



# Fine-scale partitioning among plant roots and soil fungi associated with changes in mycorrhizal dominance

Alexis Carteron  
15/09/2021



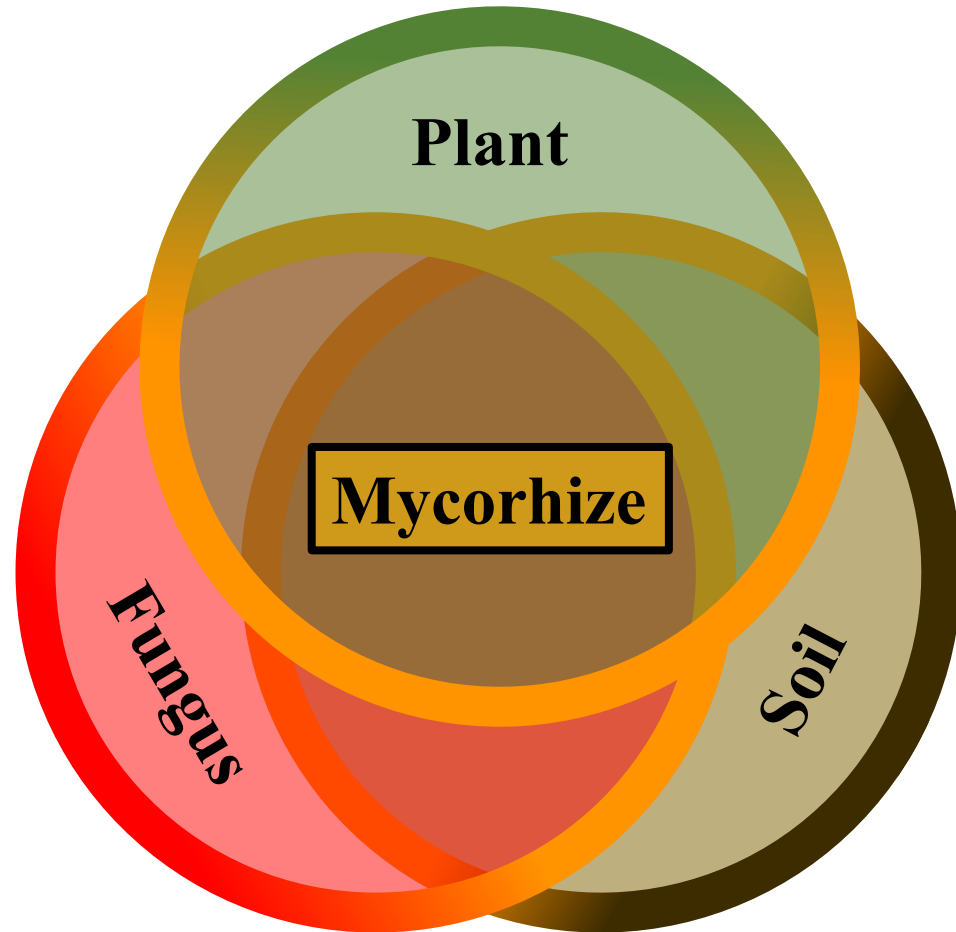
UNIVERSITÀ  
DEGLI STUDI  
DI MILANO

# Outline of my endeavor into “microbial” ecology



- Introduction on my study system and the ecological research question
- Navigating the labyrinth of eDNA metabarcoding and its challenges
  - ☐ Challenge #1
  - ☐ Challenge #2
  - ☐ Challenge #3
  - ☐ Challenge #4
  - ☐ Challenge #...
- Results!

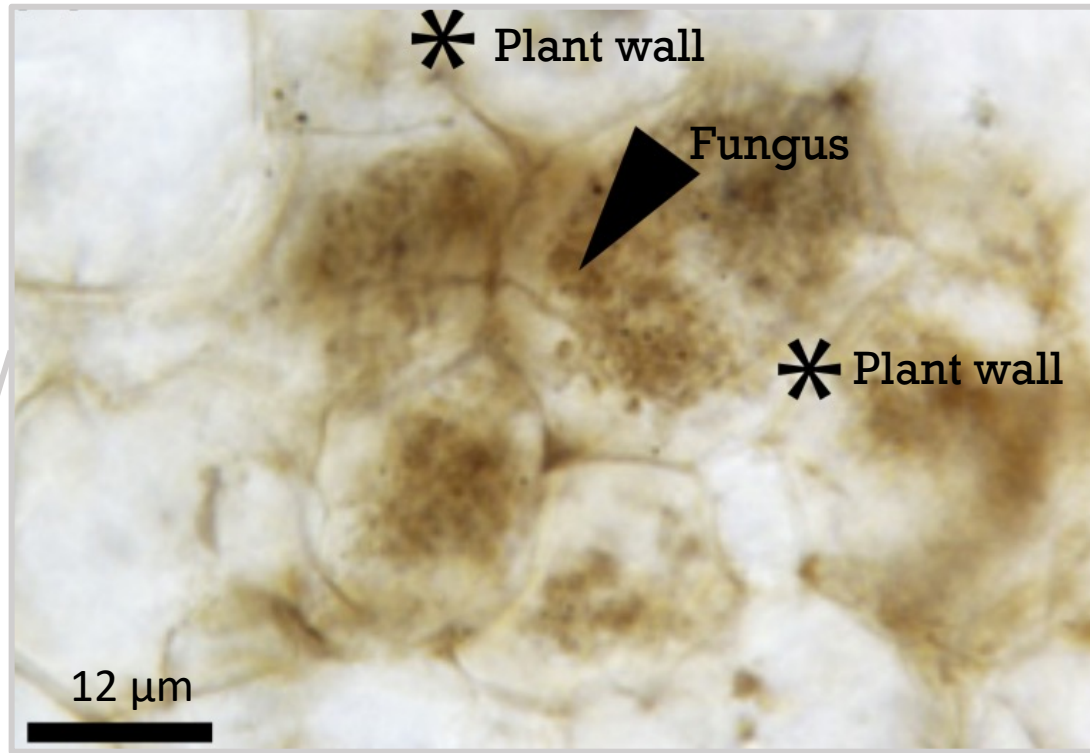
# What about mycorrhizae?



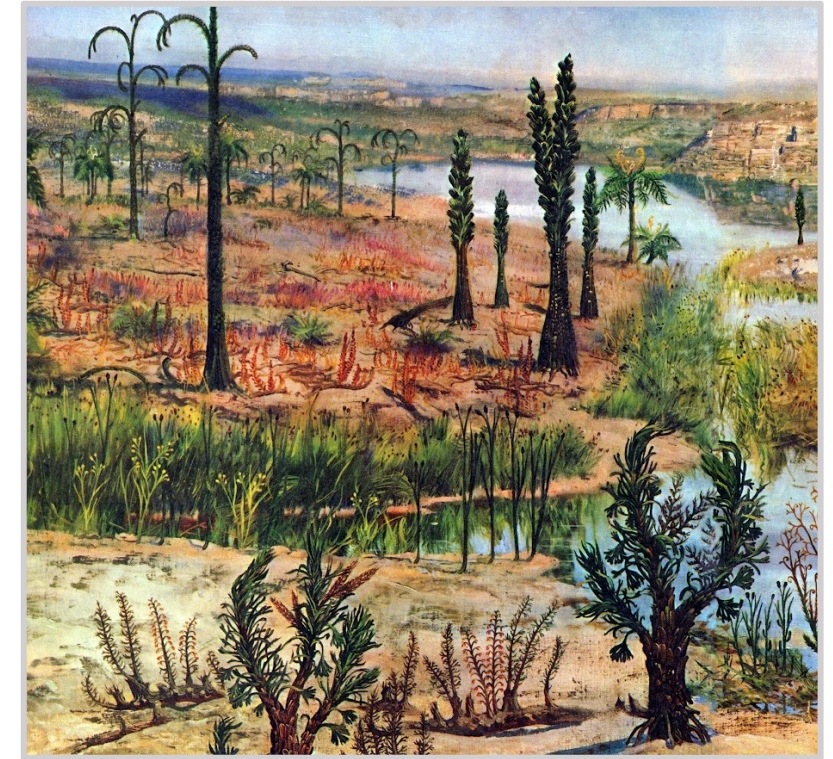
D. Read



# What about mycorrhizae?



H. Kerp

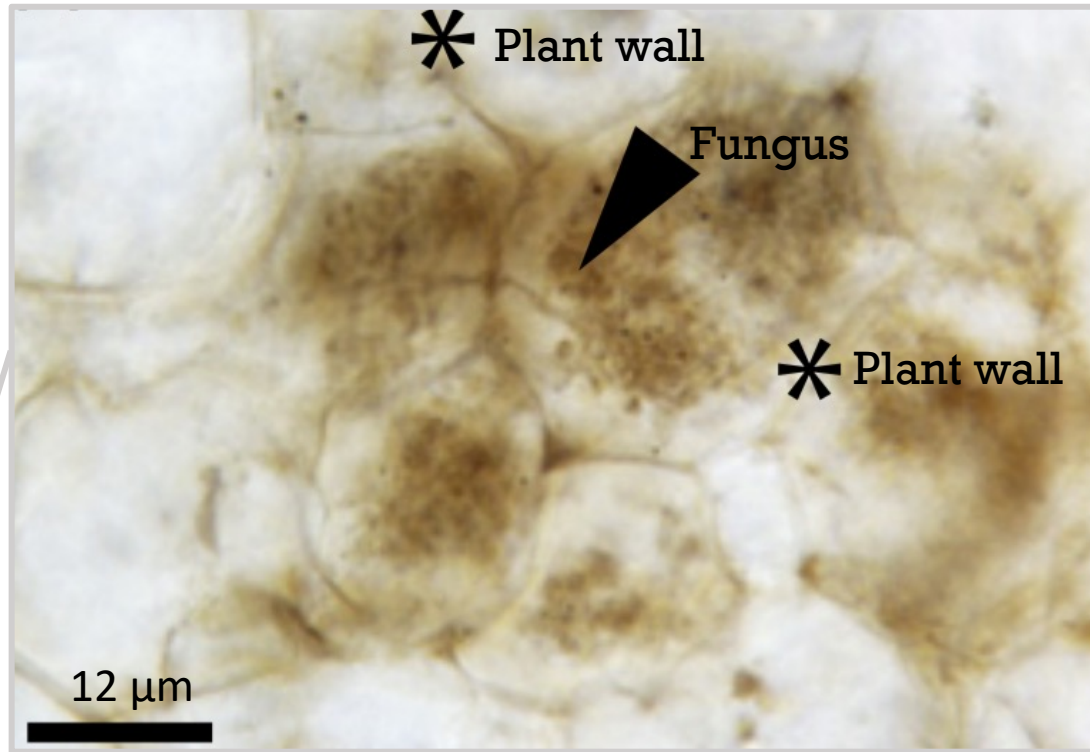


Z. Burian

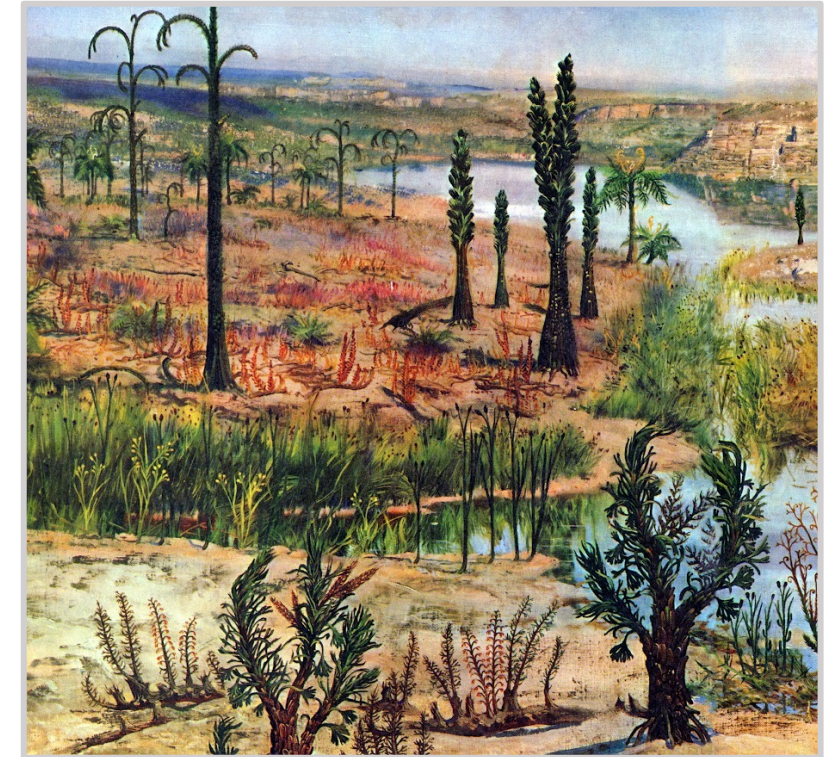
- Fossil of a 400 million year old mycorrhizal root (Taylor et al. 1995 *Mycologia*)



# What about mycorrhizae?



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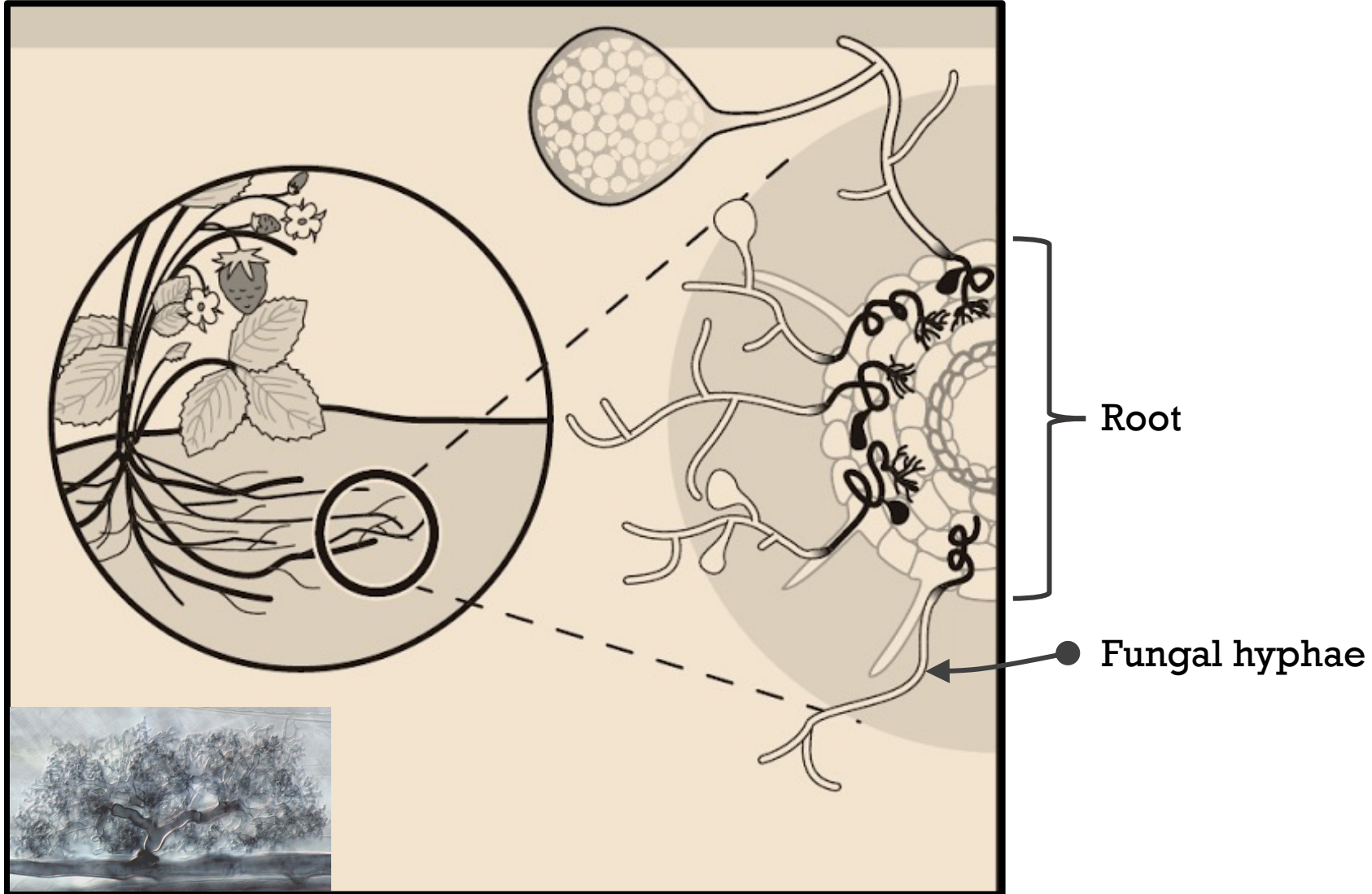
■ Fossil of a 400 million year old mycorrhizal root (Taylor et al. 1995 *Mycologia*)

« The symbiosis that made life on land. »

(Sélosse 2020, *Pour la Science*)

## Arbuscular Mycorrhiza (AM)

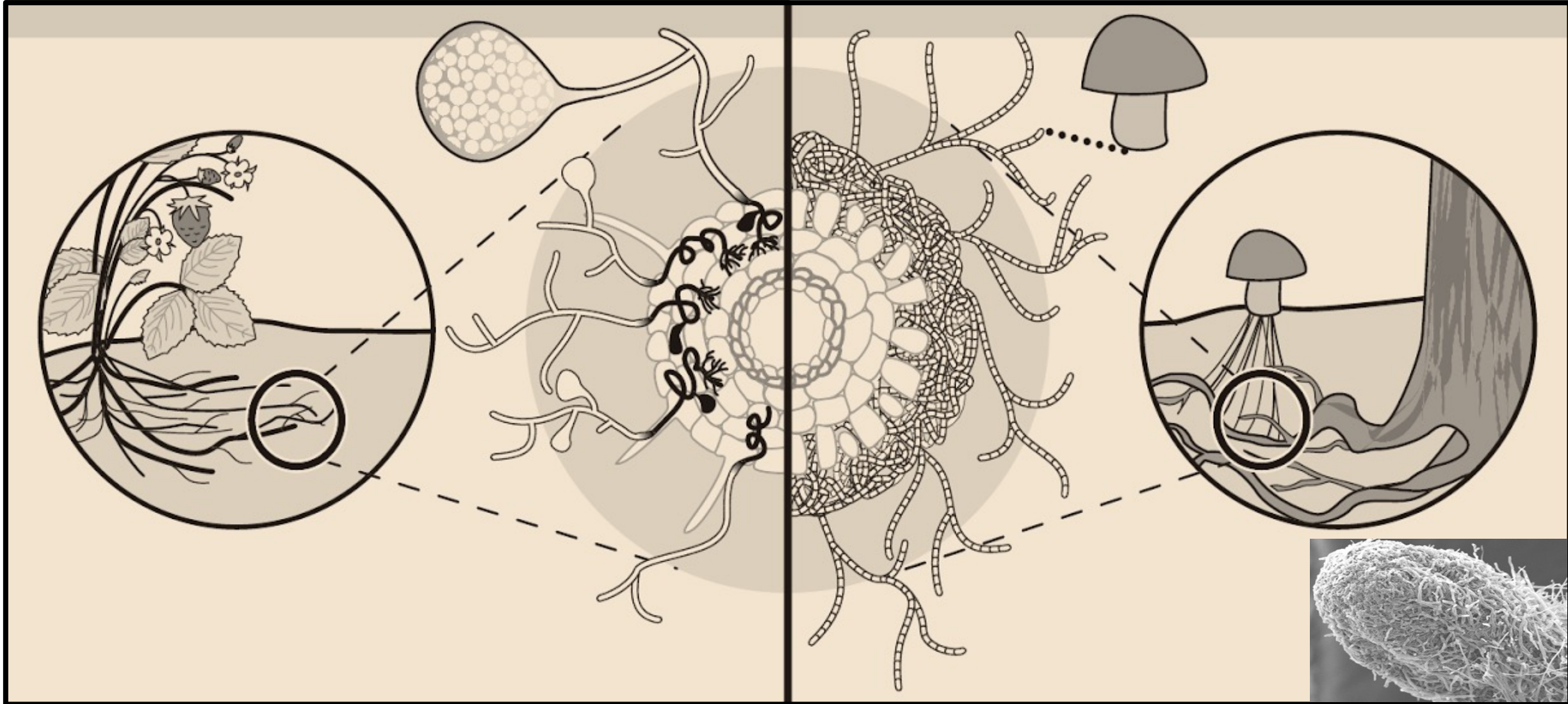
## Ectomycorrhiza (EcM)



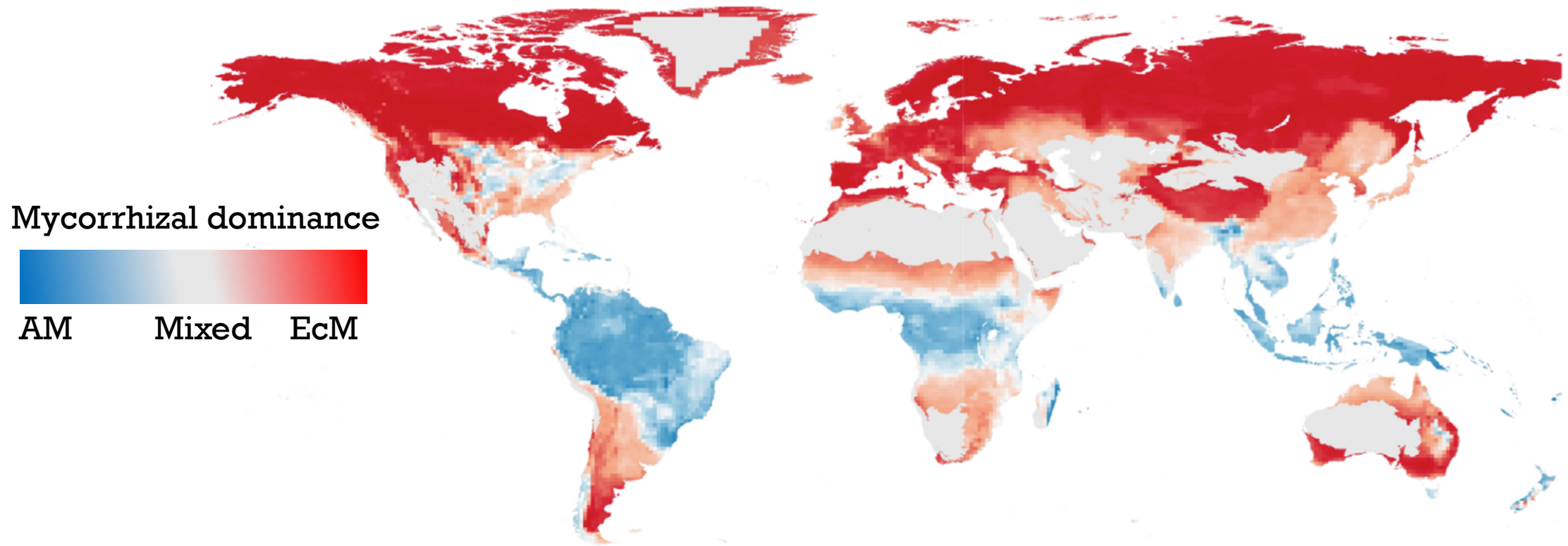


## Arbuscular Mycorrhiza (AM)

## Ectomycorrhiza (EcM)



# Mycorrhizal distribution



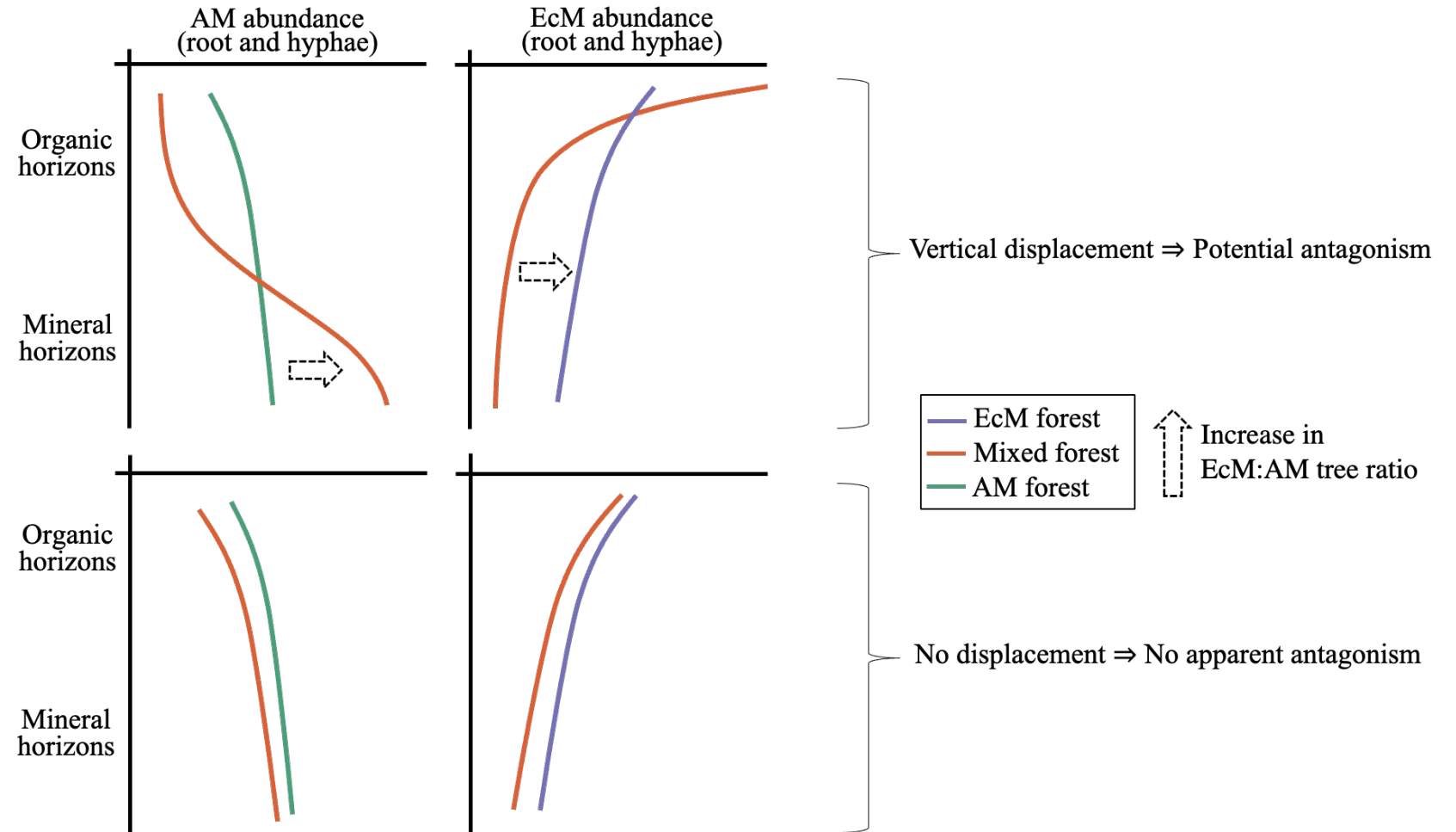
- From this distribution pattern it has been hypothesized that AM and EcM symbiosis have **antagonist relationships** (Smith & Read, 2008 *Mycorrhizal symbiosis*; Tedersoo et al. 2020 *Science*)





# Main hypothesis to be tested

## Antagonism between AM and EcM symbioses within the soil profile





# Main hypothesis to be tested

## **Antagonism between AM and EcM symbioses within the soil profile**

1. Mycorrhizal abundance can be divided into 3 individual components (Soudzilovskaia et al., 2017

*Biogeography of mycorrhizal symbiosis*):

- ☐ The intensity of root colonization by fungal symbionts
- ☐ The abundance of extra-radical fungal hyphae of fungal symbionts
- ☐ The abundance of fine roots of plant symbionts

Solution?



# Navigating the labyrinth

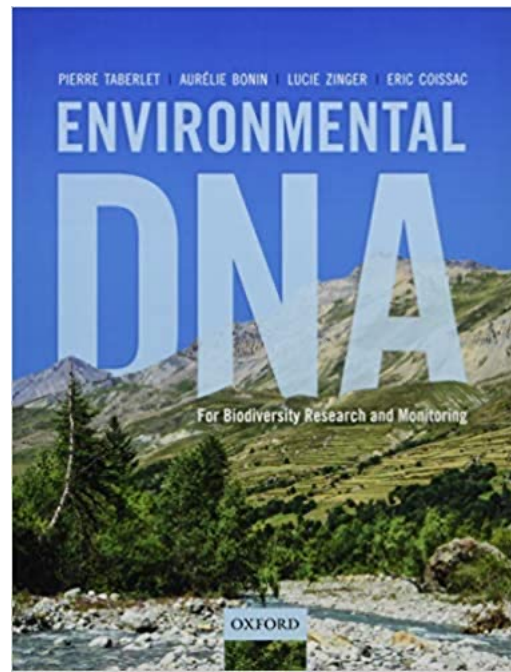
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## *Methods*

### Navigating the labyrinth: a guide to sequence-based, community ecology of arbuscular mycorrhizal fungi

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Miranda M. Hart<sup>1</sup>, Kristin Aleklett<sup>1</sup>, Pierre-Luc Chagnon<sup>2</sup>, Cameron Egan<sup>1</sup>, Stefano Ghignone<sup>3</sup>, Thorunn Helgason<sup>4</sup>, Ylva Lekberg<sup>5</sup>, Maarja Öpik<sup>6</sup>, Brian J. Pickles<sup>1</sup> and Lauren Waller<sup>7</sup>



# Navigating the labyrinth



## **Challenge #1: Terminology**

OTU?

MOTU?

ZOTU?

ASV?

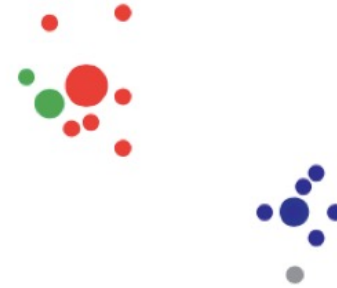


# Navigating the labyrinth

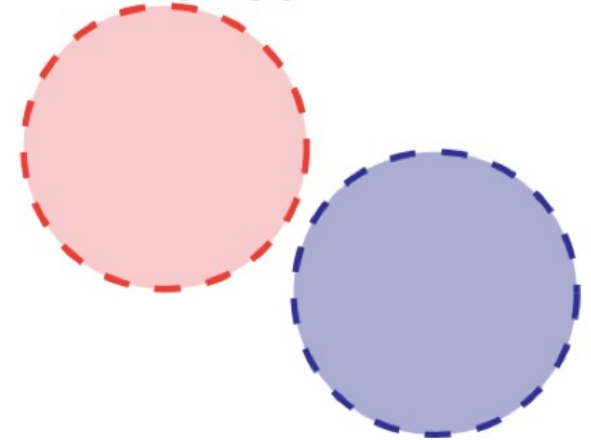
## Challenge #1: Terminology

OTU?  
MOTU?  
ZOTU?  
ASV?

amplicon reads



OTUs



# Navigating the labyrinth

## Challenge #1: Terminology

**OTU** = Operational Taxonomic Units

**MOTU** = Molecular OTU

**ZOTU** = zero-radius OTU

**ASV** = Amplicon sequence variants

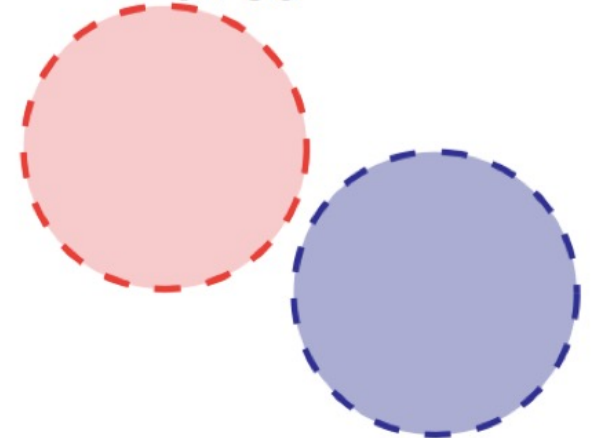
Oligotypes, ESV, etc.

- Not a synonym of species
- Can corresponds to different approaches

amplicon reads



OTUs



# Navigating the labyrinth

## Challenge #1: Terminology

**OTU** = Operational Taxonomic Units

**MOTU** = Molecular OTU

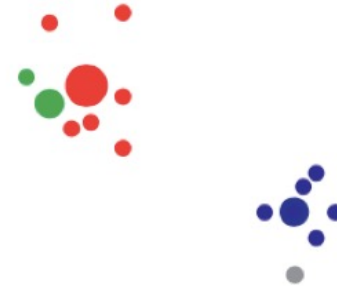
**ZOTU** = zero-radius OTU

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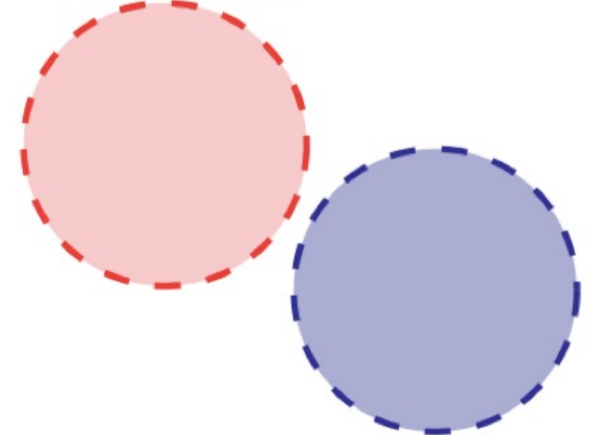
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amplicon reads



OTUs



## Challenge #2: Which sequencing platform?

- Illumina MiSeq 2 x 300 bp



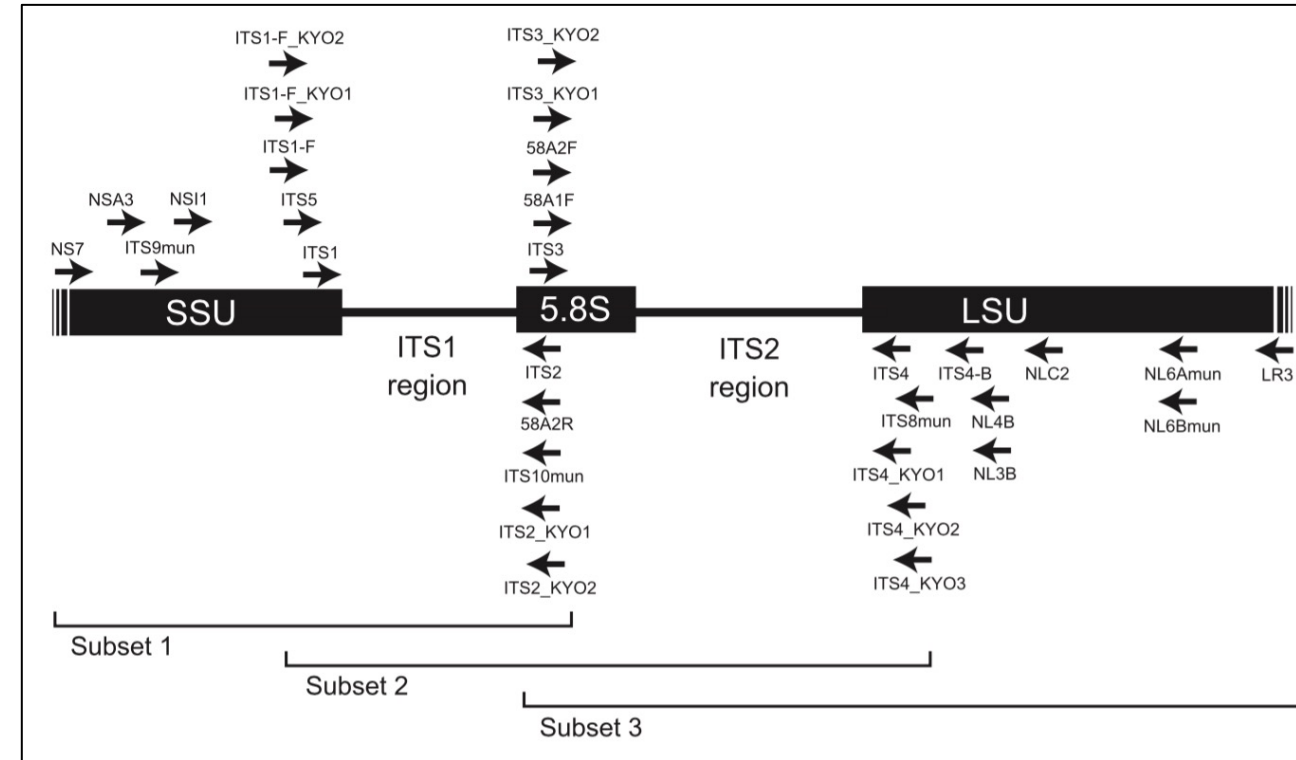
# Navigating the labyrinth

## Challenge #3: Choice of primers/markers

For general fungal amplification:

→ ITS3\_KYO2: GATGAAGAACGYAGYRAA  
position 2029–2046

← ITS4: TCCTCCGCTTATTGATATGC  
position 2390–2409



(Toju et al. 2012 Plos One)

# Navigating the labyrinth

## Challenge #3: Choice of primers/markers

For general fungal amplification:

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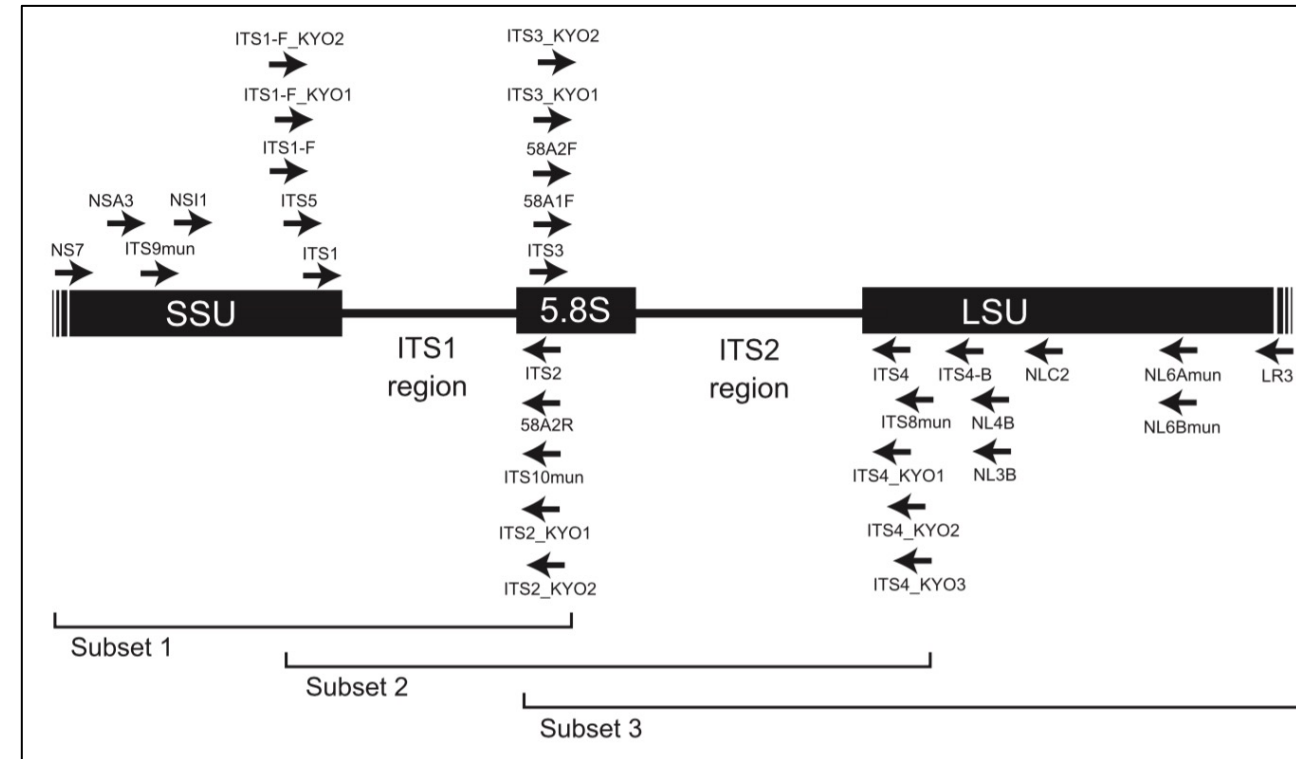
← ITS4: TCCTCCGCTTATTGATATGC  
position 2390–2409

For Glomeromycetes:

LSU: nested PCR with SSUmAf-LSUmAr  
then LSUD2f-CS1-LSUmBr-CS2

For plants:

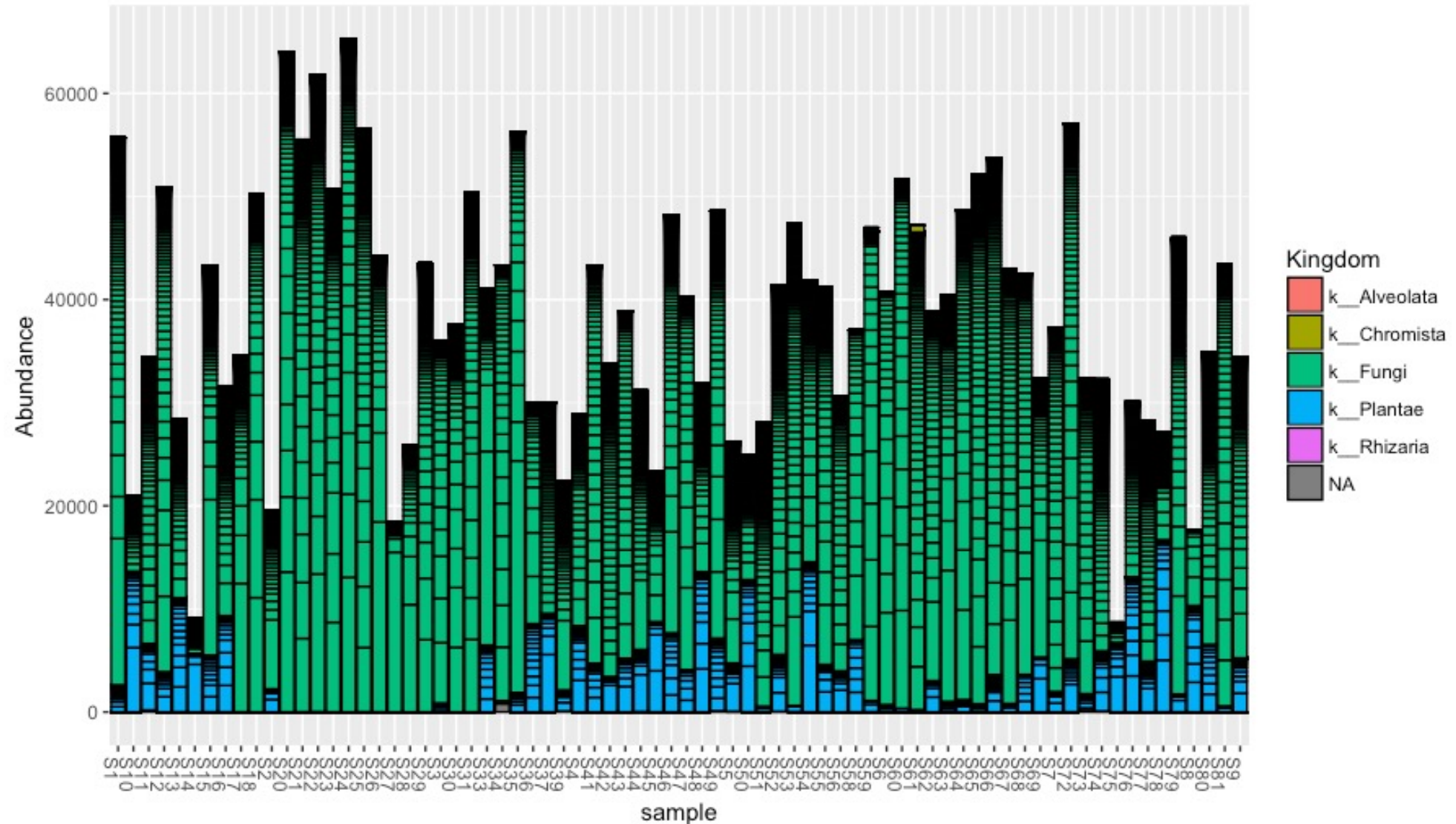
Large subunit of RuBisCO: rbcLa\_f-rbcLa\_r



(Toju et al. 2012 Plos One)

# Choice of primers: Primer specificity

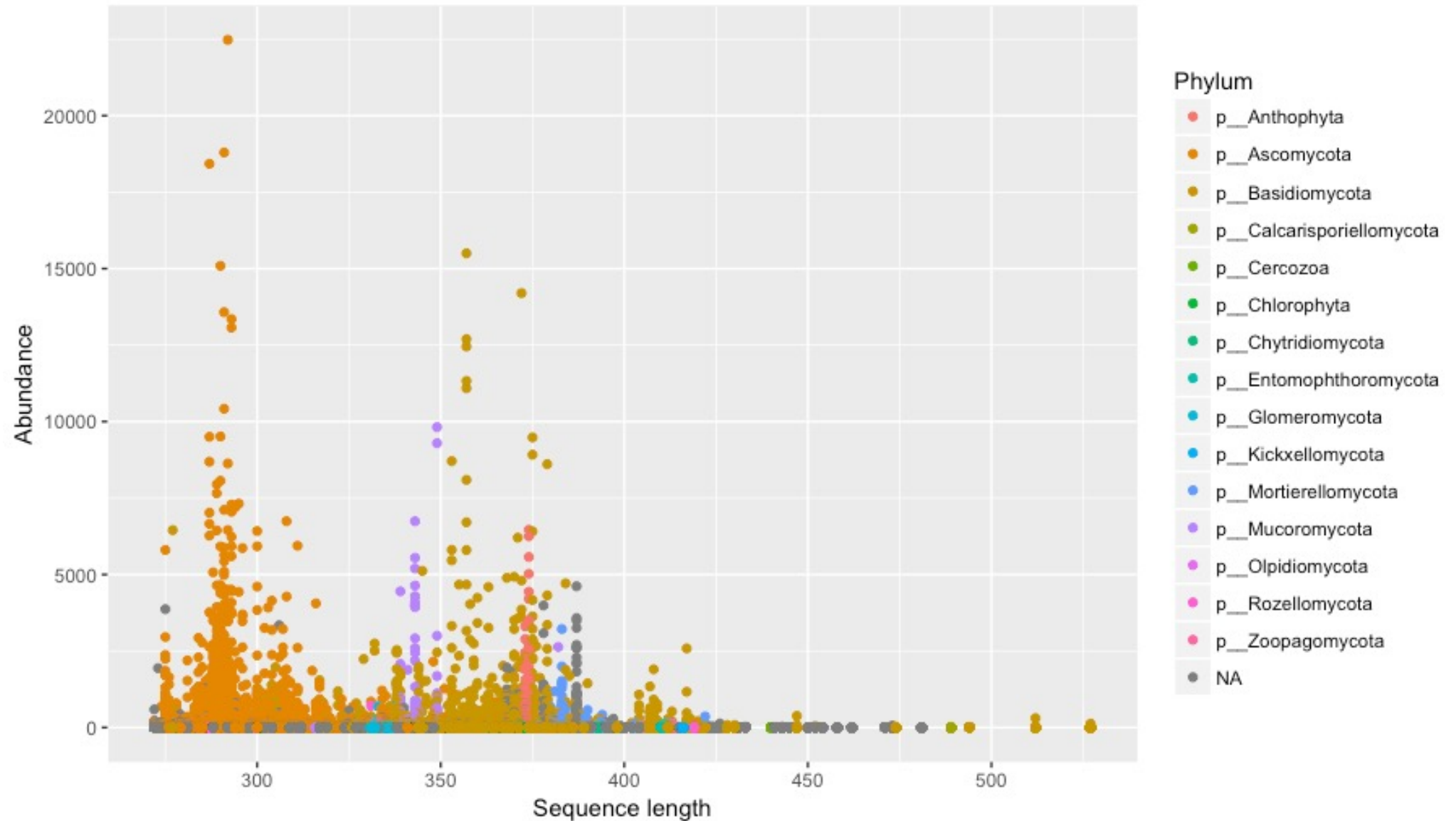
Example for fungal ITS





# Choice of primers: Expected sequence length

Example for fungal ITS



# Navigating the labyrinth

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## Challenge #4: Which pipeline?



<http://benjjneb.github.io/dada2/tutorial.html>

Callahan et al. 2016 *Nature Methods*

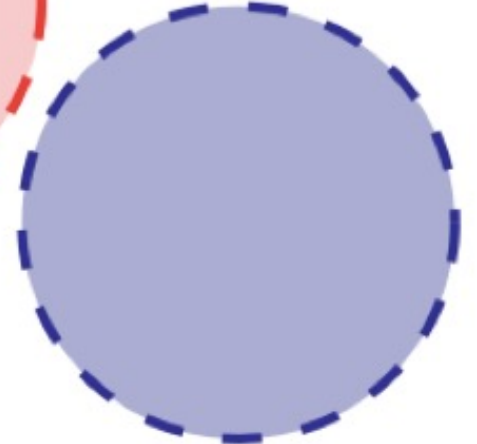
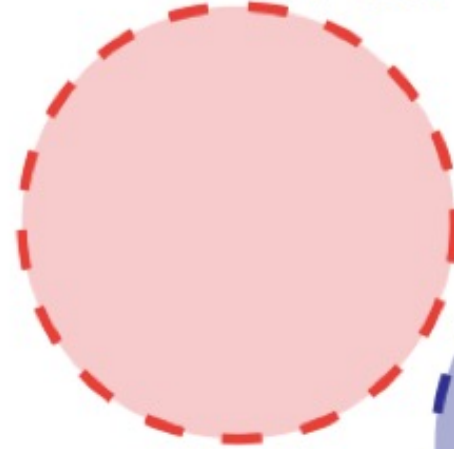
# Navigating the labyrinth

## The idea behind DADA2

amplicon reads



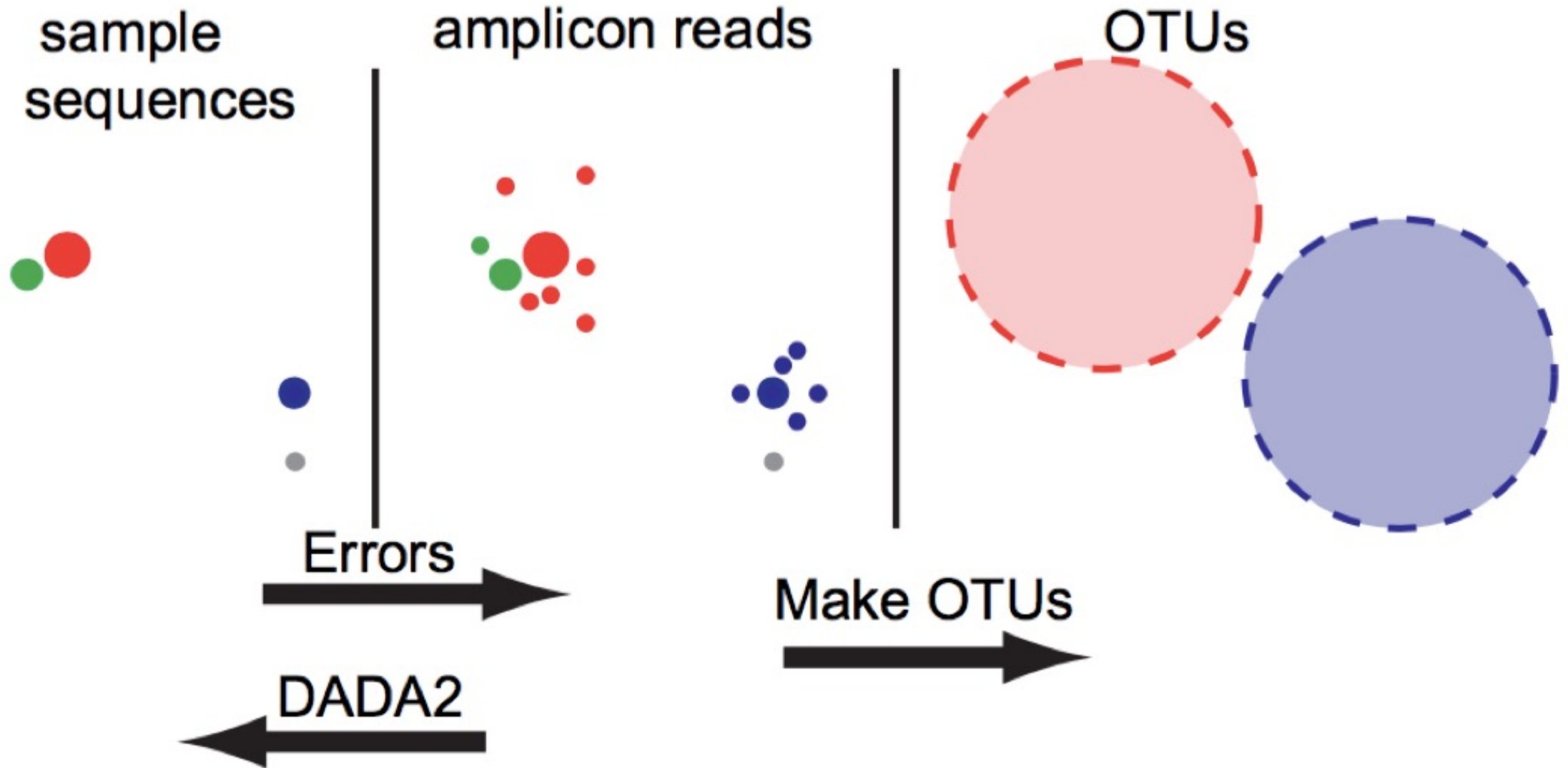
OTUs





# Navigating the labyrinth

## The idea behind DADA2



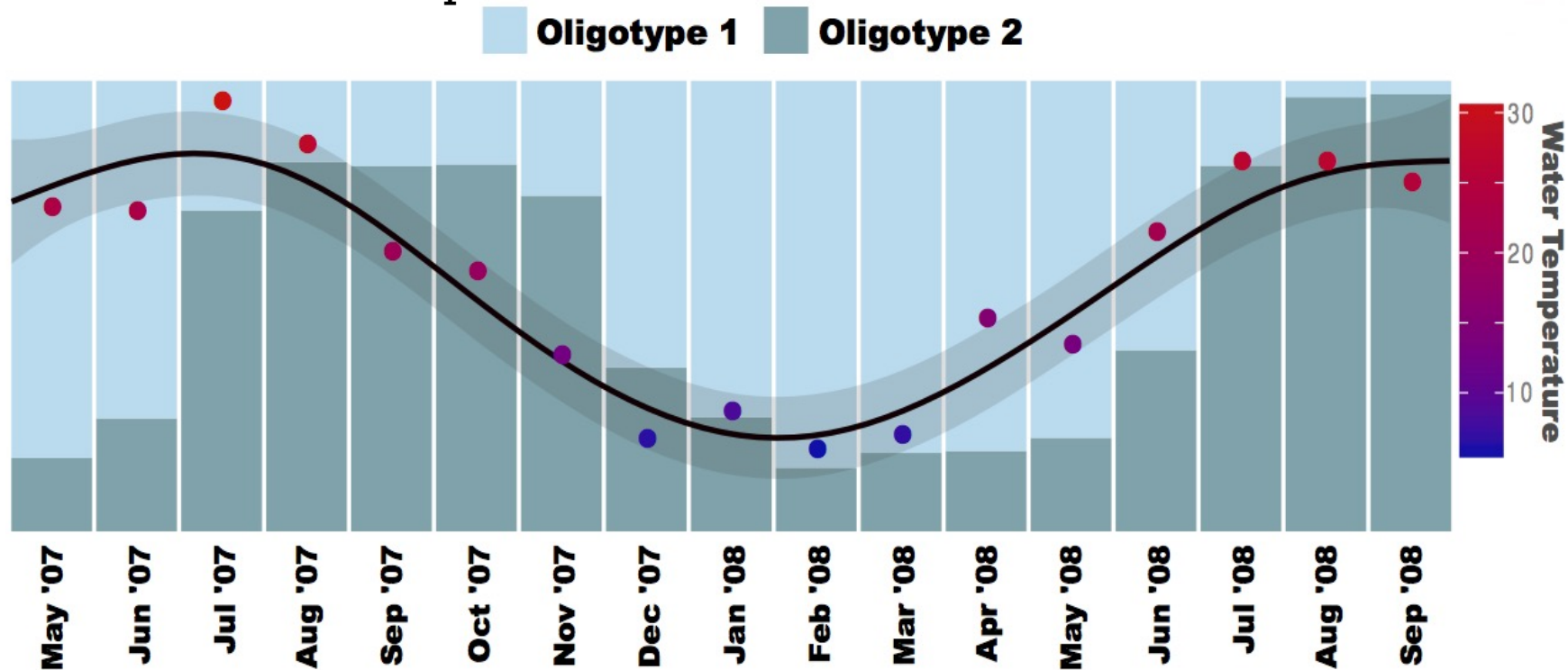
# Navigating the labyrinth

## Challenge #5: To cluster or not to cluster?

### In favor of NOT clustering:

#### ➤ Improved taxonomic resolution

e.g. differentiate between pathogenic and non-pathogenic lineages, discriminate between strains that have distinct environmental preferences



# Navigating the labyrinth



## **Challenge #5: To cluster or not to cluster?**

### **In favor of NOT clustering:**

#### ➤ **Improved taxonomic resolution**

e.g. differentiate between pathogenic and non-pathogenic lineages, discriminate between strains that have distinct environmental preferences

#### ➤ **ASVs as consistent labels**

A single sequence for all members of a variants

Sequences within each ASV are identical to one another.

Different datasets are more readily compared against one another.



# Navigating the labyrinth



## **Challenge #5: To cluster or not to cluster?**

### **In FAVOR of clustering:**

#### **➤ Intra-genomic heterogeneity**

Half of bacteria have more than one rRNA operon (Pei et al. 2010) with some bacteria having >10 rRNA operons in a single genome.

Fungi have high intra-isolate nucleotide variation

# Navigating the labyrinth

## Challenge #5: To cluster or not to cluster?

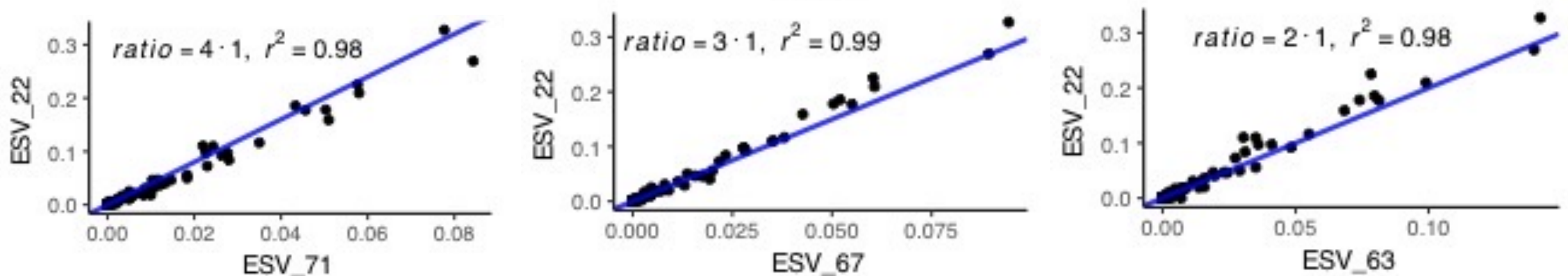
### In FAVOR of clustering:

#### ➤ Intra-genomic heterogeneity

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Fungi have high intra-isolate nucleotide variation

Solution? A single taxon split into multiple ASVs, abundance of those ASVs would be highly correlated



# Navigating the labyrinth



## **Challenge #5: To cluster or not to cluster?**

### **In FAVOR of clustering:**

➤ **Intra-genomic heterogeneity**

➤ **Too much diversity**

But not always true

Solution? Possible to cluster afterward

➤ **Sensitivity to data quality**

Discriminate between PCR or sequencing errors and 'real' biological variation

Solution? Error modeling...





### ➤ **Core “denoising” algorithm**

Model the errors in Illumina-sequenced amplicon reads

Quantifies the rate at which an amplicon read is produced from a sample sequence as a function of sequence composition and quality

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Model the errors in Illumina-sequenced amplicon reads

Quantifies the rate at which an amplicon read is produced from a sample sequence as a function of sequence composition and quality

```
dadaFs <- dada(derepFs, err=errF, multithread=TRUE)
```

```
dadaRs <- dada(derepRs, err=errR, multithread=TRUE)
```

### ➤ The math behind

See Callahan et al. 2016 *Nature Methods*

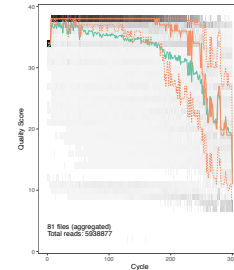
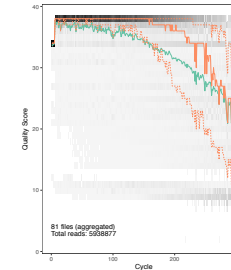
$$p_A(j \rightarrow i) = \frac{1}{1 - \rho_{\text{pois}}(n_j \lambda_{ji}, 0)} \sum_{a=a_i}^{\infty} \rho_{\text{pois}}(n_j \lambda_{ji}, a)$$

# DADA2 pipeline



```
library(dada2)
```

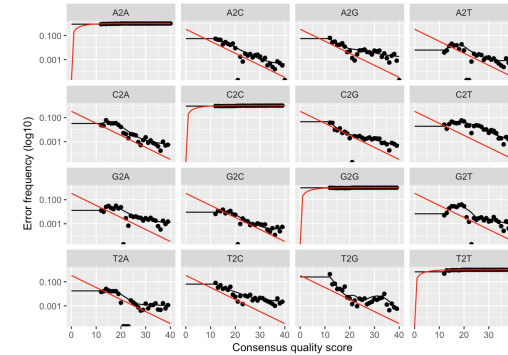
```
out <- filterAndTrim(fnFs, filtFs, fnRs, filtRs,  
                    maxN=0,  
                    truncLen = c(290,290),  
                    maxEE=c(3,3),  
                    truncQ=6,  
                    rm.phix=TRUE,  
                    trimLeft=c(18,20),  
                    compress=TRUE,  
                    multithread=TRUE)
```



# DADA2 pipeline



```
# Learning the error model from the data
errF <- learnErrors(filtFs)
errR <- learnErrors(filtRs)
```



```
# Inferring the sequence variants all the samples
dadaFs <- dada(derepFs,
               err=errF,
               pool=TRUE)
dadaRs <- dada(derepRs,
               err=errR,
               pool=TRUE)
```

It quantifies the rate at which an amplicon read is produced from a sample sequence as a function of sequence composition and quality



# DADA2 pipeline



# Merging

```
mergers <- mergePairs(dadaFs, derepFs, dadaRs, derepRs,  
                      minOverlap = 12,  
                      maxMismatch = 0,  
                      returnRejects = FALSE,  
                      propagateCol = character(0),  
                      justConcatenate = FALSE,  
                      trimOverhang = FALSE)
```

# Construct sequence table

```
seqtab <- makeSequenceTable(mergers)
```

# Removing chimeras

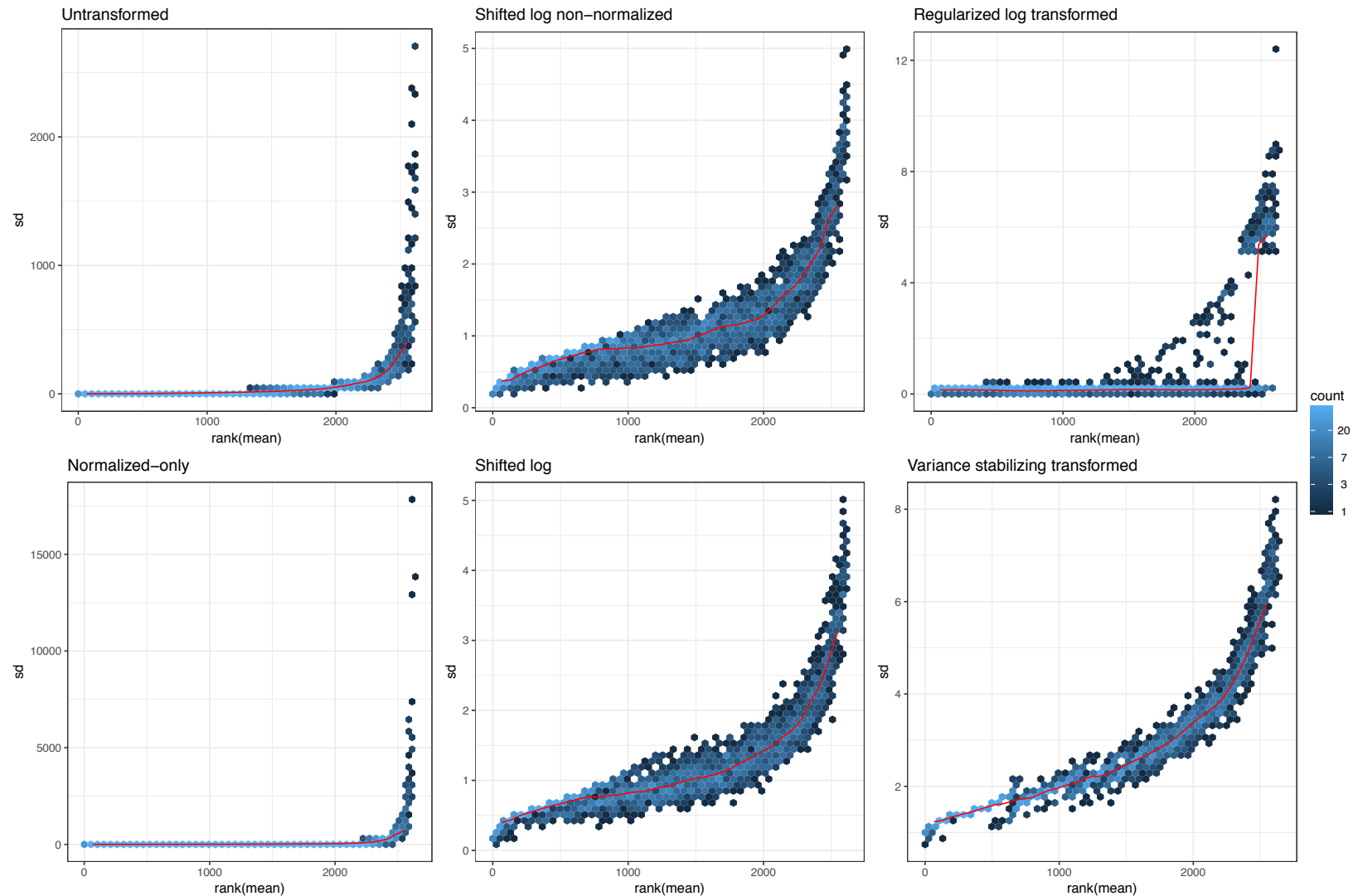
```
seqtab.nochim <- removeBimeraDenovo(seqtab,  
                                     method="pooled")
```

# Assigning Taxonomy

```
taxa.paired <- assignTaxonomy(seqtab.nochim,  
                              "UNITReferencedatabase",  
                              minBoot = 80)
```

# Navigating the labyrinth

## Challenge #6: Transformation the data for stabilizing variance inflation?



**DESeq**  
Love et al. 2014  
Genome Biology

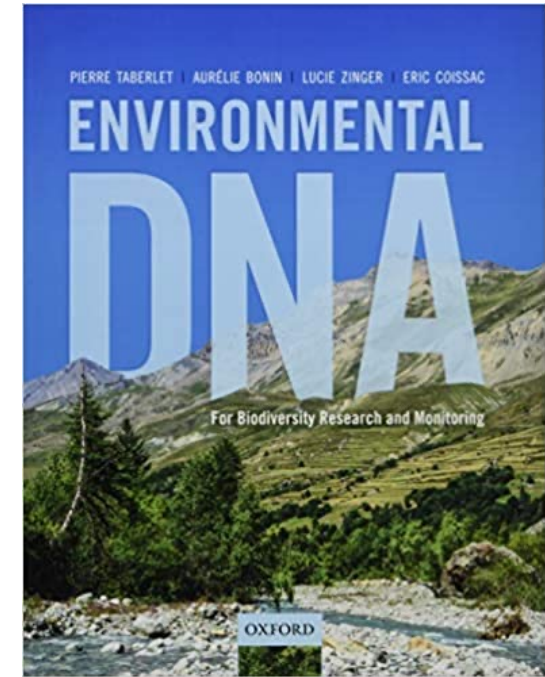
# Navigating the labyrinth

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**Many more challenges...**

**My two cents:**

- ☐ Follow workshops
- ☐ Strong review of literature
- ☐ Take into account local expertise
- ☐ Ask questions



Research

## *Methods*

Navigating the labyrinth: a guide to sequence-based, community ecology of arbuscular mycorrhizal fungi

Miranda M. Hart<sup>1</sup>, Kristin Aleklett<sup>1</sup>, Pierre-Luc Chagnon<sup>2</sup>, Cameron Egan<sup>1</sup>, Stefano Ghignone<sup>3</sup>, Thorunn Helgason<sup>4</sup>, Ylva Lekberg<sup>5</sup>, Maarja Öpik<sup>6</sup>, Brian J. Pickles<sup>1</sup> and Lauren Waller<sup>7</sup>



# Main hypothesis to be tested

## **Antagonism between AM and EcM symbioses within the soil profile**

1. Mycorrhizal abundance can be divided into 3 individual components (Soudzilovskaia et al., 2017

*Biogeography of mycorrhizal symbiosis*):

- ☐ The intensity of root colonization by fungal symbionts
- ☐ The abundance of extra-radical fungal hyphae of fungal symbionts
- ☐ The abundance of fine roots of plant symbionts

Solution = eDNA metabardoding!





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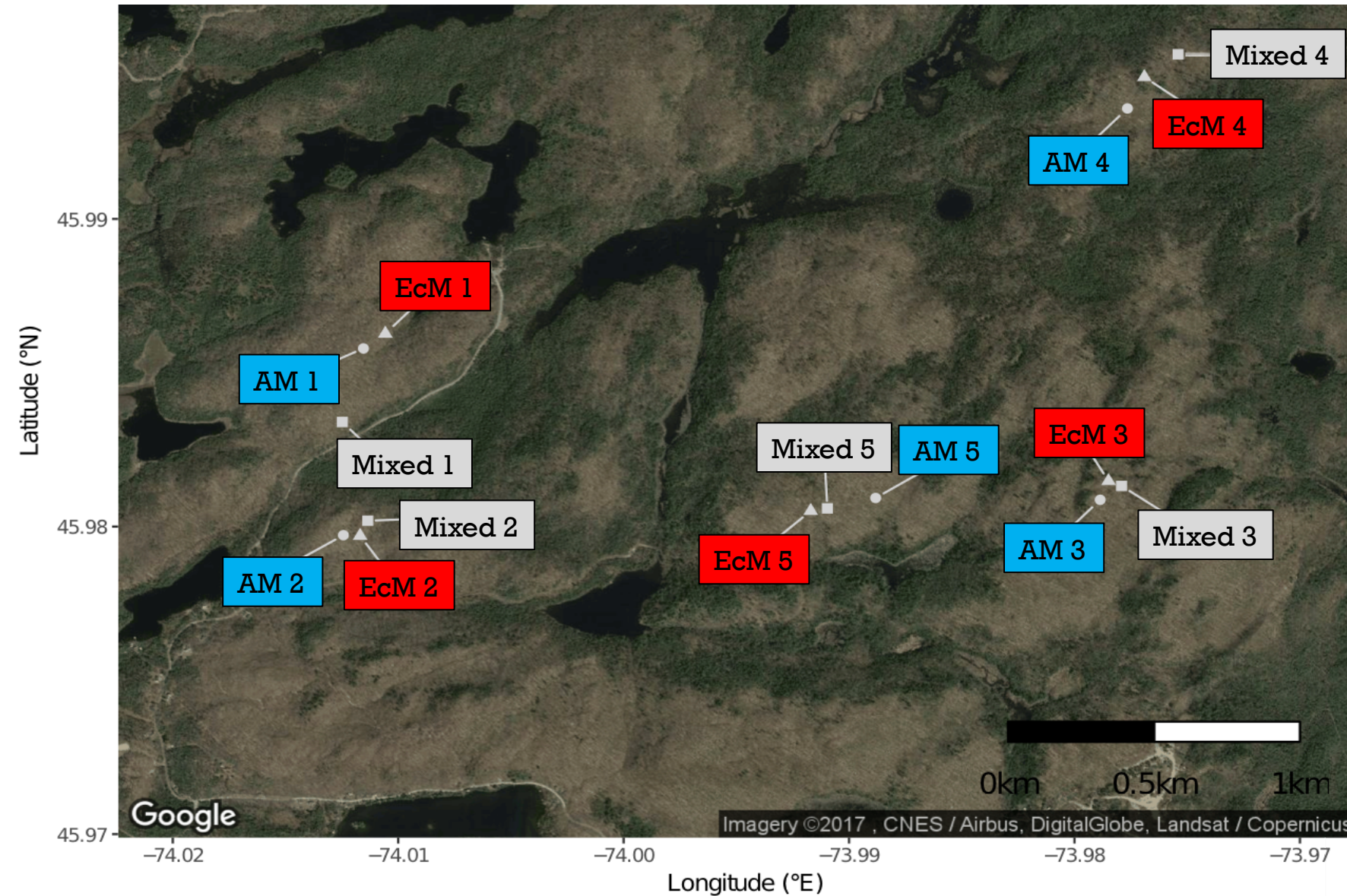
- ☐ The intensity of root colonization by fungal symbionts
- ☐ The abundance of extra-radical fungal hyphae of fungal symbionts
- ☐ The abundance of fine roots of plant symbionts

Solution = eDNA metabardoding!

2. Natural sites where AM and EcM symbioses are co-occurring

Solution = sampling design!

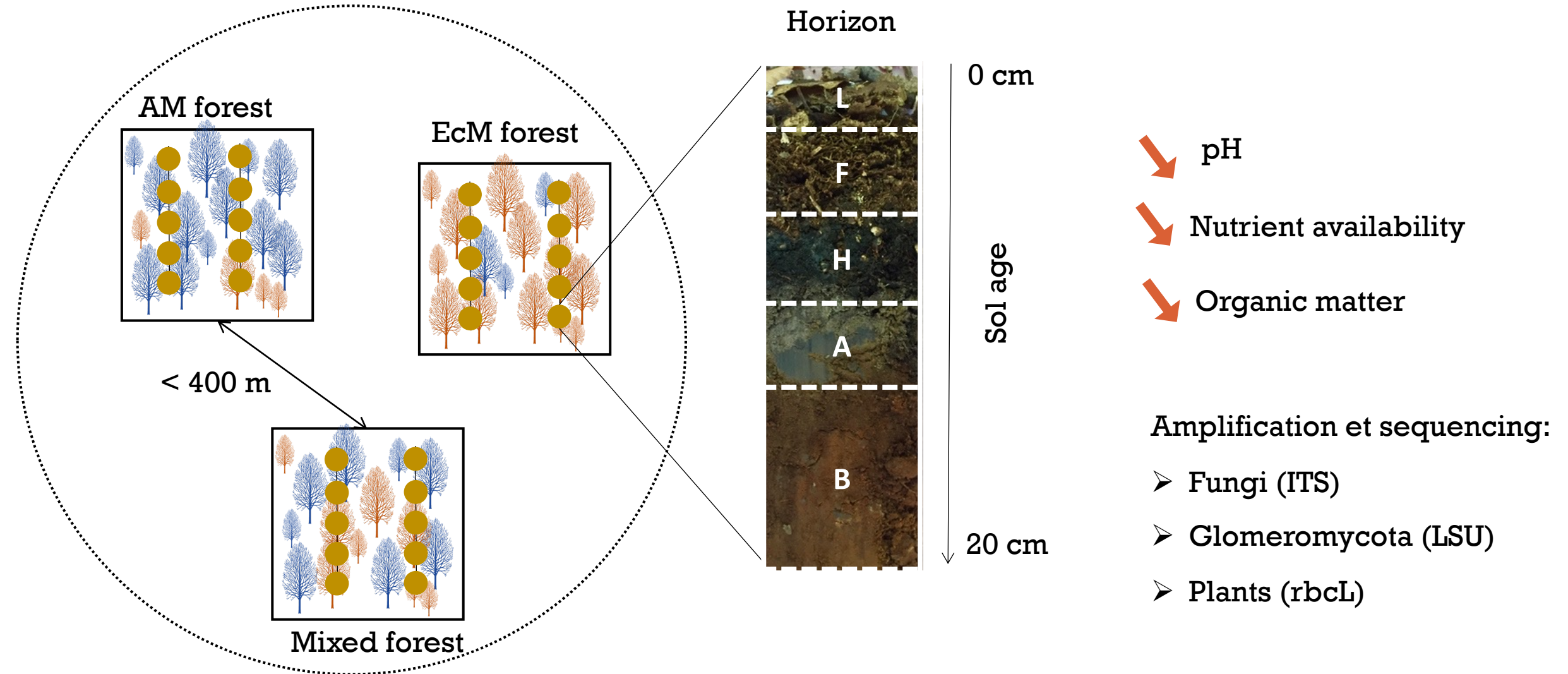
# Sampling design



- ❖ Station de biologie de l'Université de Montréal, QC, Canada
- ❖ 15 permanent plots (dominated by AM, mixed or EcM)
- ❖ Limiting variations in:
  - ✓ Climate
  - ✓ Parent material
  - ✓ Historical events



# Sampling design

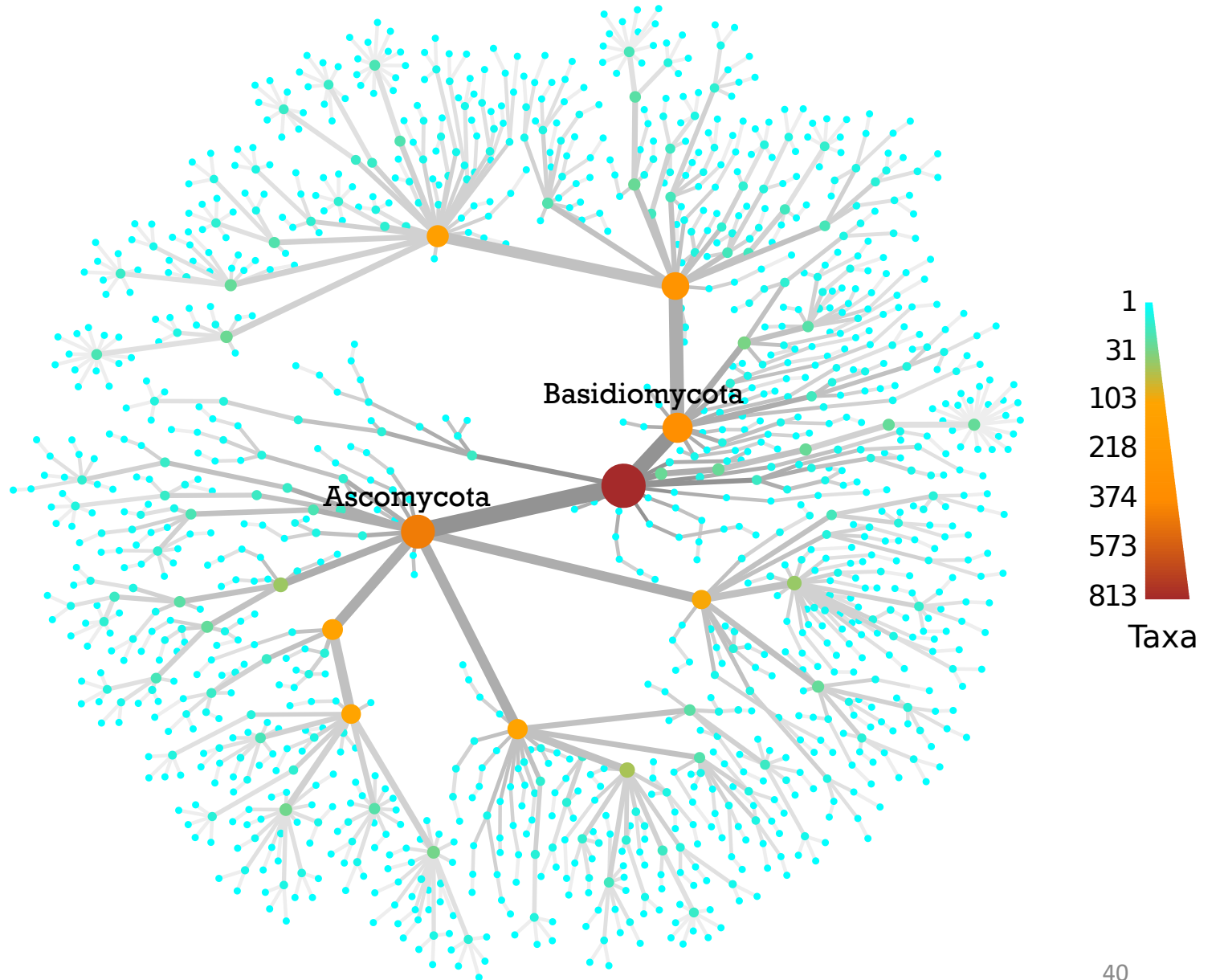


## Results and Discussion

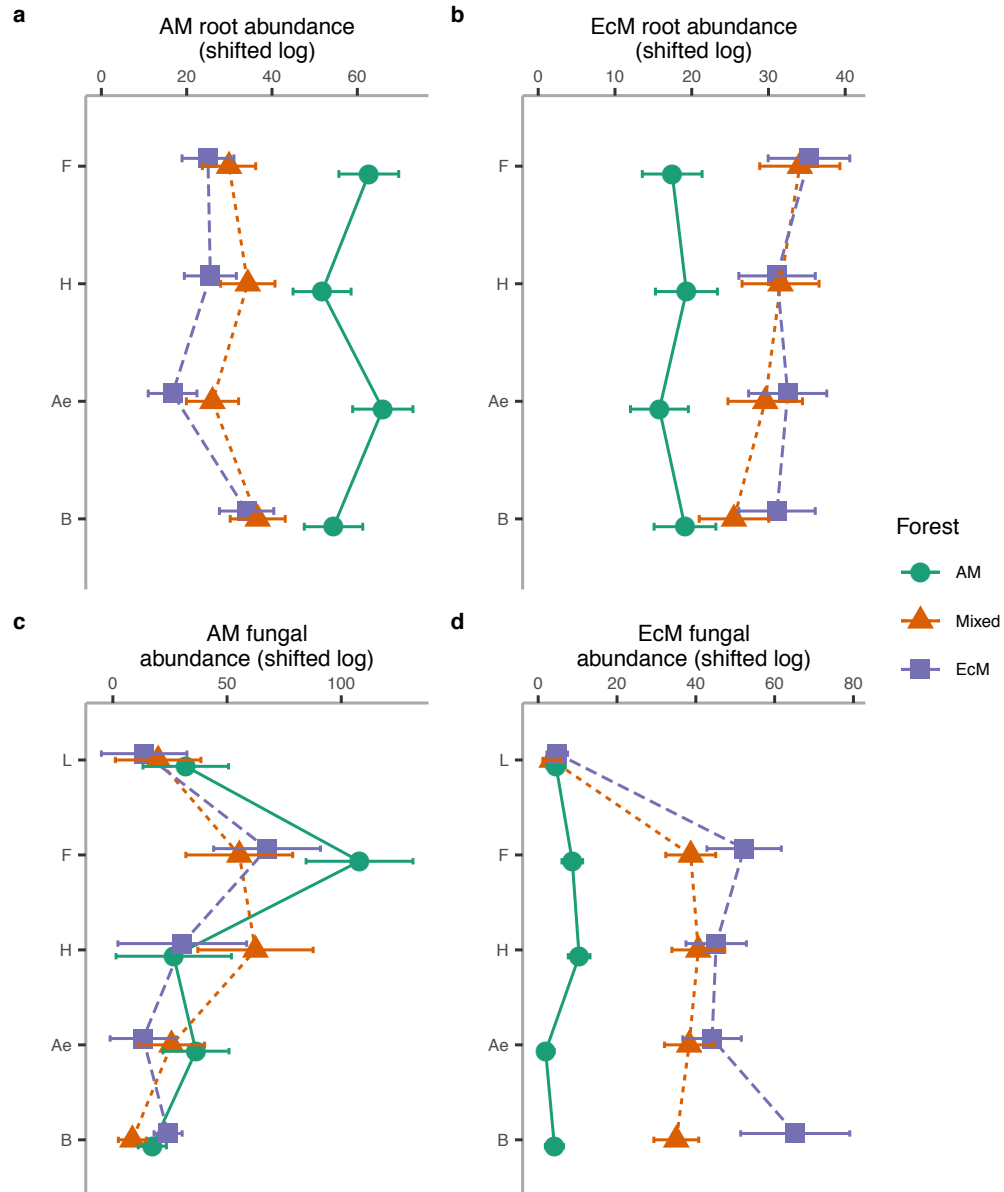


# Fungal community (ITS)

- ✓ 2,865,791 sequences
- ✓ 88.9% fungal origin
- ✓ Grouped in 813 taxa and 7 phyla

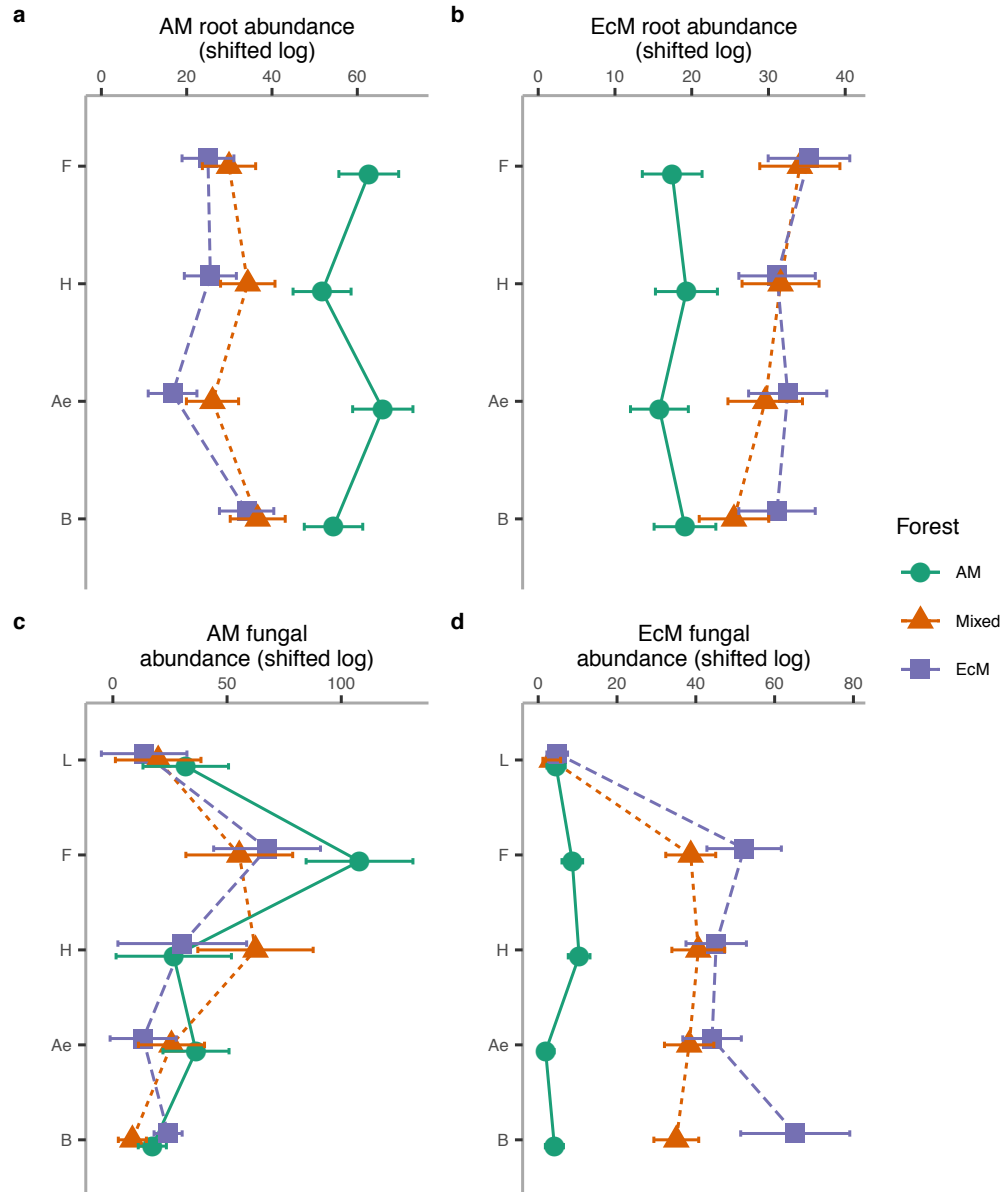


# Root and fungal distribution (from sequence data)



➤ Approach: Comparison of distribution with shifted-log data and sequence abundance summed by sample

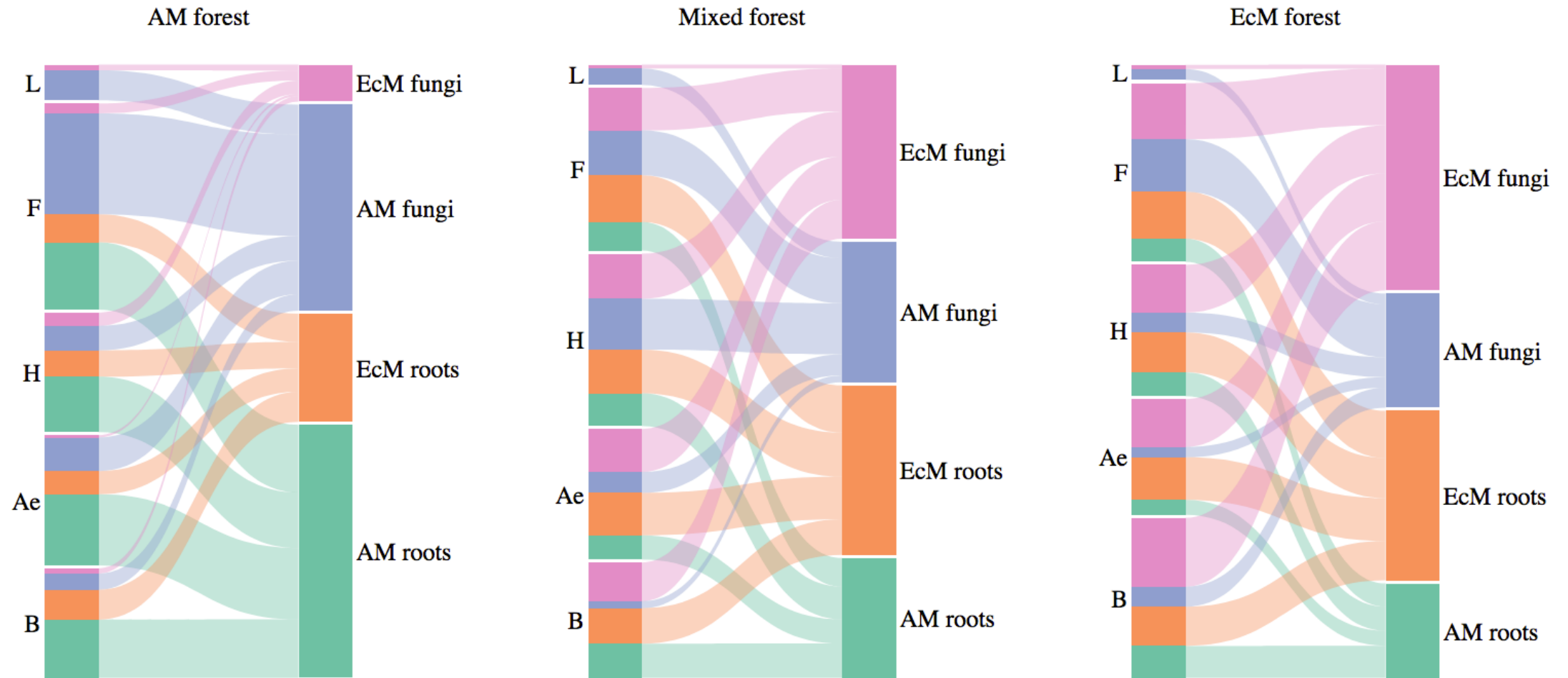
# Root and fungal distribution (from sequence data)



- Approach: Comparison of distribution with shifted-log data and sequence abundance summed by sample
- AM fungal very variable (data not great?)
- EcM fungi and root are abundant in EcM and mixed plots
- But no apparent antagonism

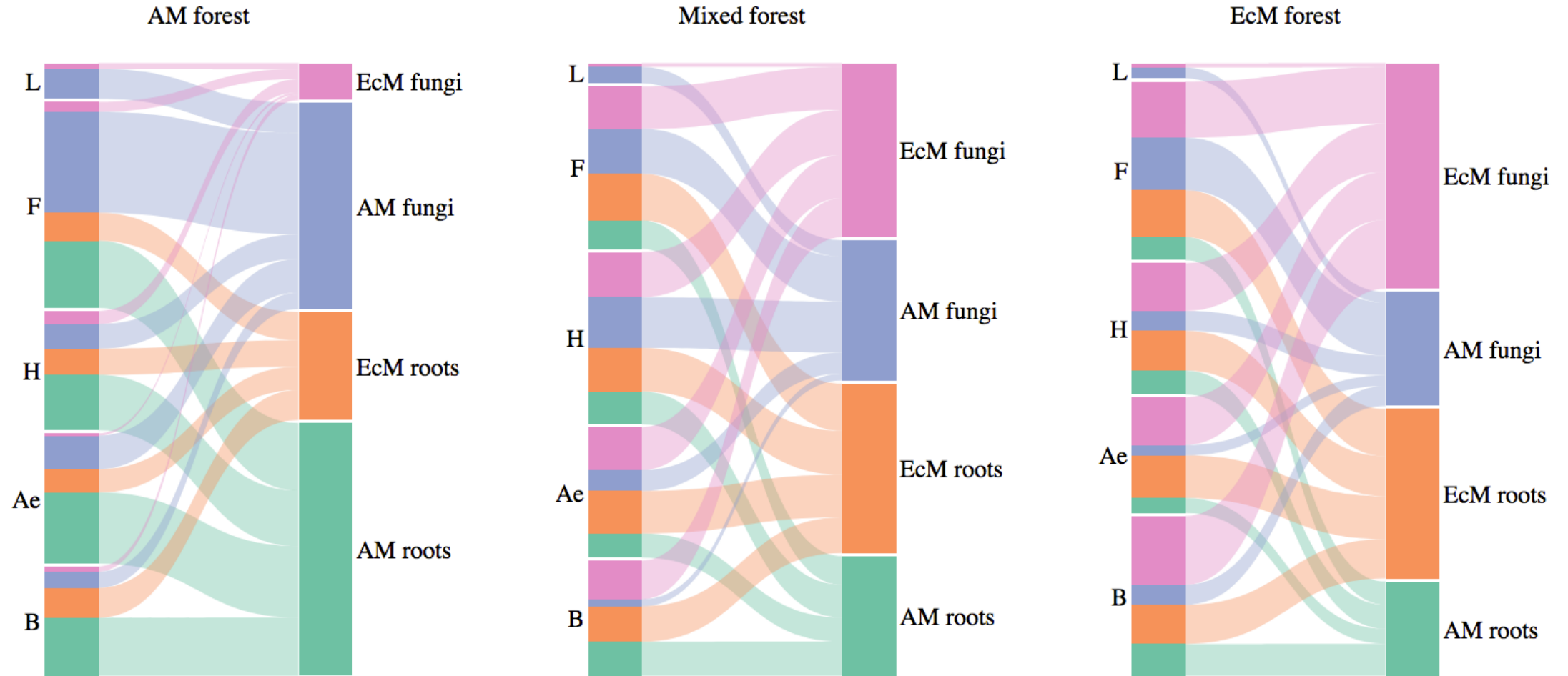
# Root and fungal network

Approach: Network analysis using sequence abundance as a proxy of mycorrhizal abundance



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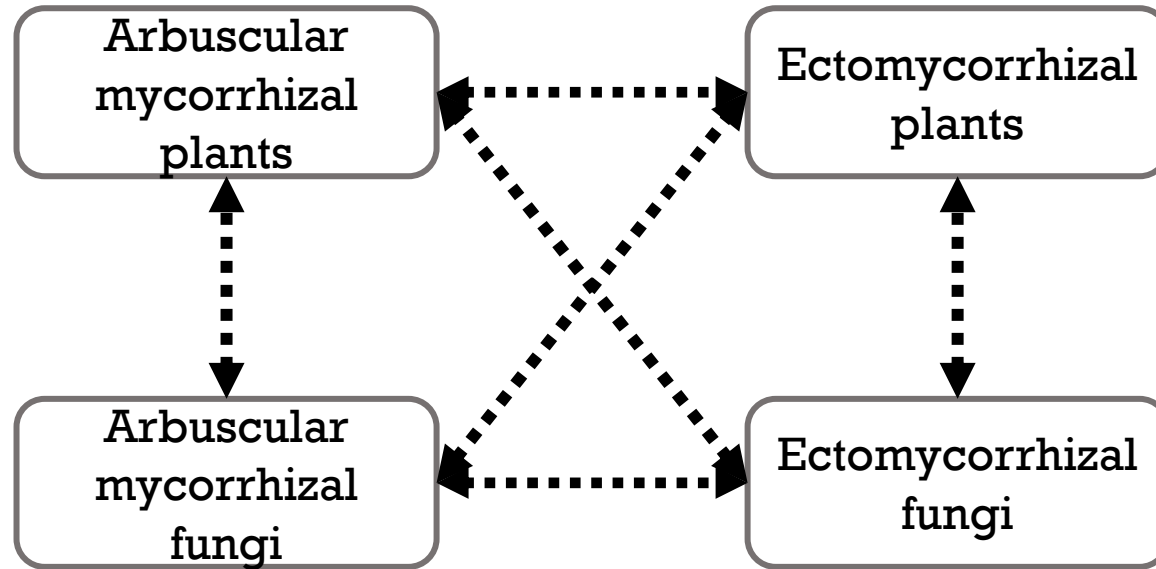
- Patterns of dominance as expected
- But no apparent antagonism between AM and EcM
- Mycorrhizal fungi colonize L (broader niche than usually expected?)



# Root and fungal co-variance

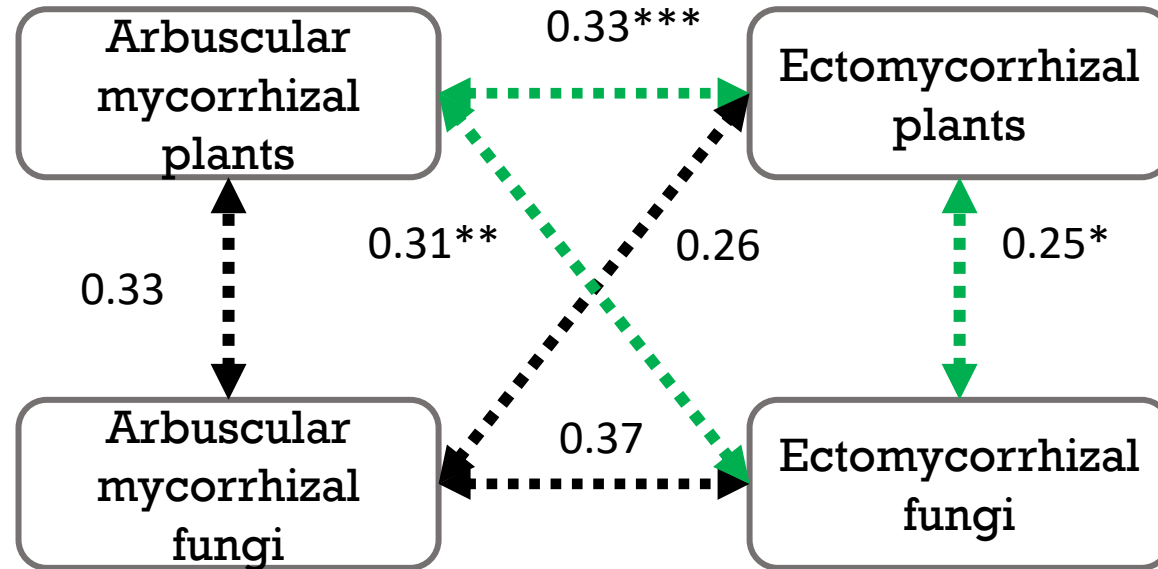
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Approach: Permutation analysis to test the strength of the relationship among groups using the Monte-Carlo method on the sum of eigenvalues of the co-inertia analysis



# Root and fungal co-variance

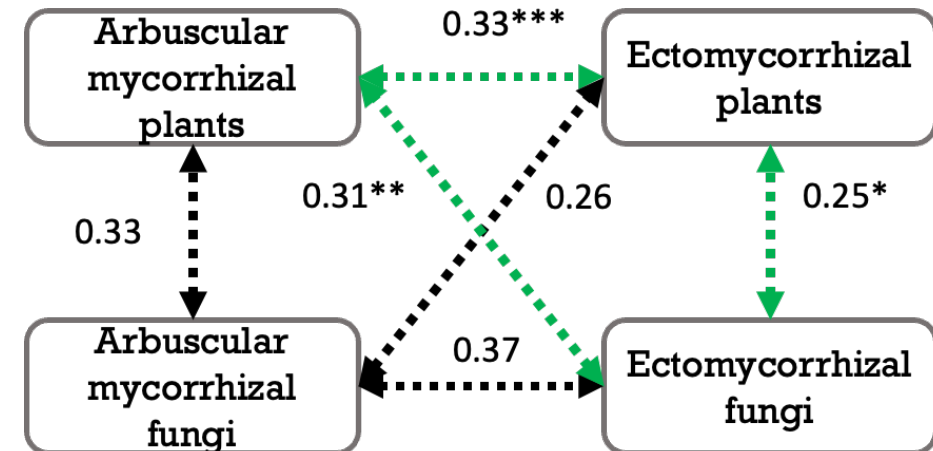
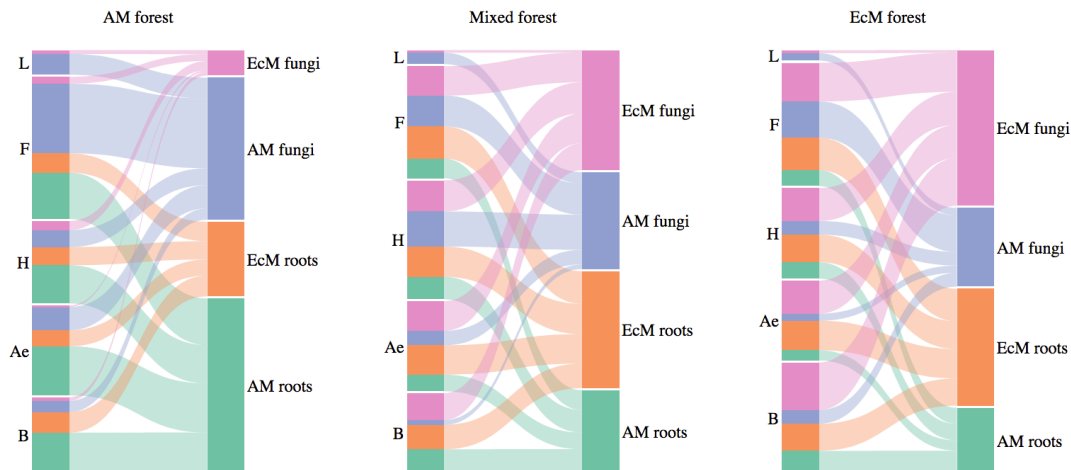
Approach: Permutation analysis to test the strength of the relationship among groups using the Monte-Carlo method on the sum of eigenvalues of the co-inertia analysis



No apparent antagonism between AM and EcM symbioses?

# Main points

- No apparent antagonism between AM and EcM symbioses
- Important to take into account the vertical distribution including organic and mineral horizons
- Hyphae in the soil are clearly not only present where roots are
- AM fungi are abundant in organic horizons, present in L and highest “abundance” in F (but issue with LSU marker?)



NEXT -> DADA2 Tutorial

<https://alexiscarter.github.io/metab/>

[https://alexiscarter.github.io/metab/Dada\\_script\\_ES.html](https://alexiscarter.github.io/metab/Dada_script_ES.html)

[https://alexiscarter.github.io/metab/Dada\\_script\\_EN.html](https://alexiscarter.github.io/metab/Dada_script_EN.html)

ALEXIS.CARTERON@UNIMI.IT

# Data source and manipulation



Group	Fungi	AM Fungi	Plant roots
Sampling	Composite soil samples from soil core, particles < 2 mm	Composite soil samples from soil core, particles < 2 mm	Fine roots” (< 2 mm diameter) from composite soil samples
DNA extraction	PowerSoil MoBio kit	PowerSoil MoBio kit	Adapted CTAB protocol
Marker for amplification	Internal transcribed spacer ITS3_KYO2-ITS4	Large Subunit (nested PCR with SSUmAf-LSUmAr then LSUD2f-CS1-LSUmBr-CS2)	Large subunit of RuBisCO rbcLa_f-rbcLa_r
Sequencing	Illumina MiSeq 2x250 bp (~1/3 run)	Illumina MiSeq 2x250 bp (~1/3 run)	Illumina MiSeq 2x250 bp (~1/3 run)
Denoising	dada2 (1.4) pipeline, link: <a href="https://doi.org/10.5281/zenodo.3631982">https://doi.org/10.5281/zenodo.3631982</a>	dada2 (1.4) pipeline	dada2 (1.4) pipeline
Taxonomy assignment	Using RDP classifier and UNITE database (version 8.1 release 2/2/2019)	LSU training set #11 <a href="https://doi.org/10.5281/zenodo.835855">https://doi.org/10.5281/zenodo.835855</a>	Customized database derived from the BOLD system <a href="http://www.boldsystems.org">http://www.boldsystems.org</a>



# Data source and manipulation



Group	Fungi	AM Fungi	Plant roots
Threshold	Singletons and doubletons excluded (keep ASV with total sum > 2)		
Transformation	Initial step for normalization: Shifted log transformation For combined analysis: Relative abundance by groups of organisms		
analysis NMDS	Sorensen (presence/absence) index Bray-Curtis index		
Groups of interest	EcM fungi, saprotrophs	Glomeromycota (phylum)	AM plant, EcM plant (using info at genus level)