

Microbial associations and interactions at the plant-climate interface

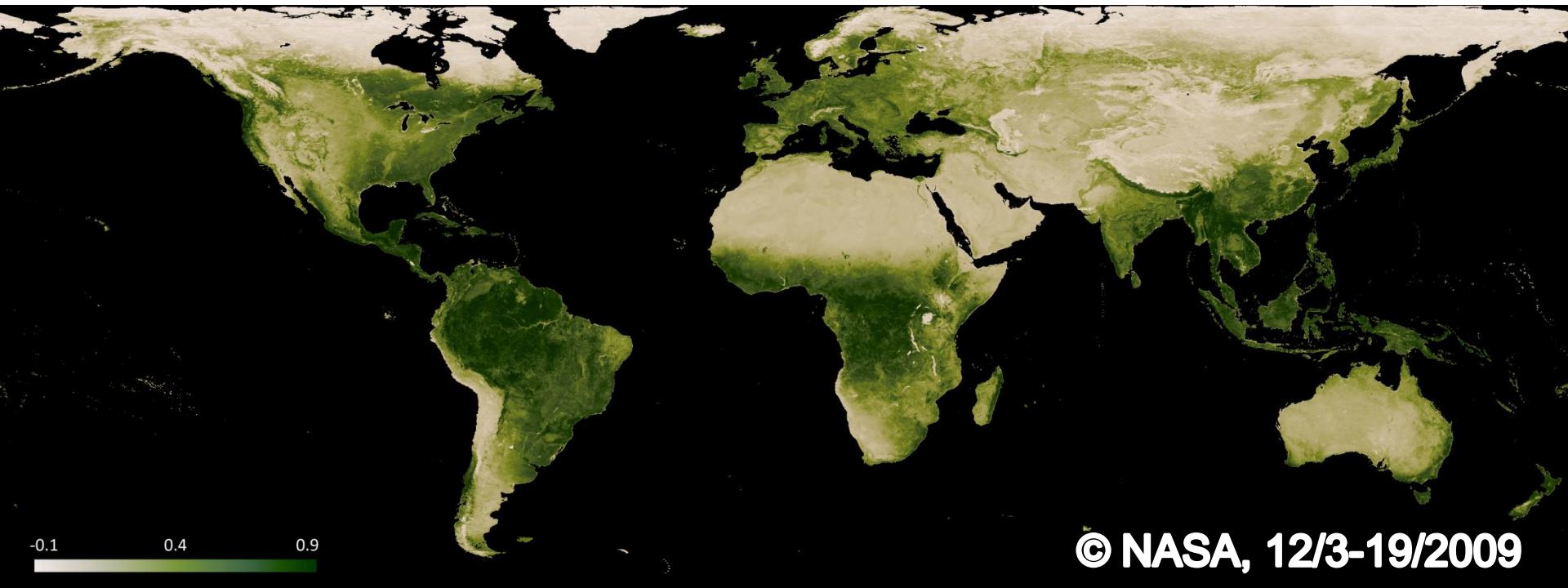


The surface of plant leaves is a microbial habitat (phyllosphere)



© A. Brusini

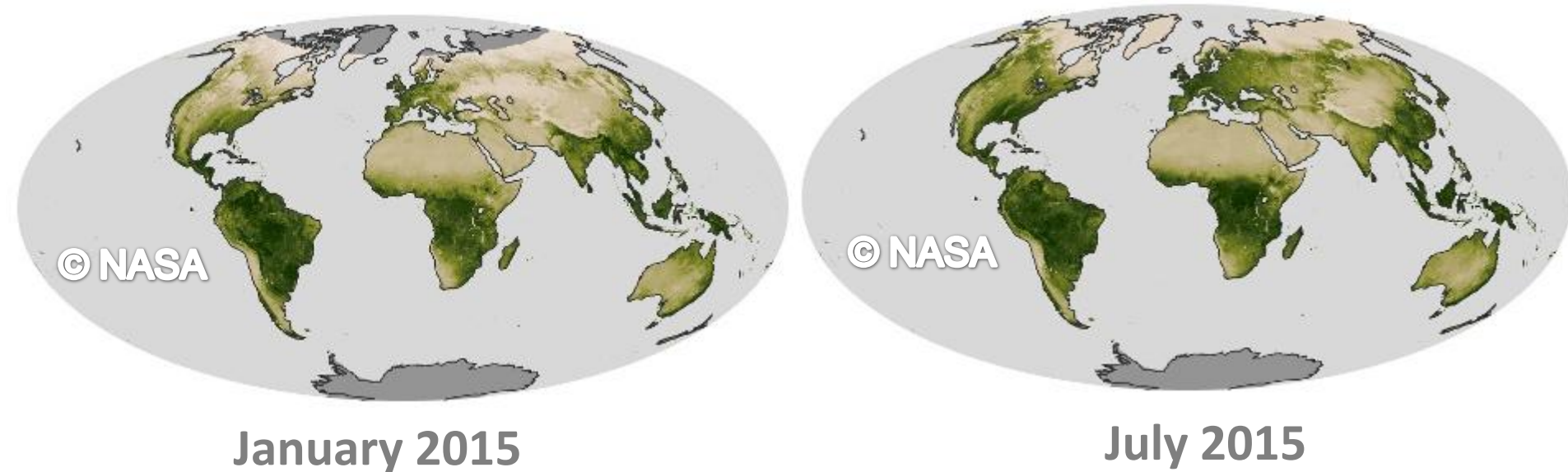
The phyllosphere is a vast dynamic area



Upper + lower leaf surface $\sim 1 \text{ billion km}^2 \sim \text{land surface} \times 2$

Vorholt 2012

The phyllosphere is a vast dynamic area



- Seasonal changes (phenology)
- Anthropogenic disturbances (deforestation, urbanization, desertification)

The phyllosphere is an exchange surface

Guyaflux
tower,
Paracou,
French
Guyana



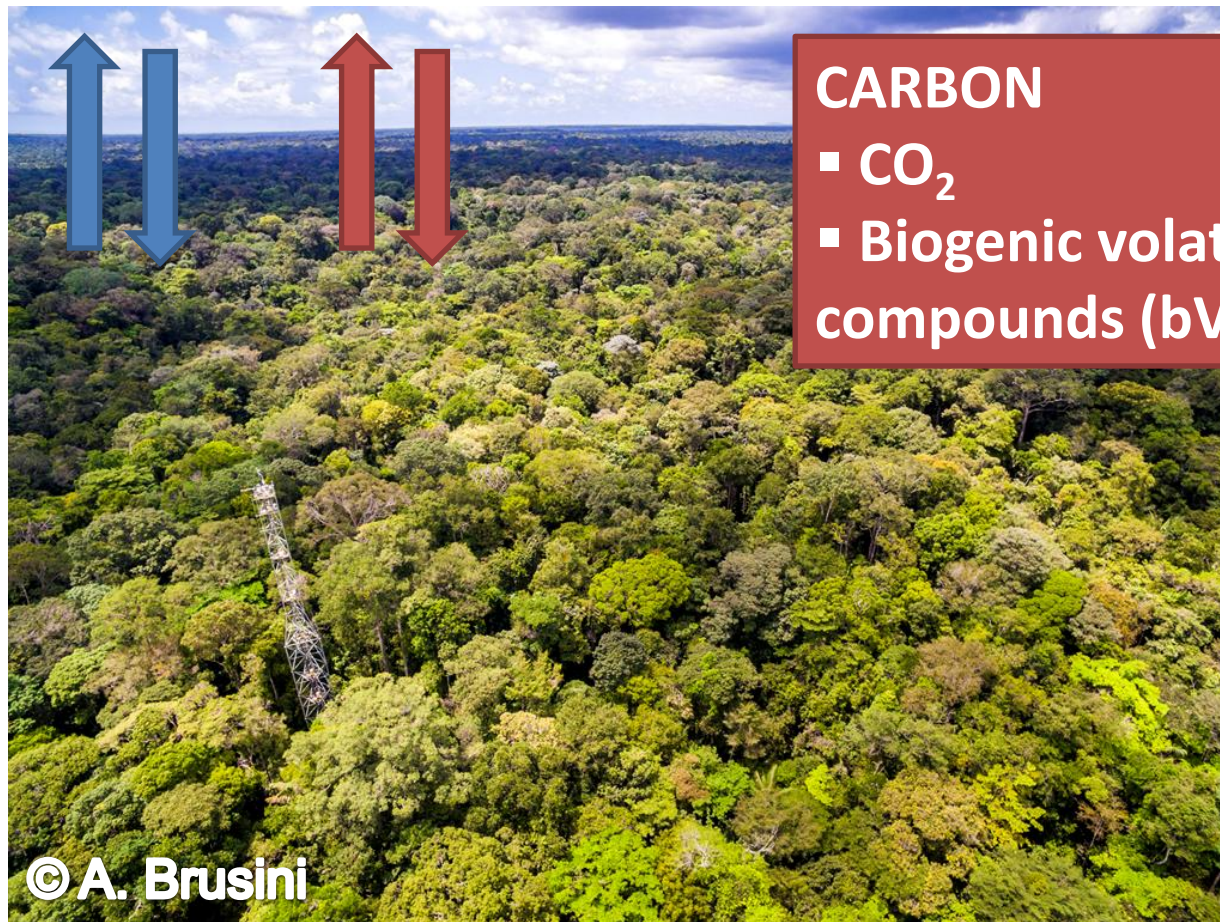
© A. Brusini

The phyllosphere is an exchange surface



*Adapted
from Suni et
al. 2015*

The phyllosphere is an exchange surface



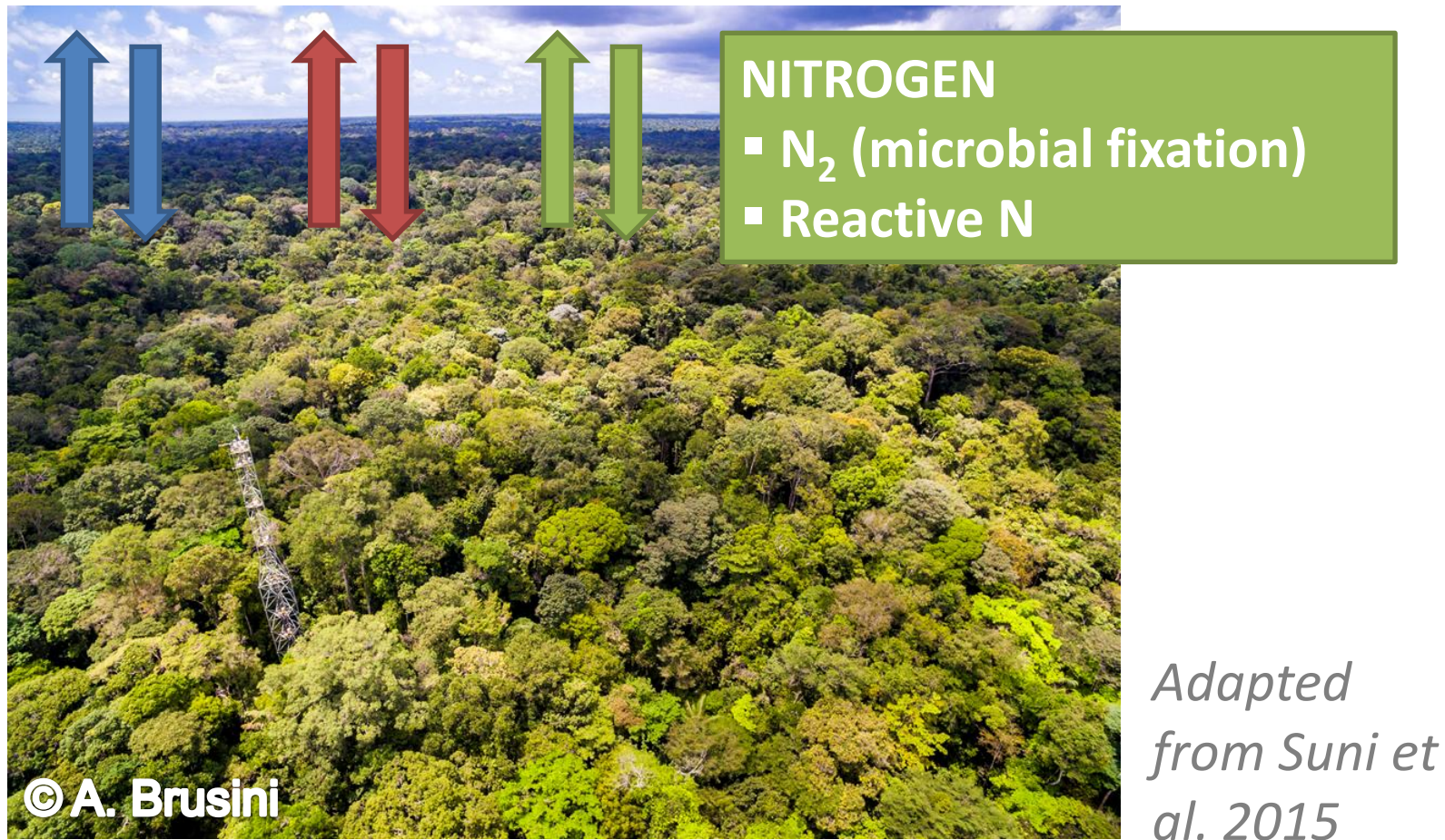
CARBON

- CO_2
- Biogenic volatile organic compounds (bVOCs)

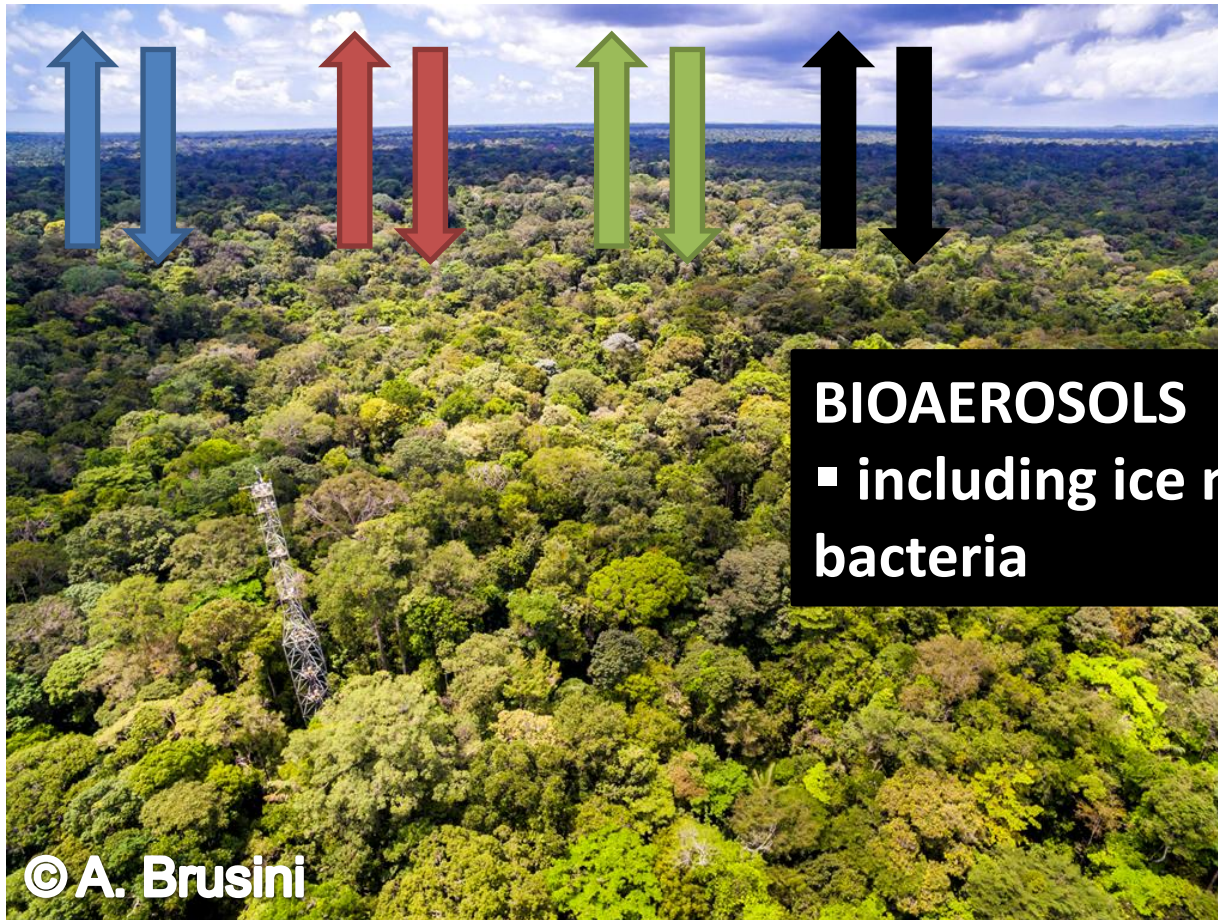
© A. Brusini

*Adapted
from Suni et
al. 2015*

The phyllosphere is a surface of exchange



The phyllosphere is a surface of exchange



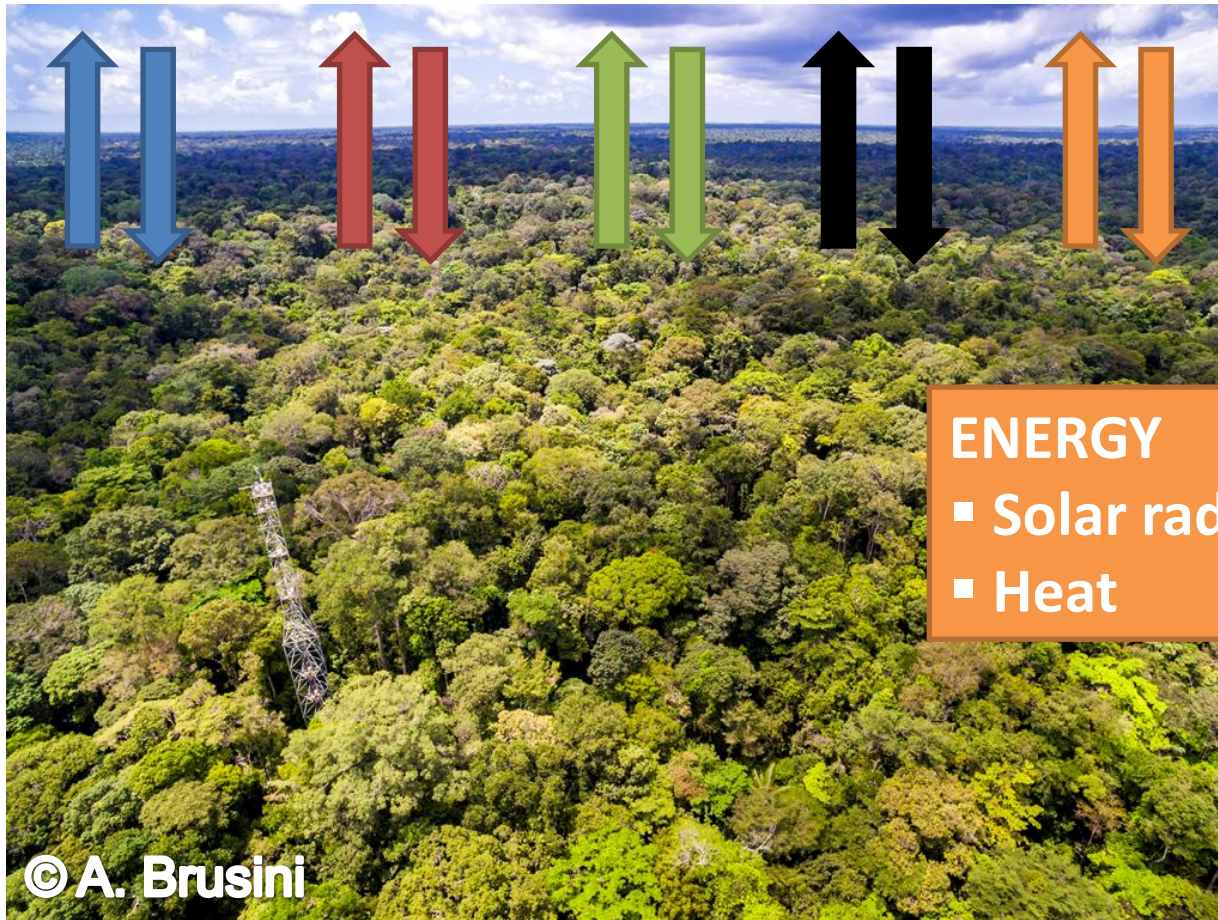
BIOAEROSOLS

- including ice nucleation bacteria

© A. Brusini

*Adapted
from Suni et
al. 2015*

The phyllosphere is an exchange surface



ENERGY

- Solar radiation
- Heat

*Adapted
from Suni et
al. 2015*

© A. Brusini

Atmospheric chemistry

Climate



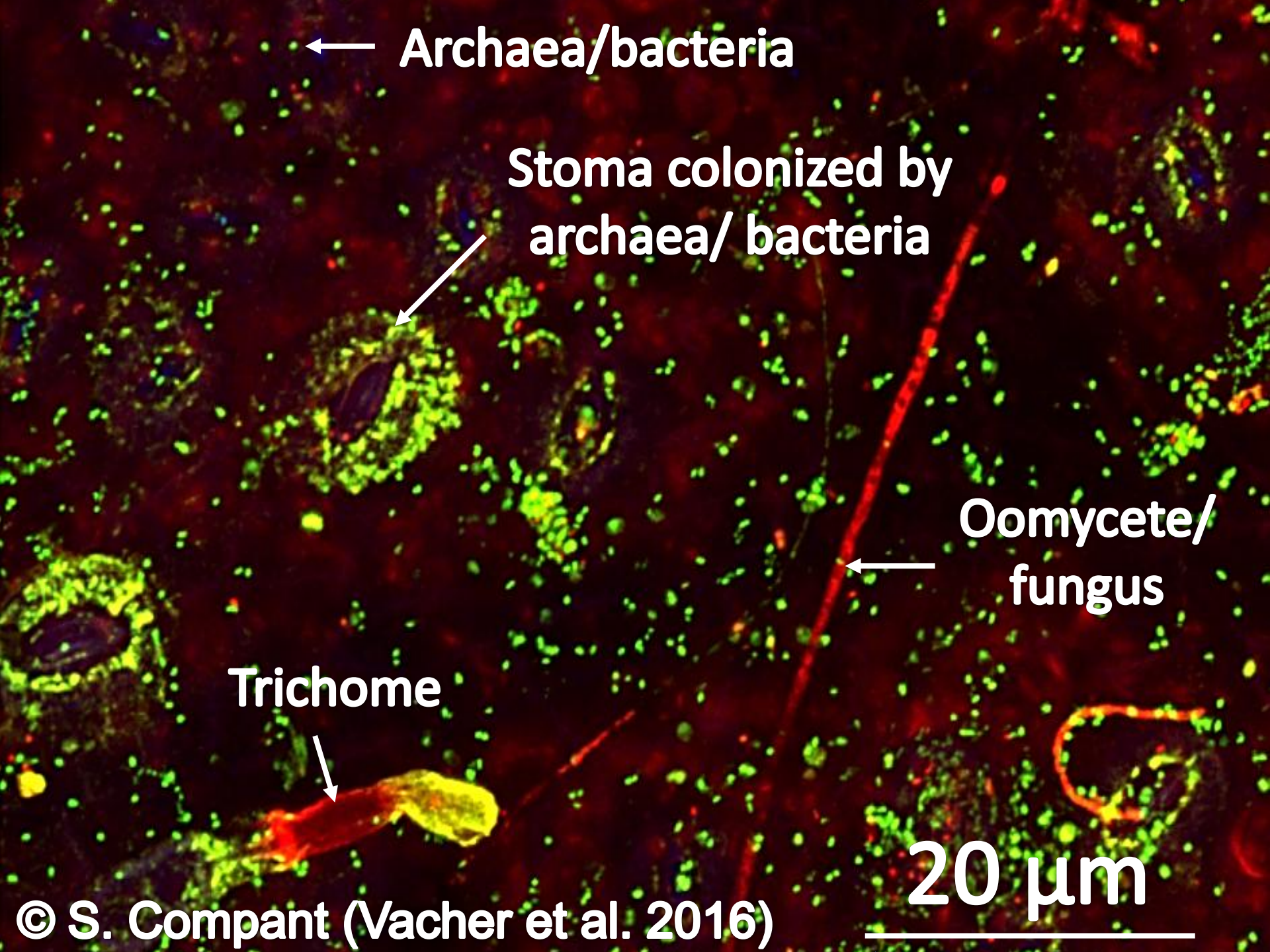
Plant health and productivity
Carbon sequestration

Atmospheric chemistry Climate



Microbial communities

**Plant health and productivity
Carbon sequestration**



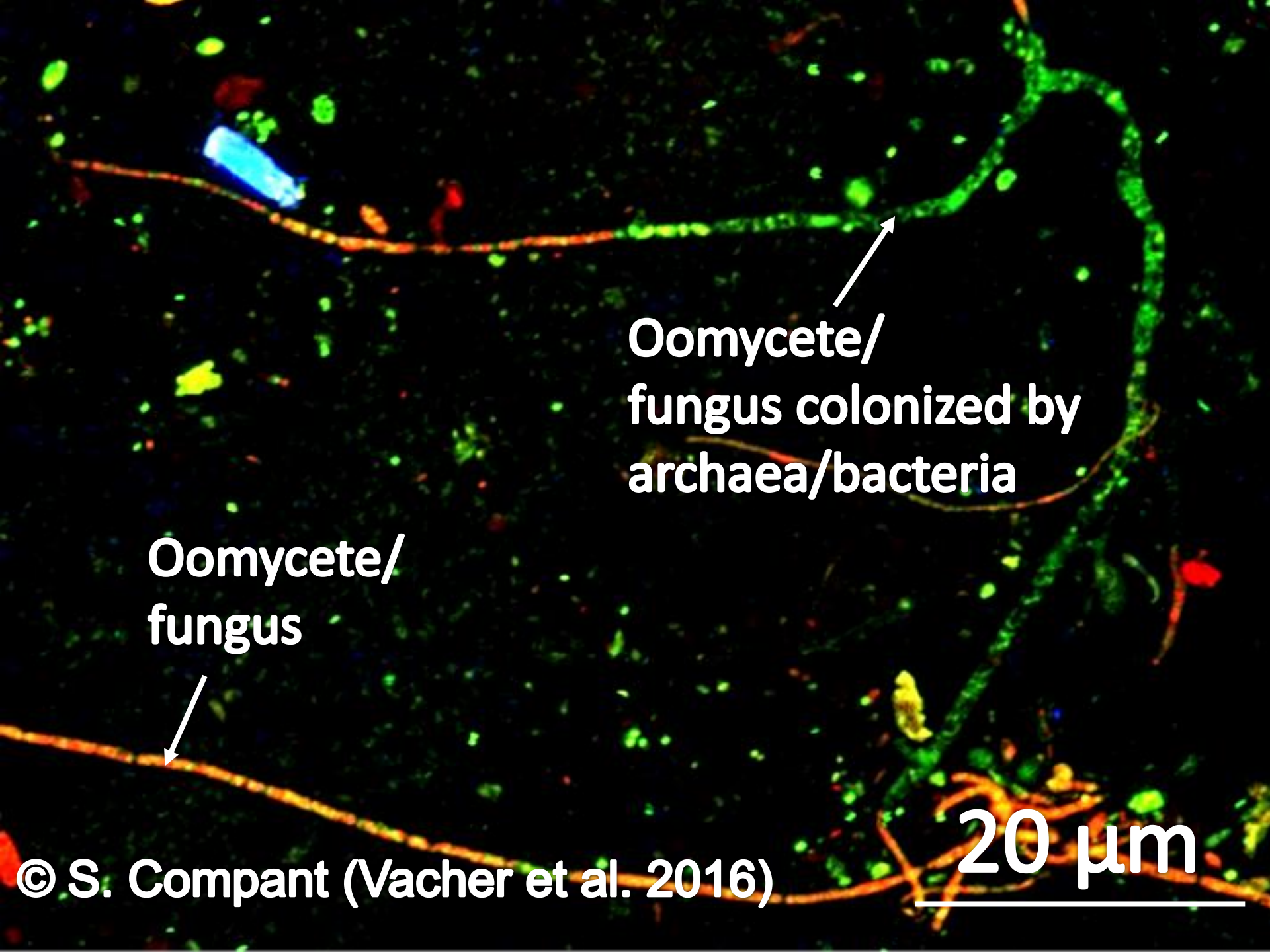
← Archaea/bacteria

Stoma colonized by
archaea/ bacteria

Oomycete/
fungus

Trichome

20 μm



Oomycete/
fungus colonized by
archaea/bacteria

Oomycete/
fungus

20 μm

© S. Compant (Vacher et al. 2016)

Functions of phyllosphere microorganisms

Plant commensals

++++++

Plant mutualists

++

Plant parasites

+

Functions of phyllosphere microorganisms

Plant commensals



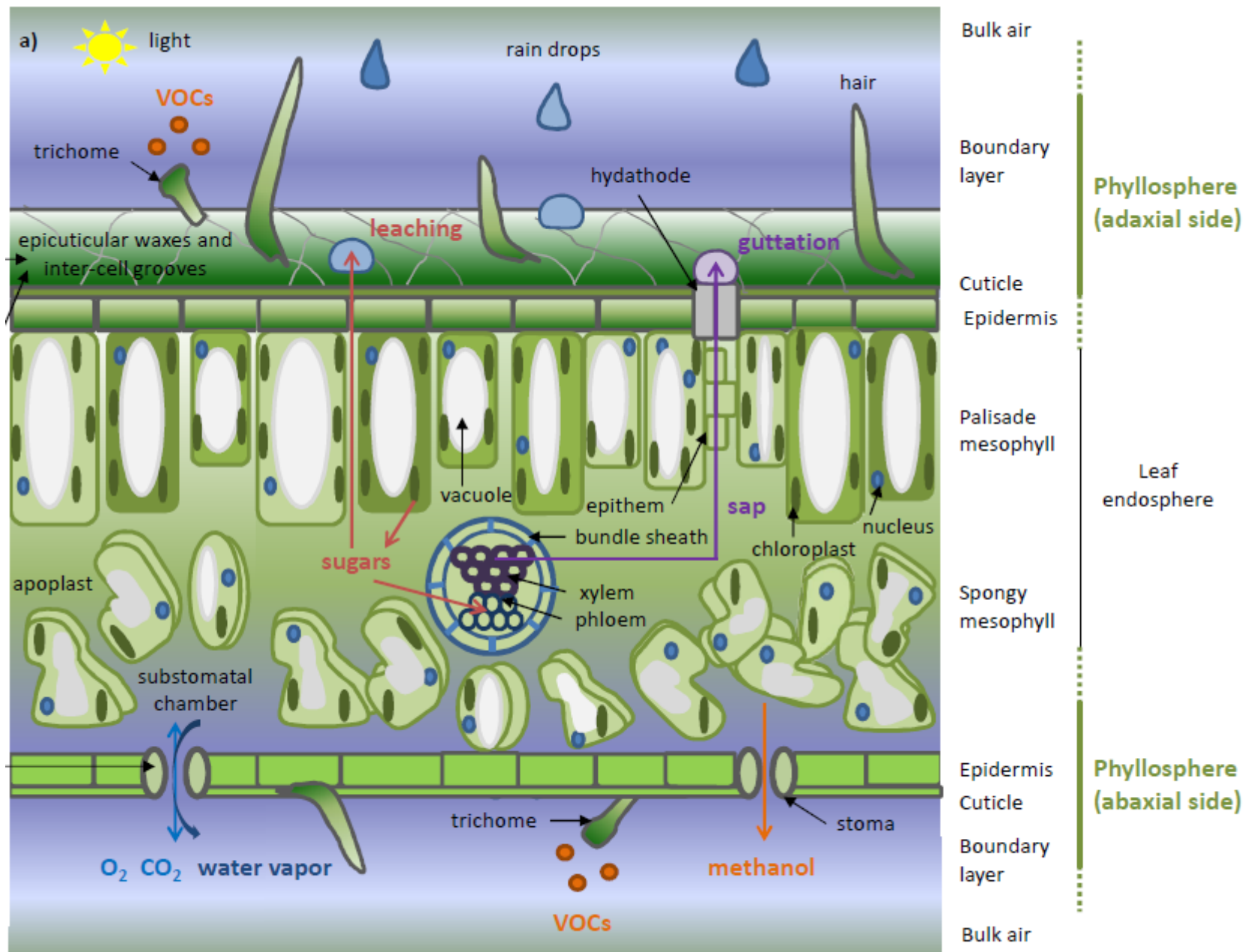
Use the leaf as a support (e.g. phototrophic microorganisms)

Plant mutualists

Use the nutrients available on the leaf (pollen, honeydew, leachates, VOCs)

Plant parasites

Decompose senescent leaves and litter (e.g. dormant saprobes)



Functions of phyllosphere microorganisms

Plant commensals

Plant mutualists



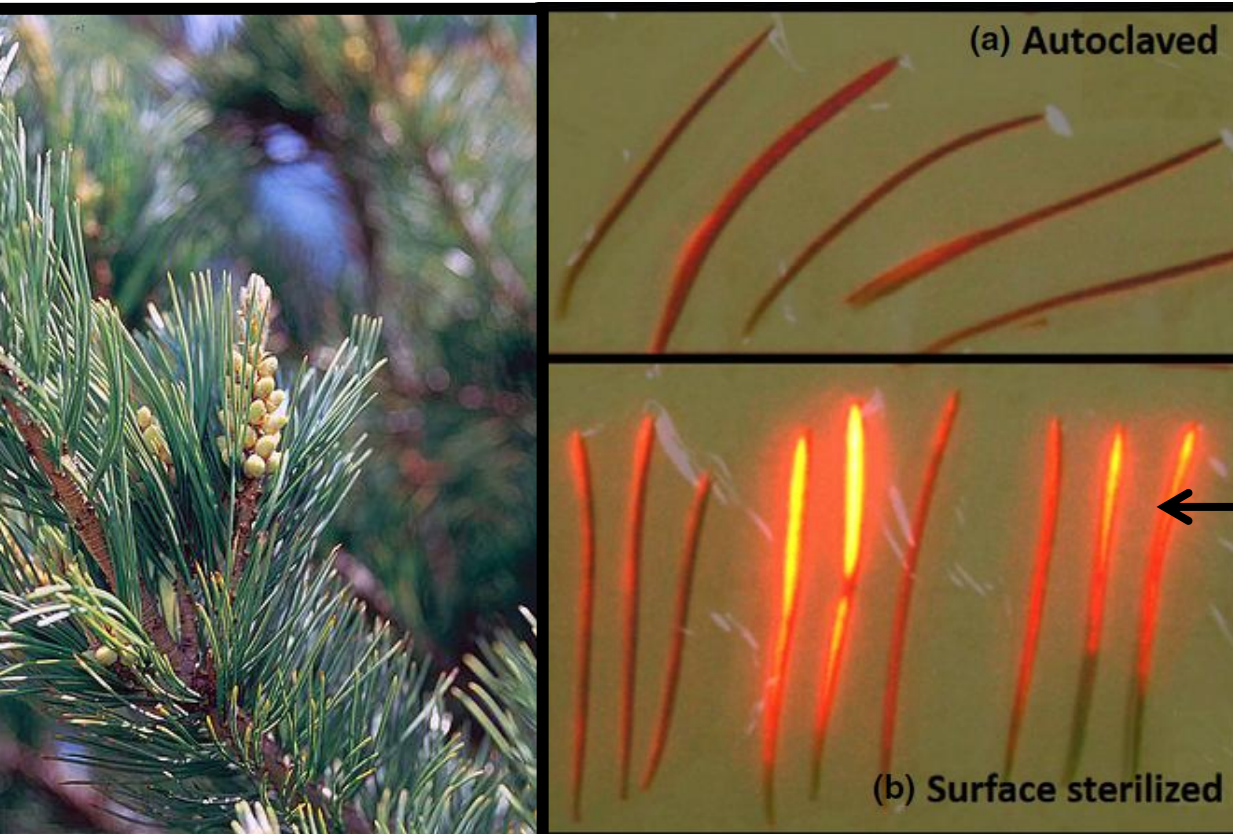
Trophic mutualists (e.g. diazotrophic bacteria)

Protective mutualists (against pathogens, herbivores, drought)

Plant parasites

Diazotrophic bacteria

Pine needles (*Pinus flexilis*) exposed to radioactive N_2



Uptake of atmospheric N_2 by endophytic bacteria

Moyes et al. 2016

Functions of phyllosphere microorganisms

Plant commensals

Plant mutualists

Plant parasites



Primary pathogens

- Cause disease in healthy plants

Latent/secondary pathogens

- Cause disease in stressed or senescent plants

Impact of primary pathogens on leaf physiology



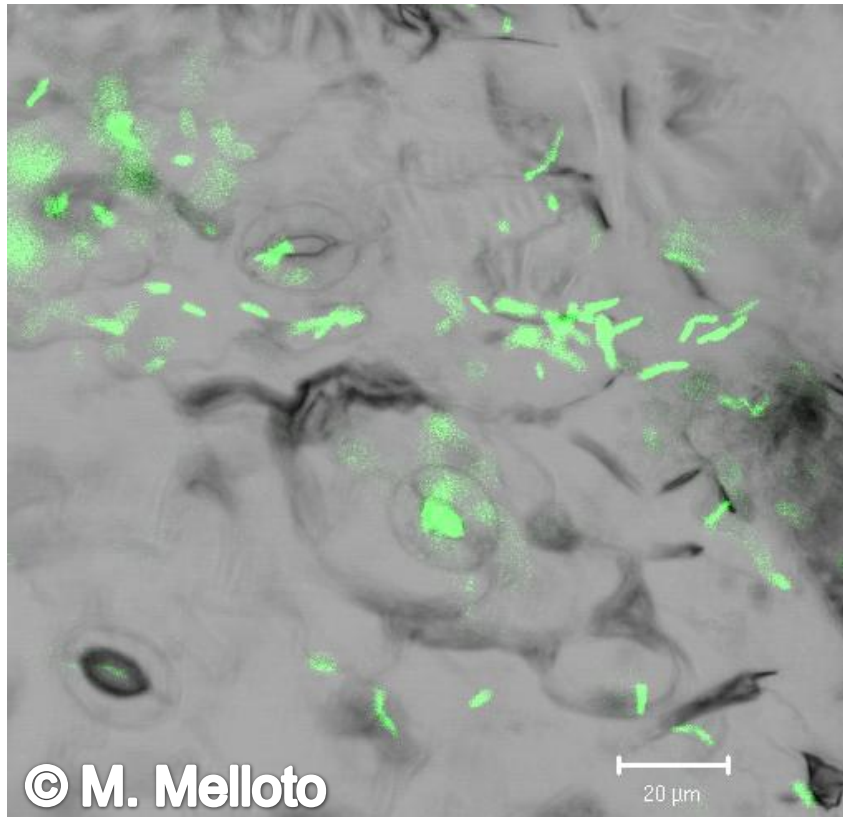
© M.-L. Loustau

Reduction in
**photosynthetic
activity**

Emission of
**volatile organic
compounds**

Copolovici et al. 2015

Impact of primary pathogens on leaf physiology



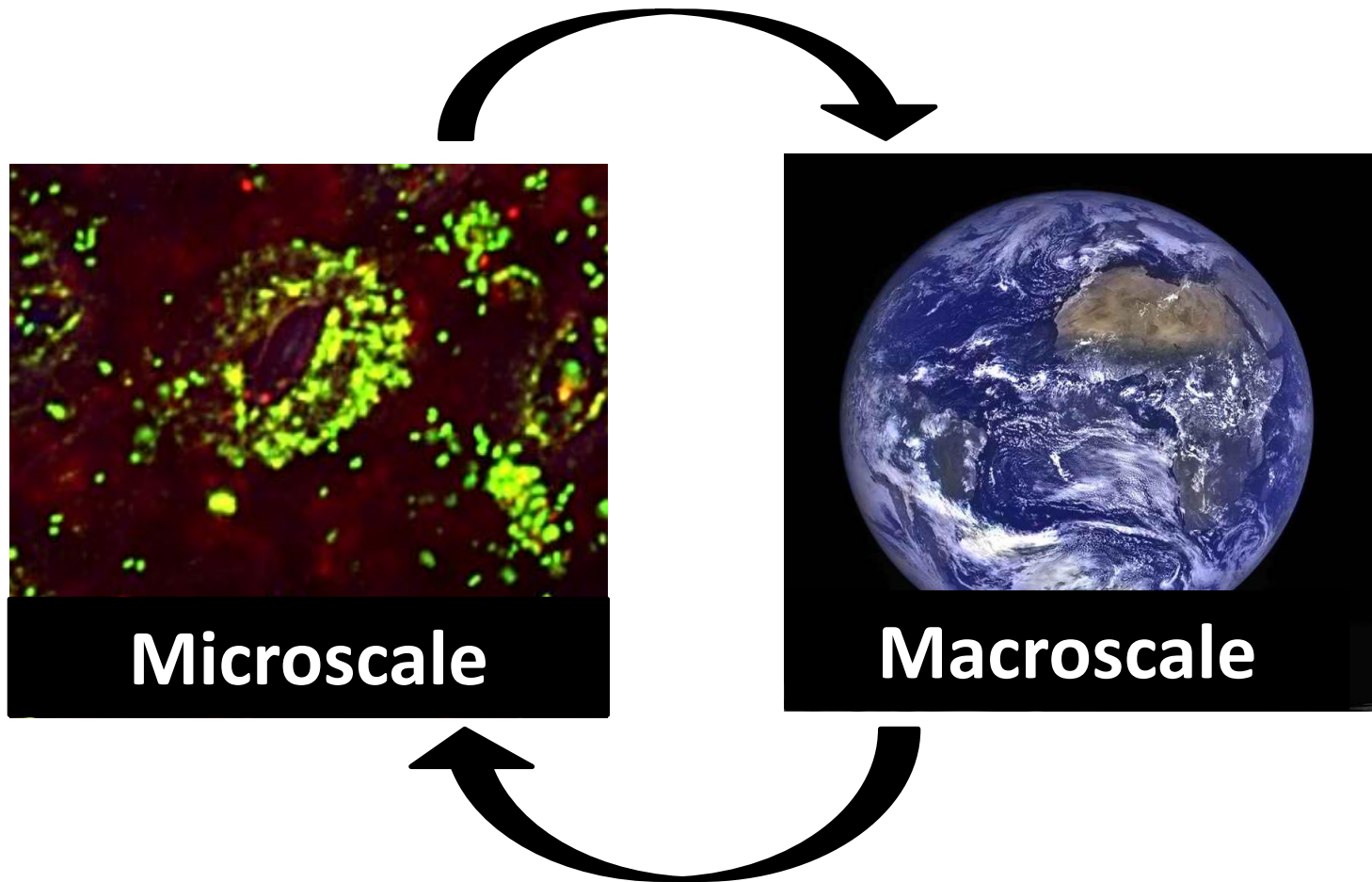
Pseudomonas syringae triggers **stomatal aperture** by producing a virulence factor (coronatine).

The commensal microbiota protects against infection by *Ps*.

Melotto et al. 2006

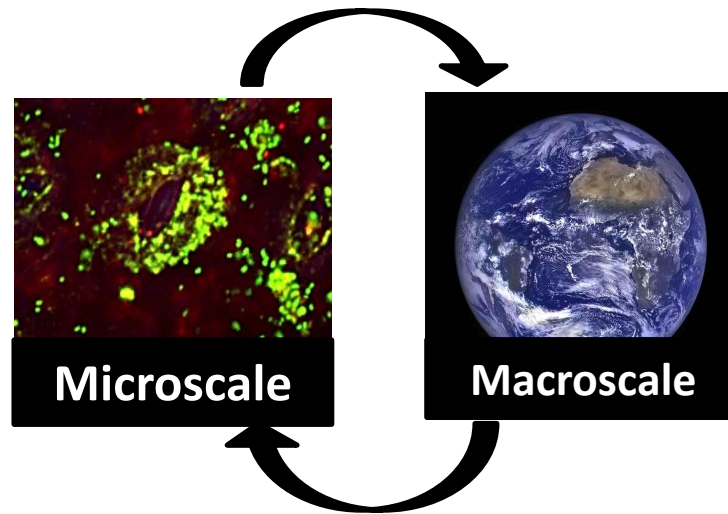
Vogel et al. 2016

A current challenge is to better link the spatial scales



A current challenge is to better link the spatial scales

- Abundance
- Distribution
- Composition
- Diversity
- Dynamics
- Interactions



- Water cycle
- Nutrient cycle
- Climate regulation
- Pest/disease regulation

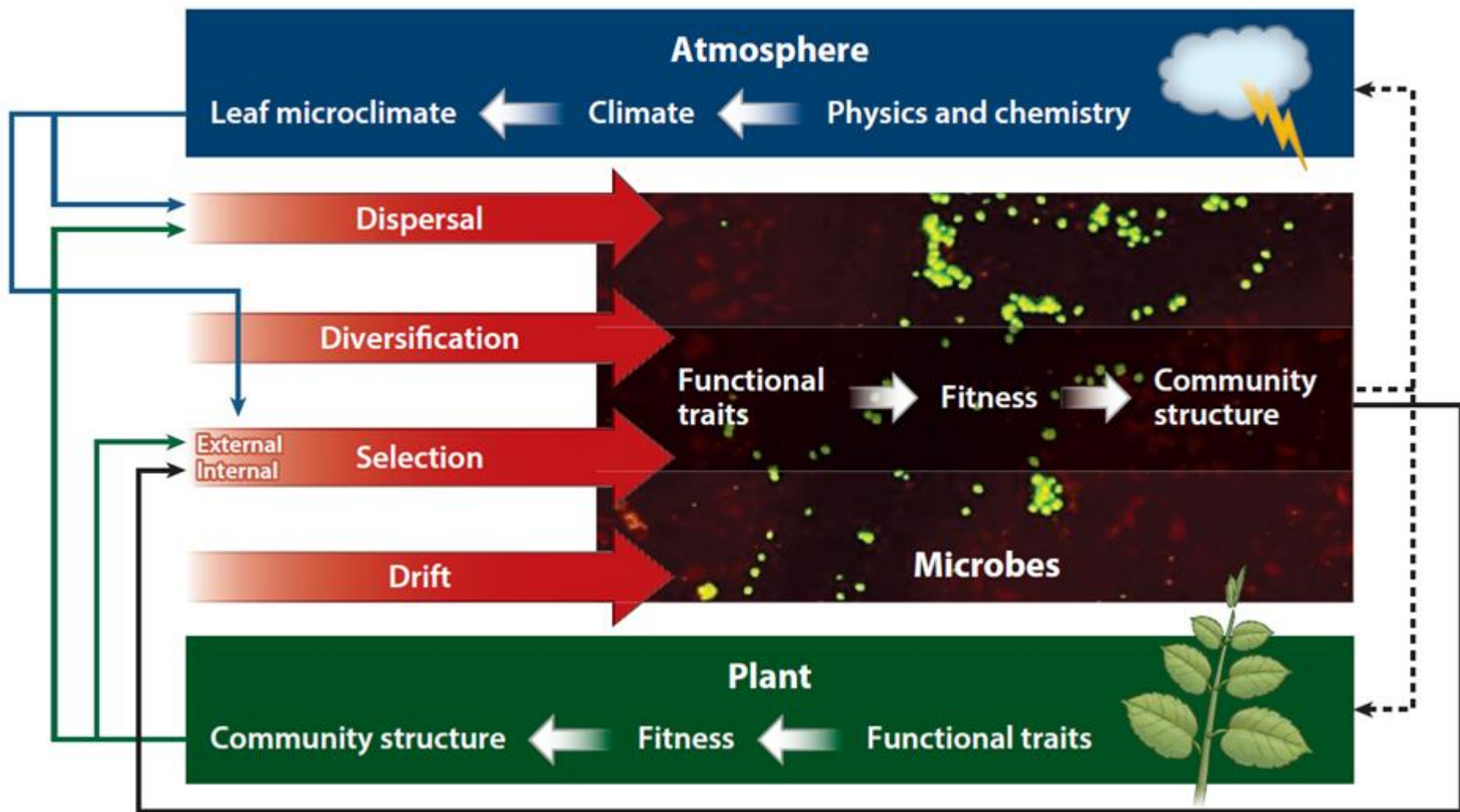
Atmospheric chemistry Climate

Framework ?



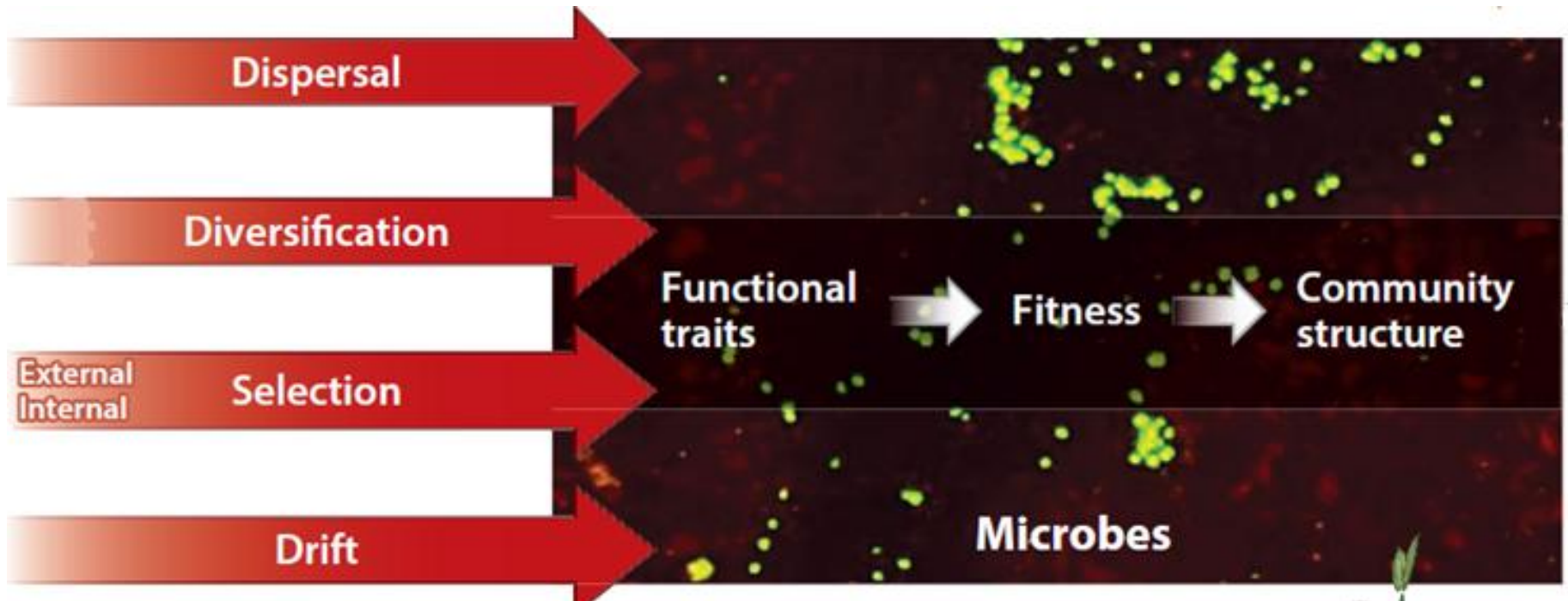
Microbial communities

**Plant health and productivity
Carbon sequestration**



Vacher et al. 2016

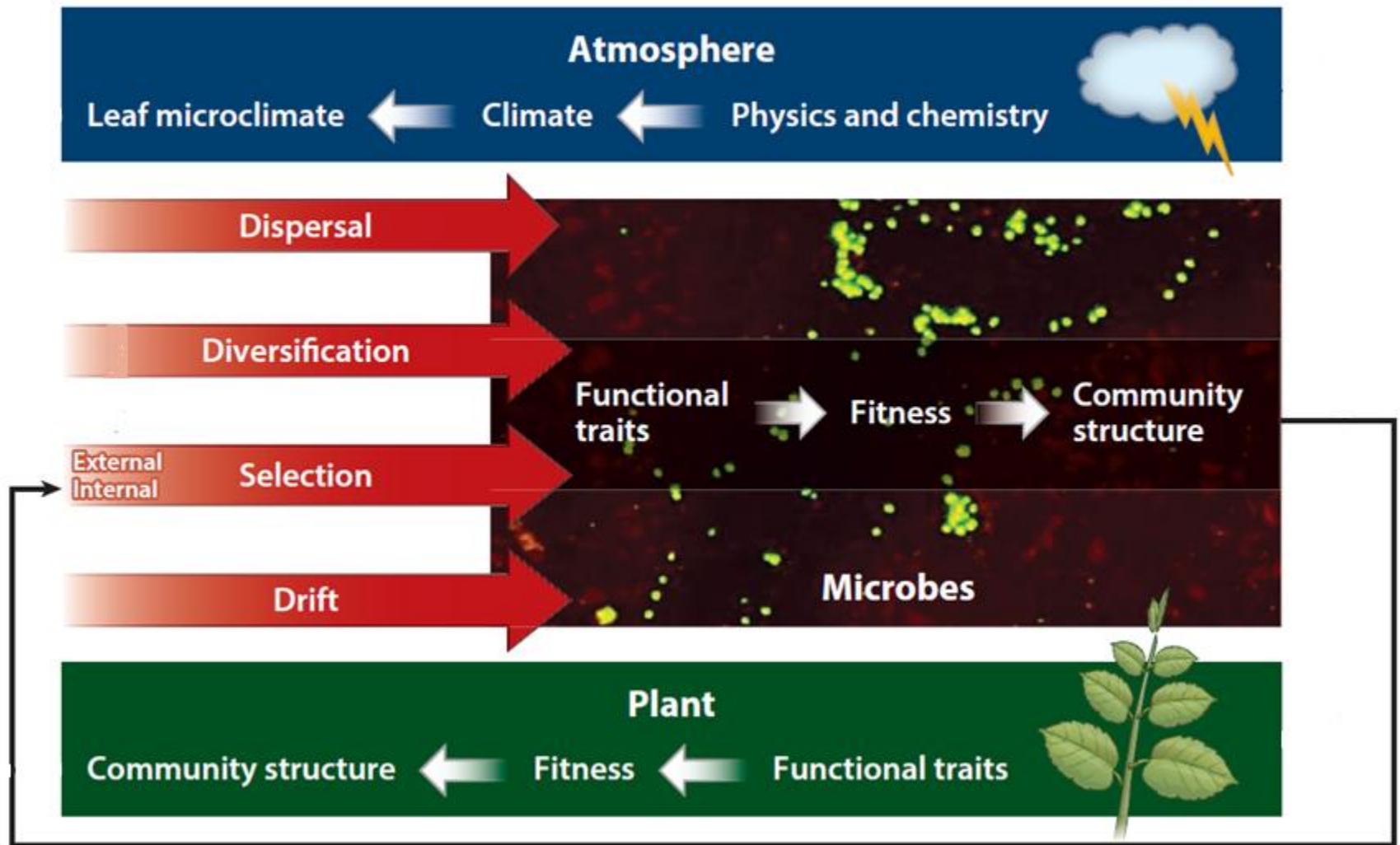
Eco-evolutionary processes shaping microbial communities

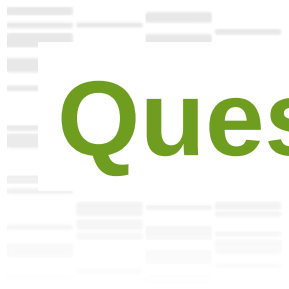


Vellend 2010

Nemergut et al. 2013

Internal selection





Questions

1

How to reconstruct microbial interaction networks?

2

Can the plant select for beneficial network properties?

How to collect interaction data?

« Easy » when interactions can be observed



Host-parasite



Plant-ant



Plant-herbivore



Plant-pollinator



Plant-seed disperser



Predator-prey

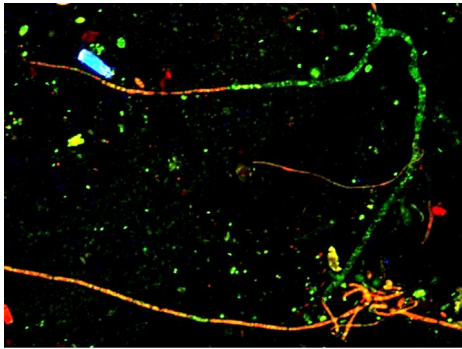


Anemone-fish

Interaction Web Database, NCEAS

How to collect interaction data?

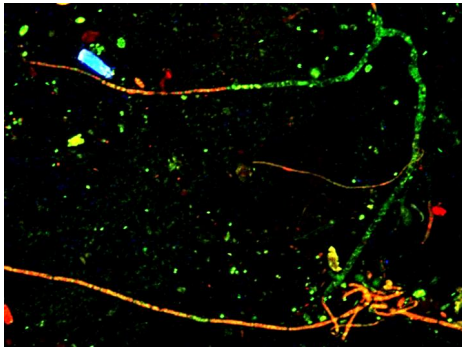
« More difficult » for microorganisms



- Interactions rarely observed *in situ*
- Cultures impossible for most microorganisms

How to collect interaction data?

« More difficult » for microorganisms



- Interactions rarely observed *in situ*
- Cultures impossible for most microorganisms

Learning Ecological Networks from Next-Generation Sequencing Data

Vacher et al. 2016

Case study #1



**Who's interacting
with *Erysiphe
alphitoides*, the
causal agent of oak
powdery mildew?**

Sampling design

1 oak tree

susceptible to
powdery mildew



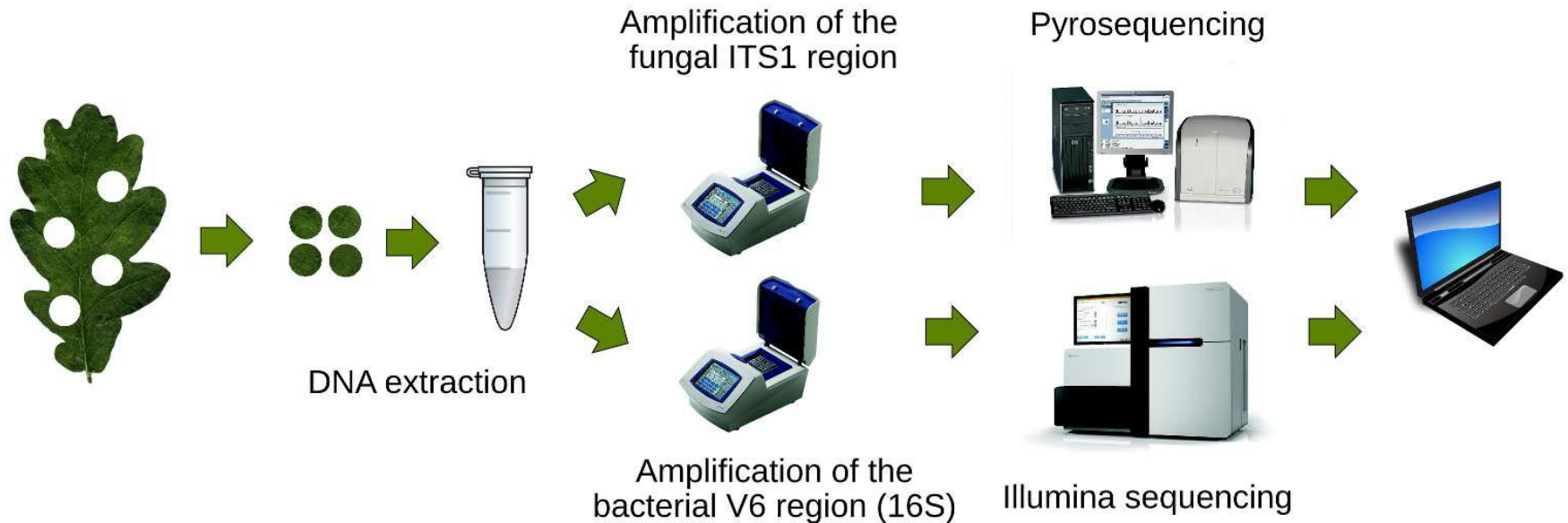
Quercus robur
full-sib family
(Bourran, FR)



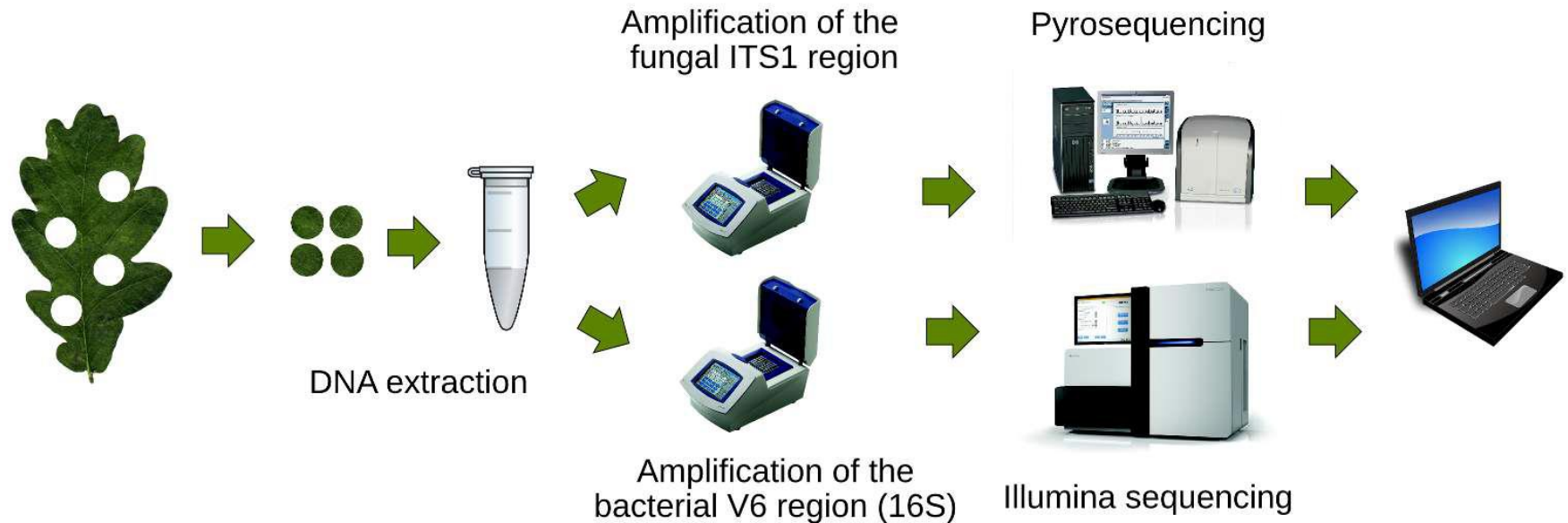
40 leaves displaying
various levels of
symptoms

(0 to 80% of the
upper leaf area)

Next-Generation Sequencing



Next-Generation Sequencing

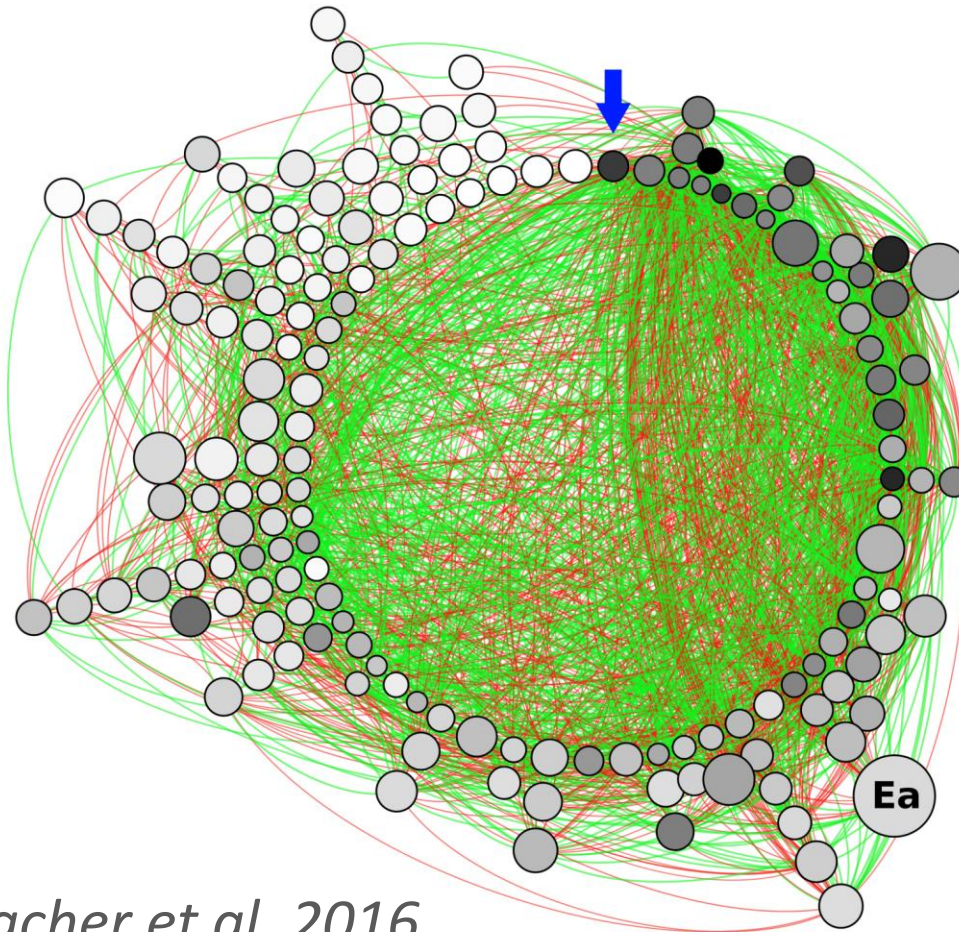


Inferring Correlation Networks from Genomic Survey Data

Jonathan Friedman¹, Eric J. Alm^{1,2,3*}



Microbial correlation network

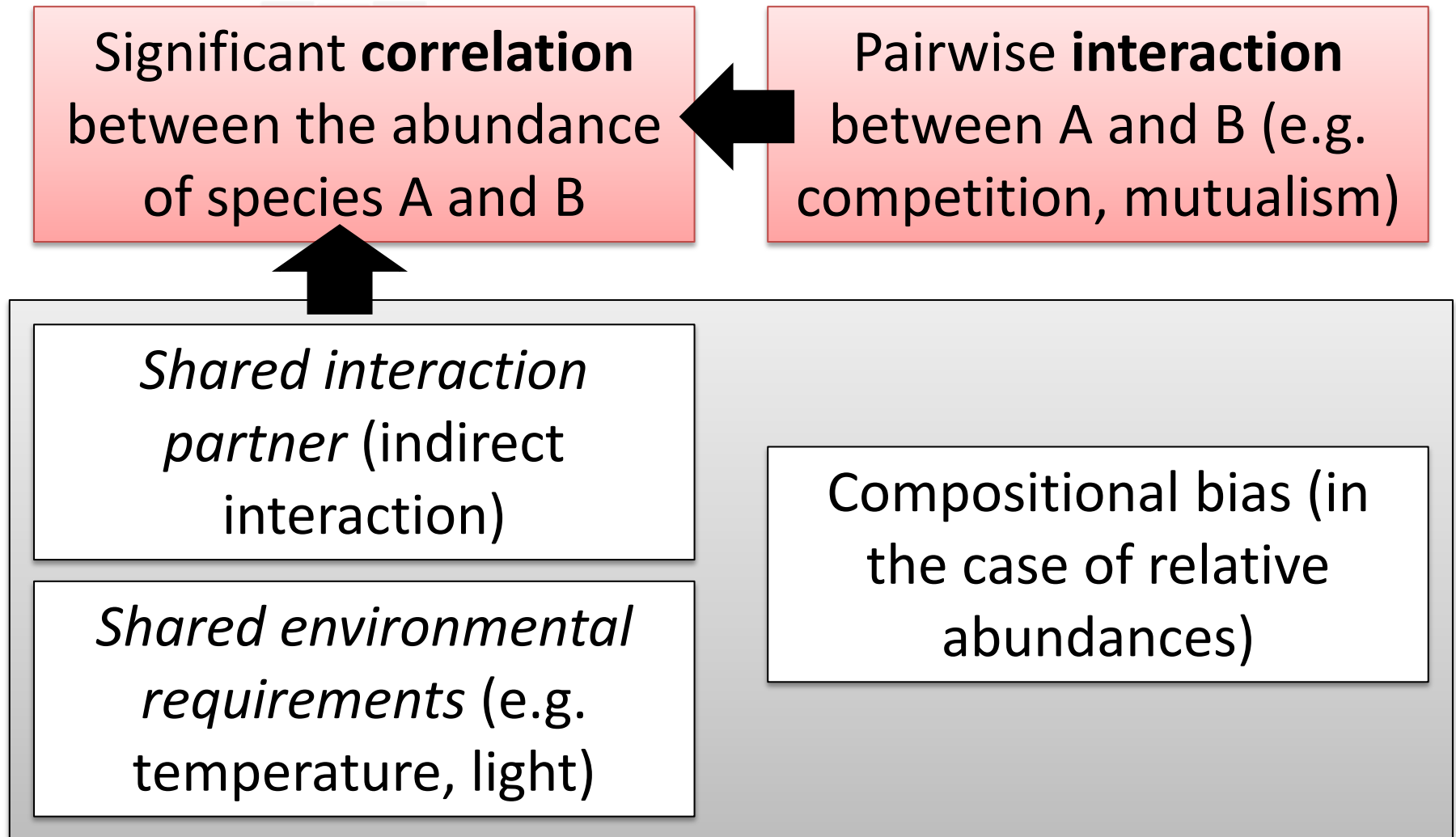


162 nodes, 2053 edges
51% positive correlations
49% negative correlations

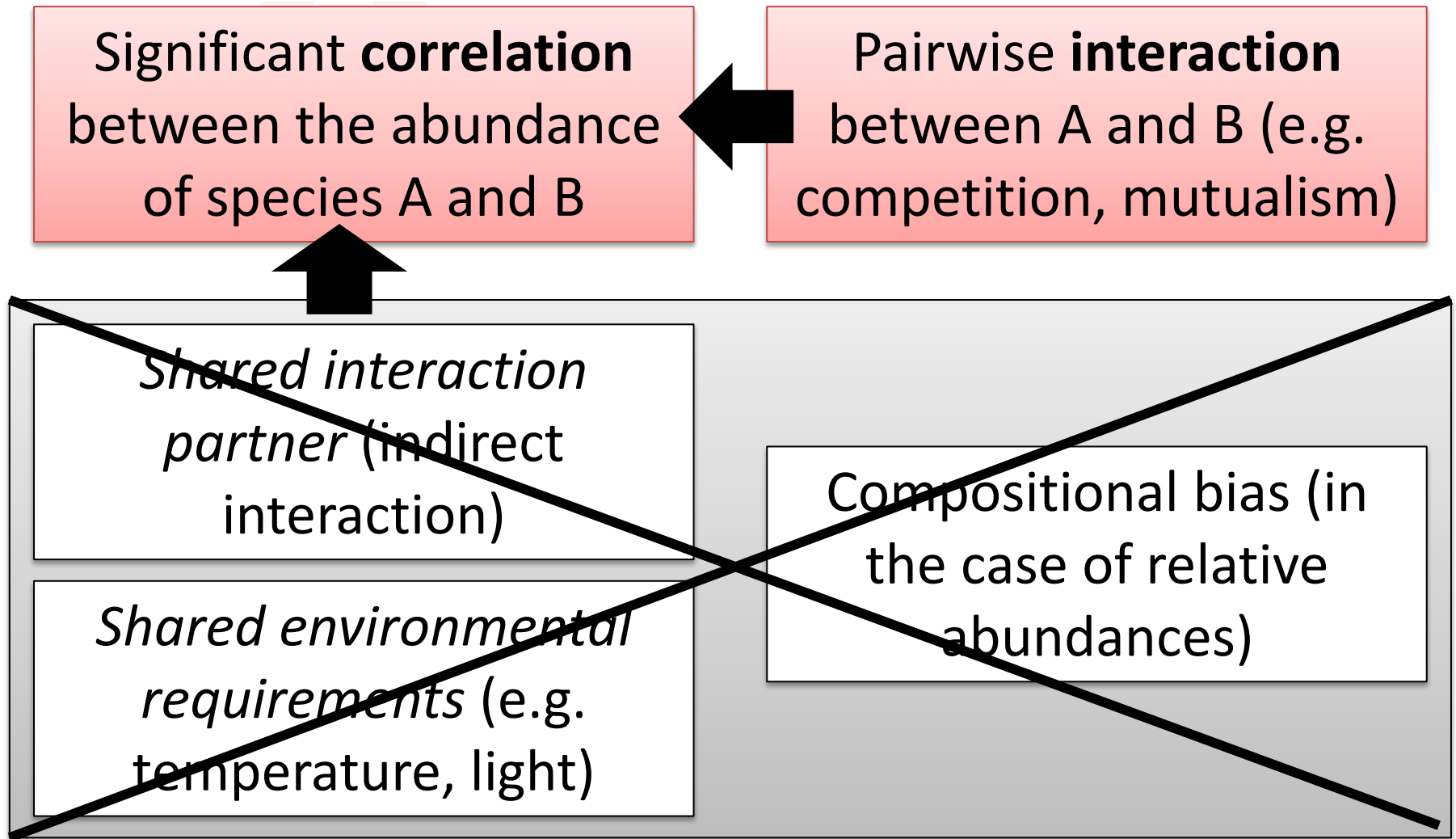
Erysiphe alphitoides is
predominantly
connected through
strong negative links (co-
exclusions)

Vacher et al. 2016

Correlations are not interactions



Correlations are not interactions



From correlations to putative interactions

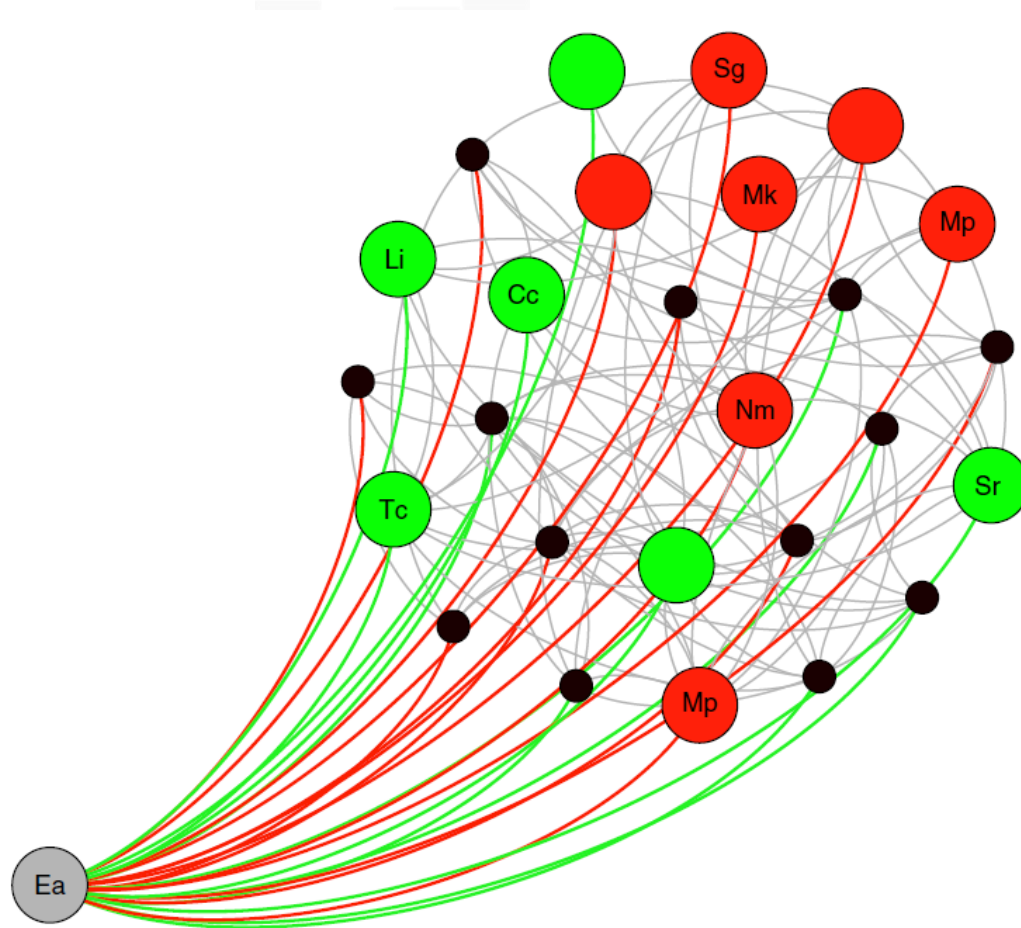


1. Position of the leaf in the crown taken as a proxy of its abiotic environment (temperature, UV)
2. Effect of leaf position and sequencing depth on the number of reads per OTU assessed using NBGLMs
3. Inference of direct associations between OTUs based on the residuals of the model

Schwaller et al. 2015. Bayesian inference of graphical model structures using trees.

Jakuschkin et al. 2016

Network of putative interactions

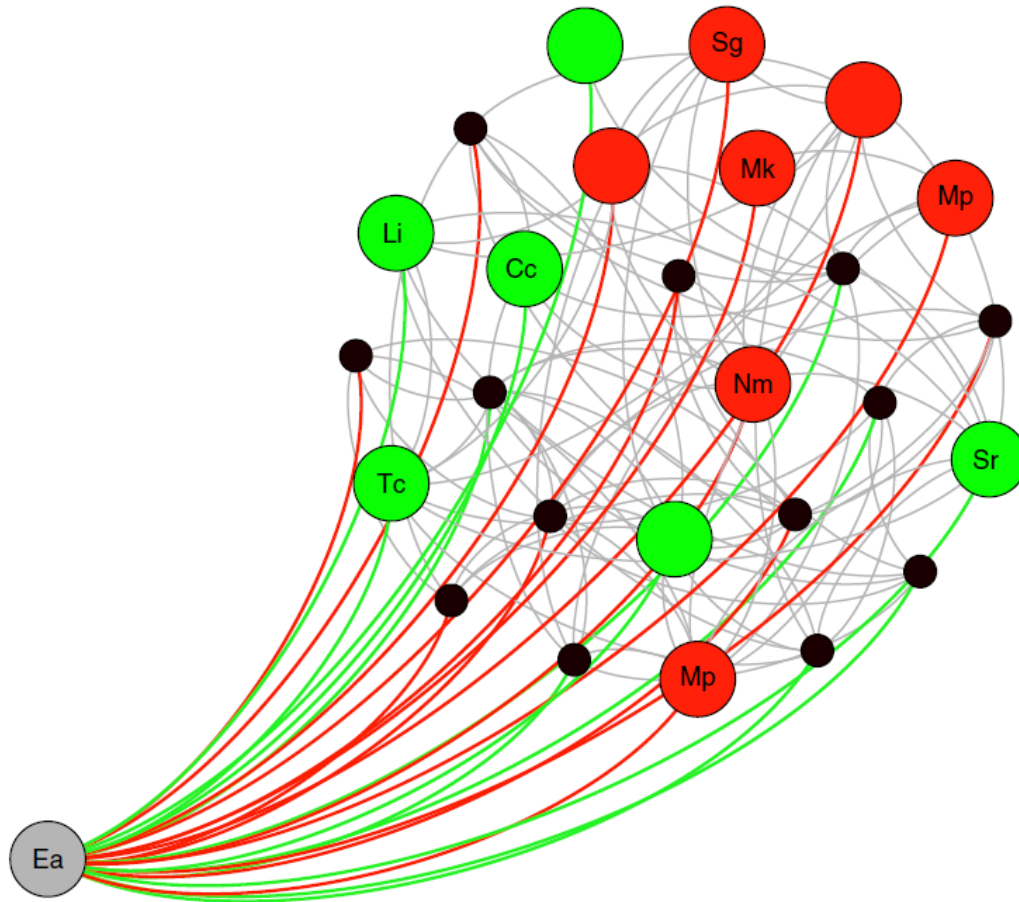


●
13 bacterial OTUs

● ●
13 fungal species
6 putative facilitators (or
facilitated species)
7 putative antagonists

Jakuschkin et al. 2016

Network of putative interactions



Major limitations

- ✓ No experimental validation
- ✓ No replication

Case study #2



Who's interacting with *Erysiphe necator*, the causal agent of grapevine powdery mildew?

- Replicated networks
- Explicit covariates
- Experimental validation
- Statistics & Machine-Learning

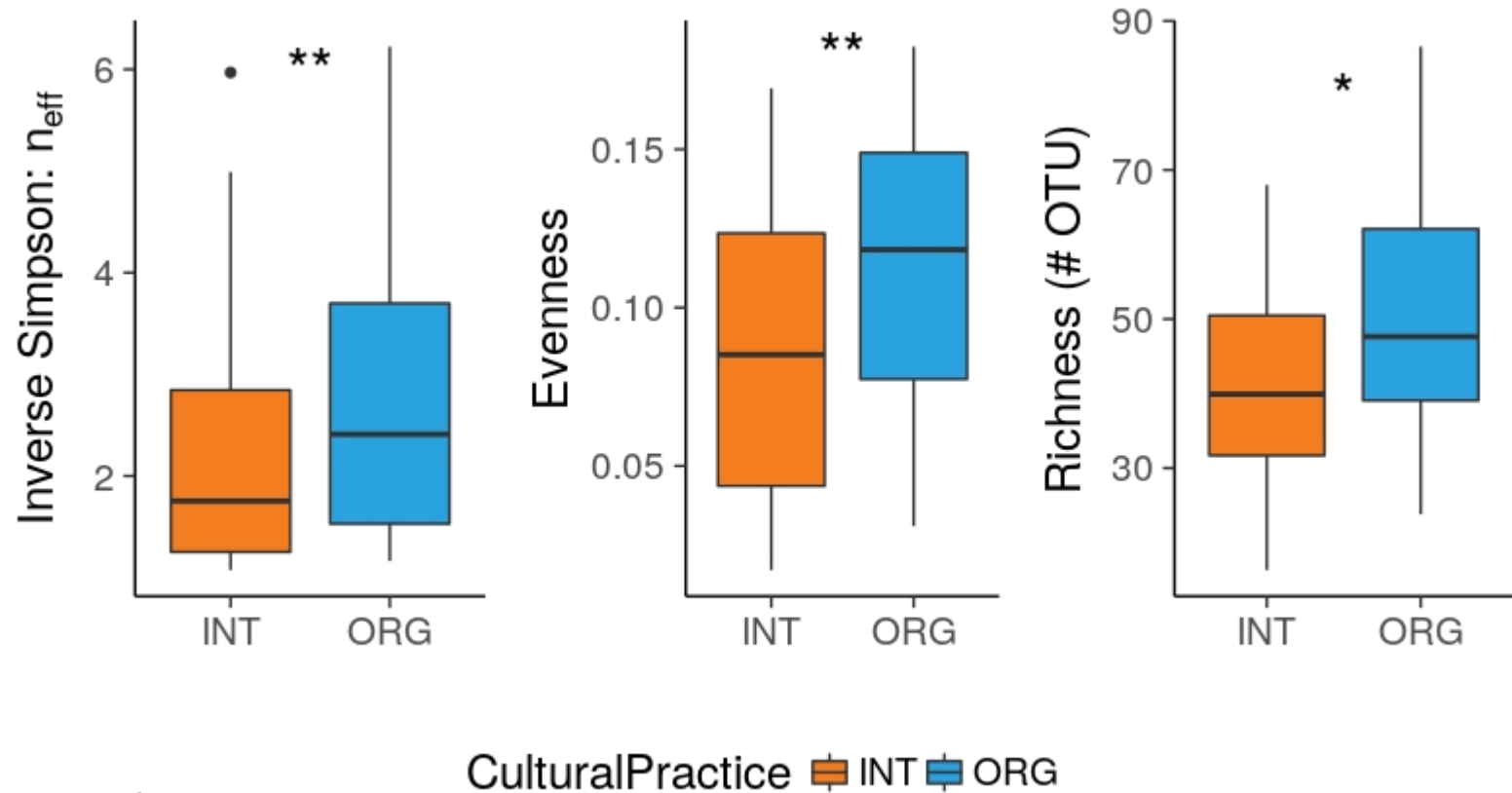
Charlie Pauvert's PhD thesis

Experimental design



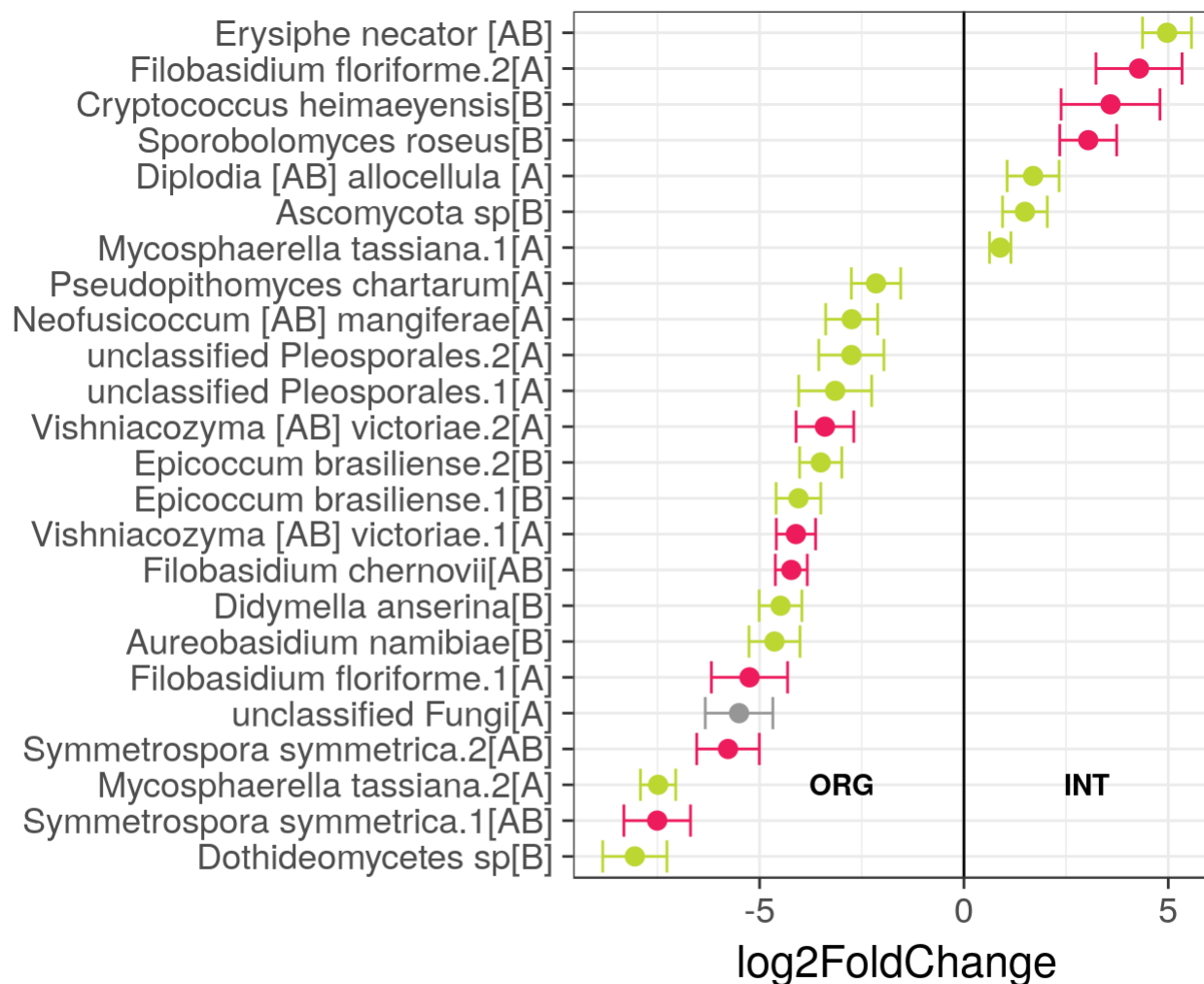
ResIntBio
experiment,
INRA-
Bordeaux
(PI: Laurent
Delière &
Jessica
Vallance)

Influence of the farming system on microbial diversity



Pauvert et al. in prep

Influence of the farming system on microbial composition



Influence of the farming system on microbial associations

Microbial association network inferred using SparCC

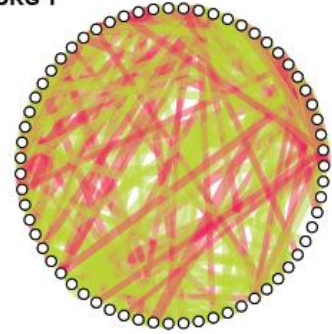
No effect of the farming system on network properties

Pauvert et al. in prep

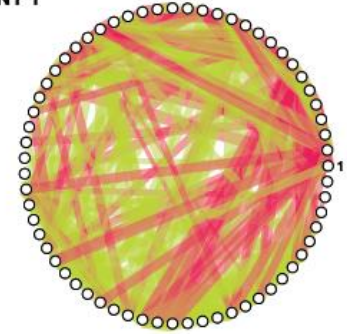
ORGANIC

INTEGRATED

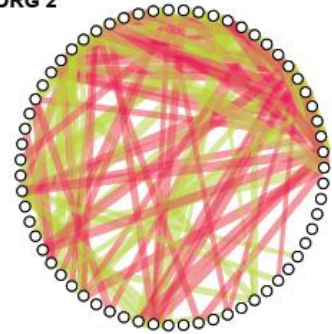
ORG 1



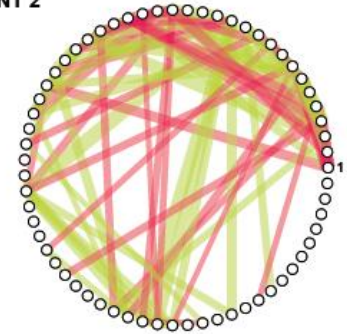
INT 1



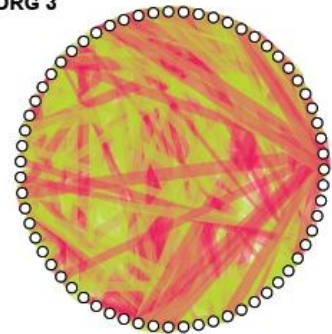
ORG 2



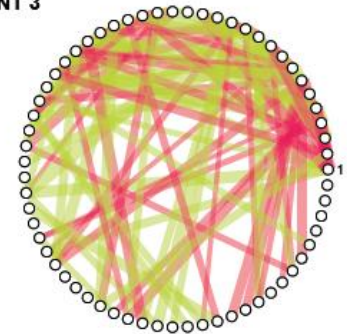
INT 2

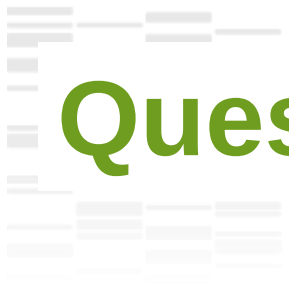


ORG 3



INT 3





Questions

1

How to reconstruct microbial interaction networks?

2

Can the plant select for beneficial network properties?

Genetic architecture of variation in phyllosphere microbiota



Quercus robur



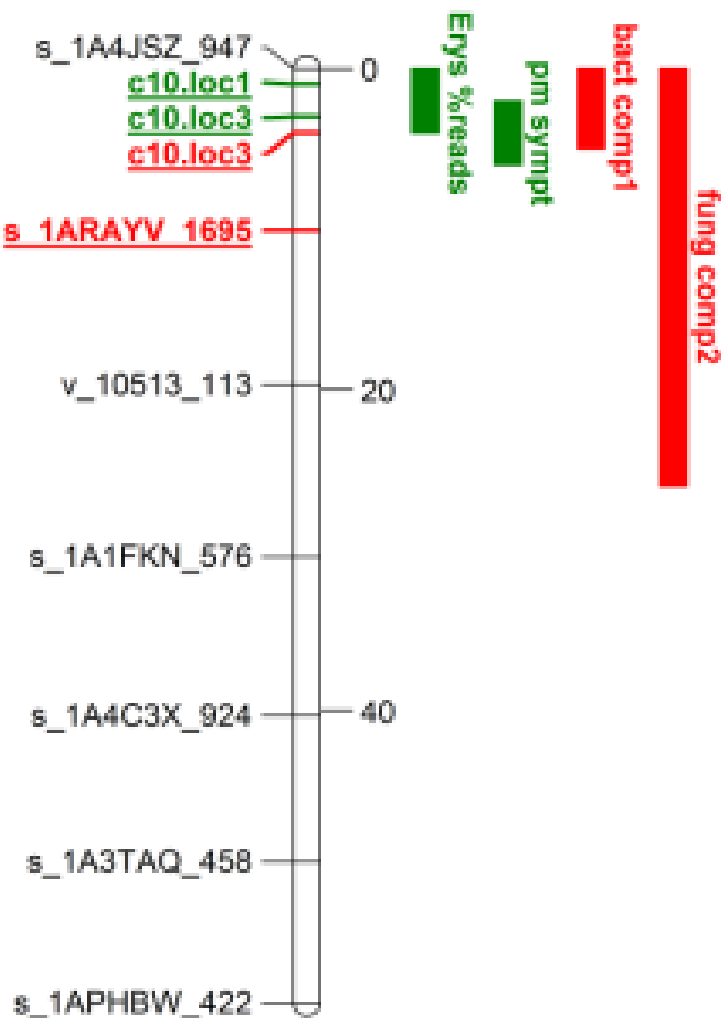
Full-sib family (Bourran, FR)

QTLs for variation in fungal and bacterial community composition

Colocalization between QTLs that control bacterial composition and susceptibility to powdery mildew

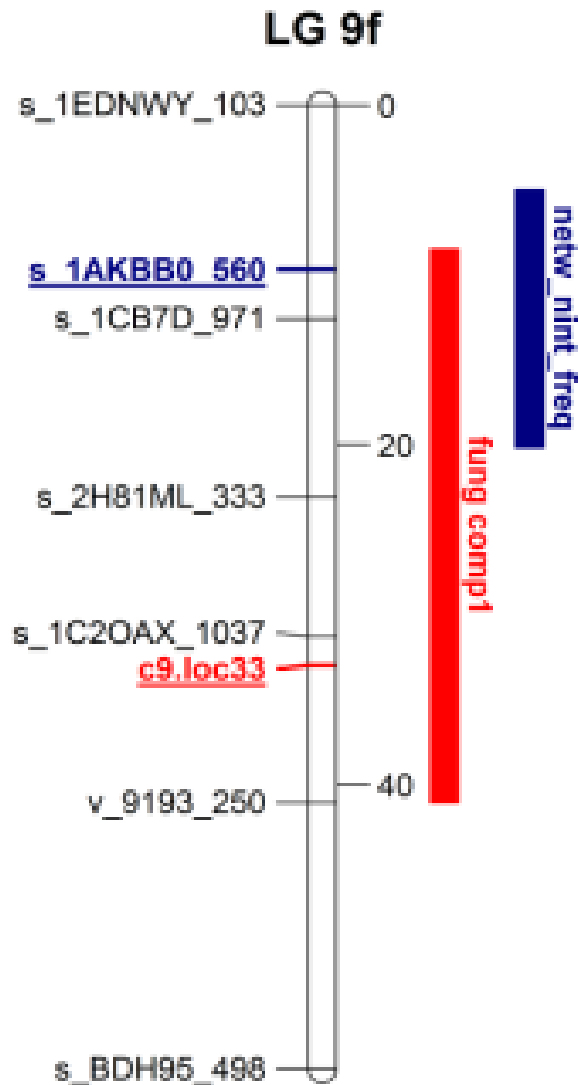


LG 10m



Jakuschkin et al. in prep

QTLs for variation in microbial association network properties



Microbial association network
inferred using SparCC

Significant QTL for the frequency of
negative associations (PEV=16.6%)

Jakuschkin et al. in prep





Research priorities (1)

Assess the relative roles of **dispersal, evolutionary diversification, selection, and drift** in shaping PMCs

Decipher phyllosphere **microbial interaction networks** and assess their role in plant health

Identify of the **plant traits** that shape PMCs and the underlying **genes** in model and non-model plant species

Research priorities (2)

Identify which **whole-community properties** of PMCs mediate plant performance and ecosystem functions

Assess the influence of environmental change on the **evolutionary diversification** of PMCs and the subsequent effects on plant fitness

Analyse the **global biogeography** of PMCs; predict changes in PMCs distribution and function under climate change scenarios.



Applied perspectives

BIOCONTROL

Identify automatically potential antagonists of plant pathogens

PLANT BREEDING

Create plant varieties that select for beneficial microbial communities

BIOMONITORING

Use NGS networks to monitor changes in ecosystem functioning

Next-Generation Biomonitoring

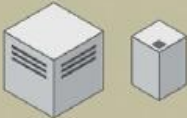
(A) Automated sampler and sequencing

Schematic of the key elements of an automated sampler and sequencer to be distributed across a global array of sample points

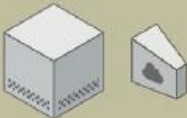
Sample mechanism



DNA extractor and reagents pack



Sequencer and communication pack



Battery/solar pack and processor



(B) Global array of samplers and in-cloud network reconstruction

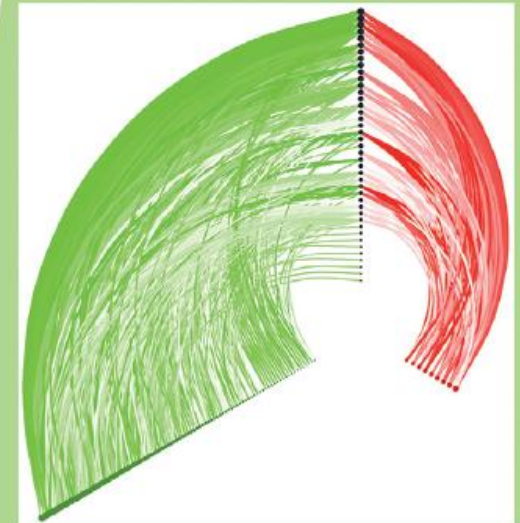
Sequences in all uploaded samples are identified and the implicit interactions reconstructed into networks using machine learning in the cloud

LoRa



(C) Analysis across highly-replicated networks

Detection of change in network structure, from analysis of variation between networks, across the sample array



Bohan et al. 2017

Many thanks to...

The Phyllosphere: Microbial Jungle at the Plant–Climate Interface

Corinne Vacher,¹ Arndt Hampe,² Annabel J. Porté,¹
Ursula Sauer,³ Stéphane Compant,³
and Cindy E. Morris⁴

Annu. Rev. Ecol. Evol. Syst. 2016. 47:1–24



AIT,
Austria



INRA

Many thanks to...



Stéphane Robin, INRA, Paris

➤ Statistical Inference of Ecological Networks

Dave Bohan, INRA, Dijon

➤ Machine-Learning of Ecological Networks



Trends in Ecology & Evolution

Next-Generation Global
Biomonitoring: Large-scale,
Automated Reconstruction of
Ecological Networks

David A. Bohan,^{1,*} Corinne Vacher,²
Alireza Tamaddon-Nezhad,³ Alan Raybould,⁴
Alex J. Dumbrell,⁵ and Guy Woodward⁶

Many thanks to...



Boris Jakushkin

Deciphering the Pathobiome: Intra- and Interkingdom Interactions Involving the Pathogen *Erysiphe alphitoides*

Boris Jakuschkin¹ • Virgil Fievet¹ • Loïc Schwaller^{2,3} • Thomas Fort¹ • Cécile Robin¹ • Corinne Vacher¹



Thomas Fort



Foliar fungal communities strongly differ between habitat patches in a landscape mosaic

Thomas Fort¹, Cécile Robin¹, Xavier Capdevielle¹, Laurent Delière² and Corinne Vacher³

Many thanks to...



Charlie Pauvert

Learning microbial networks from NGS data: application to biocontrol



Tania Fort

Influence of microclimate on leaf microbiota and feedback effects on leaf physiology and phenology

Perspectives

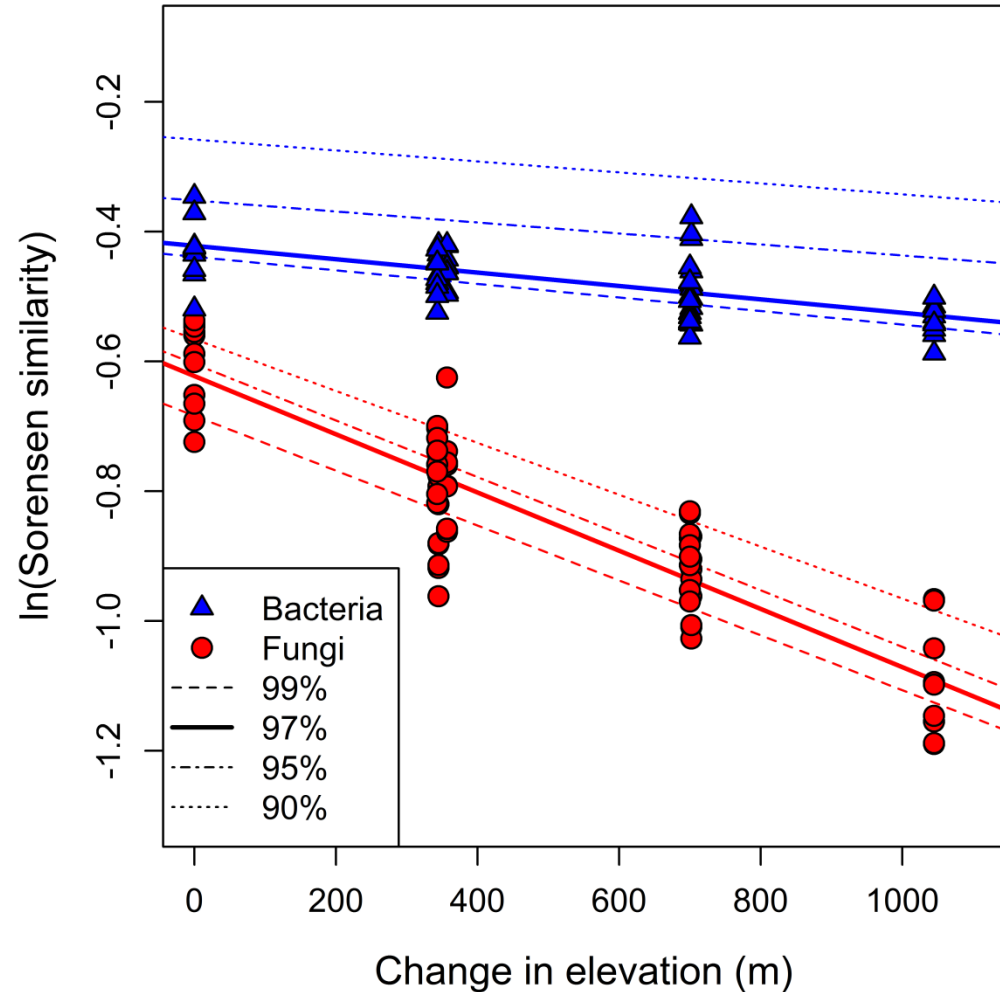
VERTIGE
project (PI:
Heidy
Schimann,
UMR
EcoFoG)

COPAS,
Nouragues,
French
Guyana





Distance-decay of similarity in PMCs

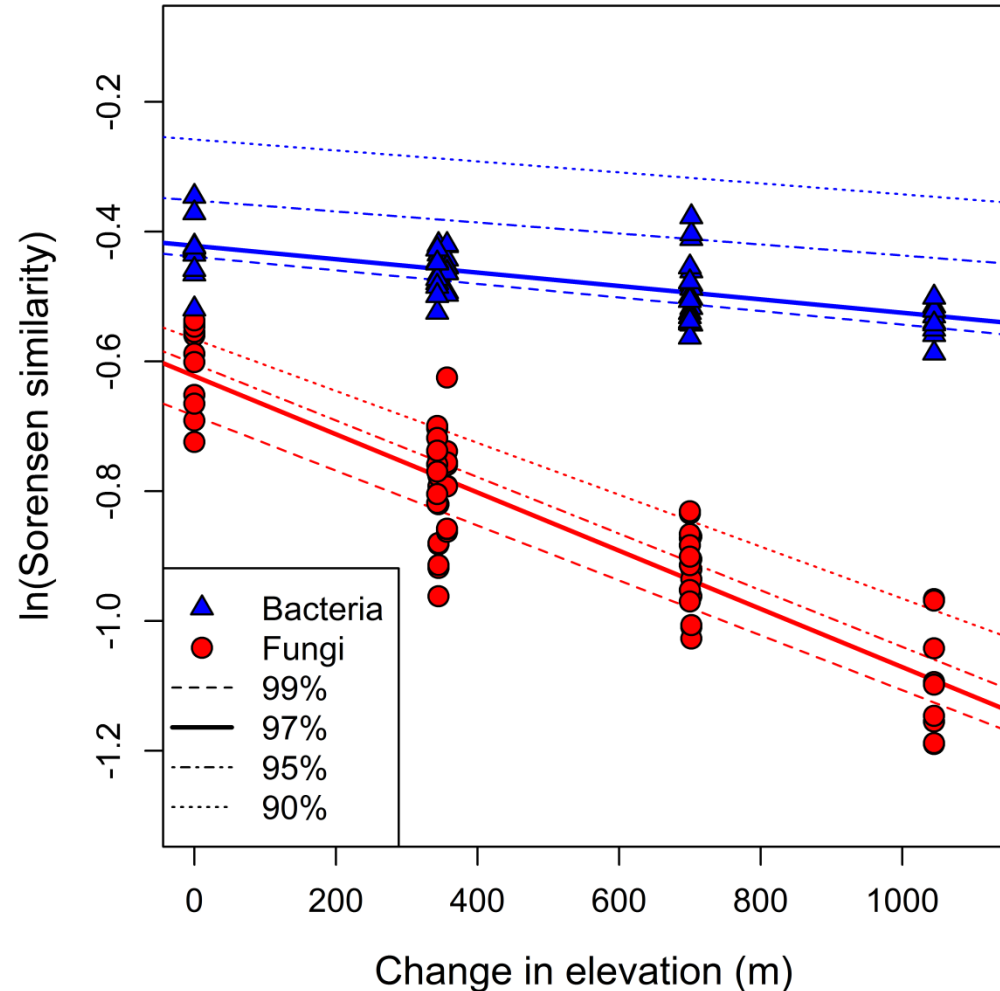


Distance-decay of similarity in PMCs

Higher dispersal abilities of bacteria

Higher sensitivity of fungi to temperature variations

Methodological bias (different barcodes)



Measurement of bacterial emissions above plant canopies

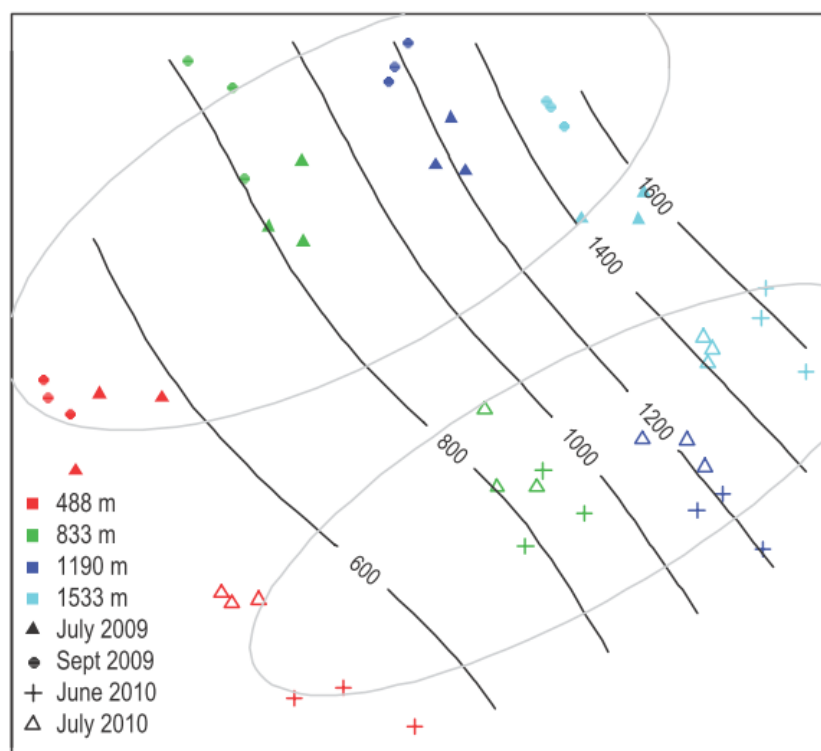


Microflux
project
(PI: Yves
Brunet)

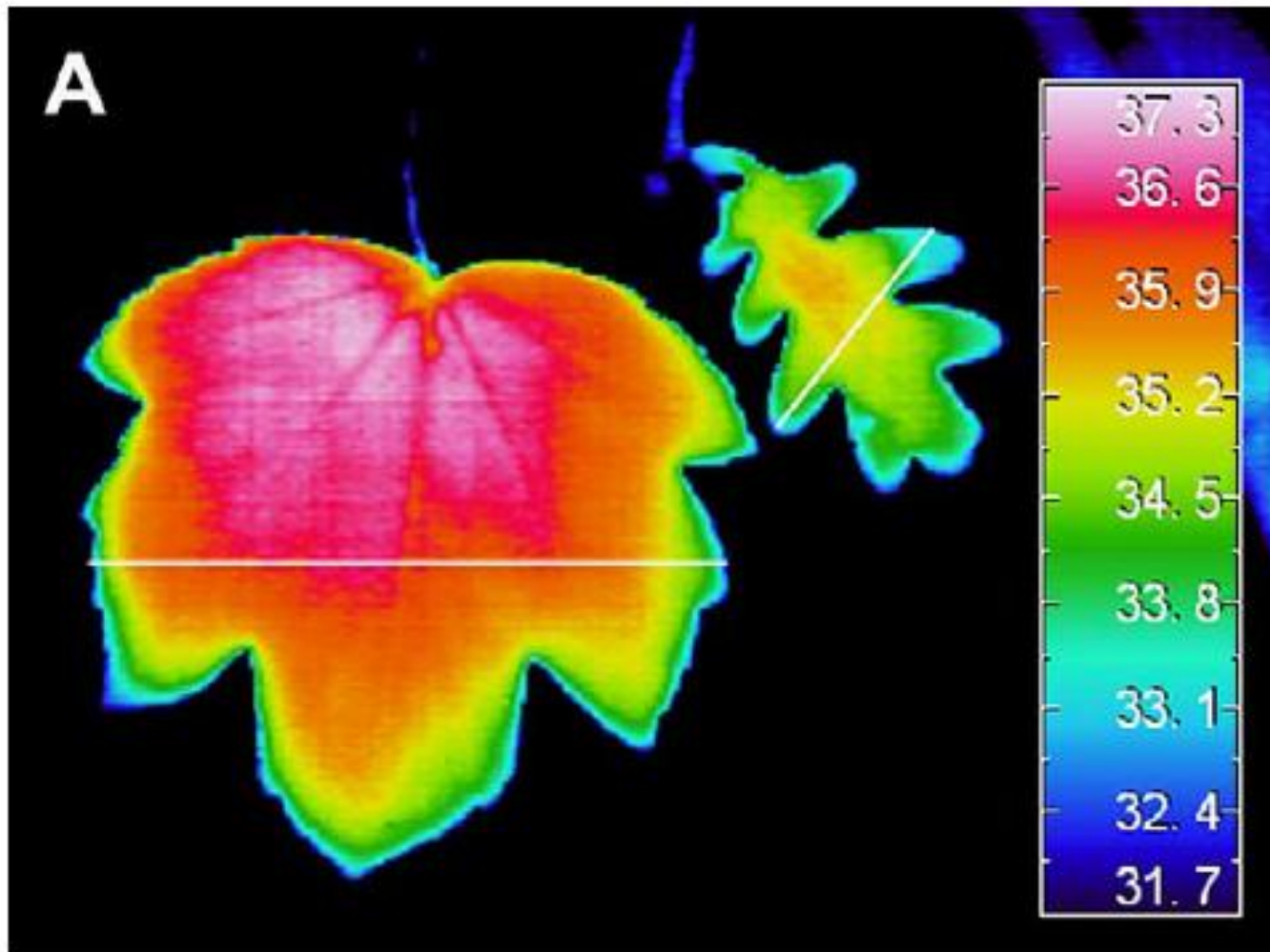


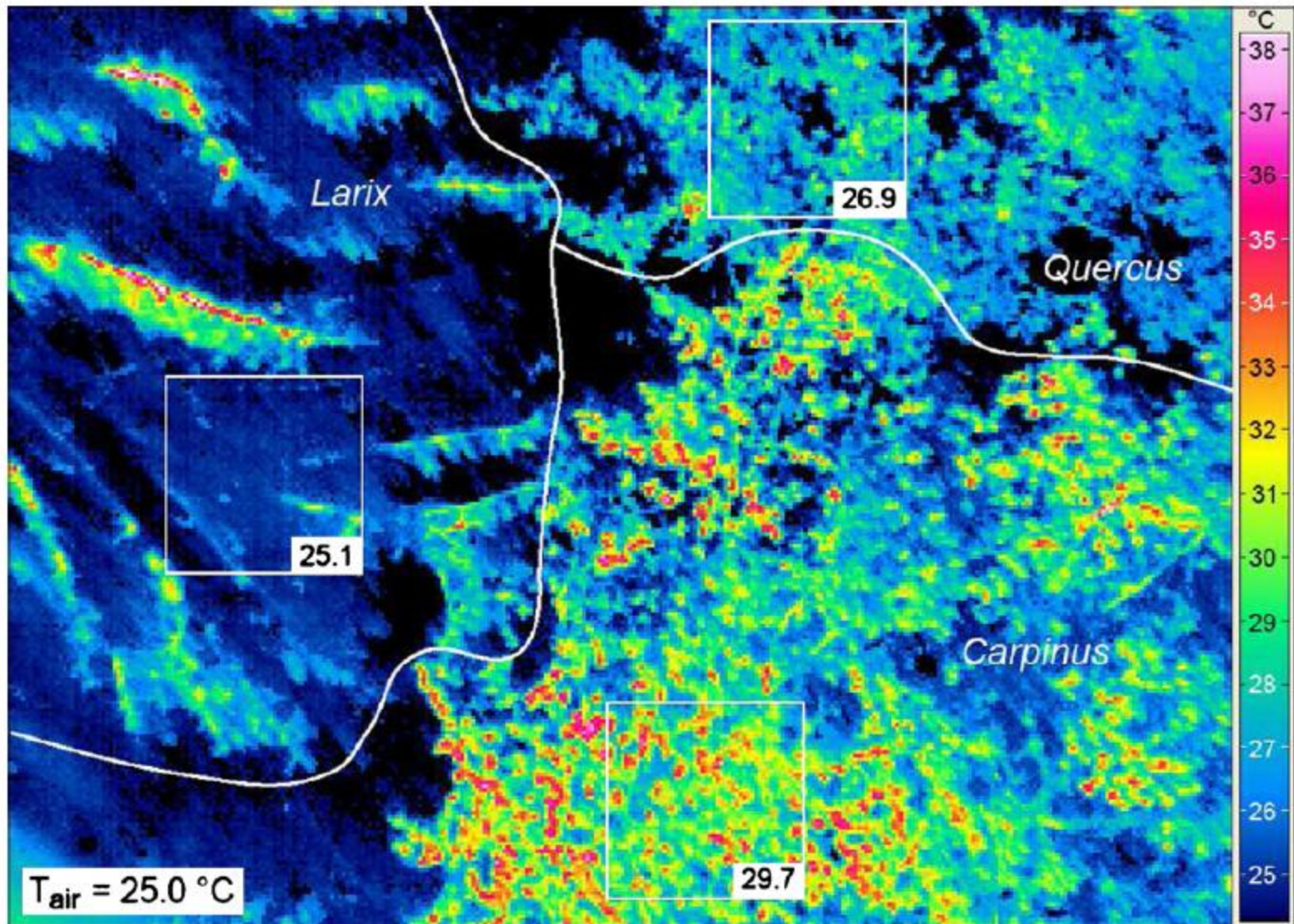
The composition of phyllosphere fungal assemblages of European beech (*Fagus sylvatica*) varies significantly along an elevation gradient

Tristan Cordier^{1,2}, Cécile Robin^{1,2}, Xavier Capdevielle^{1,2}, Olivier Fabreguettes^{1,2}, Marie-Laure Desprez-Loustau^{1,2} and Corinne Vacher^{1,2}



Phyllosphere: a heterogeneous habitat

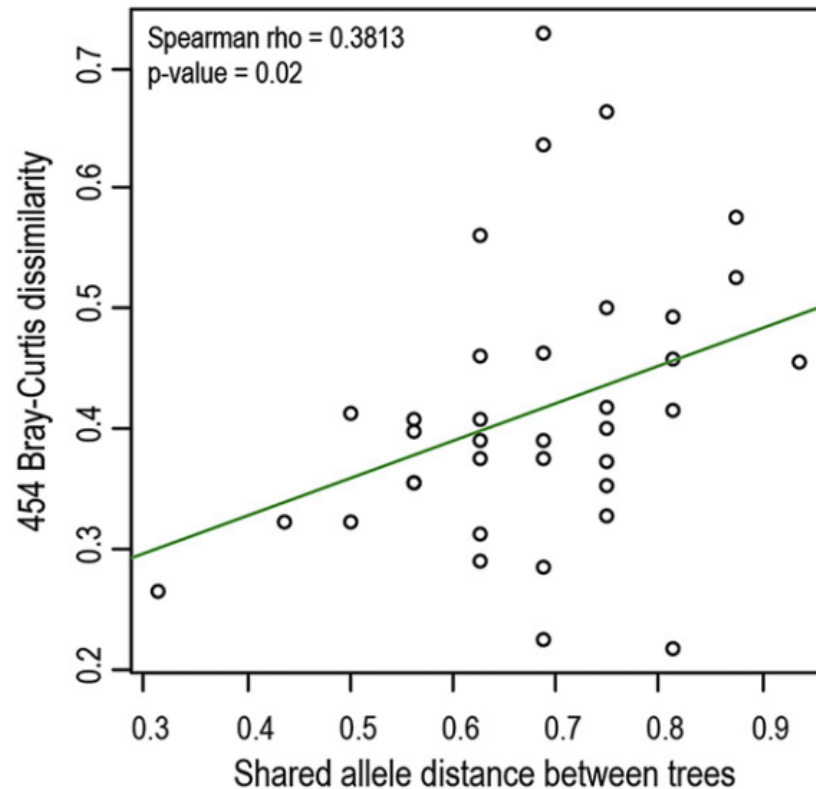


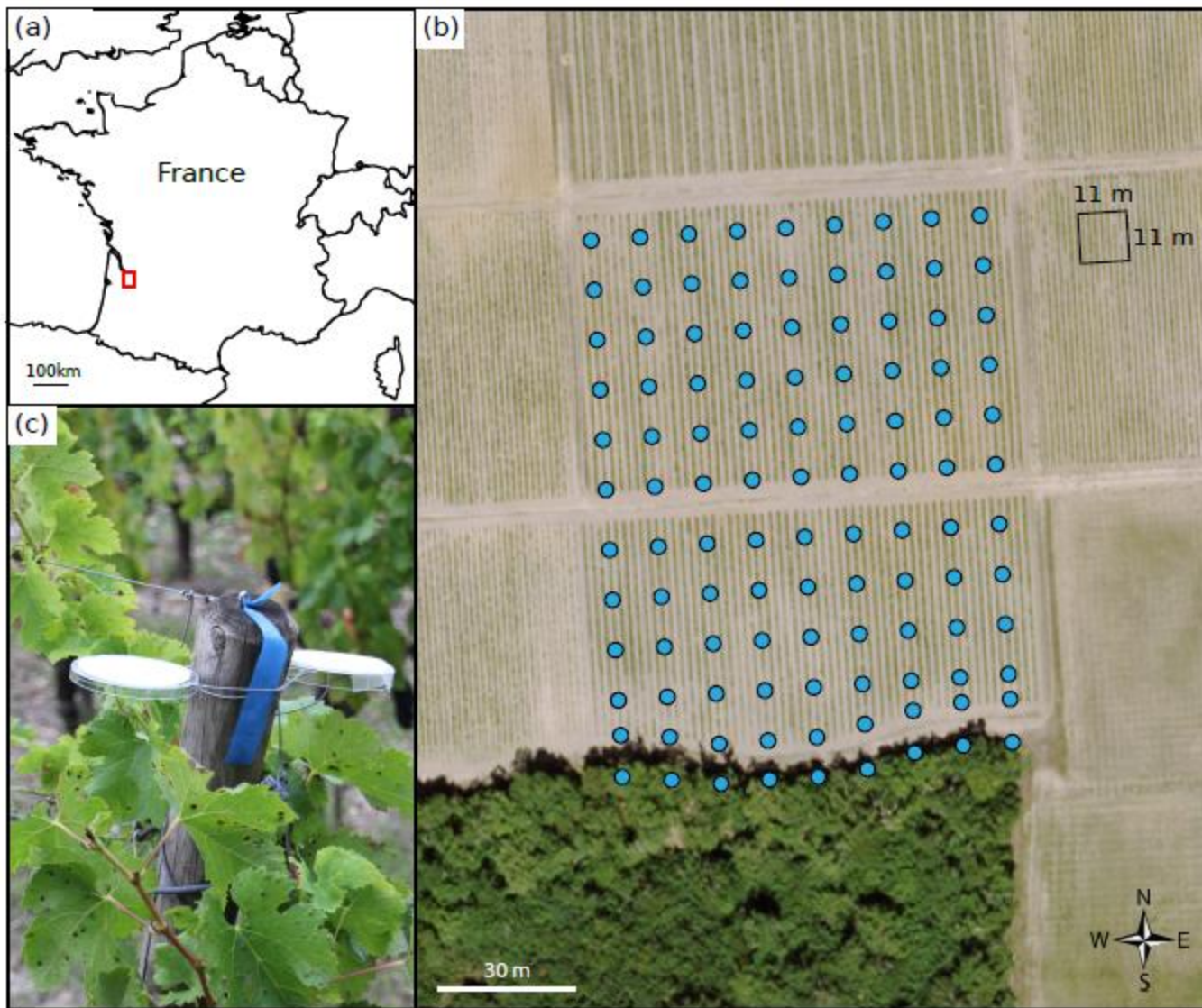




Spatial variability of phyllosphere fungal assemblages: genetic distance predominates over geographic distance in a European beech stand (*Fagus sylvatica*)

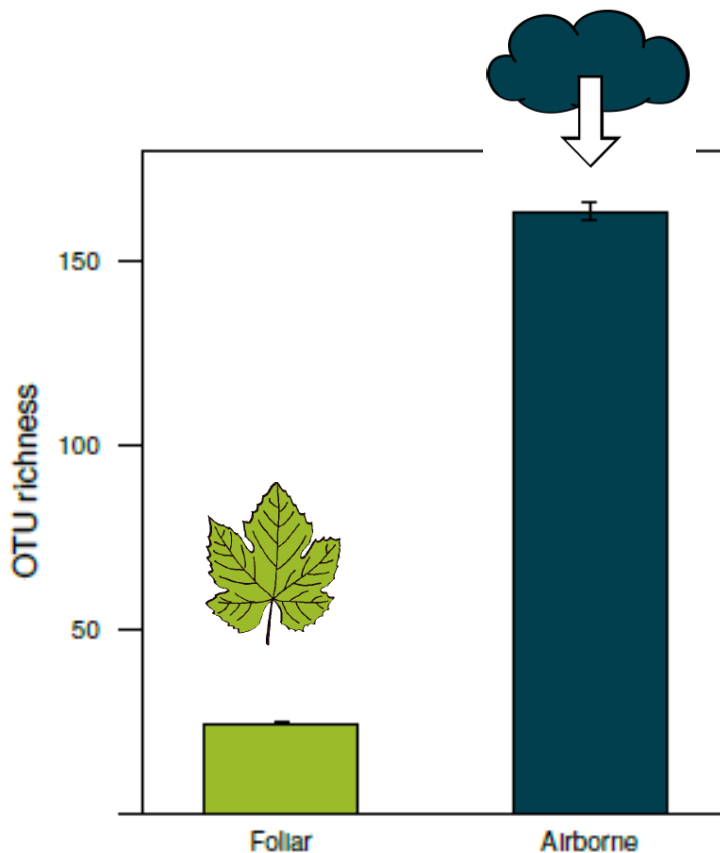
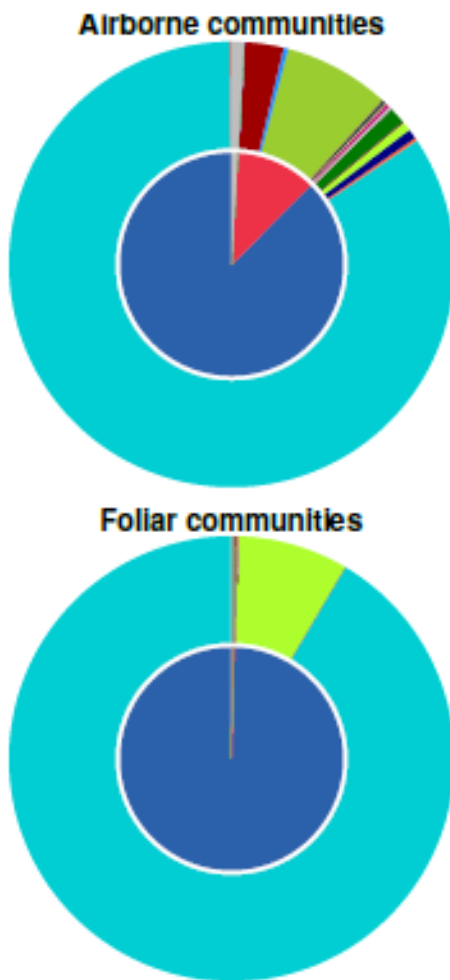
Tristan CORDIER^{a,b,*}, Cécile ROBIN^{a,b}, Xavier CAPDEVIELLE^{a,b}, Marie-Laure DESPREZ-LOUSTAU^{a,b}, Corinne VACHER^{a,b}





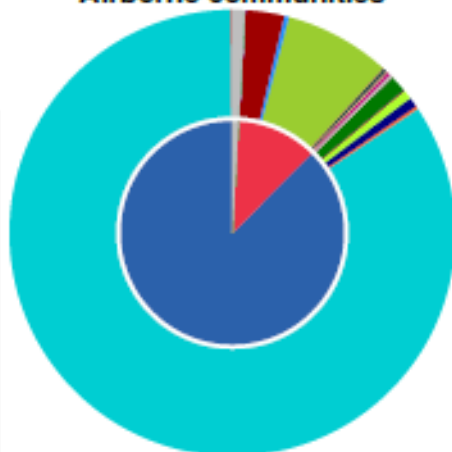


- Fungal divisions:**
- Ascomycota
 - Basidiomycota
 - Unassigned
- Ascomycota classes:**
- Arthoniomycetes
 - Dothideomycetes
 - Eurotiomycetes
 - Lecanoromycetes
 - Leotiomycetes
 - Sordariomycetes
 - Unassigned
- Basidiomycota classes:**
- Agaricomycetes
 - Cystobasidiomycetes
 - Exobasidiomycetes
 - Microbotryomycetes
 - Pucciniomycetes
 - Tremellomycetes
 - Unassigned

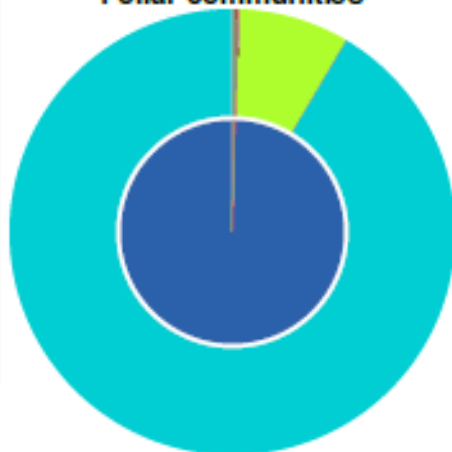




Airborne communities



Foliar communities



Fungal divisions:

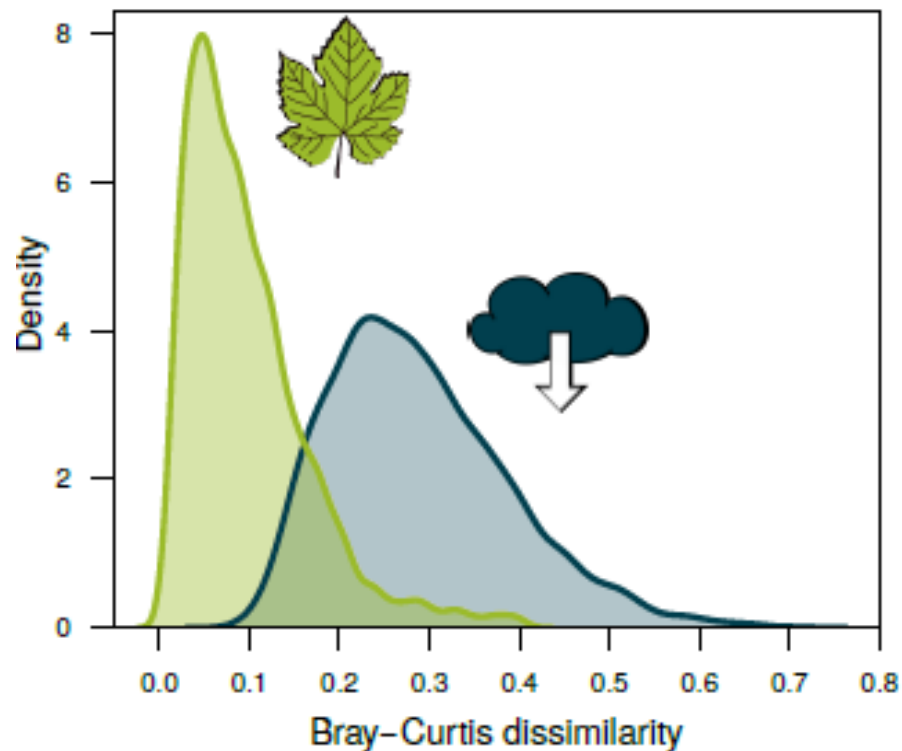
- Ascomycota
- Basidiomycota
- Unassigned

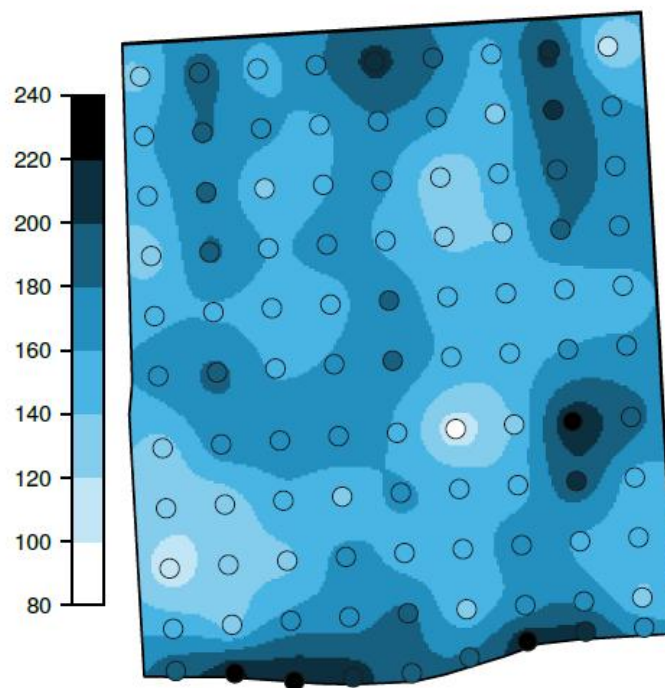
Ascomycota classes:

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Basidiomycota classes:

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- Tremellomycetes
- Unassigned

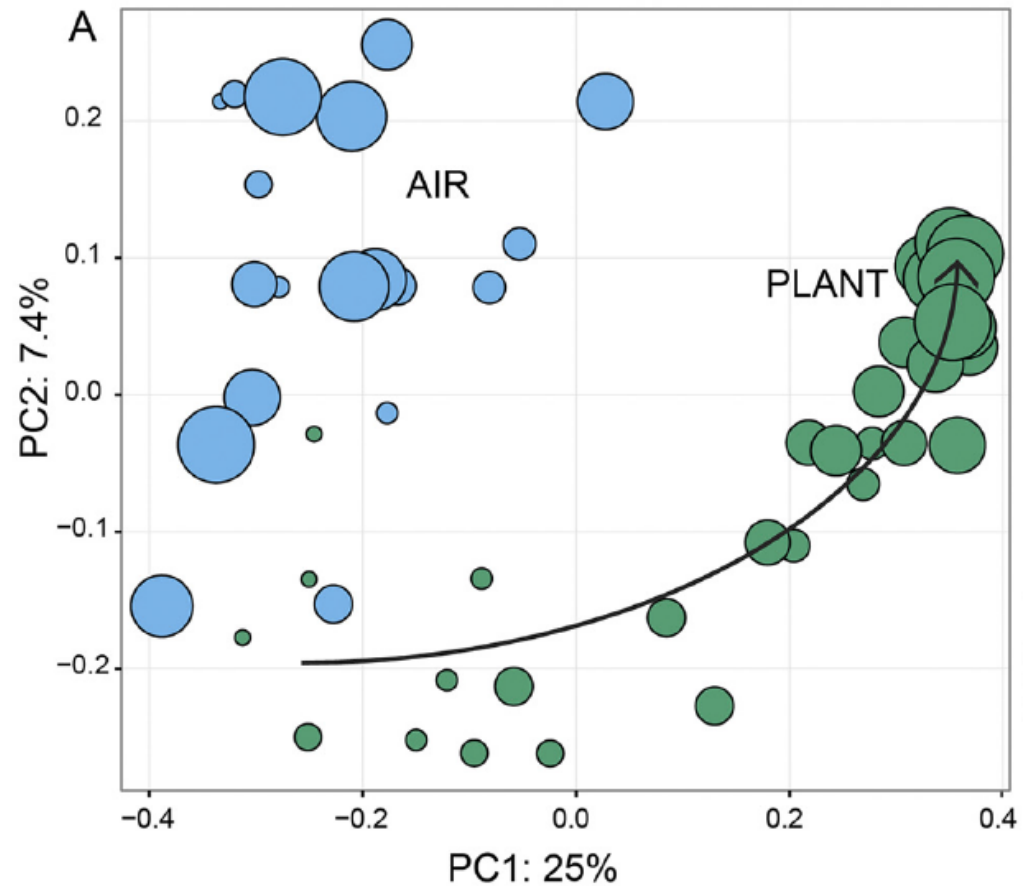




Demonstration of external selection in controlled conditions



Sterilized seeds
and soil



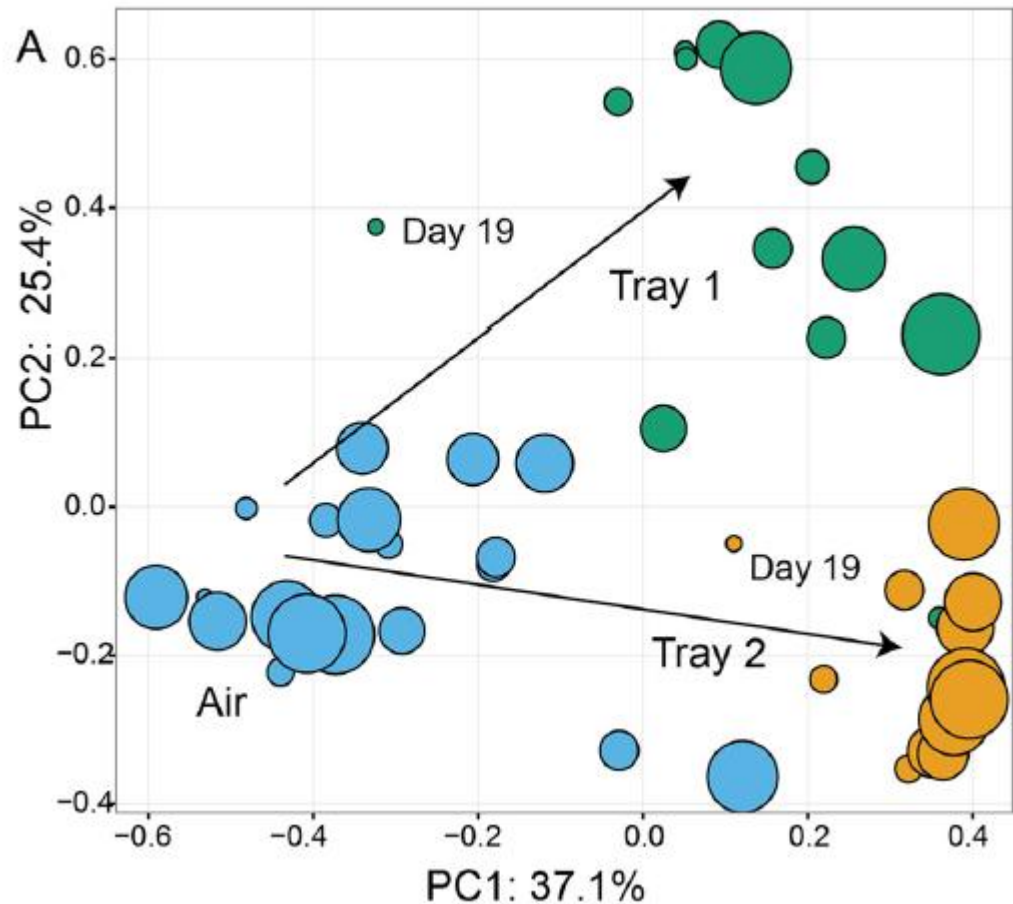
Maignien et al. 2014

Evidence for ecological drift



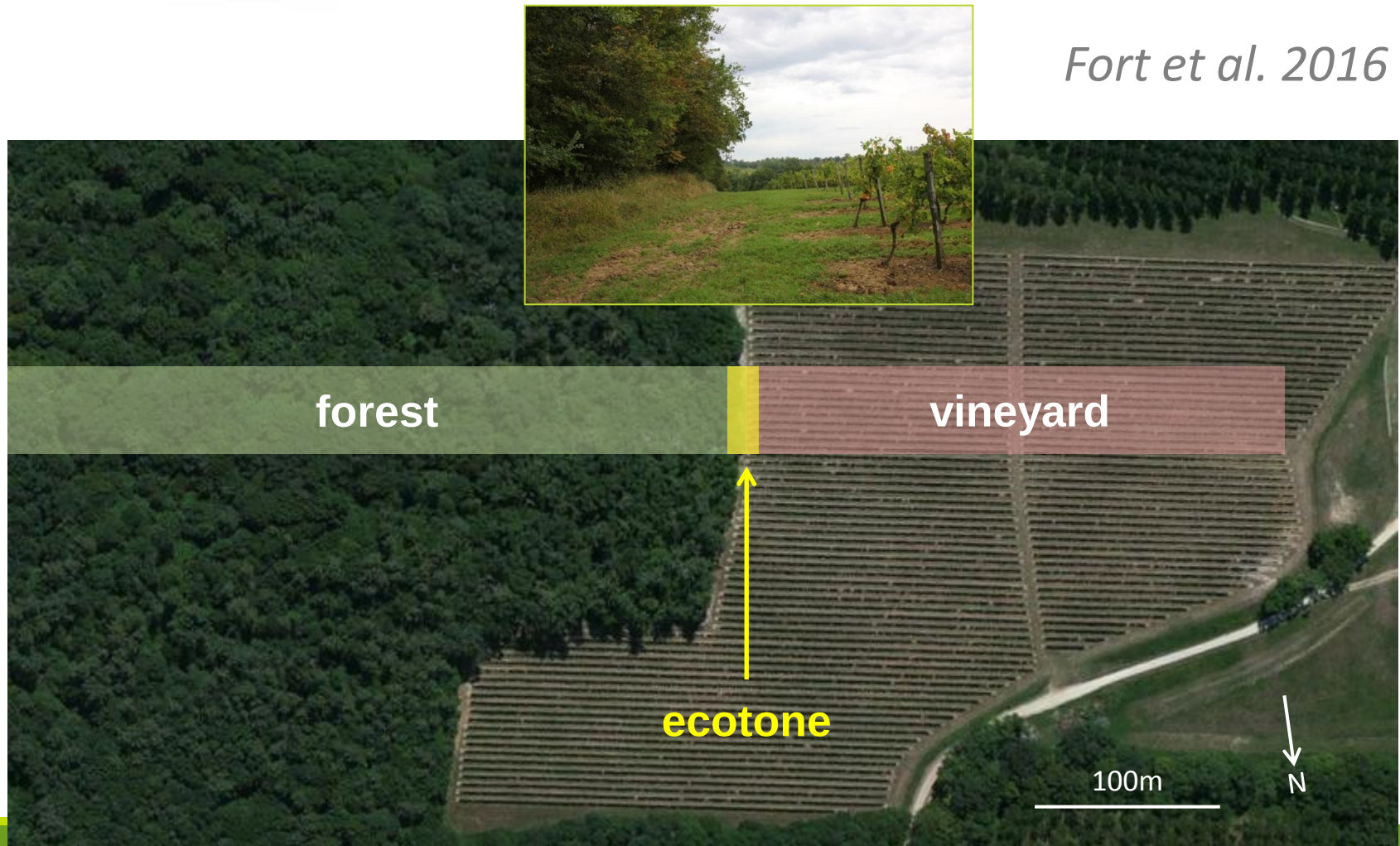
Stochasticity in
colonization
order and
priority effects

Maignien et al. 2014



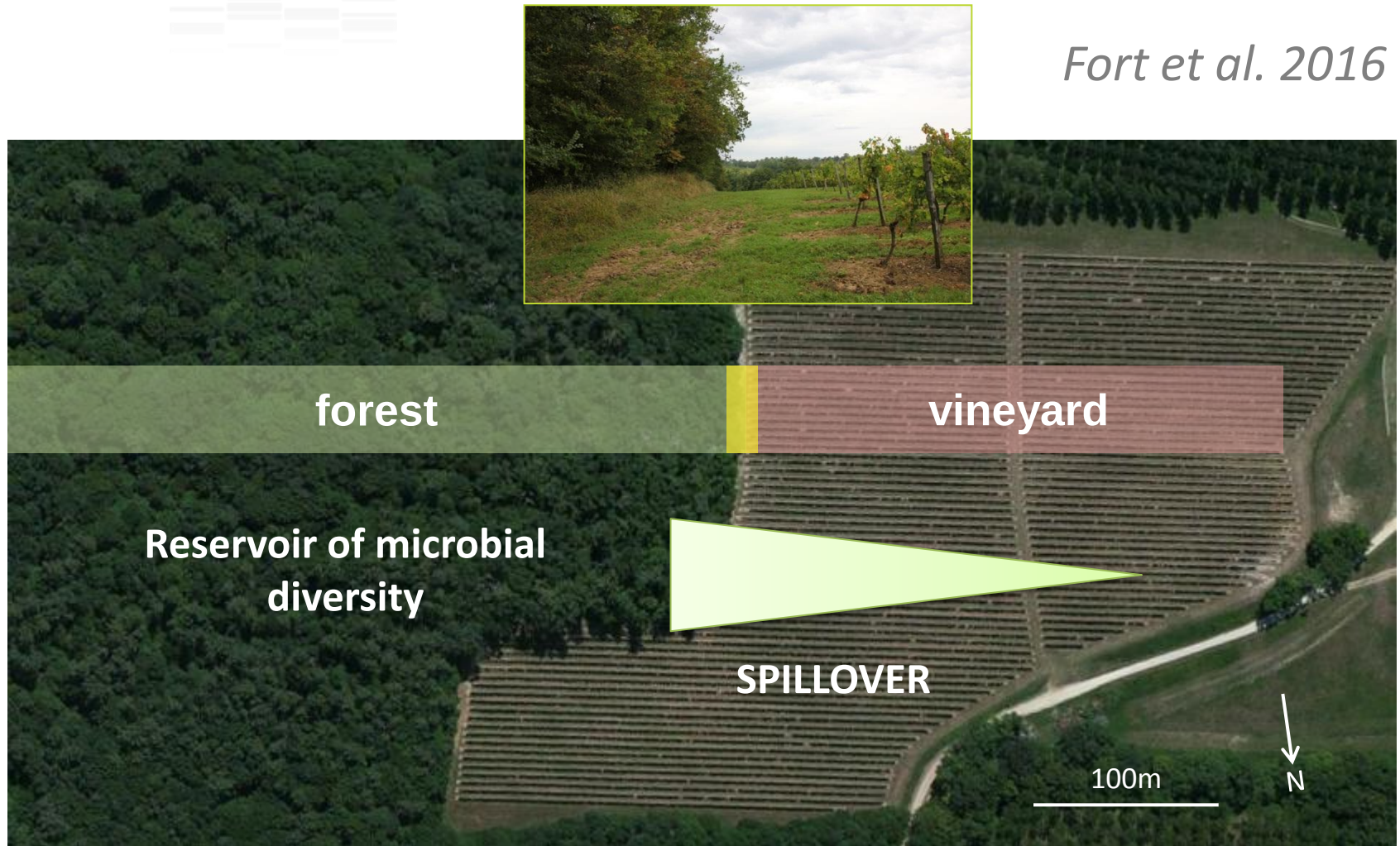
Demonstration of external selection in natural conditions

Fort et al. 2016

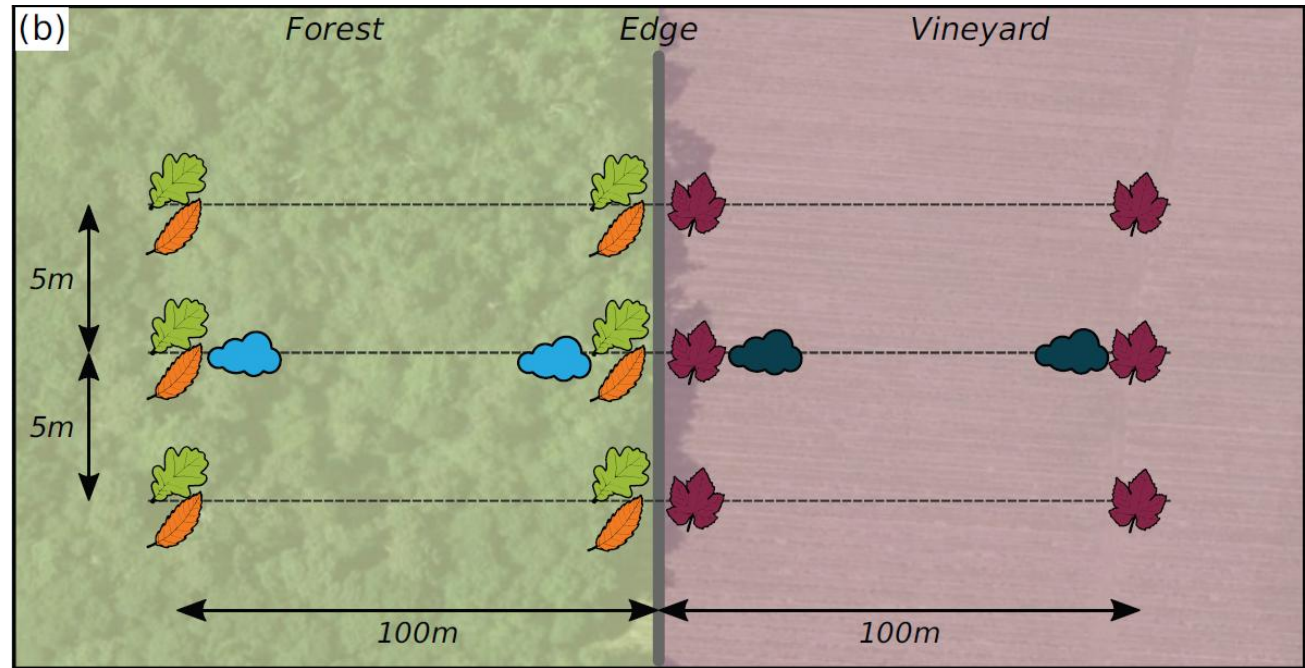


Hypothesis

Fort et al. 2016

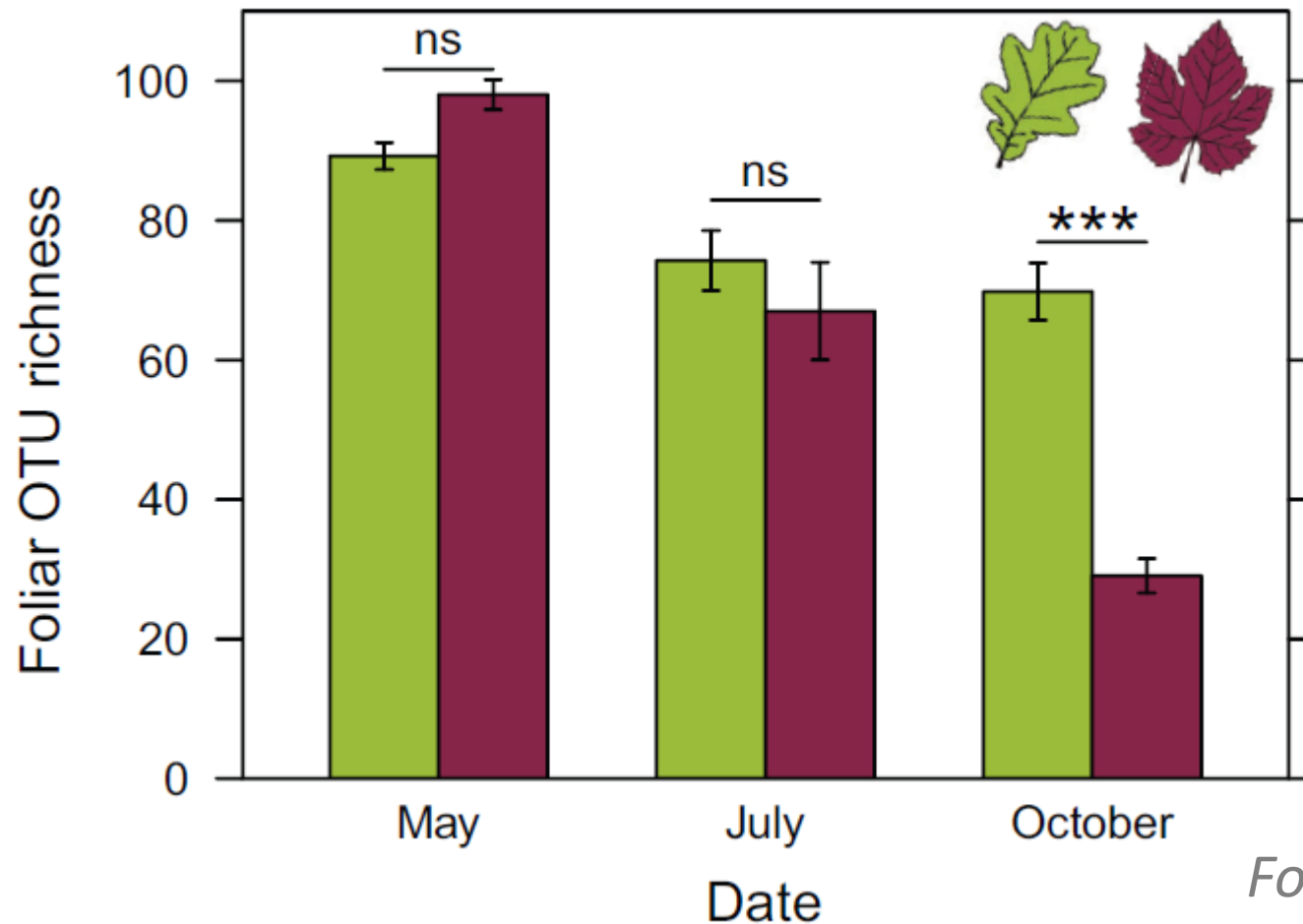


Sampling of airborne and phyllosphere microbial communities



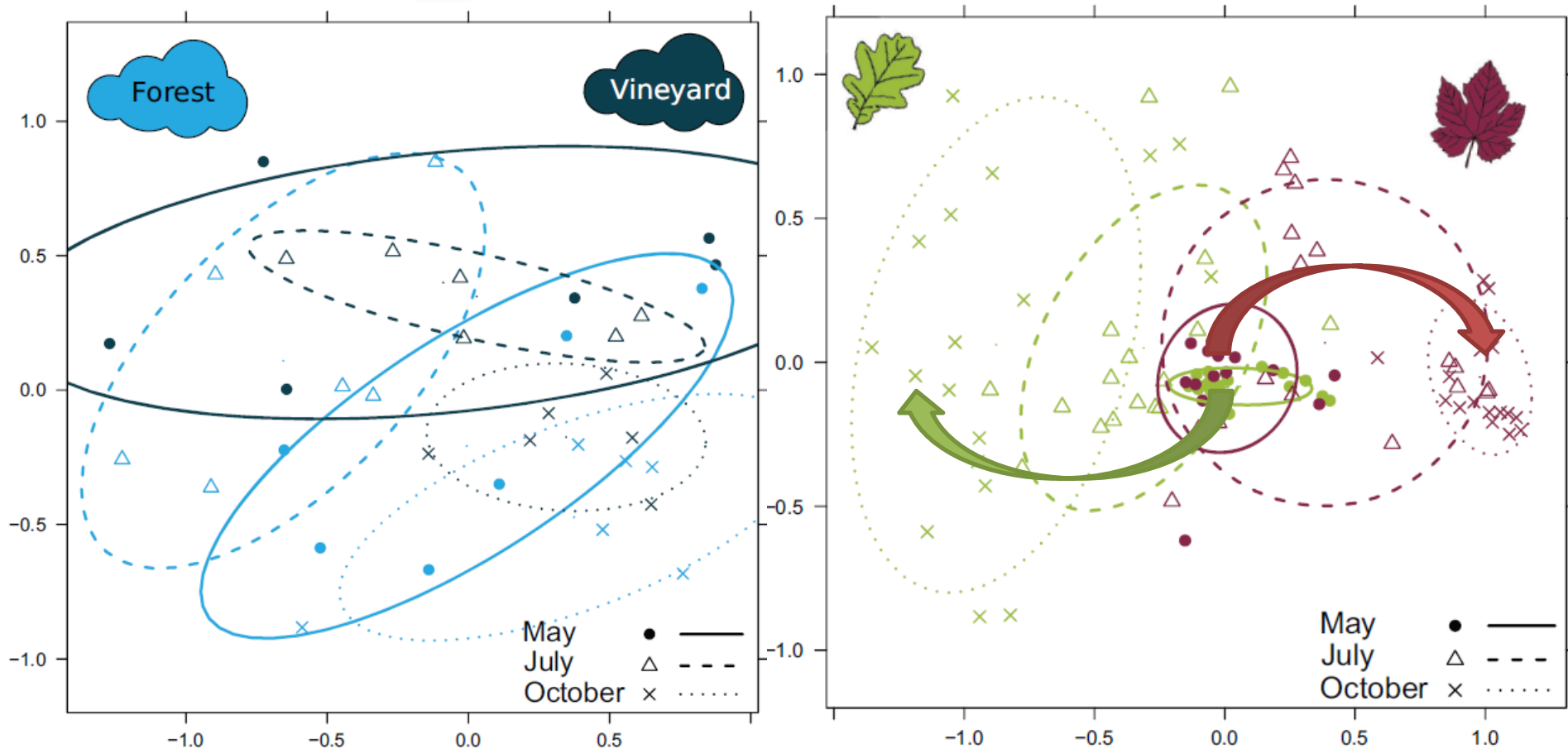
Fort et al. 2016

Forest patches are not a reservoir of microbial diversity



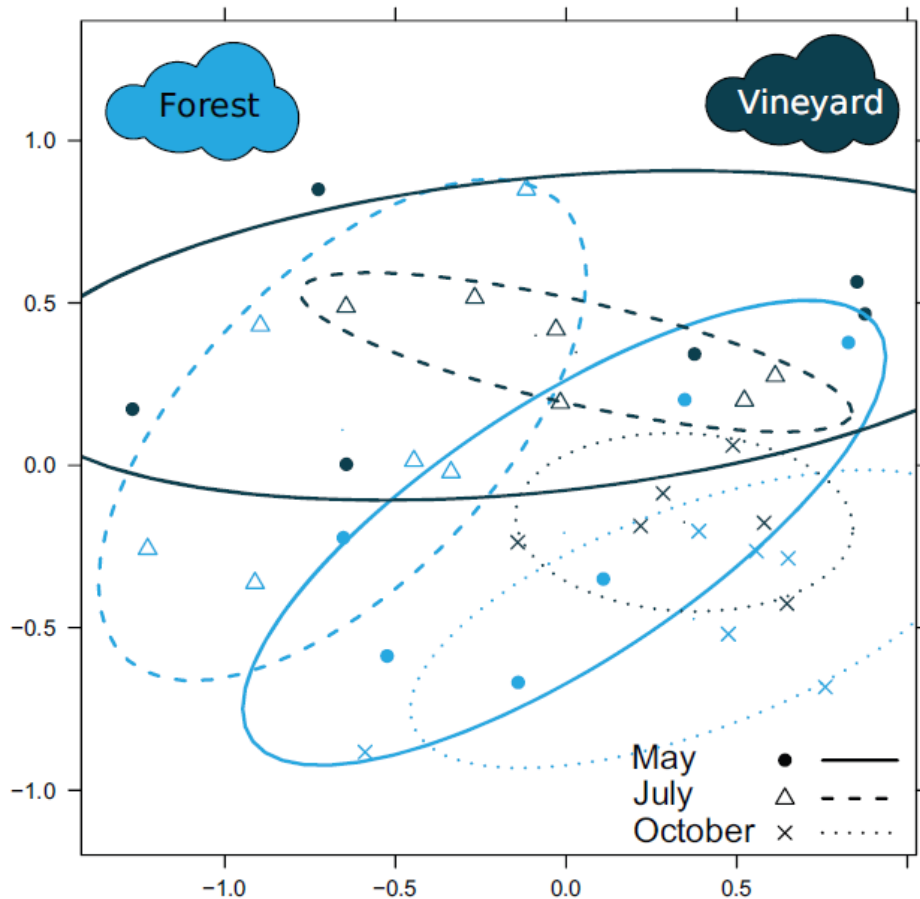
Fort et al. 2016

Airborne and phyllosphere communities have different dynamics



Fort et al. 2016

Airborne and phyllosphere communities have different dynamics

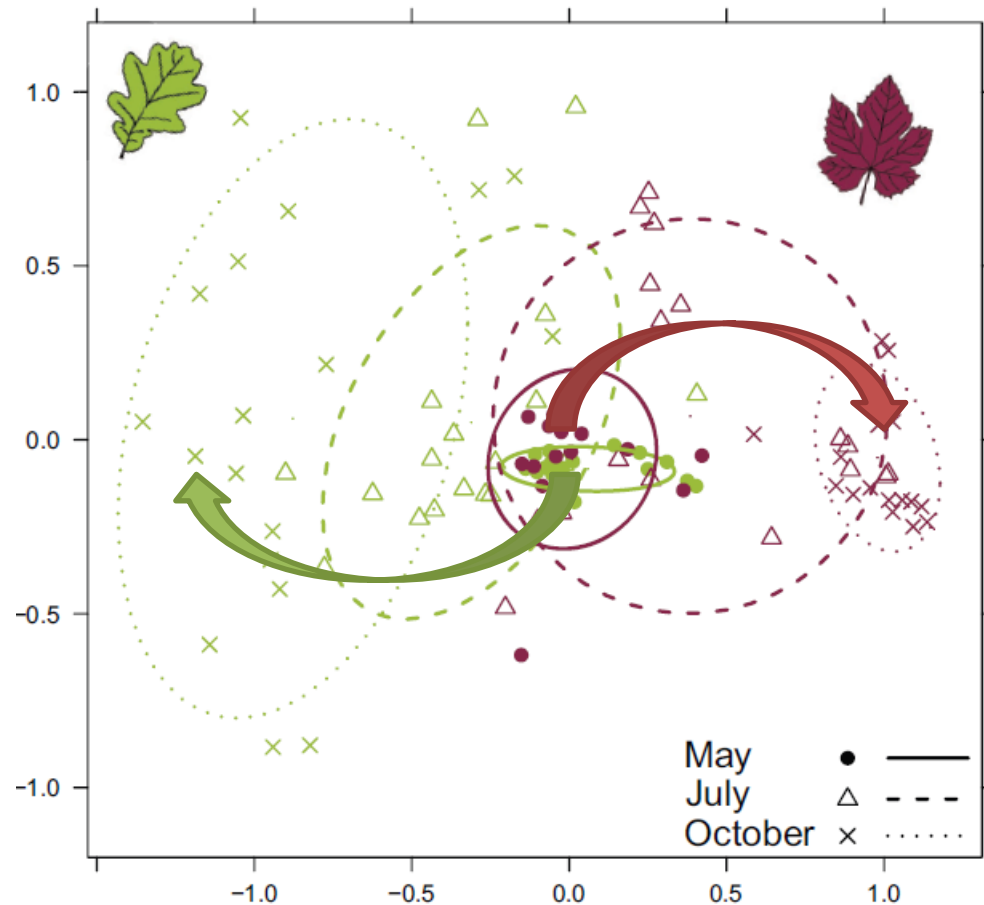


Airborne communities do not differ between habitats and are quite stable through time.

Fort et al. 2016

Airborne and phyllosphere communities have different dynamics

Phyllosphere communities of oak and grapevine have divergent trajectories



Fort et al. 2016