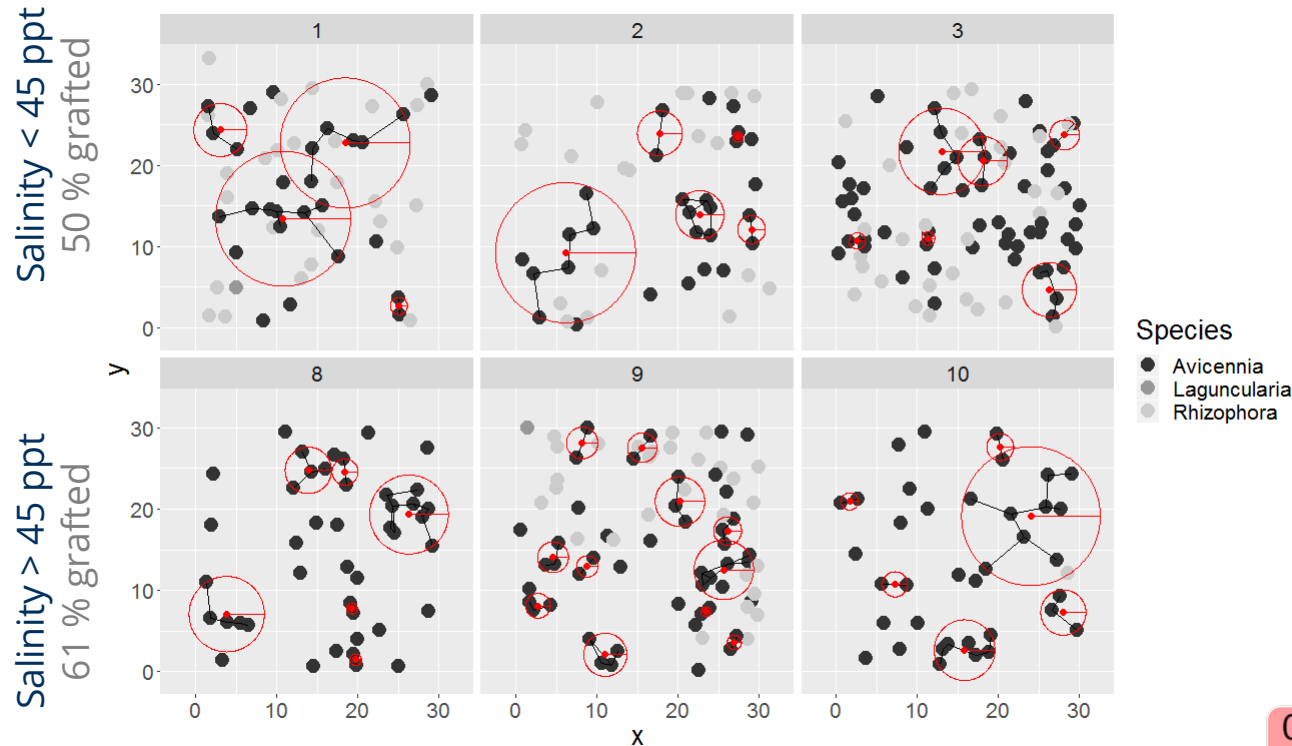
Vovides et al. 2014

# Network detection via echosounder

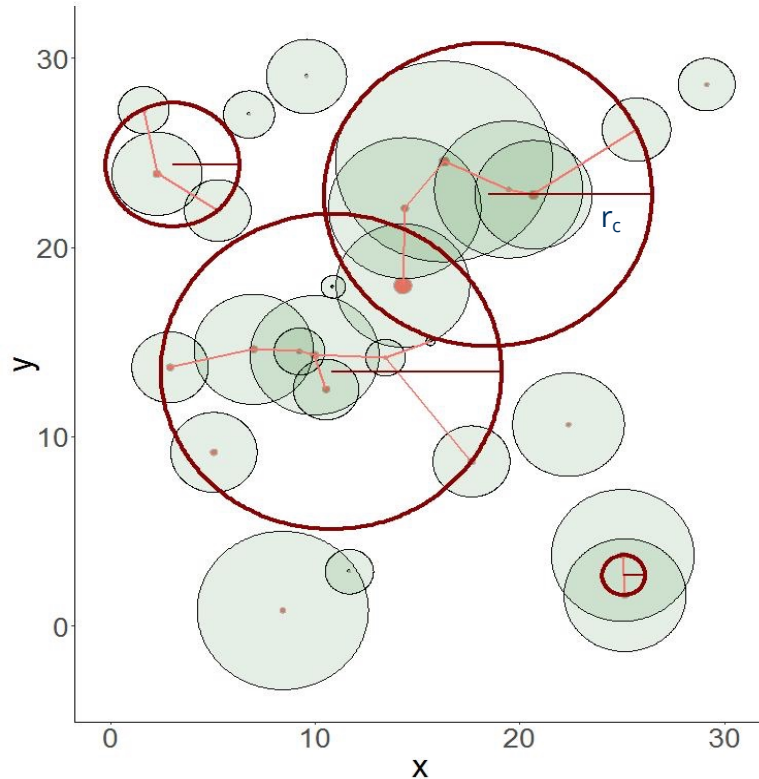


Vovides et al. 2016

# La Mancha *A. germinans* networks



# Root graft data represented as network



**Network**

>> Sampling plot

**Node**

>> Tree

**Edge**

>> Link between root grafted trees

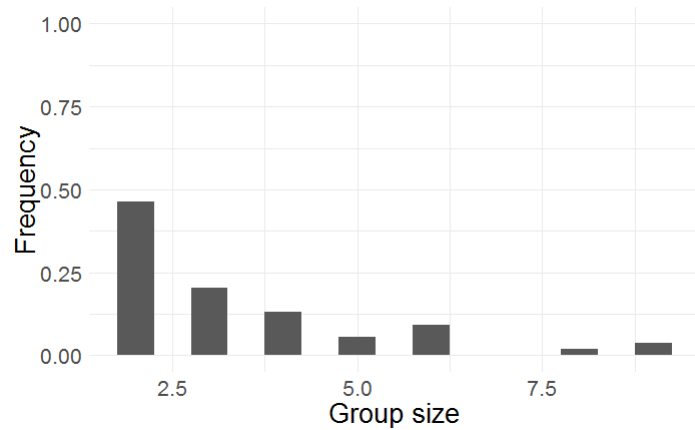
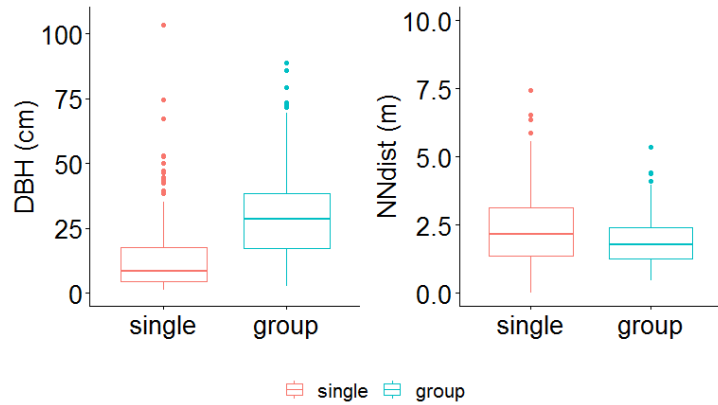
**Component**

>> Group of linked trees

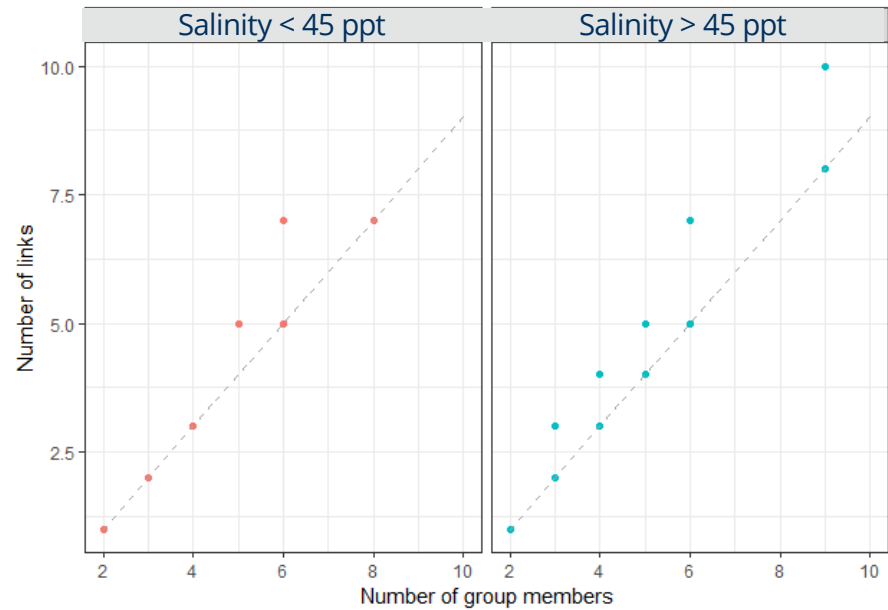
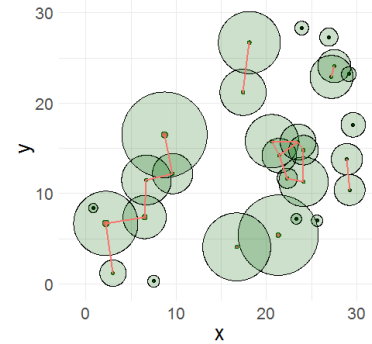
All networks are **undirected & unweighted**

# Nodes	27
# Links	15
# Groups	4
Edge density	0.043
Connectance	0.563
Mean distance	1.78
Mean diameter	3.25
% RG trees	66.7 %
# RG trees · ha <sup>-1</sup>	200
# Groups · ha <sup>-1</sup>	44.4

# Network data from La Mancha

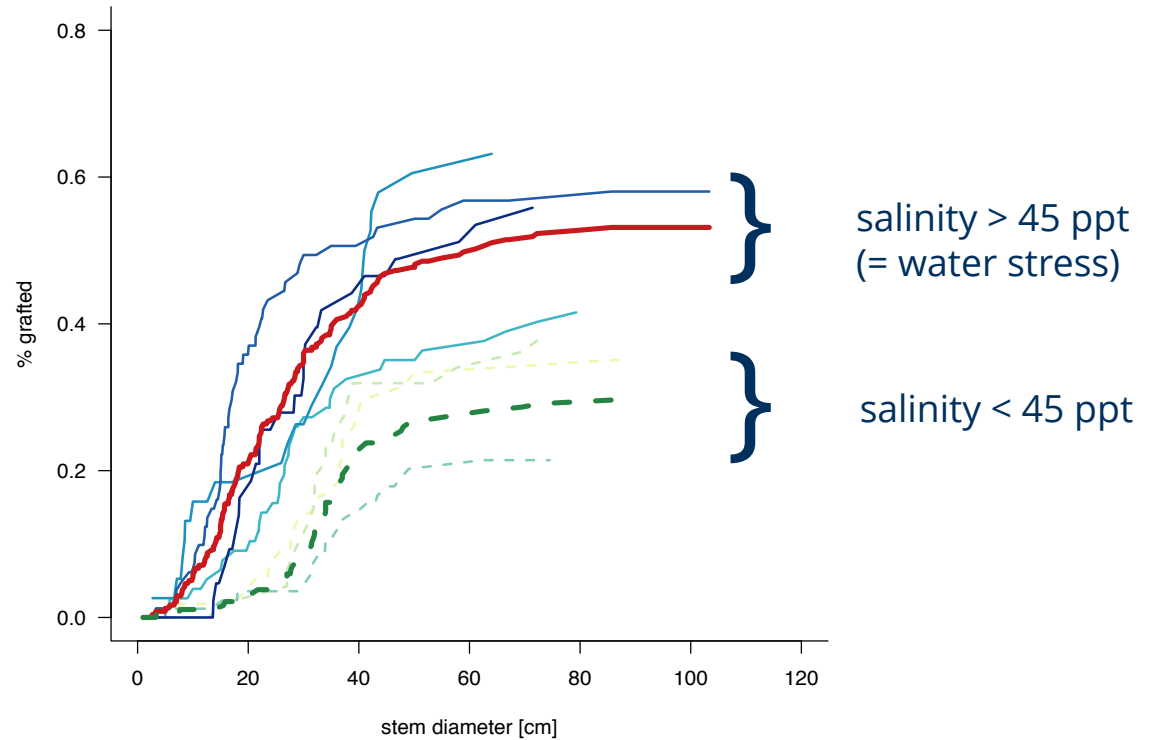


- 75% of grafted trees linked to closest neighbour
- linear structure



## Further patterns observed in La Mancha ..

- spatial distribution
- #grafts ~ density
- #grafts =  $f(\text{salinity, tree size ...})$
- ..



## NULL model



Input: La Mancha data

- (x, y)

Random grafting

- each tree to one of its nearest neighbour
- Random selection
- Probability according to field observations

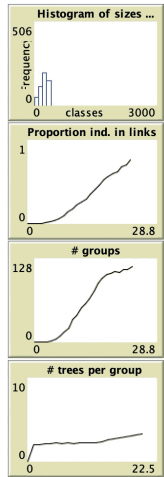
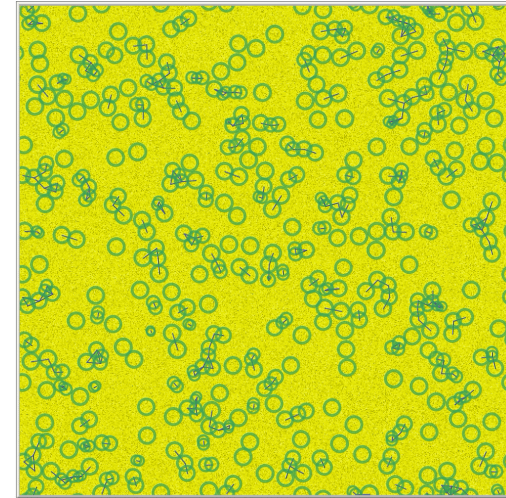


Networks of  
La Mancha

**randomness or  
process?**



## AZOI forest model

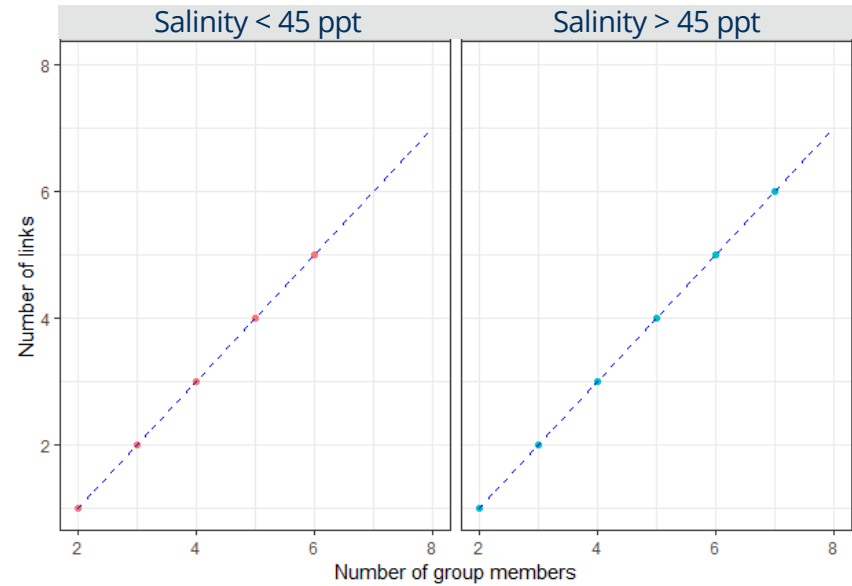
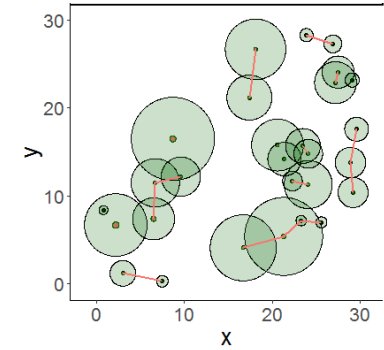
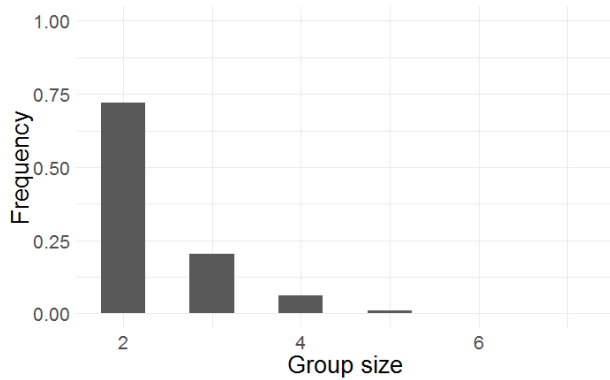
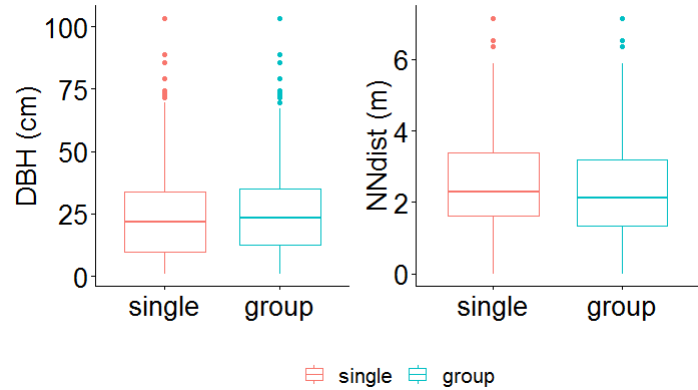


Life processes of trees considered

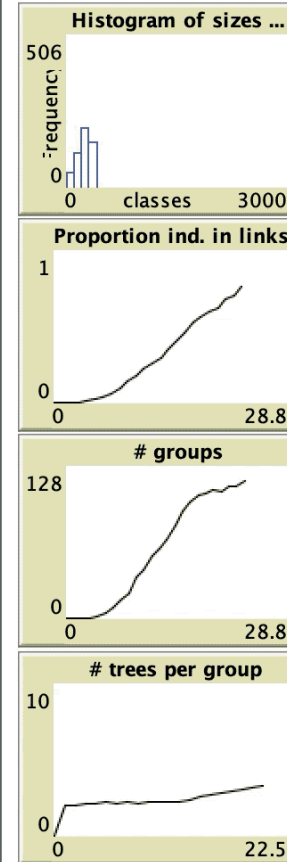
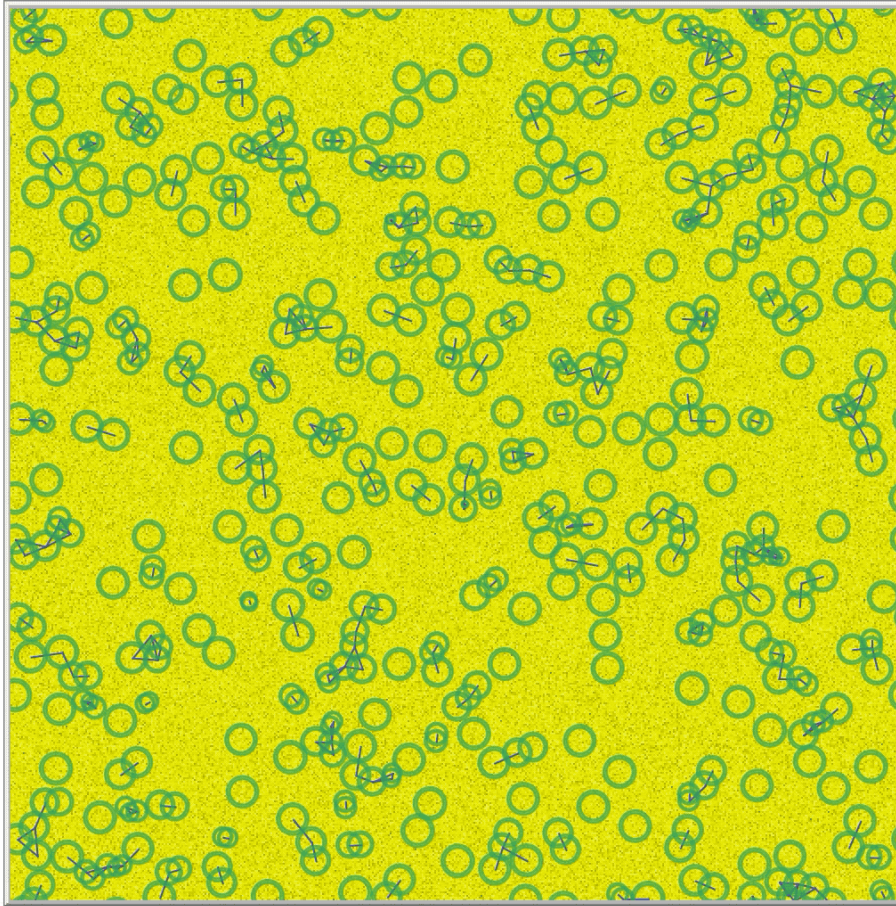
1. Recruitment
2. Growth
3. Competition
4. Mortality
5. Grafting & Exchange of resources



## Null model



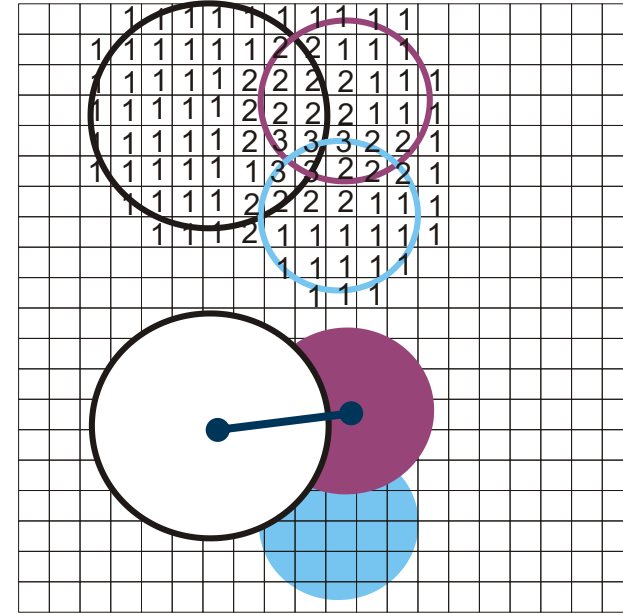
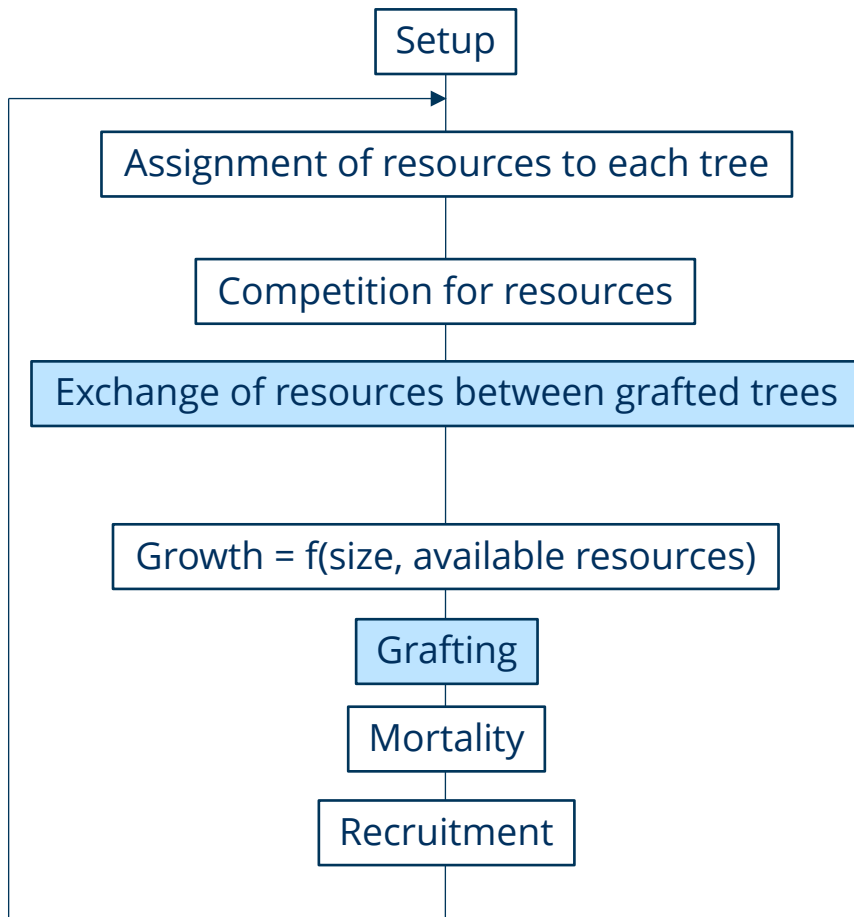
# AZOI model description



Entity	State Variables	Description
Plants	$B_{\max}$	Maximum biomass
	$B$	Current biomass
	$x,y$	coordinates of stem position
	$P_{\text{netw}}$	Probability to graft with neighbour
	radius	Radius of the Zone Of Influence (size)
Patches	$r$	resource availability
	owners	IDs of trees claiming this patch

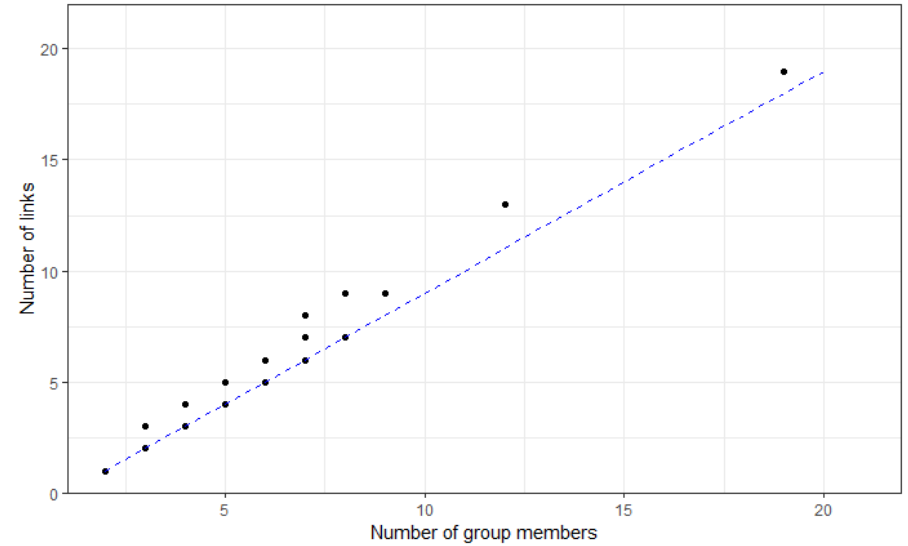
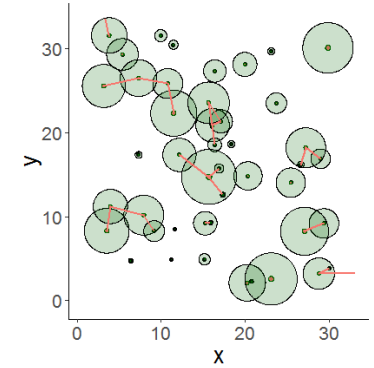
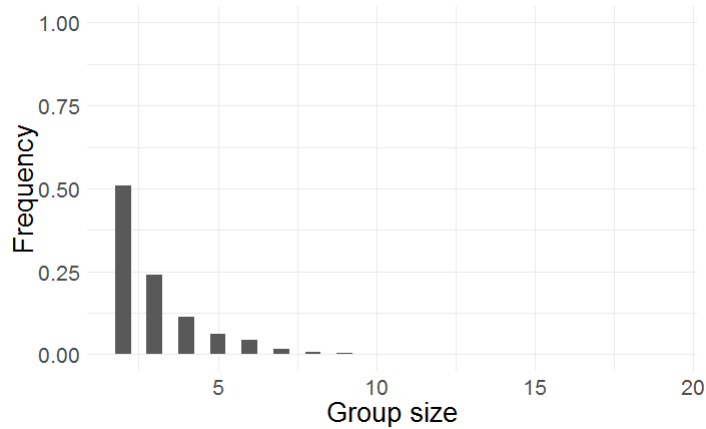
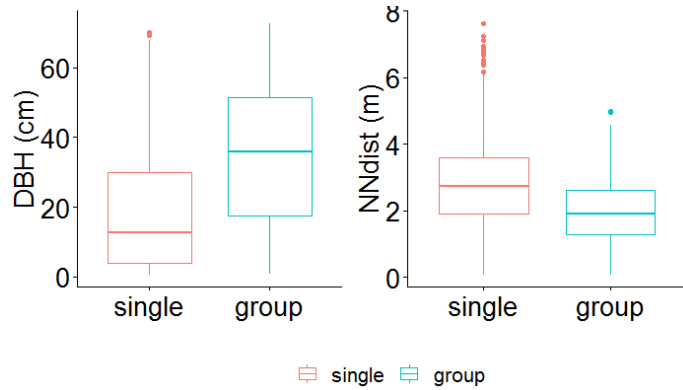
## Scales

Space: 100 m x 100 m = 1 ha  
 Time step: 1 year  
 Time<sub>max</sub>: 1000 years

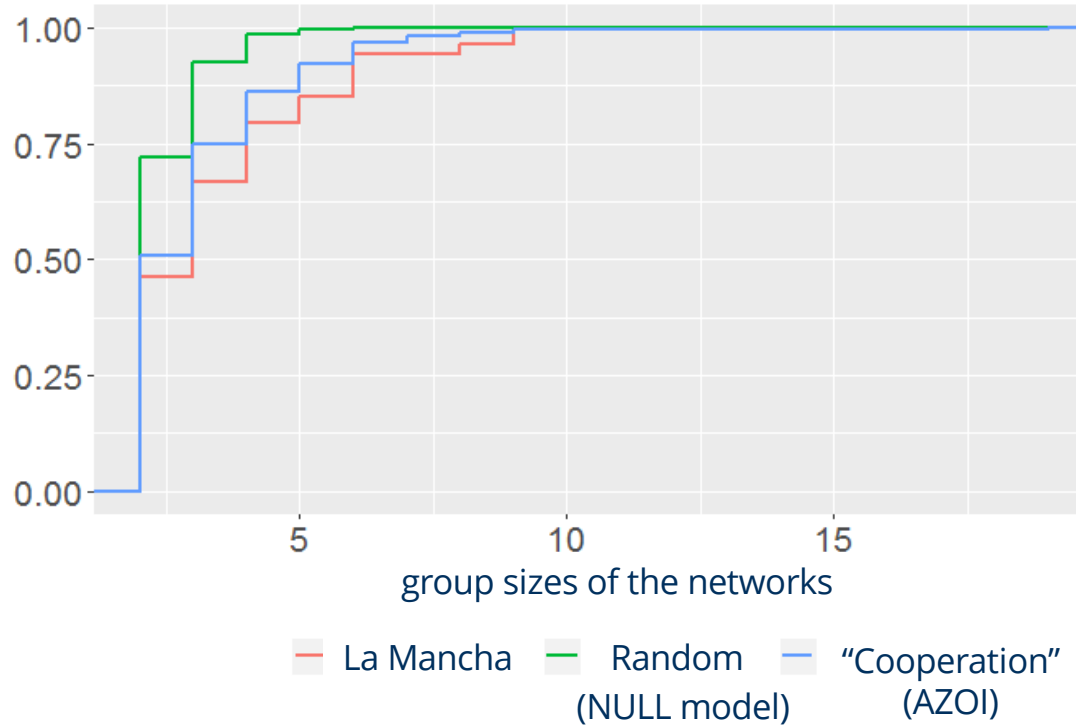


Zone of Influence (ZOI, Weiner et al. 2001!)

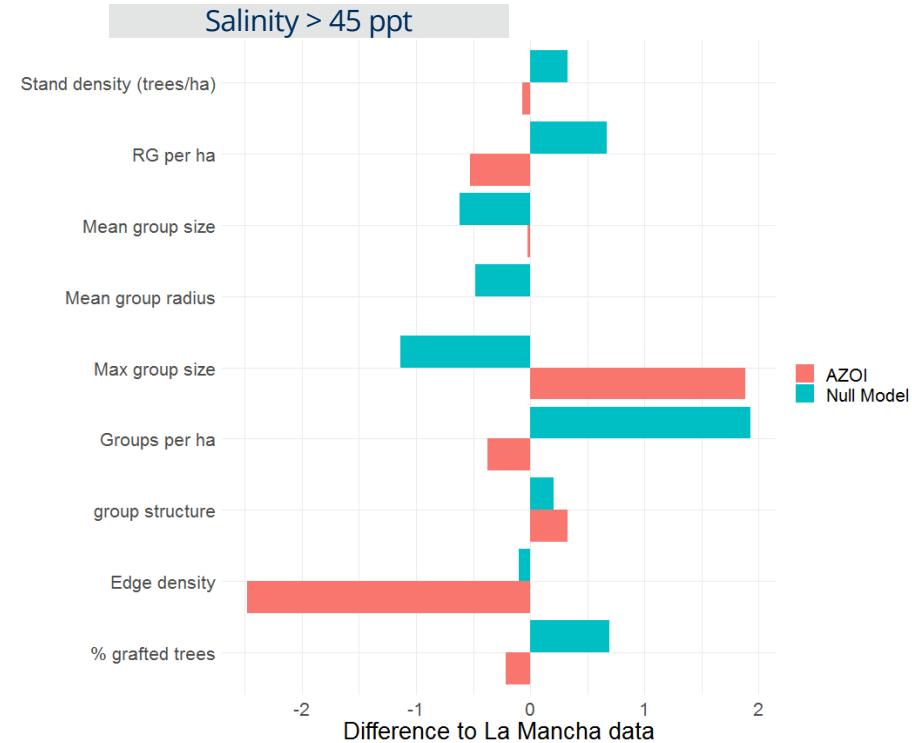
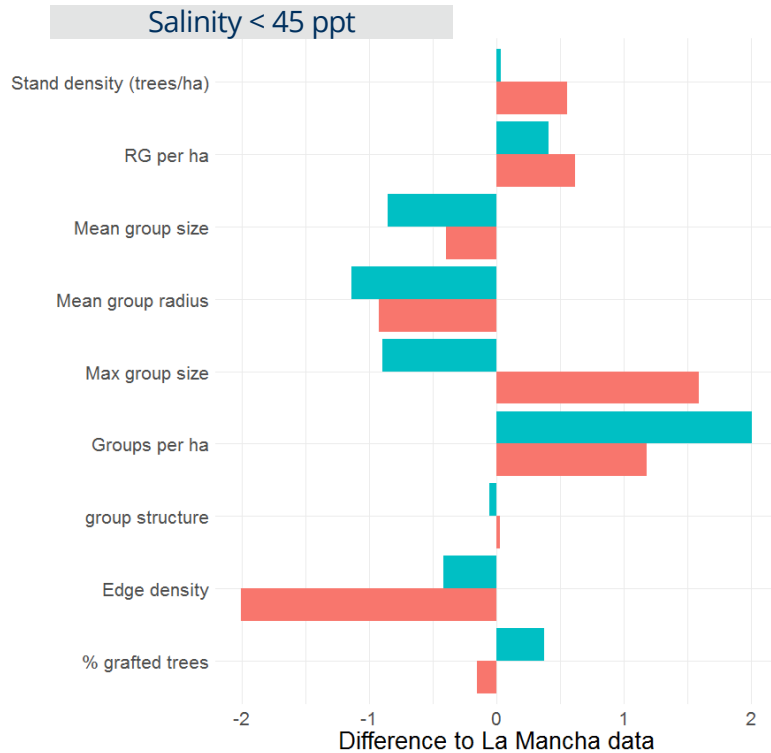
# simulation results AZOI model



## Direct comparison of La Mancha data with both models

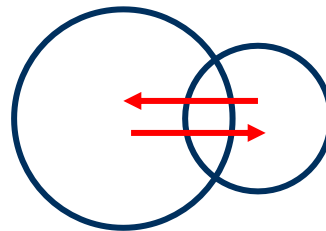
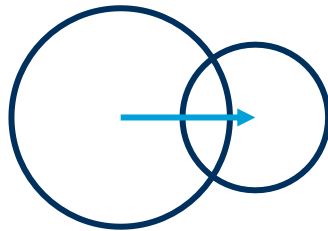
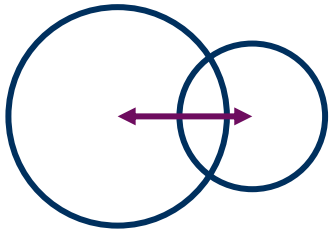


## Direct comparison of La Mancha data with both models



## AZOI model: 3 different submodels to exchange of resources:

submodel	explanation
random	Resources flow between grafted trees in random direction.
big2small	Resources flow from bigger to smaller tree.
fast2slow	Resources flow from faster growing tree to the slower growing.



Sub-model	% grafted trees	Grafts per ha	Groups per ha	Mean group size	Max group size	Mean group radius	linearity	Edge density
big2small	56.8	286.7	91.9	3.1	11.8	2.0	1.06	0.003
fast2slow	57.65	291.1	92.2	3.2	11.1	2.0	1.06	0.003
random	53.15	268.1	88.3	3.0	10.1	2.0	1.05	0.003
LM, ≤ 45 ppt	55.8	203.7	55.6	3.8	6.3	3.7	1.04	0.031
LM, > 45 ppt	61.7	352.8	108.4	3.5	7.2	2.4	1.04	0.020

No conclusion yet ...

# Direct sampling for parameter optimization:

# 411600

## EMBED YOUR MODEL

1. Scala
2. Java
3. NetLogo
4. Python
5. R
6. Scilab
7. Linux Executable

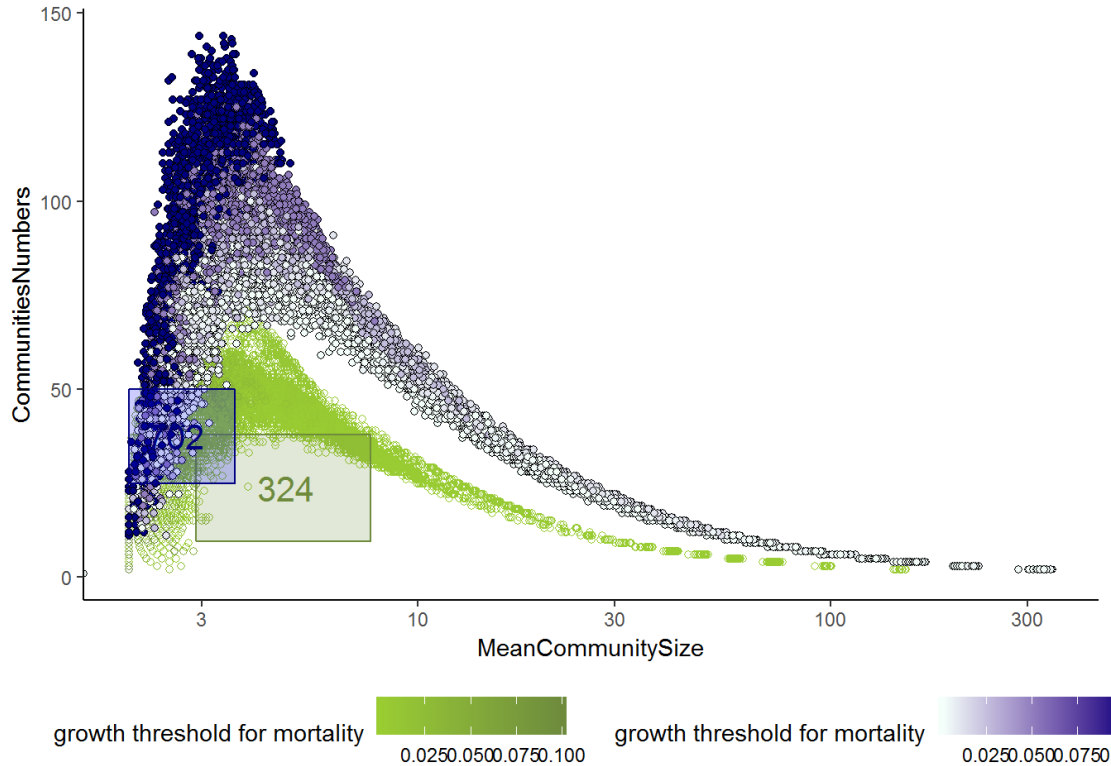
## EXPLORE YOUR MODEL

1. Samplings
  - a. Elementary Samplings
  - b. Samplings for High Dimension Spaces
  - c. Uniform Sampling
  - d. Sampling Over Files
  - e. Spatial Sampling
  - f. Custom Sampling
  - g. Advanced Operations on Samplings
2. Calibration
3. Statistical Sensitivity Analysis
4. Profile
5. Pattern Space Exploration
6. Origin Space Exploration

# Model version 1

Competition = F; Cooperation = F

MeanPnetw, SDPnetw, grperCrit,  
MortNoCompet



**Data points within the target (mean  $\pm$  2\*sd)**

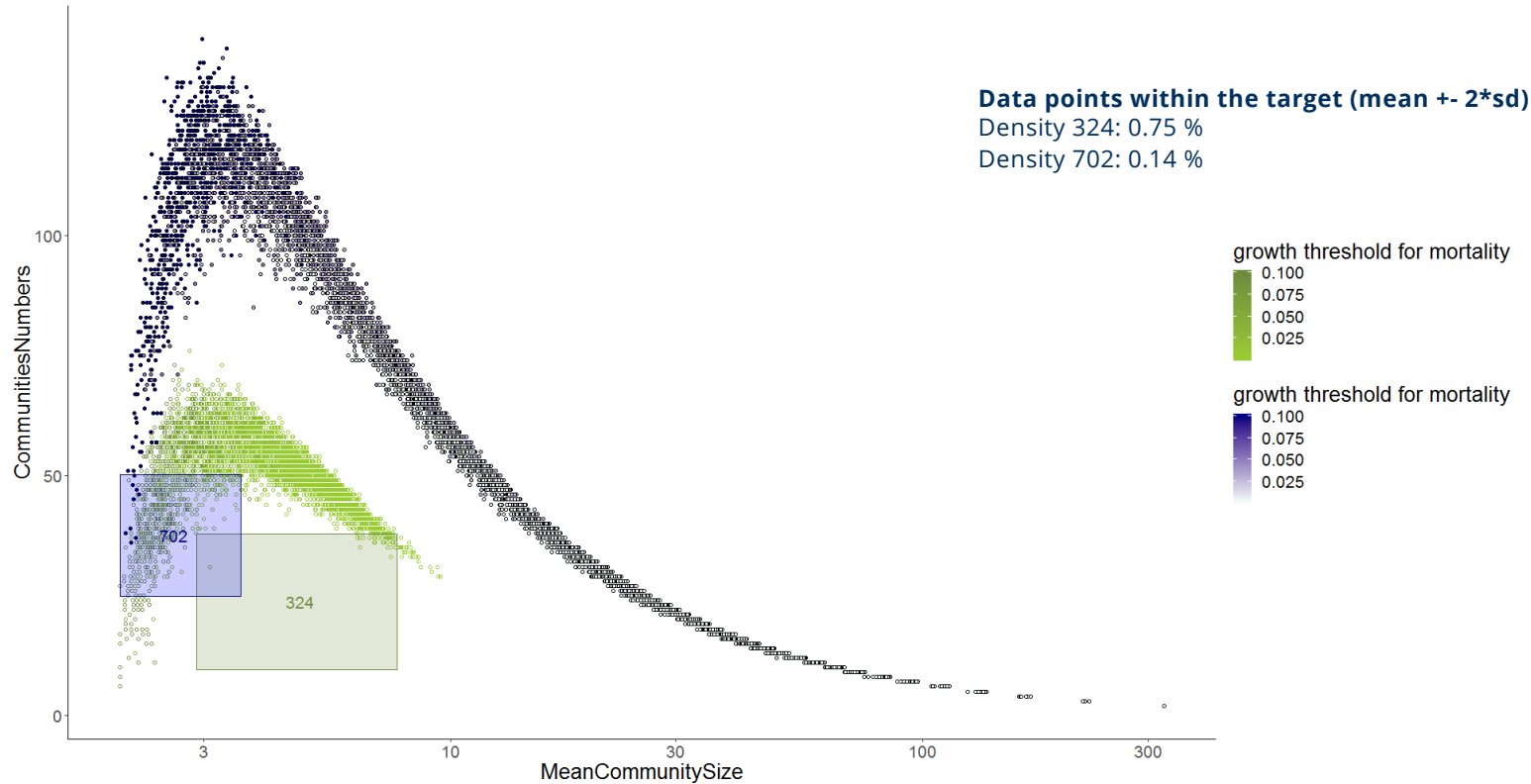
Density 324: 4.93 %

Density 702: 5.93 %

# Model version 3

Competition = T; Cooperation = T;  
Random Benefits = On

MeanPnetw, SDPnetw, grperCrit,  
Mn, cost



# Feeding back into empirical studies:

## Kropotkin's Garden

*Networking beats competition in the struggle for limited resources*

HOME ABOUT US PUBLICATIONS PHOTO GALLERY NEWS

### Grafted Roots Interaction Networks

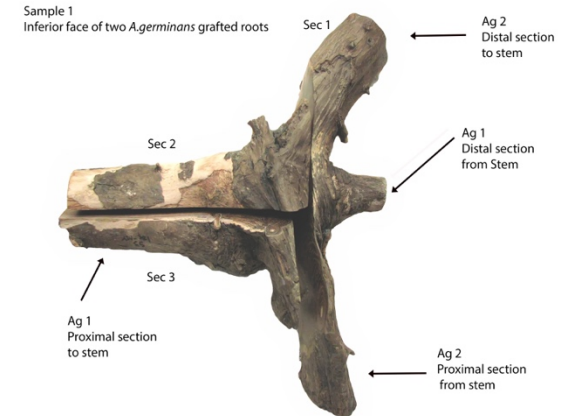
An "Off the Beaten Track" project funded by Volkswagen Stiftung

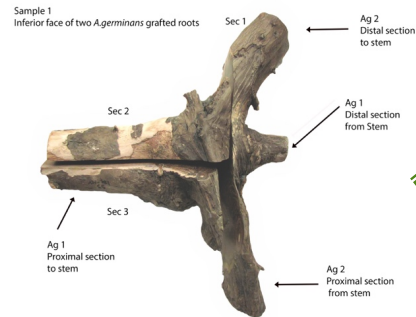
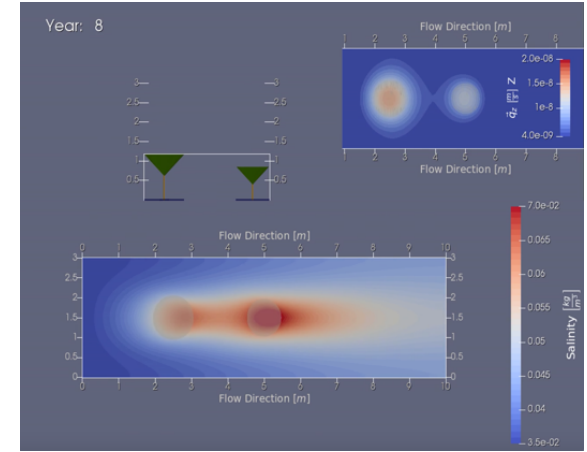
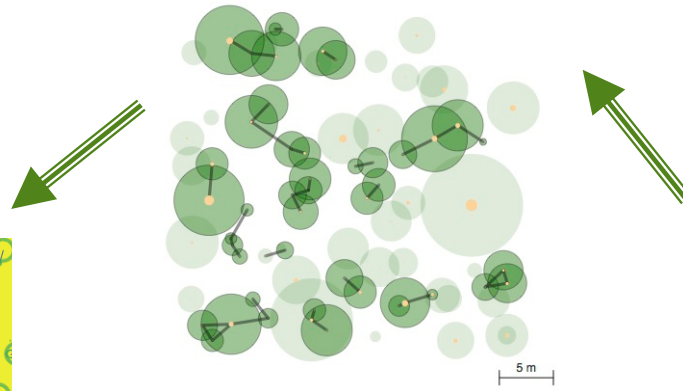
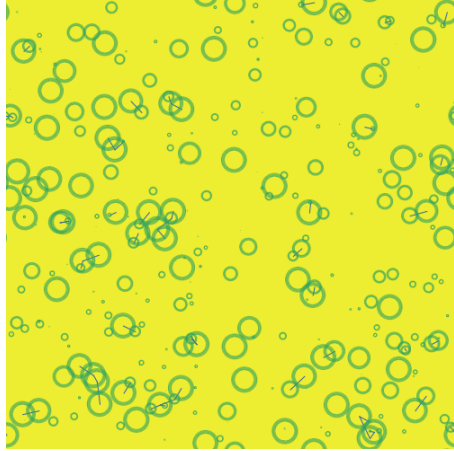
MAY 2, 2019 / VOVIDESAG / LEAVE A COMMENT

**Increasing interest on the ecological significance of root grafts for forest populations.**

<https://mangroverootnetworks.info/>

funded by Volkswagen Foundation Germany





# Conclusion

## Specific

- Positive effect of root grafting for single trees known but not its ecological importance for stands
- Our empirical studies specify networks but not the mechanisms of resource exchange
- Simulation models used to test whether networks are just random
- Agent-based model used
  - to develop hypotheses about the direction of resource exchange
  - to derive sap-flow measurements in the field

## In general

- Case study shows (first) **cycle of field studies – simulation experiments – field studies**
- The use of the established **ZOI** approach reduces modelling effort and enables focus on one mechanism (resource exchange \_ networking): **build on existing theory == develop new theory**
- ZOI will not be sufficient: first principles do not only produce but require mechanistic understanding

# Acknowledgments



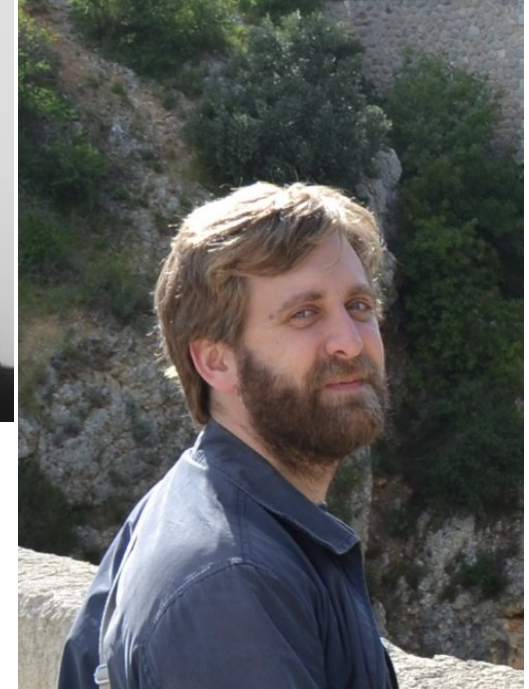
Ale Vovides



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