

# Fungal phylogenomics: Getting lost in the moldy forest

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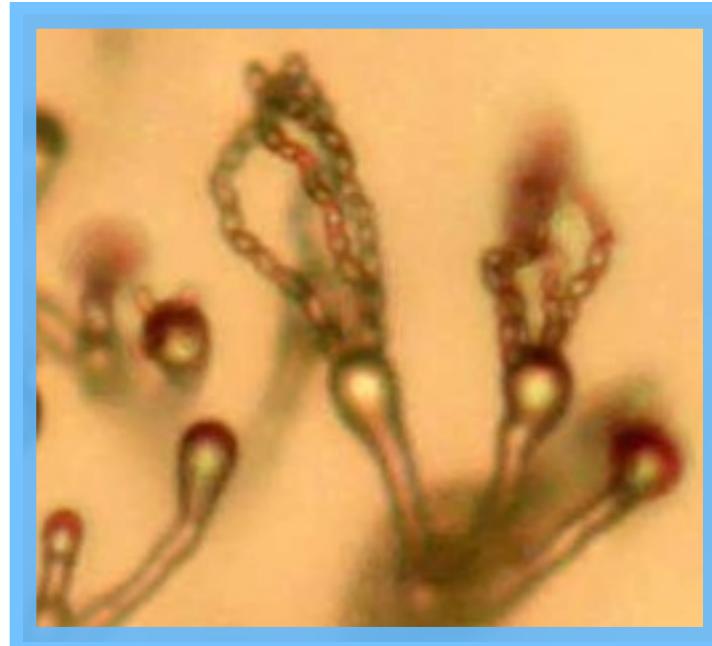
<http://lab.stajich.org>

<http://fungalgenomes.org/blog>

<http://fungiDB.org>

twitter{stajichlab,hyphaltip,fungalgenomes,fungidb}

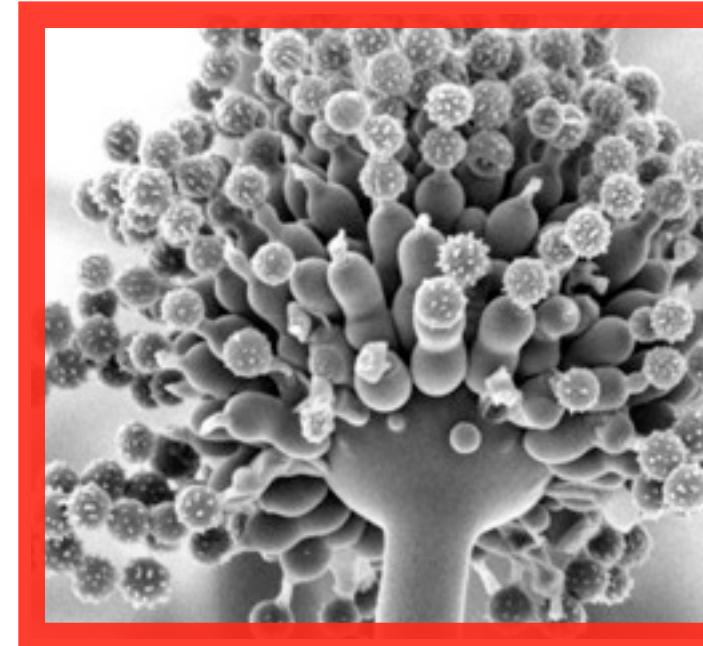
# Fungi have diverse forms, ecology, and associations



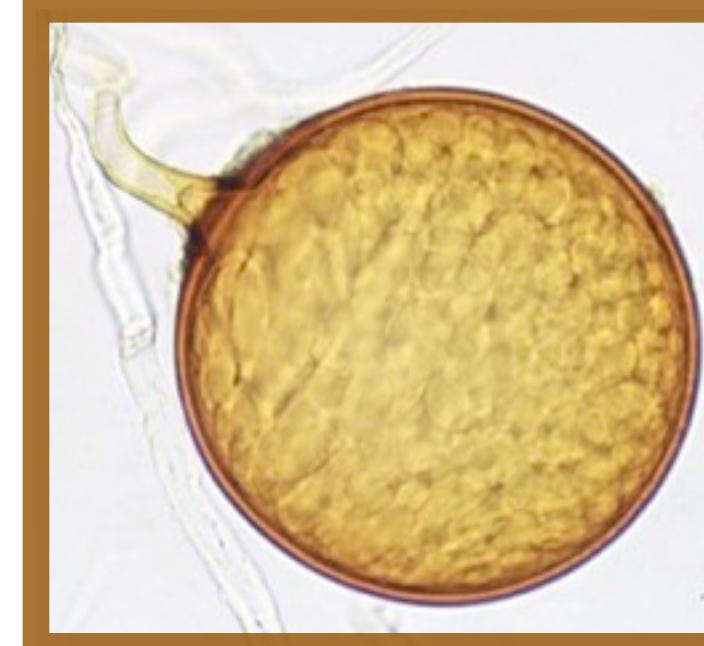
*Cryptococcus neoformans* X. Lin



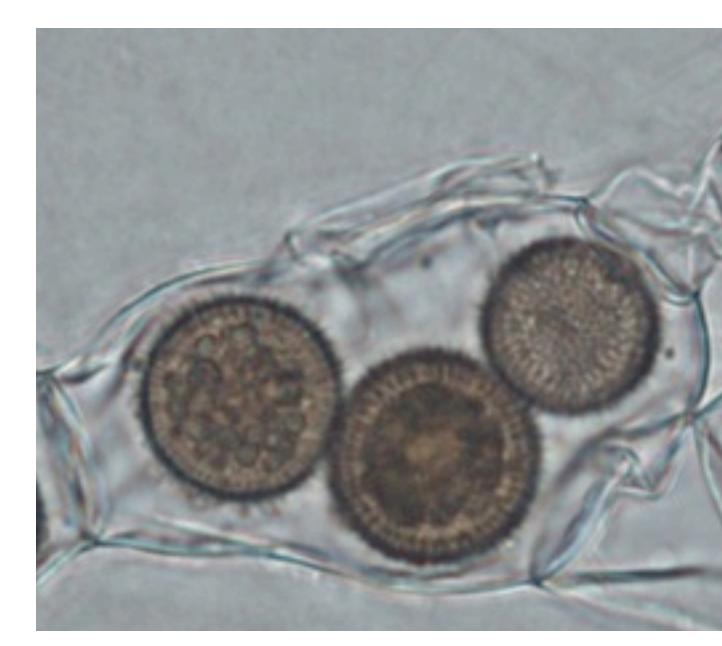
*Coprinopsis cinerea* Ellison & Stajich



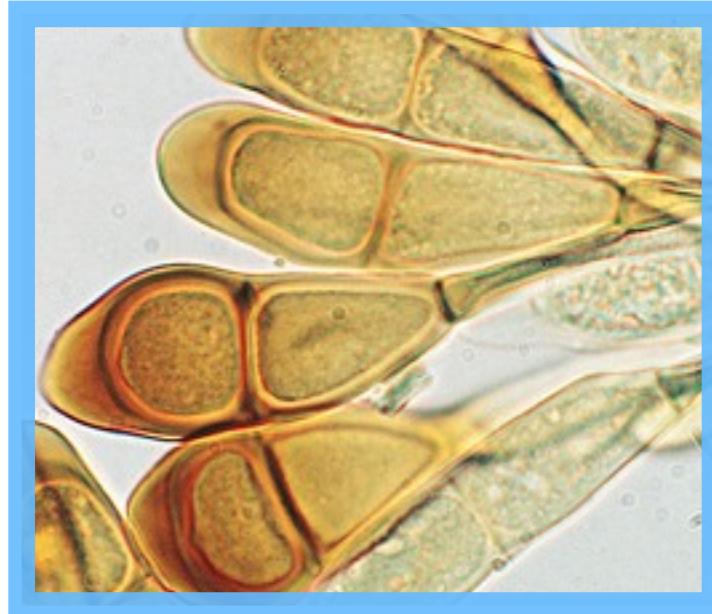
*Aspergillus niger*. N Read



*Glomus* sp. Univ Sydney



*Rozella allomyces*. James et al



*Puccinia graminis* J. F. Hennen



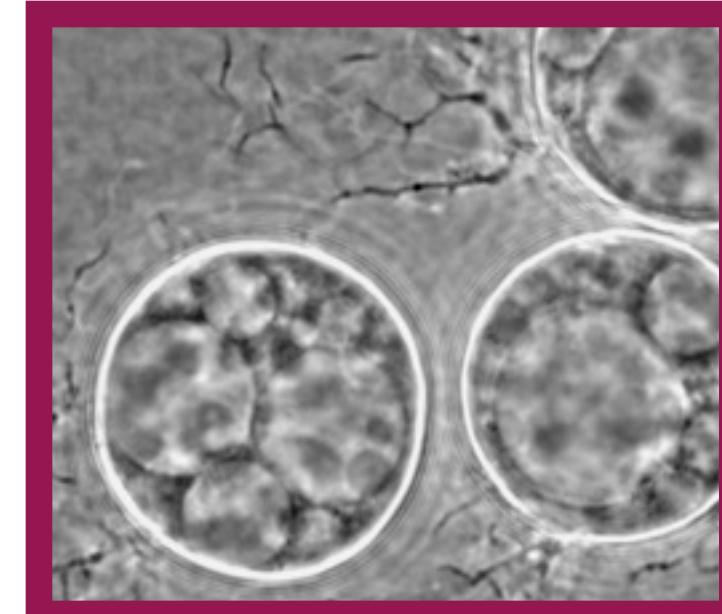
*Laccaria bicolor* Martin et al.



*Neurospora crassa*. Hickey & Reed



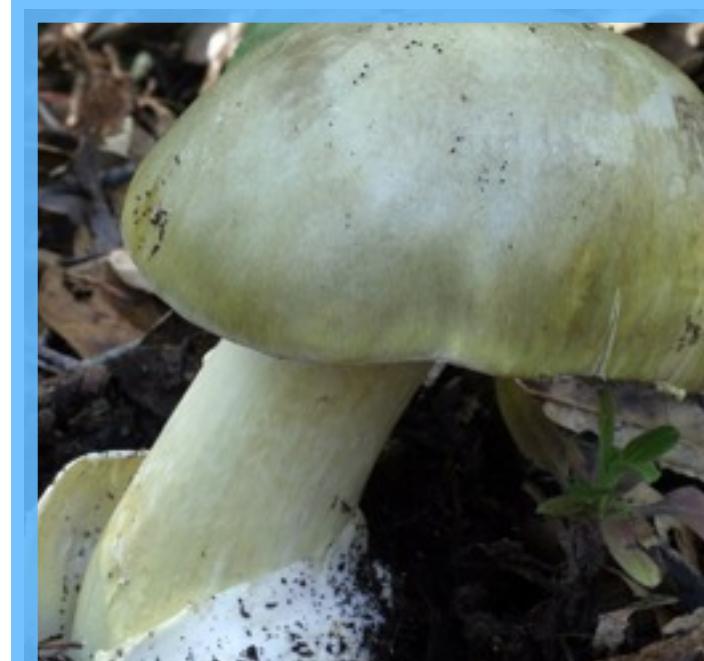
*Phycomyces blakesleeanus* T. Ootaki



*Batrachochytrium dendrobatidis*  
J. Longcore



*Ustilago maydis* Kai Hirdes



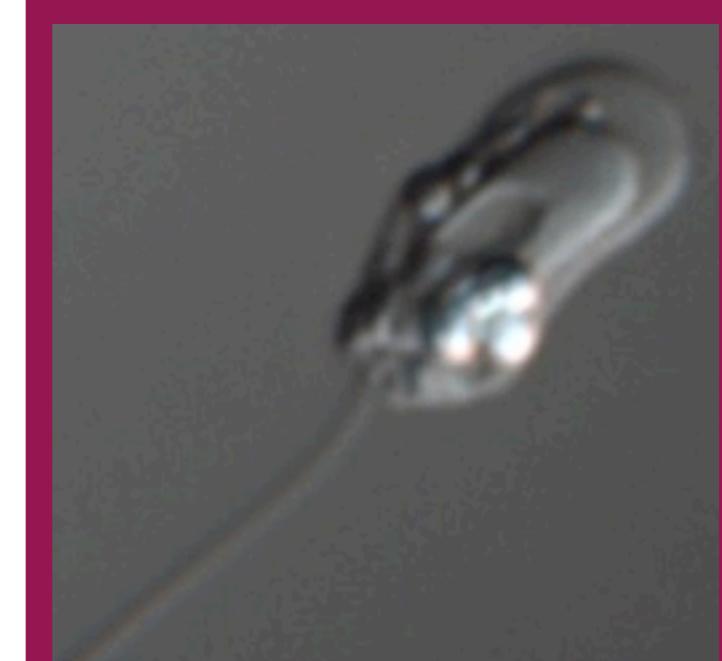
*Amanita phalloides*. M Wood



*Xanthoria elegans*. Botany POtD



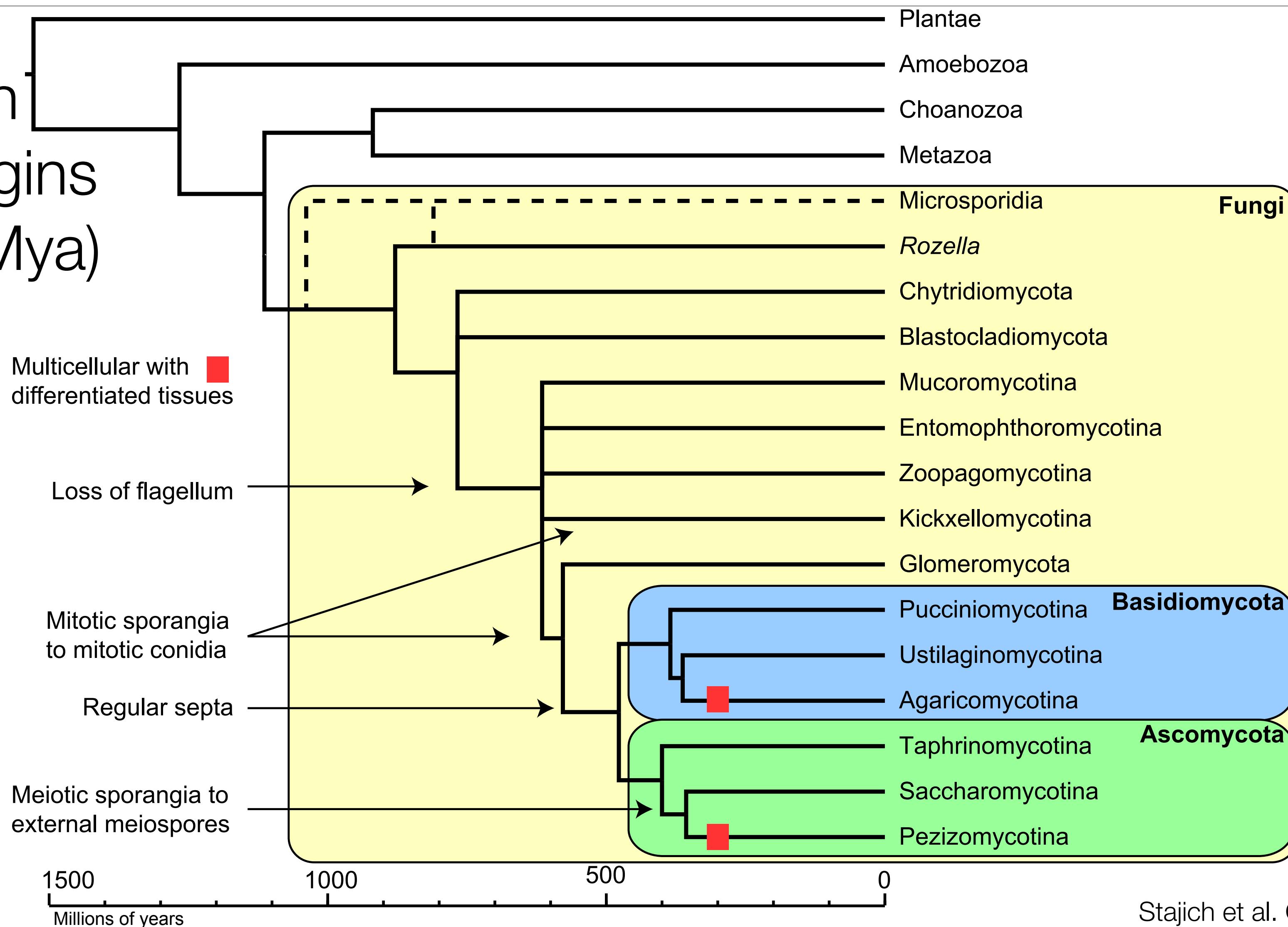
*Rhizopus stolonifera*.



*Blastocadiela simplex* Stajich & Taylor

# Fungi are an old group of organisms

(Eutherian  
mammal origins  
~ 150-180 Mya)

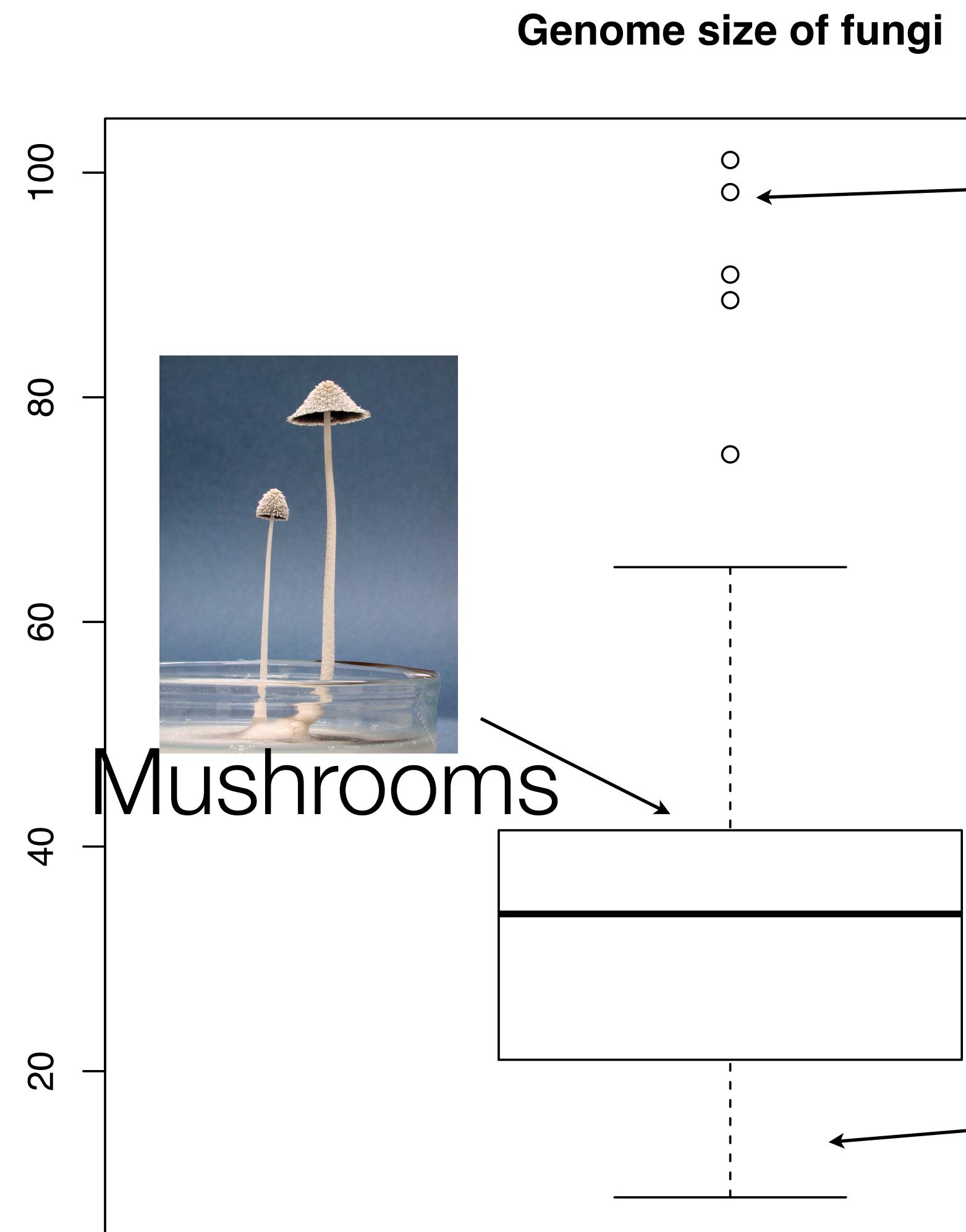


# Awash in Fungal Genomes

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- Mid-2011: Genomes from 150+ species sequenced and ~400 more in progress/pipeline
- Several multi-strain resequencing projects (*Neurospora* - Ellison PNAS 2011), *Saccharomyces* (Liti Nature 2009), *Coccidioides* (Neafsey Genome Res 2010) and many in progress/proposed.
- Many of sequenced genomes were focused around plant, animal pathogens, and some specific evolutionary questions.
- Now are starting to fill out the tree more to capture the diversity of kingdom and also for studies of molecular evolution among many related species.
- Also efforts targeting specific questions - pathogens and their relatives; wood rotting fungi; flagellated and non-flagellated forms; extremophiles; comparison of growth forms (e.g. yeast forms from phylogenetically very different species)

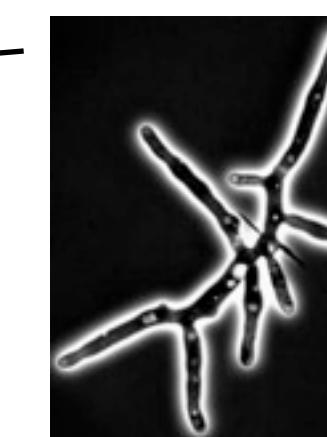
Genome sizes of fungi are 8Mb-100Mb = easy(ish) to sequence



*Melampsora, Blumeria,  
Puccinia*  
(many Transposable elements)

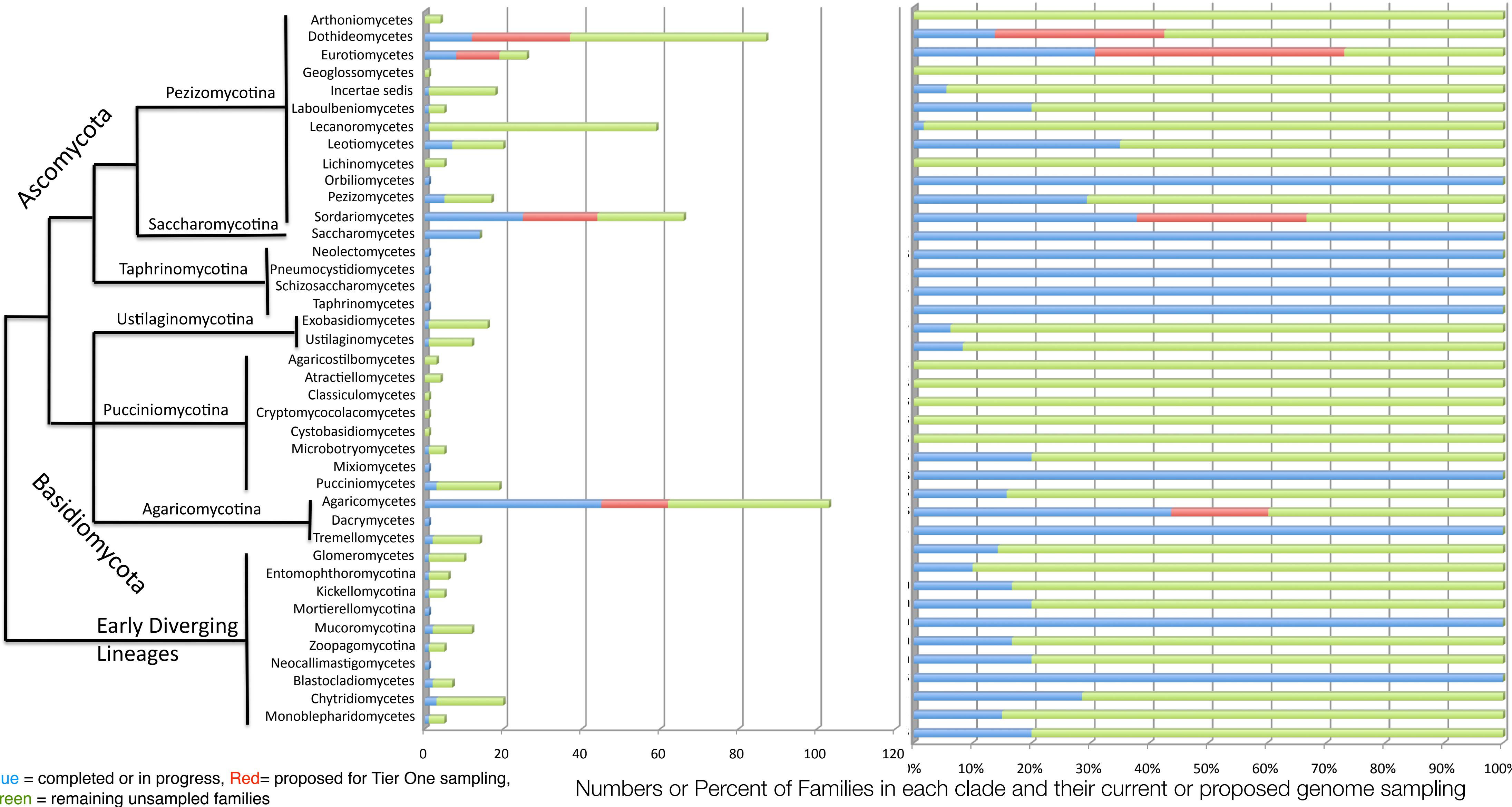


*Ashbya, Malassezia, Candida  
other yeasts*



<http://www.biologie.uni-osnabrueck.de/Genetik/index.php?menuid=12>

# Need to cover more of the phylogenetic diversity: 1000 Fungal genomes project



# Tools to access this data

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- Genome databases at sequencing centers and NCBI
- Comprehensive and integrated systems are not as well developed in Fungi, but some examples of excellent tools highlighted at <http://tools.fungalgenomes.org/>
- Ensembl Fungi, MicrobesOnline, JGI's Mycocosm, Comparative Fungal Genomics, and some targeted to specific clades e.g. *Saccharomyces* (SGD), *Aspergillus* (AspGD), *Candida* (CGD)
- We have launched FungiDB - <http://fungidb.org> to support integrating functional genomics data for data mining as well as standard 'Gene' pages for genes.

# Searching with FungiDB: A strategy for drug targets

**My Strategies:** New Opened (1) All (83) Basket Examples Help

(Genes)

Step 1      Step 2      Add Step

Expanded View of Step Orthologs

Step 1      Step 2      Step 3      Add Step

Filter results by species (results removed by the filter will not be combined into the next step.)

All Results	Ortholog Groups	Eurotiomycetes				Sordariomycetes				Saccharomycotina			Basidiomycota		Rhizopus oryzae				
		A.cla	A.flu	A.fum	A.nid	A.nig	A.ter	C.imm H538.4	C.imm RS	F.gra	F.oxy	G.mon	M.ory	N.cra	C.alb	S.cer	C.neo	P.gra	Rhizopus oryzae
268	249	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	268	0	0

Cryptococcus Drug target? - step 2 - 268 Genes

First 1 2 3 4 5 Next Last Advanced Paging

Gene	Genomic Location	Weight	Predicted GO Function	Predicted GO Process
CneoH99_CNAG_07830	CneoH99_Chr_2.4: 1,052,305 - 1,054,670 (-)	20	DNA binding, zinc ion binding	transcription
CneoH99_CNAG_07632	CneoH99_Chr_2.6: 473,070 - 476,242 (+)	20	pyridoxal phosphate binding, transaminase activity	biosynthetic process, cellular amino acid metabolic process
CneoH99_CNAG_07589	CneoH99_Chr_2.11: 160,029 - 161,779 (-)	20	binding, catalytic activity, oxidoreductase activity, zinc ion binding	metabolic process, oxidation reduction
CneoH99_CNAG_07441	CneoH99_Chr_2.5: 1,287,517 - 1,288,271 (-)	20	4-alpha-hydroxytetrahydrobiopterin dehydratase activity	tetrahydrobiopterin biosynthetic process
CneoH99_CNAG_07011	CneoH99_Chr_2.12: 762,209 - 764,308 (+)	20	DNA binding, zinc ion binding	transcription
CneoH99_CNAG_06868	CneoH99_Chr_2.5: 29,970 - 32,039 (-)	20	phosphopyruvate hydratase activity	glycolysis
CneoH99_CNAG_06719	CneoH99_Chr_2.2: 235,880 - 239,543 (+)	20	DNA binding, zinc ion binding	transcription

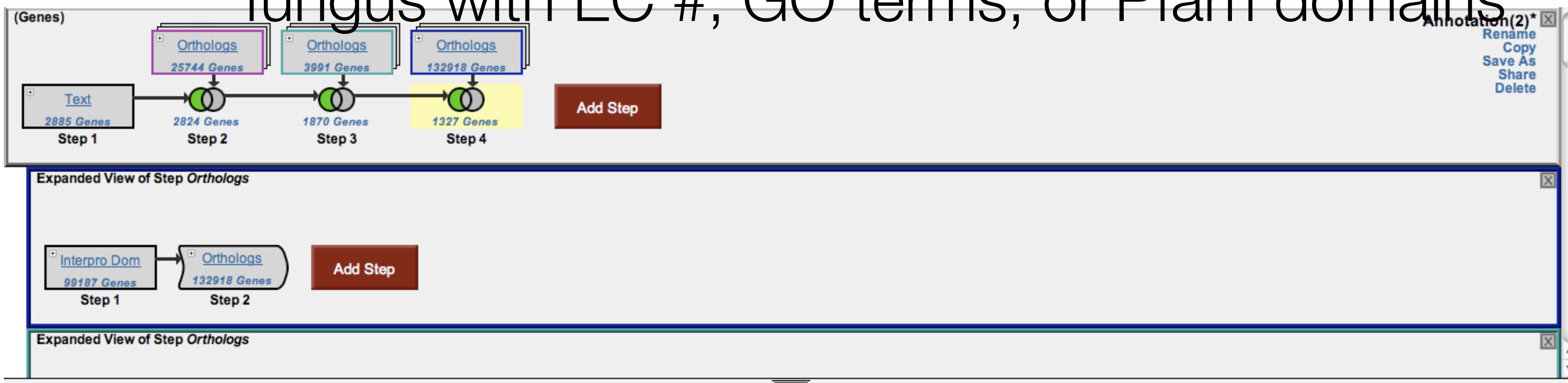
*C.neoformans* genes with

- no hits in other eukaryotes (excepting fungi), bacteria
- has *S.cerevisiae* orthologs that have EC terms OR orthologs in other fungi with GO metabolic terms associated

# Searching with FungiDB:

## A strategy for reannotation

2885 *C.neoformans* genes with desc ““conserved hypothetical protein” but 1327 can be assigned name from ortholog in any fungus with EC #, GO terms, or Pfam domains



Filter results by species (results removed by the filter will not be combined into the next step.)

All Results	Ortholog Groups	Eurotiomycetes								Sordariomycetes					Saccharomycotina			Basidiomycota		Rhizopus oryzae
		A.cla	A.flu	A.fum	A.nid	A.nig	A.ter	C.imm H538.4	C.imm RS	F.gra	F.oxy	G.mon	M.ory	N.cra	C.alb	S.cer	C.neo	P.gra		
1327	1229	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1327	0	0	

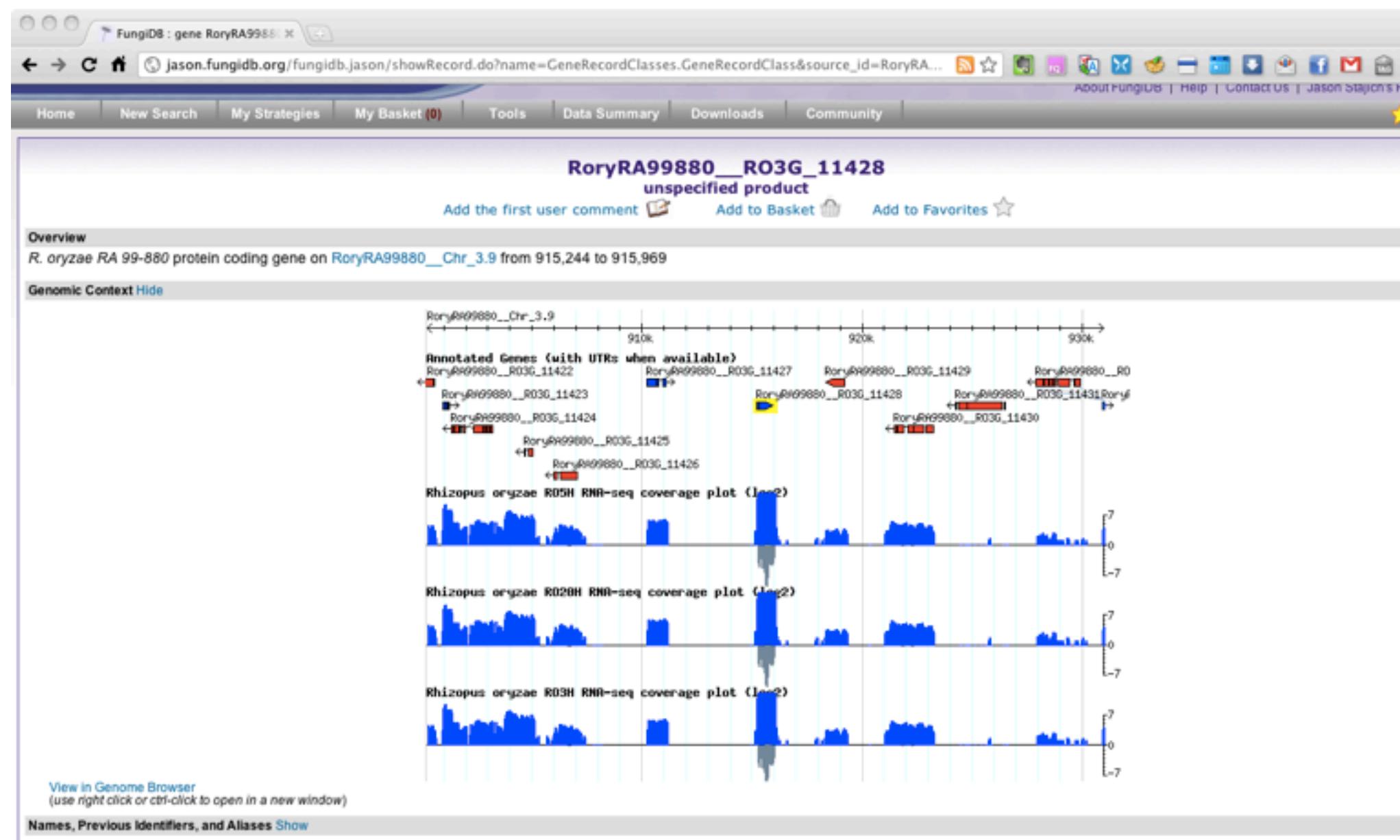
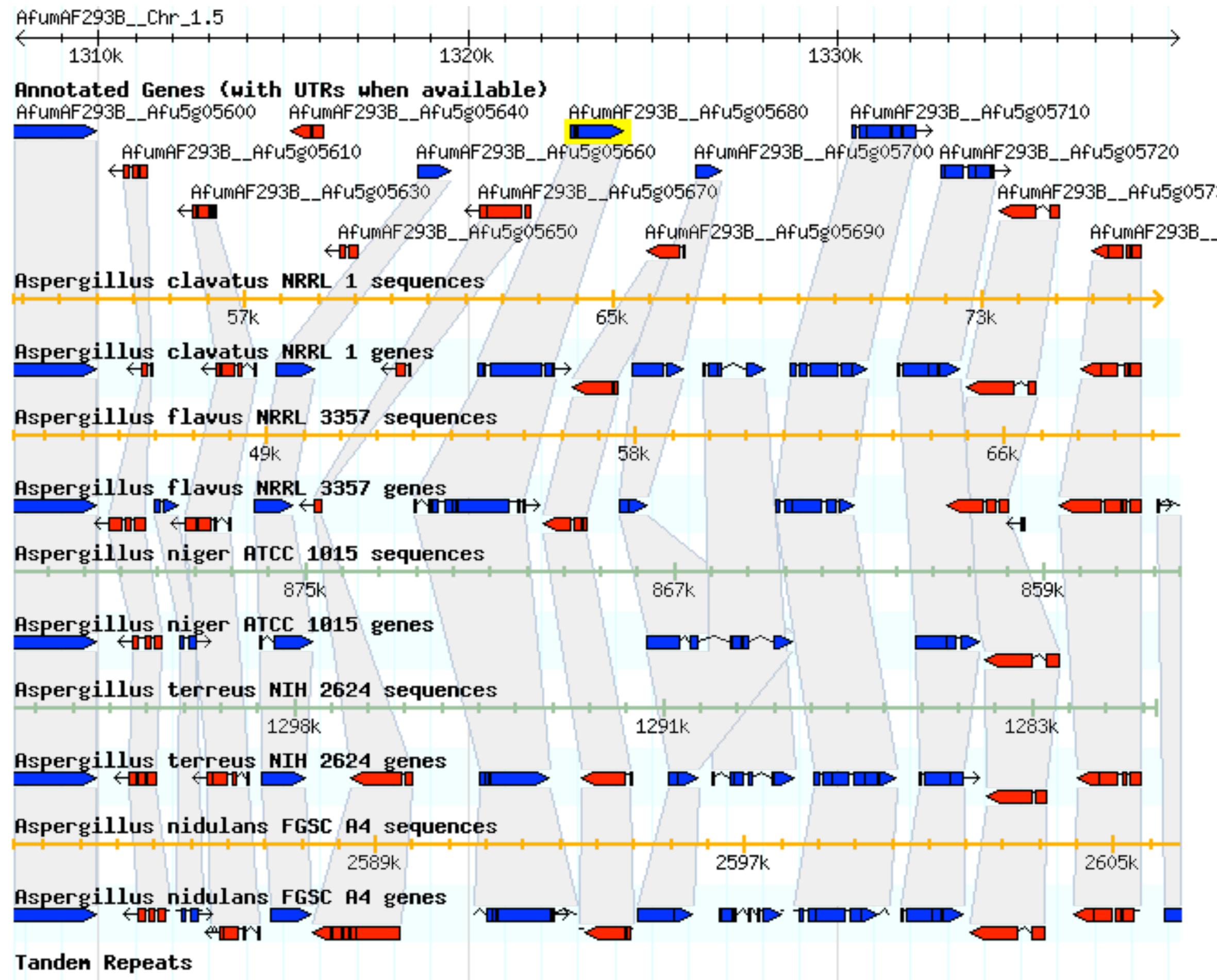
Annotation(2) - step 4 - 1327 Genes [Add 1327 Genes to Basket](#) | [Download 1327 Genes](#)

First 1 2 3 4 5 Next Last Advanced Paging [Select Columns](#) [Reset Columns](#)

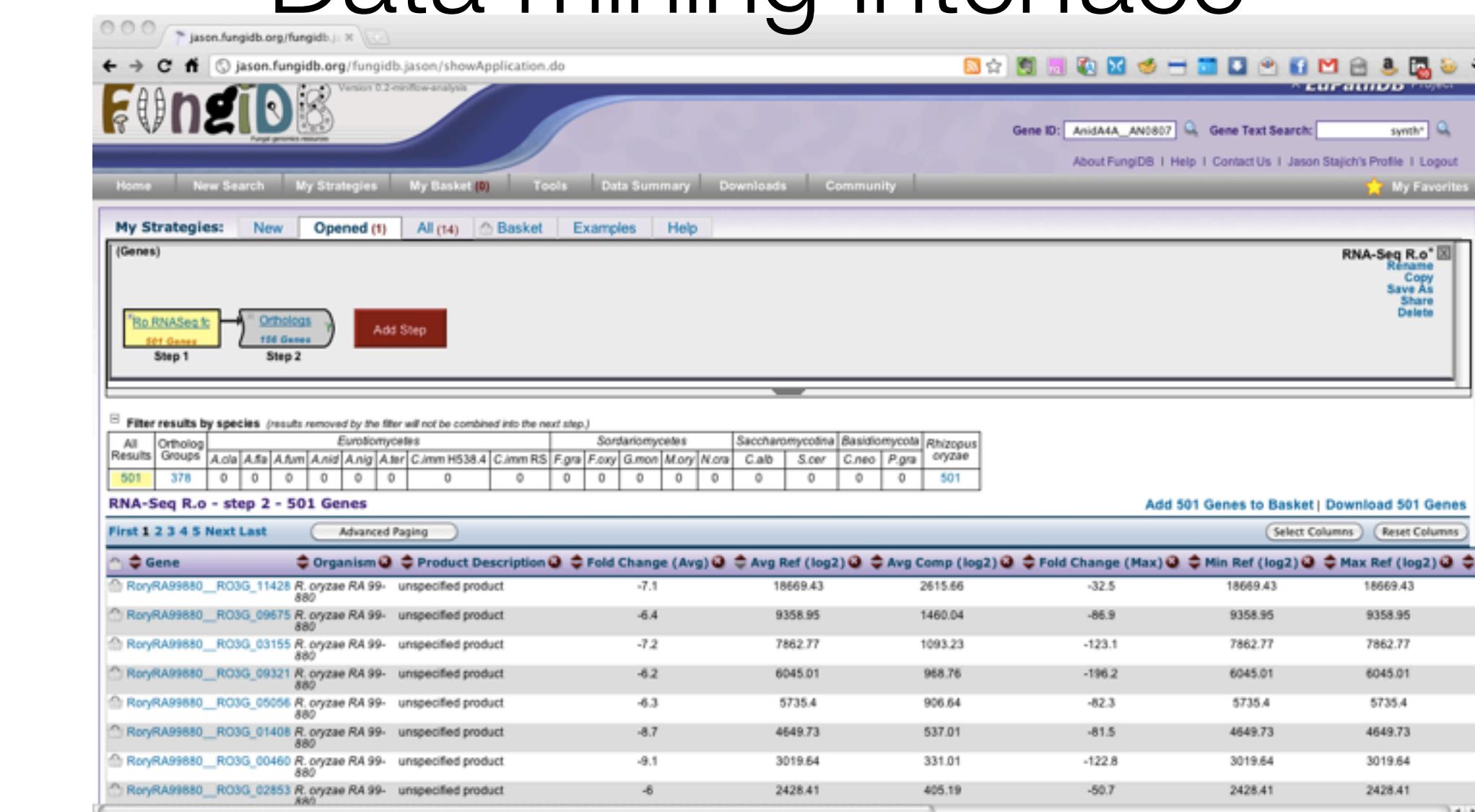
Gene	Genomic Location	Weight	Predicted GO Function	Predicted GO Process	Ortholog Group	SignalP Peptide
CneoH99_CNAG_07913	CneoH99_Chr_2.12: 637,812 - 638,653 (+)	10	N/A	N/A	OG5_226248	N/A
CneoH99_CNAG_07912	CneoH99_Chr_2.12: 636,724 - 637,155 (+)	10	N/A	N/A	OG5_226247	N/A
CneoH99_CNAG_07898	CneoH99_Chr_2.12: 191,256 - 192,798 (+)	10	N/A	N/A	OG5_226246	N/A
CneoH99_CNAG_07890	CneoH99_Chr_2.14: 796,716 - 797,600 (+)	10	N/A	N/A	OG5_226245	HMM: MSISKSPSLDLCLATLHELLHPSPILSLLLSALDLSAHFQLFAQQLSSDAALVSAL, NN: MSISKSPSLDLCLATLHELLHPSPILSLLLSAL...
CneoH99_CNAG_07883	CneoH99_Chr_2.14: 482,566 - 484,632 (-)	10	N/A	N/A	OG5_226244	N/A

# Gene page and genome browser

## Synteny Views



Data mining interface



# Using comparative genomics towards understand pathogen evolution

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- How do traits like pathogenecity evolve?
- Can comparative genomics indicate meaningful differences that can lead to understanding the basis for pathogenesis?
- Contrasting genomes of pathogens with non-pathogens can suggest recent genomic changes that might be testable in the lab
- Gene duplication is thought to be important source for evolutionary innovation - What role might gene family size change play in adaptation?

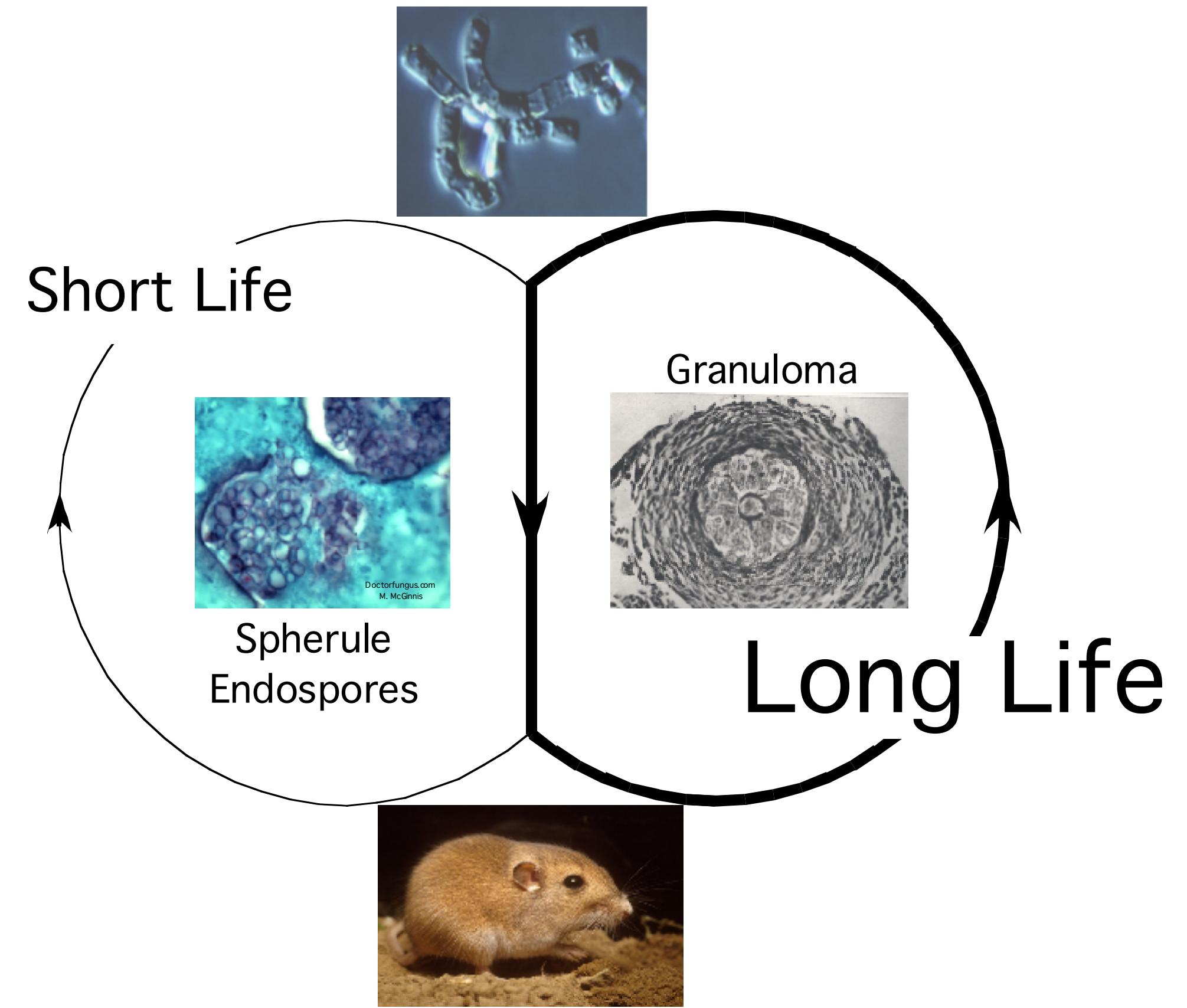
# Models for comparing gene family size changes

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- A model for gene family size change that incorporates the birth-death process of gene families which follow a power law distribution (Hahn et al, Genome Res 2005)
- Implemented in a program called CAFE to find unexpectedly large lineage or clade-specific changes in gene family sizes (Hahn Lab @Indiana Univ) (De Bie et al, Bioinformatics 2006)
- Can screen genome family sizes across multiple species to find expectedly large changes (based on counts) which can be verified using gene tree-species tree reconciliation approaches like Notung (Chen, Durand, Farach-Colton, J Comp Bio 2000)

# *Coccidioides*

- Fungal pathogen genomics: Gene families and appetite differences

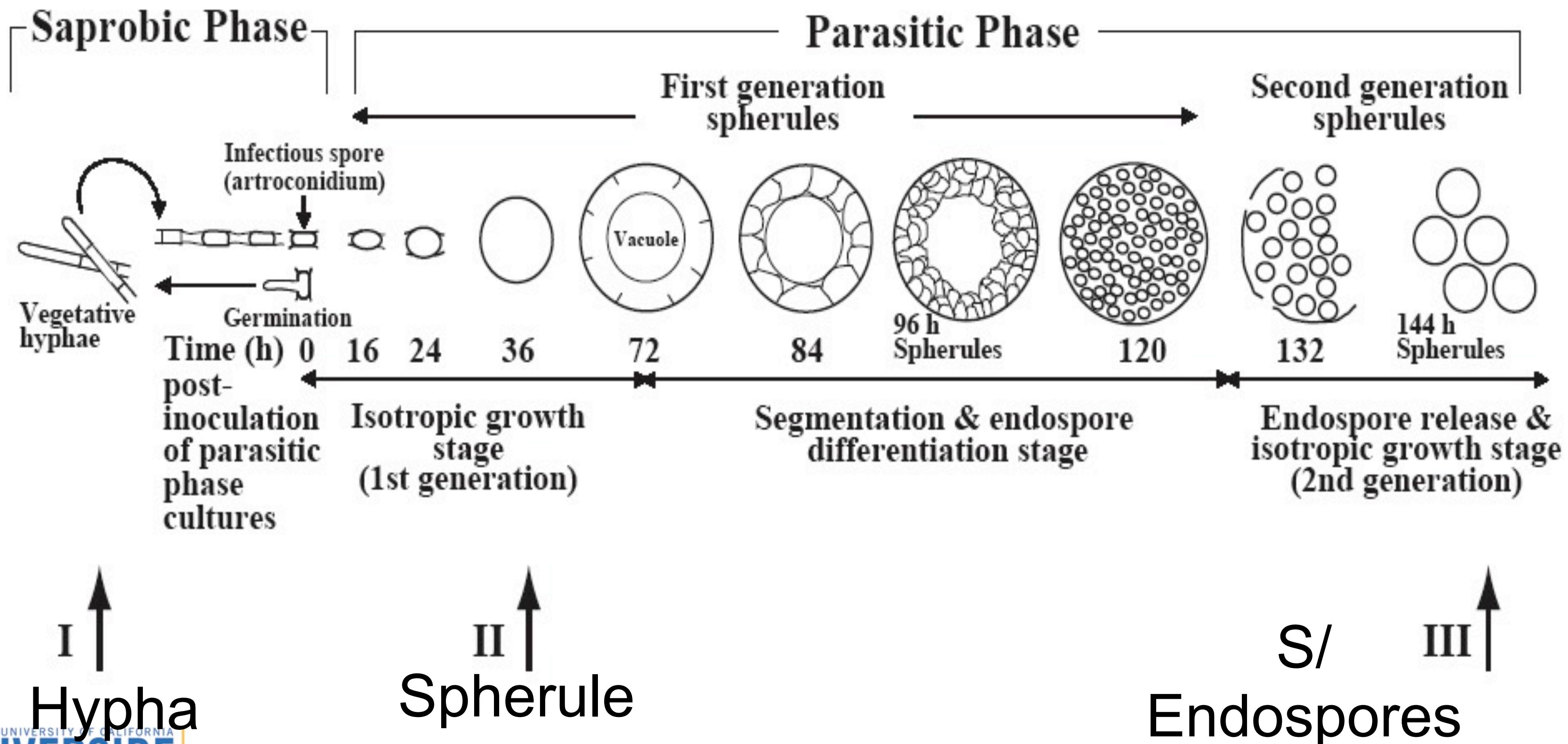


# Human pathogen *Coccidioides*

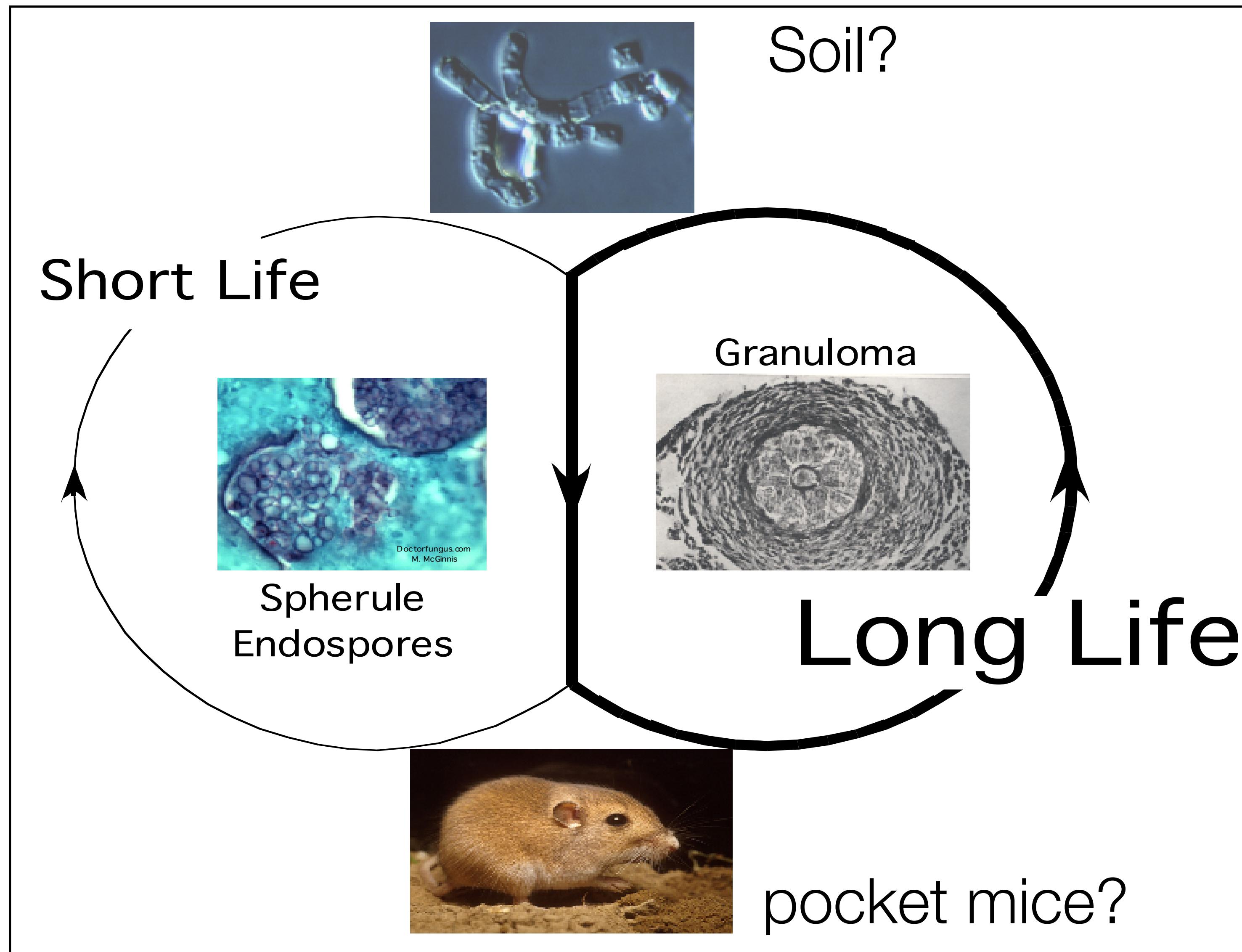
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- *Coccidioides* (Valley fever) - 2 species *C. immitis* and *C. posadasii*
  - Is a primary human pathogen - infects healthy people (most human pathogenic fungi are opportunistic)
  - Endemic in US Southwest, Mexico
  - Requires laboratory BSL3 and is a Select Agent
  - Genomes of 2 species (Sharpton et al Genome Res 2009) and then 18 strains (Neafsey et al Genome Res 2010)
- Comparative analyses of *Coccidioides* spp

# Human pathogen *Coccidioides* Life cycle

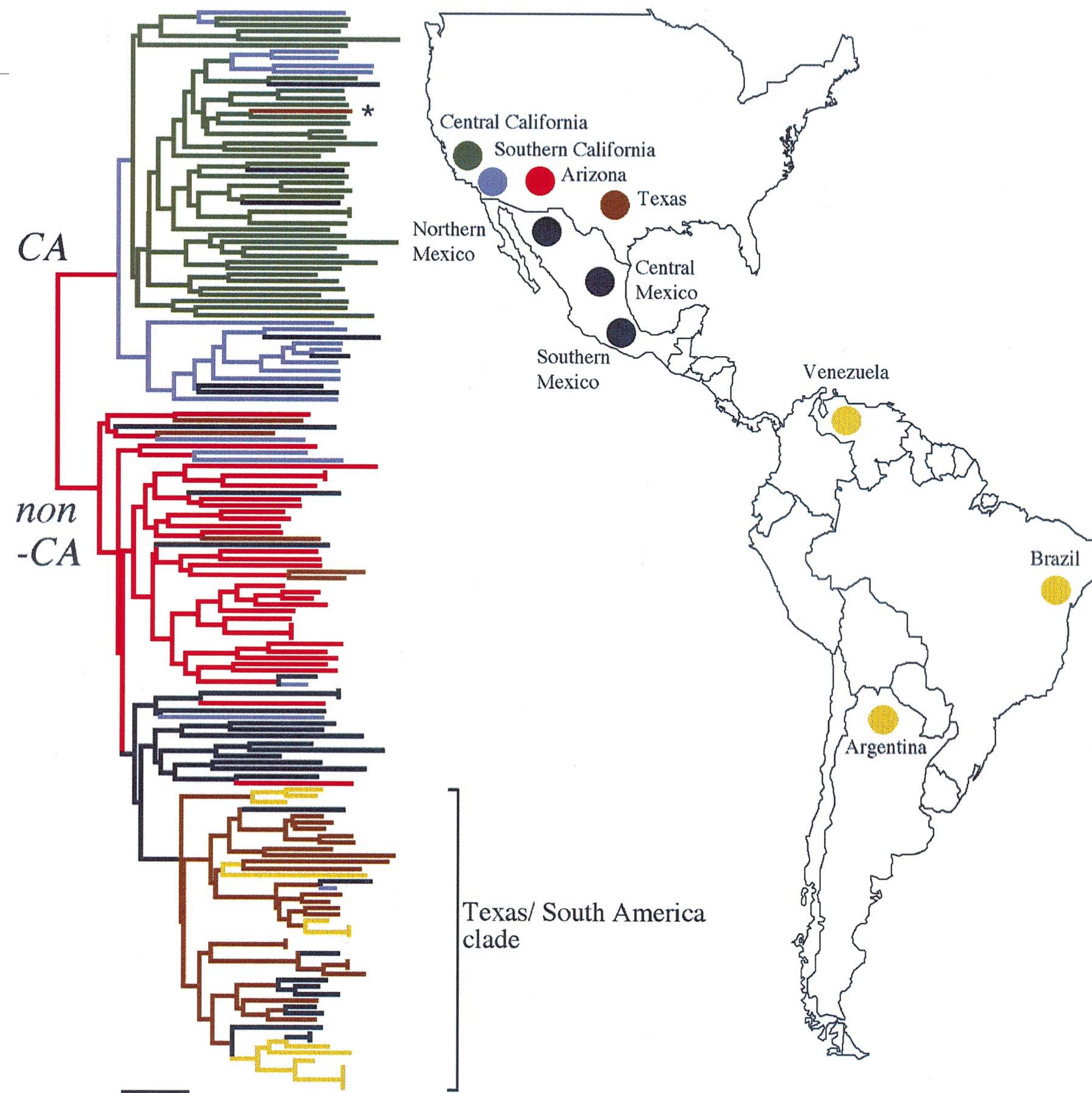


# *Coccidioides* ecology



# Two species of *Coccidioides* are allopatric

*C.immitis*  
*C.posadasii*



Fisher et al, 2000

# Studying the evolution of a pathogen

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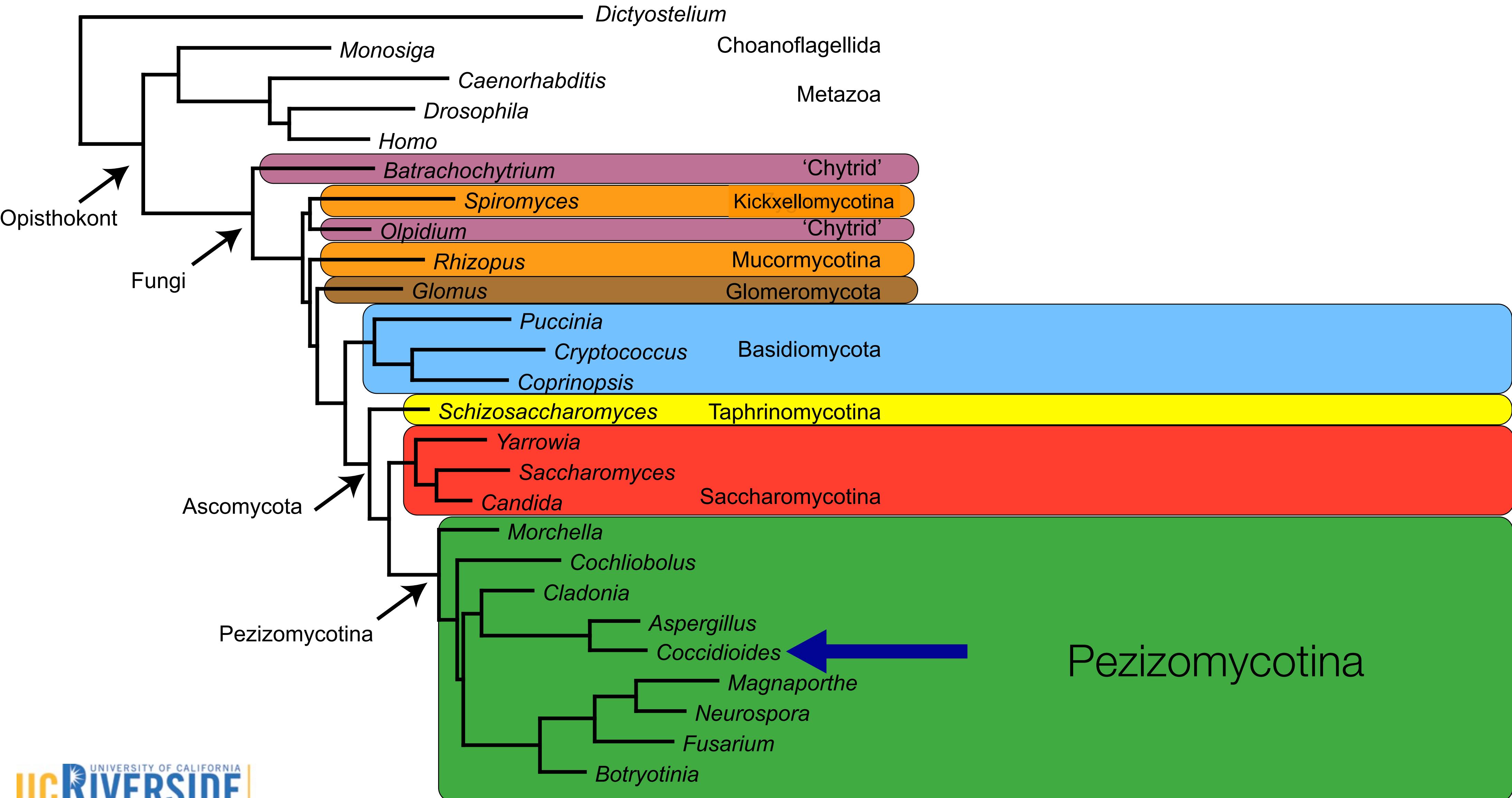
- Comparing sequences from two *Coccidioides* species, closely related outgroup, and more distant ougroups species:
- Evidence for recent positive selection
- What gene family differences can be identified that distinguish phenotypic groups (mammalian pathogens from non-pathogens)
- Evidence for recent introgression which contains candidate genes for pathogenesis

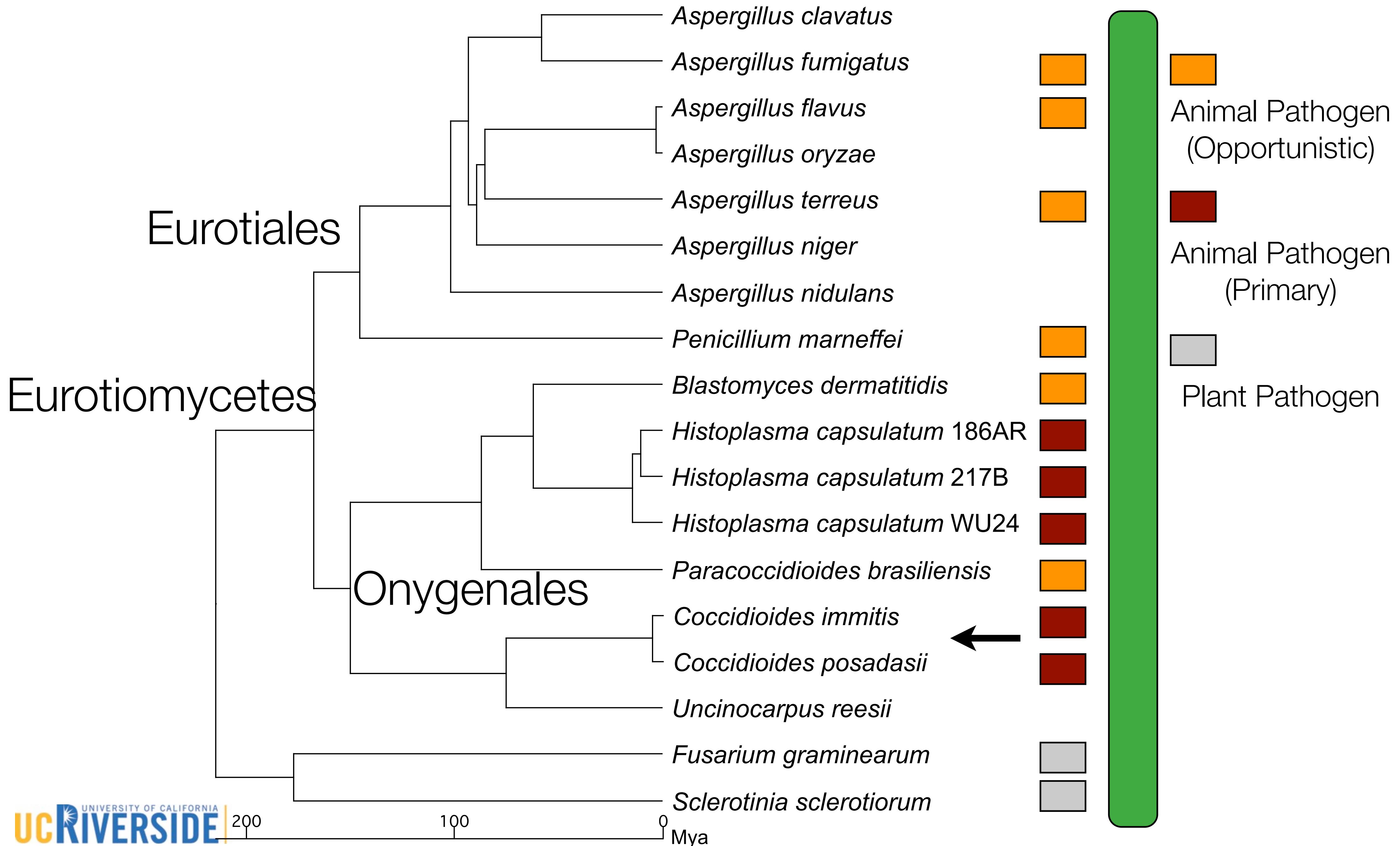
# Gene family changes

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- Another mechanism for adaptation may be changes in copy number of a gene family
  - Gene duplication is a source of novelty allowing for changes in the function of one copy if the other maintains original function
  - Expansions of copy number may also be an easy way to get more protein for a particular process
- How important is copy number change in adaptation?

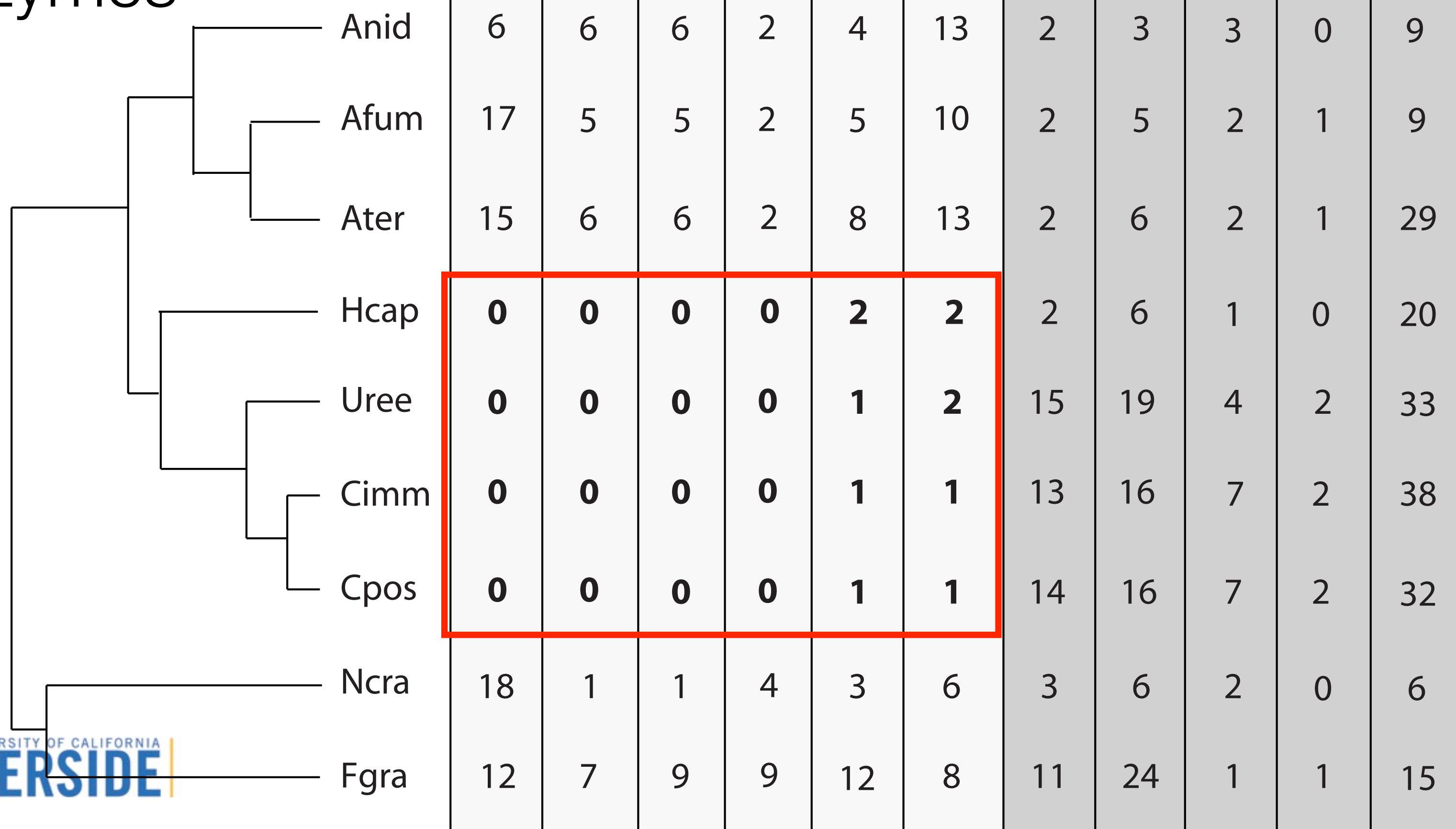
# Genome samples from fungi





# Few protein domains for eating plant material in animal pathogens

Loss of plant saprophytic enzymes



Animal Pathogen (Opportunistic)

Animal Pathogen (Primary)

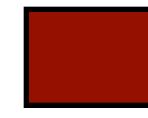
Plant Pathogen

# Domains for eating animal material?

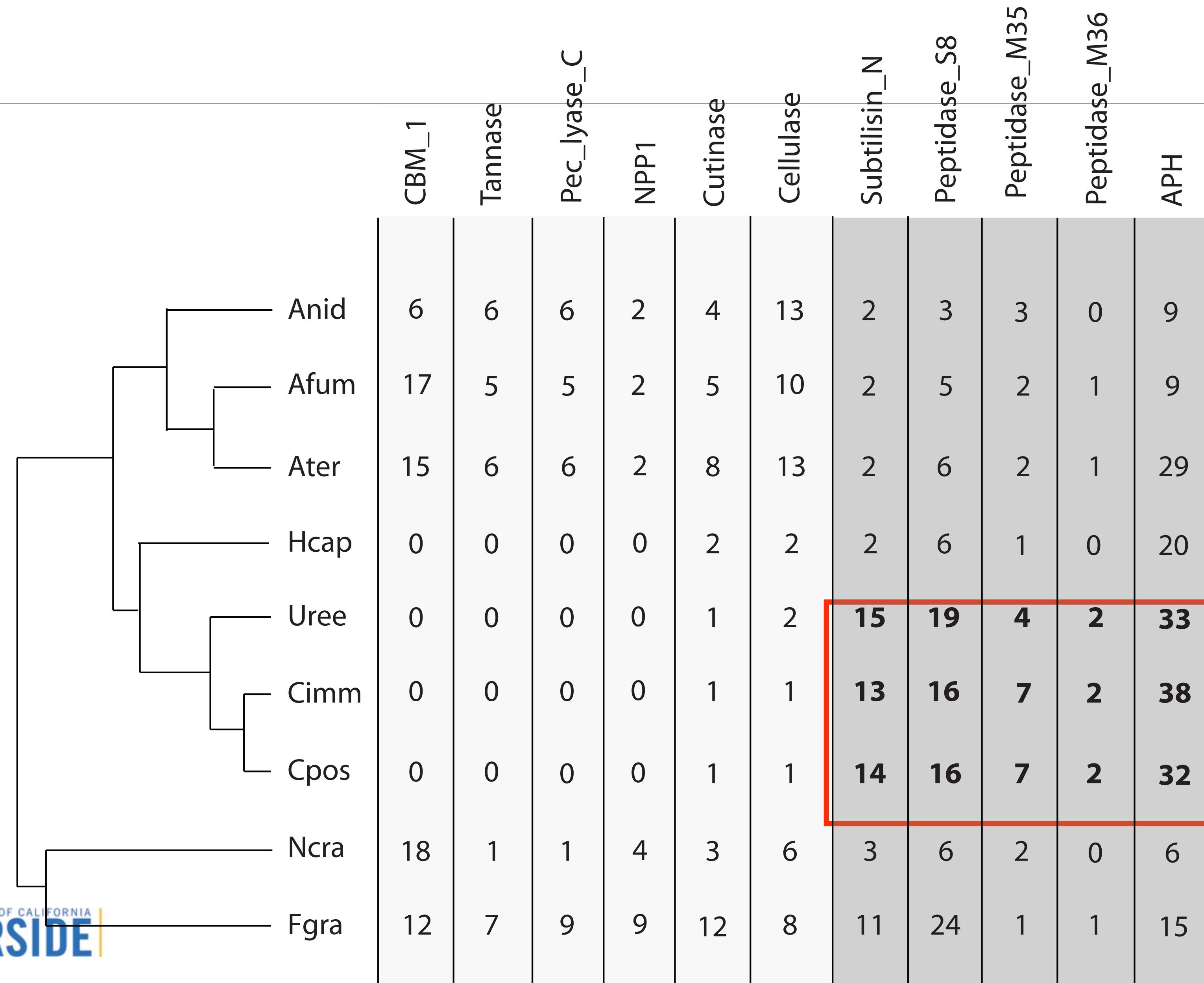
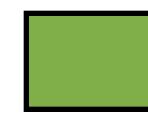
Animal Pathogen  
(Opportunistic)



Animal Pathogen  
(Primary)



Plant Pathogen



Sharpton, Stajich, et al, Genome Res. 2009

# Keratinases in Onygenales

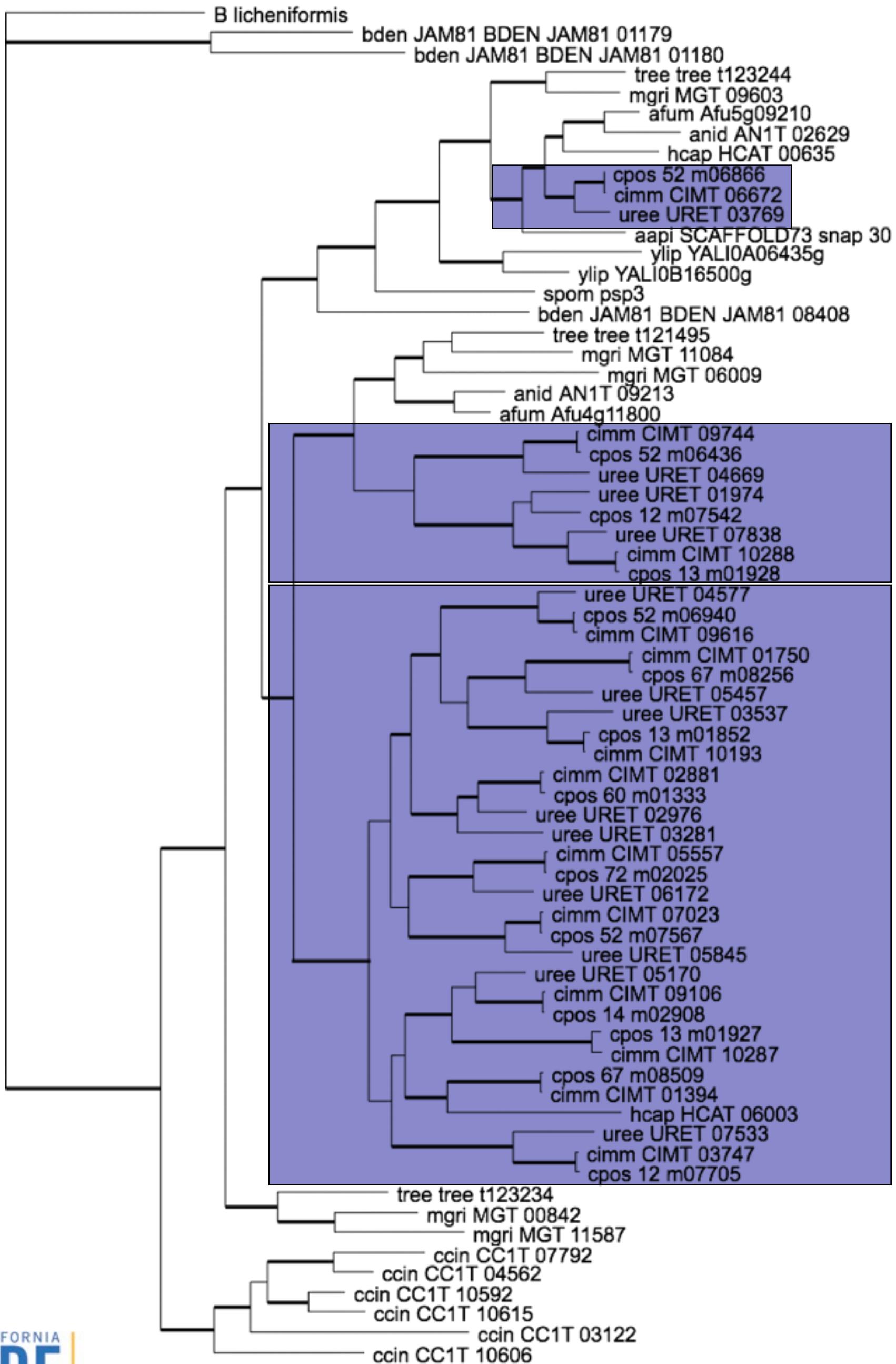
SignalP



- Onygenales are Keratinophilic
- Domains: Peptidase S8, Subtilisin domains
- Large expansion of putative keratinases in Onygenales

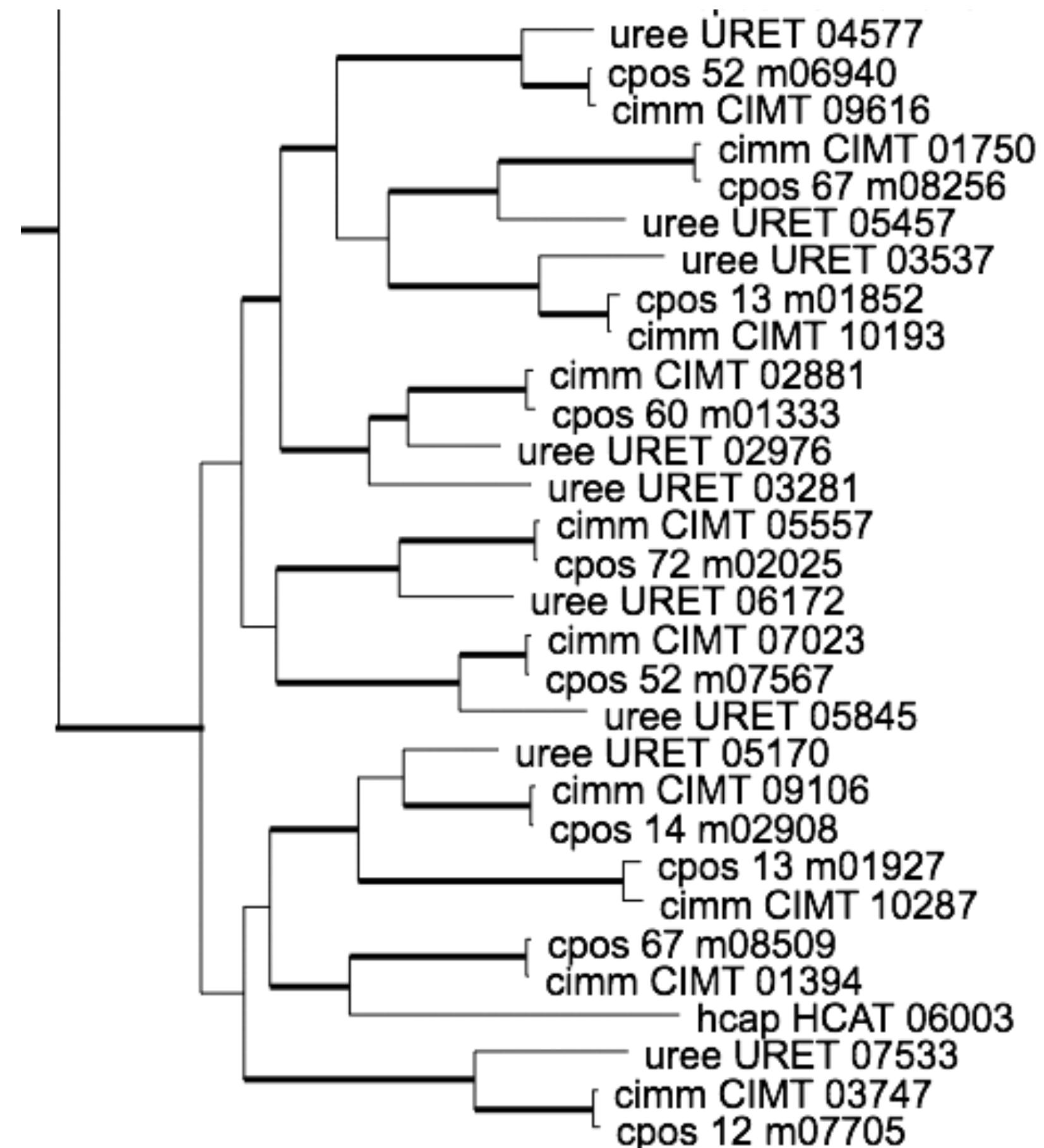
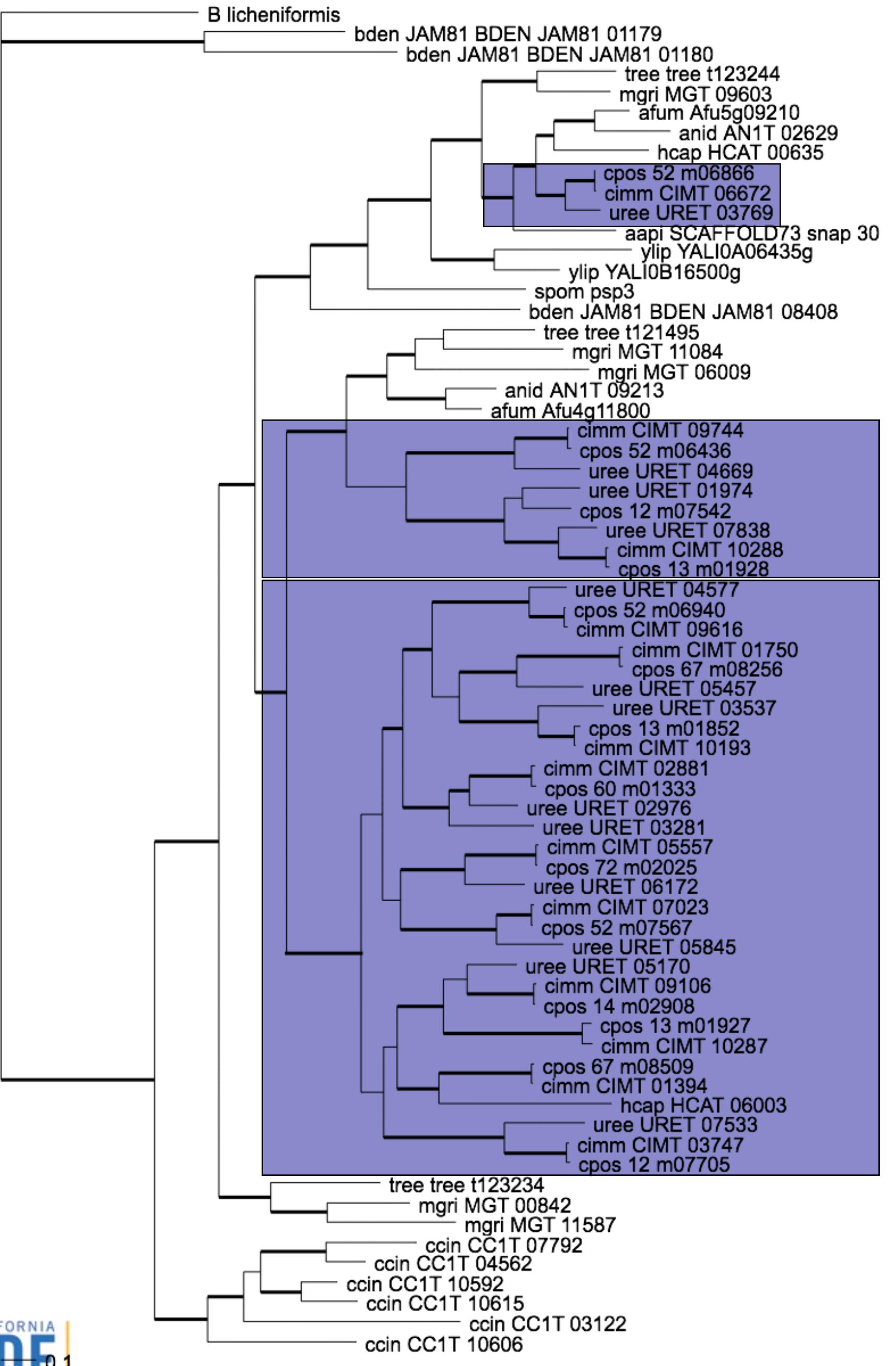
# Peptidase S8 expansion in Onygenales

14 copies in *Coccidioides*  
1 in *Histoplasma*



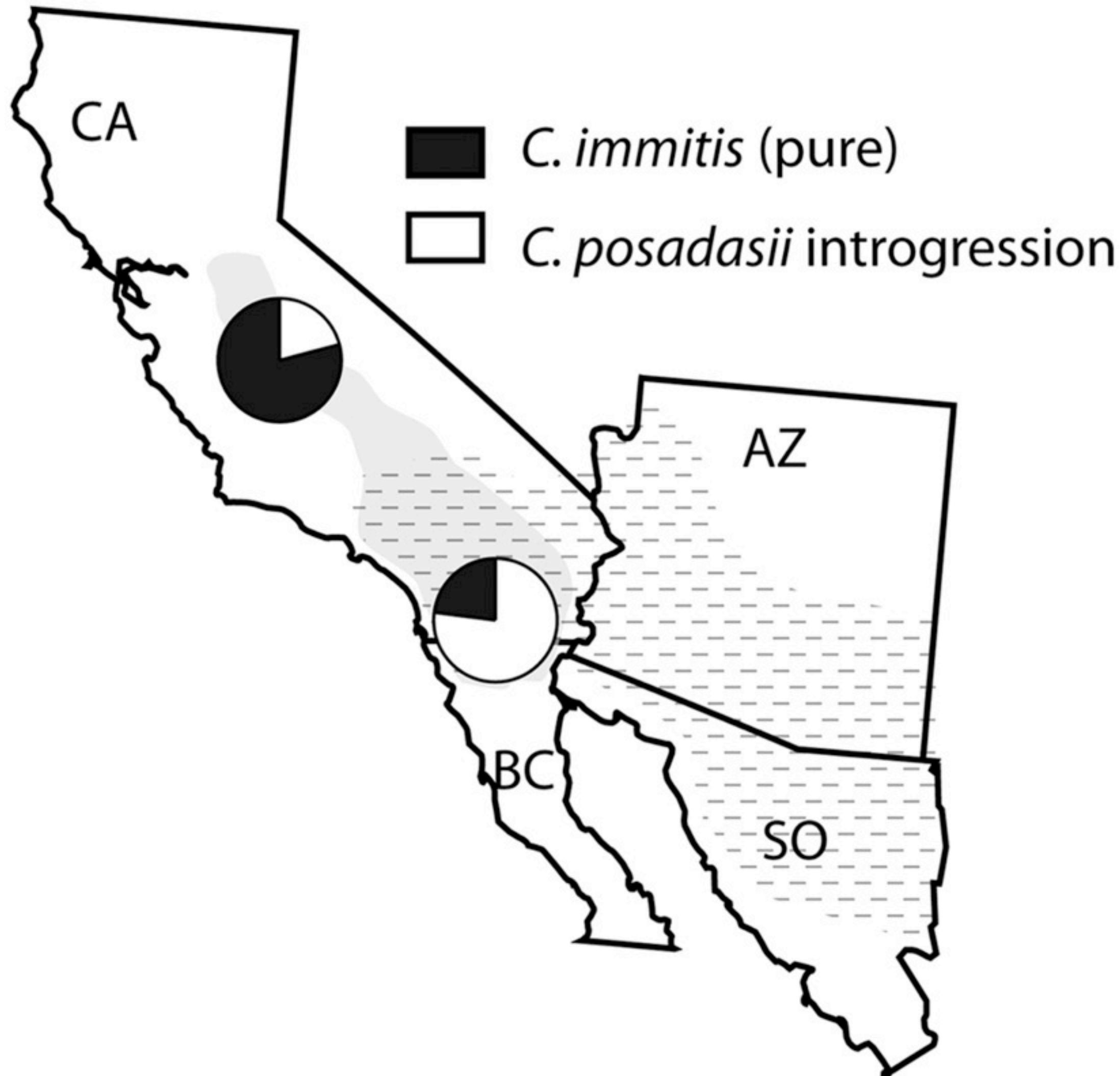
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# Population genomics

- Revealed no loci with evidence for balancing selection - so little evidence for long standing host-pathogen battle as in *Plasmodium*.
- Sliding window  $F_{ST}$  analysis revealed some regions of reduced divergence and followup revealed a regions of recent intergression. Directionality looks to be mostly from Cp and into Ci.
- One gene implicated in pathogenesis, MEP4, is found in introgressed region



# Towards identifying genes underlying adaptation

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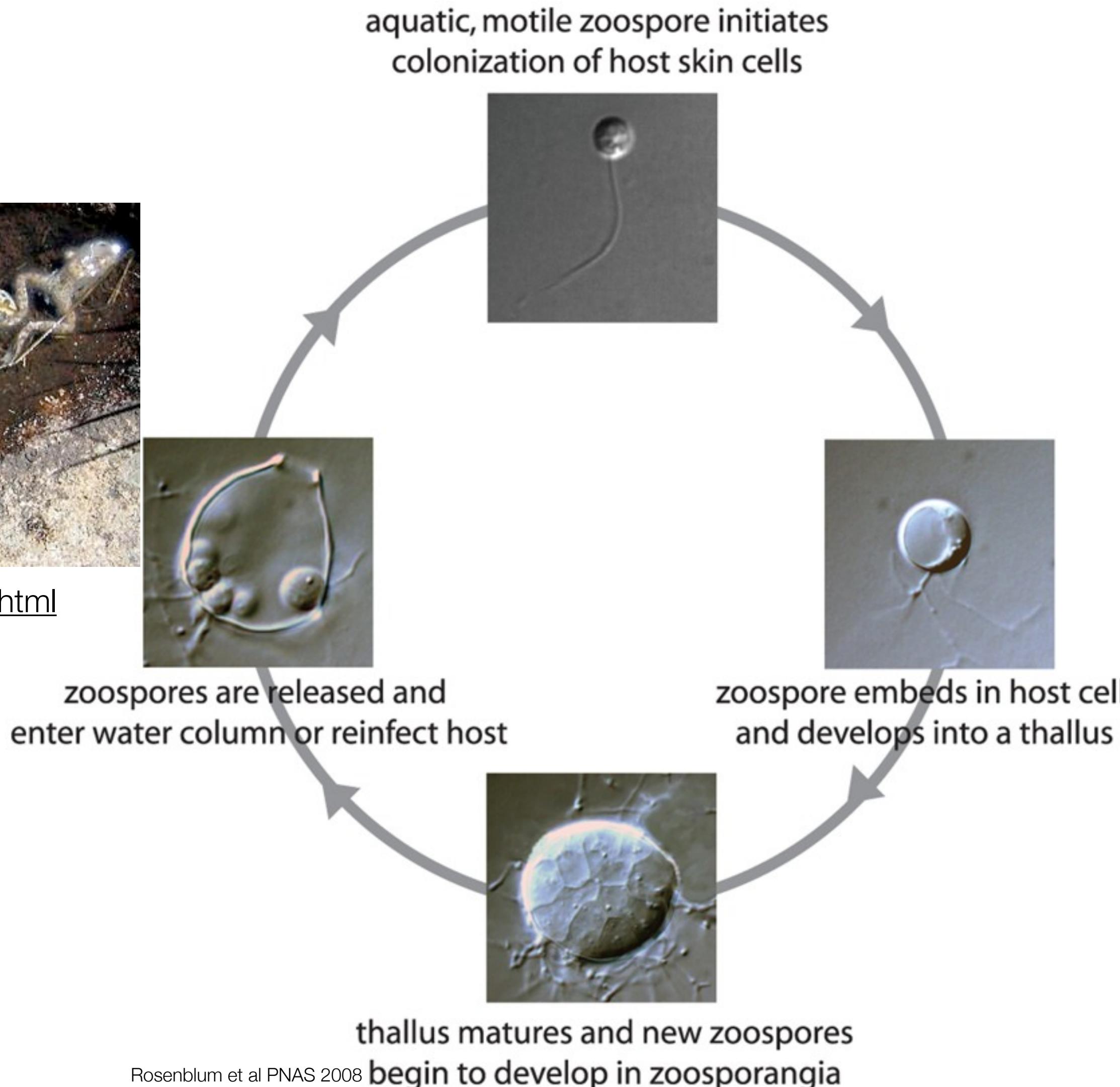
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- From population genetics analysis - failed to find regions under balancing selection suggesting there is not a long-term arms race between host and pathogen.
- Evidence for introgression between the species and perhaps imported novel alleles that are important for adaptation in both species to their animal hosts.

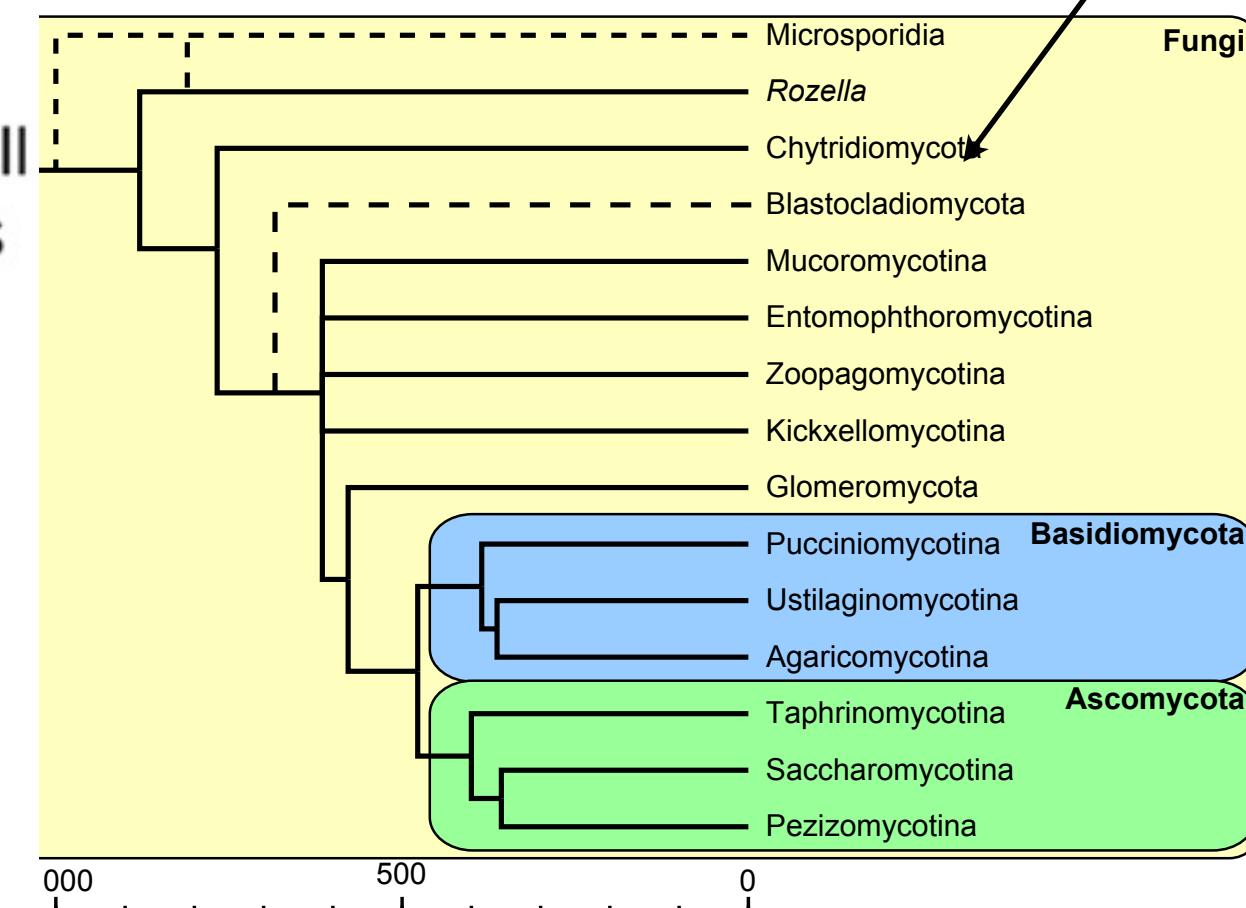
# *Batrachochytrium dendrobatidis* (*Bd*)- a major cause of amphibian decline



[http://cistr.ucr.edu/chytrid\\_fungus.html](http://cistr.ucr.edu/chytrid_fungus.html)



*Bd* is a Chytrid fungus



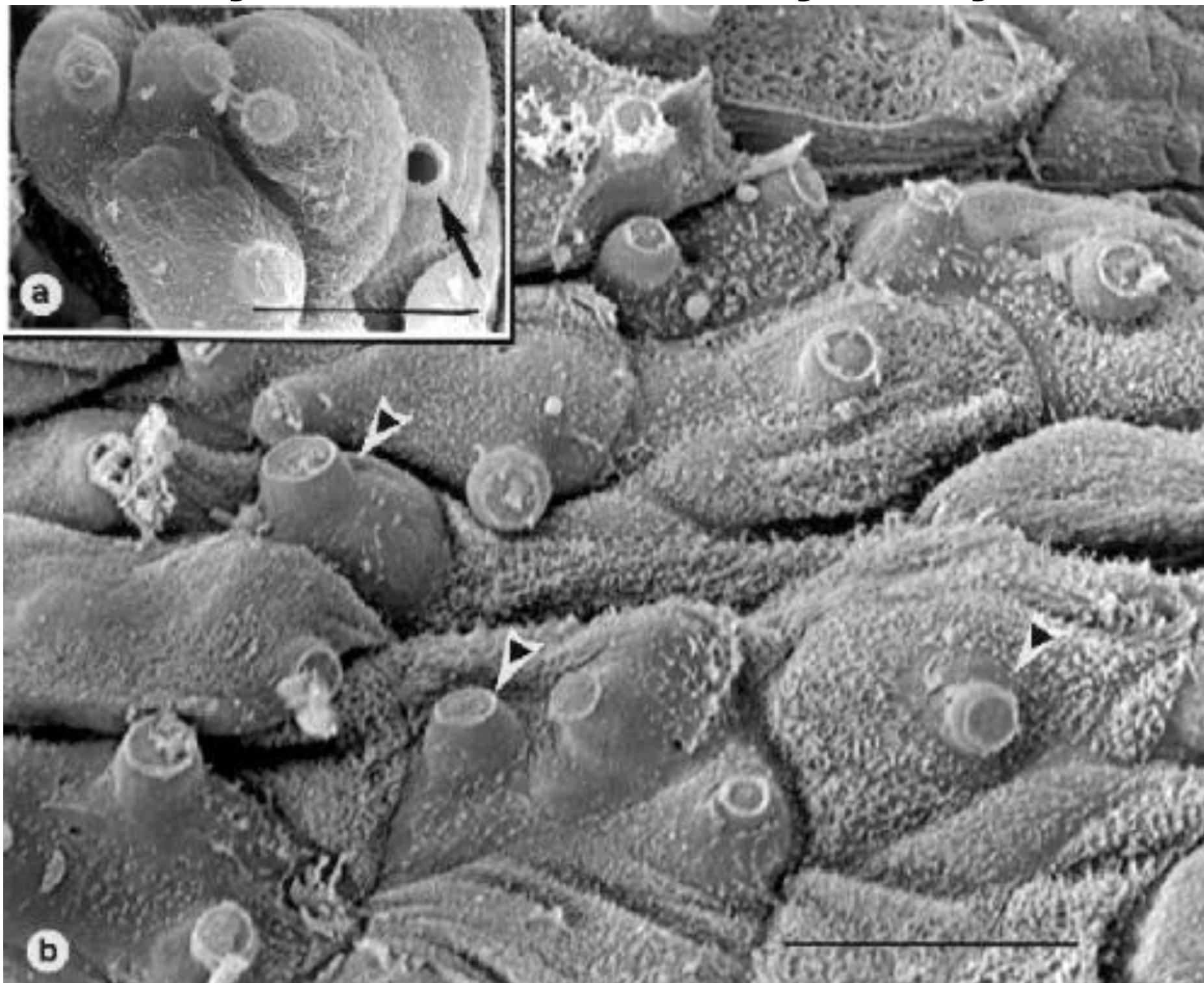
# Bd genome sequence projects

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- 2 strains sequenced at JGI and Broad; allow whole genome comparison between strains
- Found that genome is diploid, but with large regions with loss of heterozygosity (LOH)
- Identified gene family changes that might suggest mechanisms of pathogenecity
- Greater understanding of what the early fungus was like
- With collaborators we are sequencing 20 more strains for population genomics to better understand population dynamics, trace origin of diversity, and understand the LOH as independent or shared events.

# *Bd* grows intercellularly

Formally described by Joyce Longcore (U Maine) (Mycologia 1999)



Rick Speare, Lee Berger, Alax Haytt  
James Cook University, Townsville, Australia

# Phylogenomic profiling

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- For each gene in the target (*Bd*) genome, look to see which have homologs in other fungi, animals, plants
- Classify genes by its profile as to when it must have arisen based on identified homologs
- Also compare well-studied organisms (*S. cerevisiae*, *N. crassa*) to see which genes were missing
- For *Bd*/Chytrids several trends appeared
  - Missing: some cell wall genes, spindle-pole body
  - Present in *Bd* but not other non-chytrid fungi: Flagella, some signaling pathways, effector like proteins
  - Some expansions of gene families

# Fungal cell wall evolution- a view from earliest branches

Ergosterol

Plasma membrane

Yeast Cell Wall

GPI- anchored  
protein

What is the fungal cell wall  
made of? Sugar polymers

Chitin

$\beta$  (1,3) glucan

mannoproteins

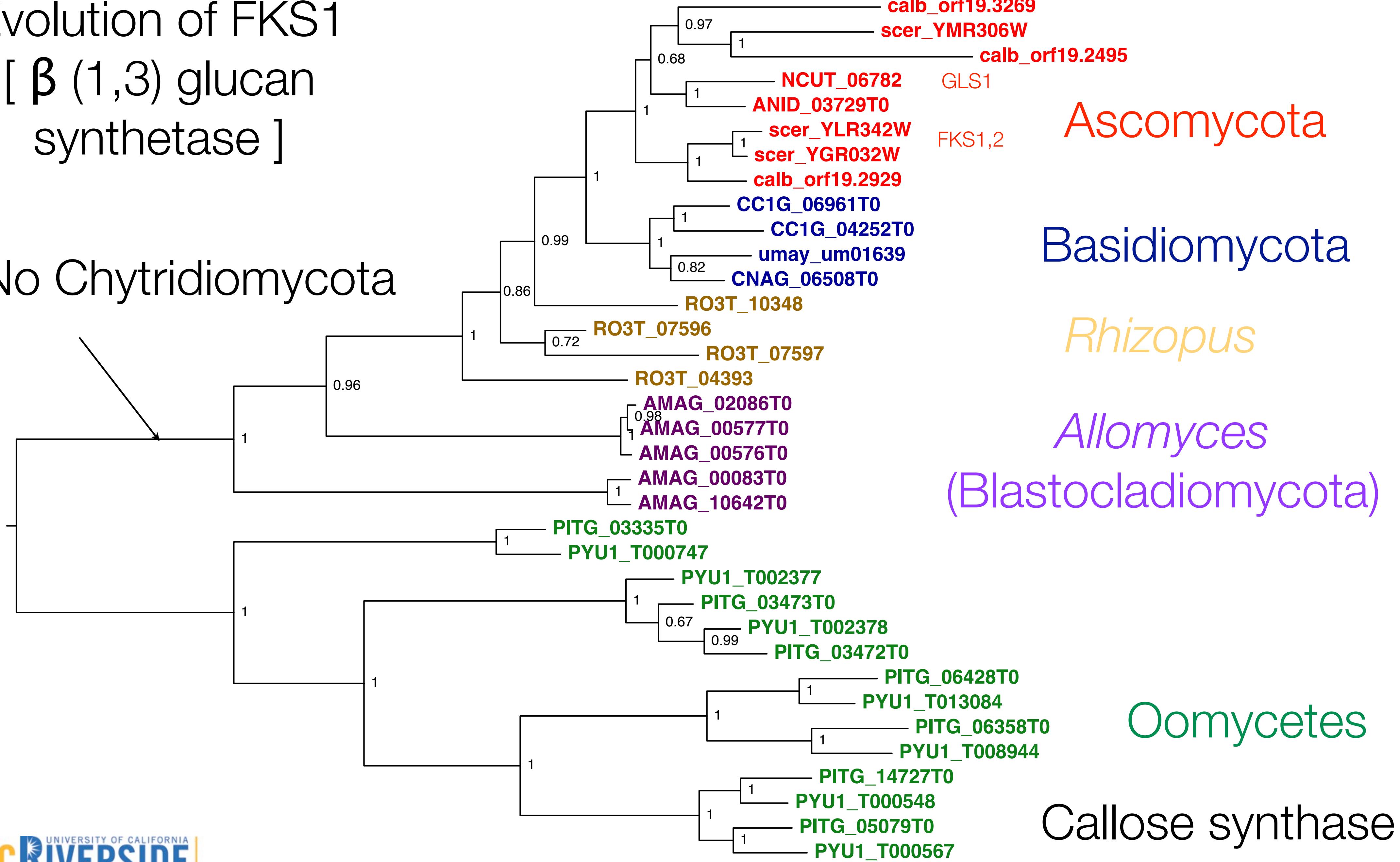
$\beta$  (1,6) glucan

Some fungi also have  
 $\alpha$  (1,3) glucan

# Evolution of $\beta$ (1,3) glucan synthase

# Evolution of FKS1 [ $\beta$ (1,3) glucan synthetase ]

No Chytridiomycota



Ascomycota

Basidiomycota

*Rhizopus*

Allomyces  
(Blastocladiomycota)

Oomycetes

Callose synthase

No 1,3 Beta-glucan?

## *B. dendrobatidis* cell wall biochemical analysis

$\beta$ (1,3)-glucan	$\beta$ (1,6)-glucan	$\alpha$ (1,3)-glucan	Cellulose $\beta$ (1,4)-glucan	Chitin
X	X	X	✓	✓

A putative cellulose synthase gene can be found in genome of Bd but also found in *N. crassa* and other Fungi

with JP Latgé, M. Fisher

## *B. dendrobatidis* cell wall biochemical analysis

$\beta$ (1,3)-glucan	$\beta$ (1,6)-glucan	$\alpha$ (1,3)-glucan	Cellulose $\beta$ (1,4)-glucan	Chitin
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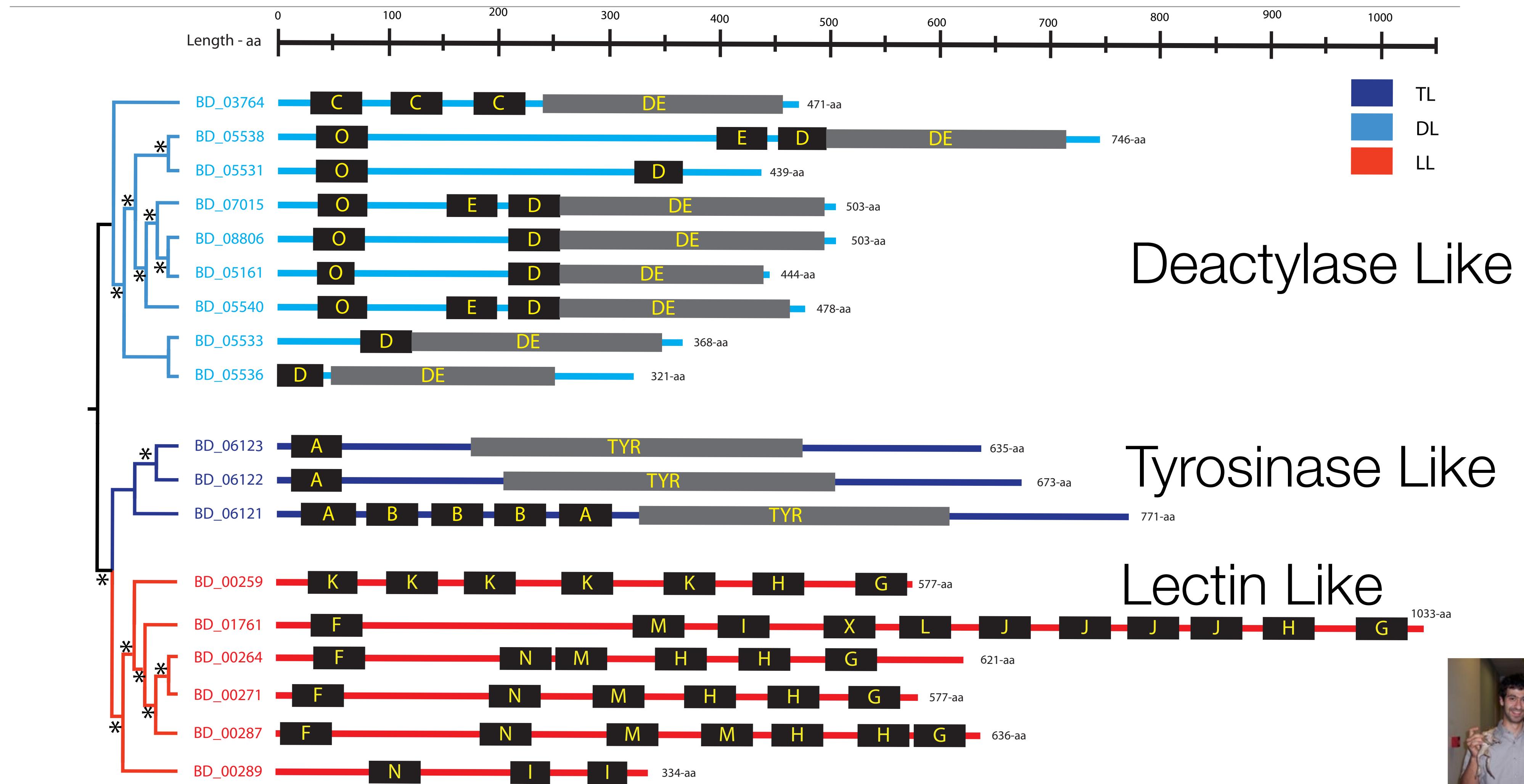
A putative cellulose synthase gene can be found in genome of Bd but also found in *N. crassa* and other Fungi

with JP Latgé, M. Fisher

100X higher MIC for Caspofungin than *C. albicans*

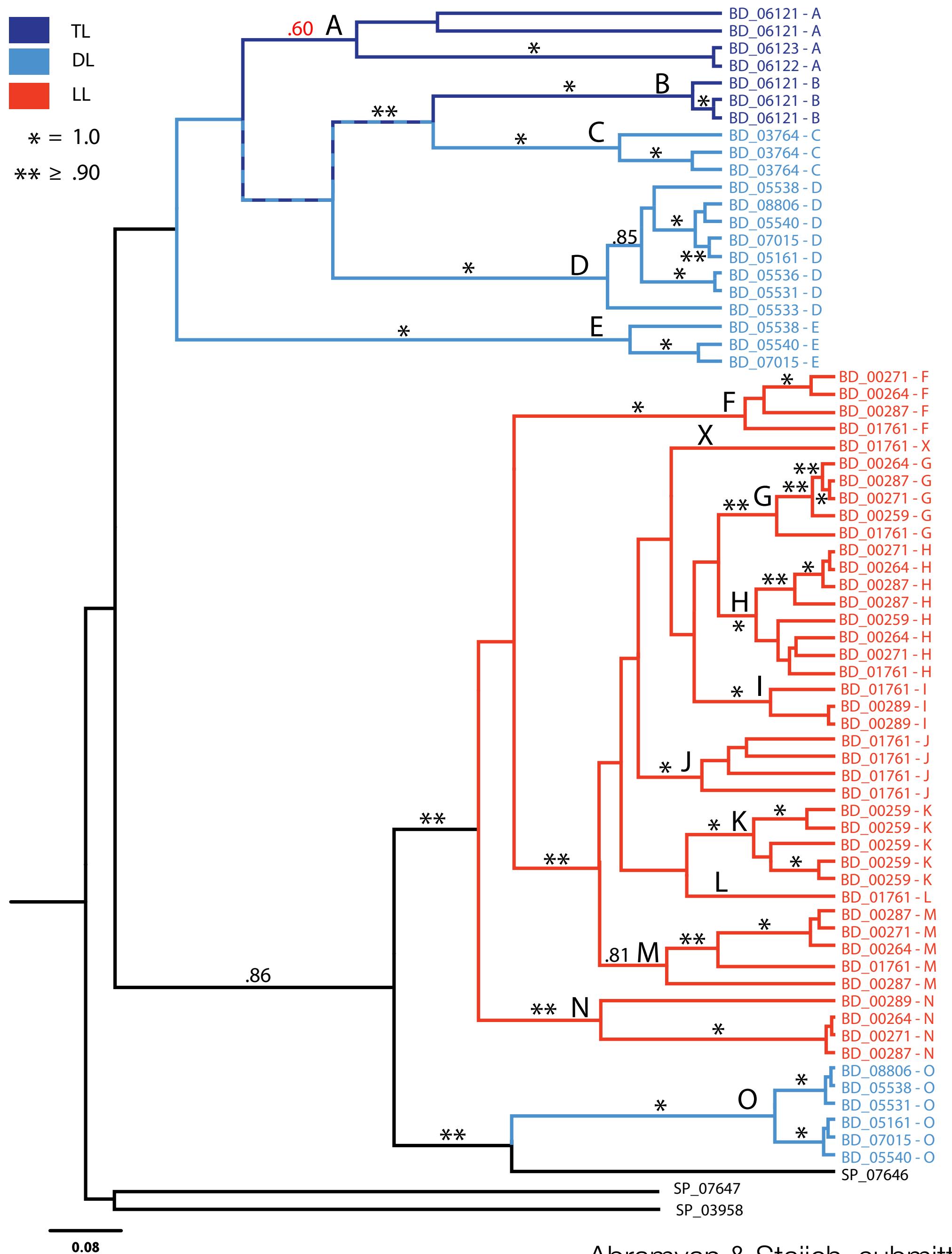
with N.A.R Gow & M. Fisher

# Expansion of CBM18 domain - Chitin binding gene family



# Domain tree shows clade-specific grouping

Domains evolved from mostly tandem  
duplications with some intergene  
duplications.



# CBM18 expansion

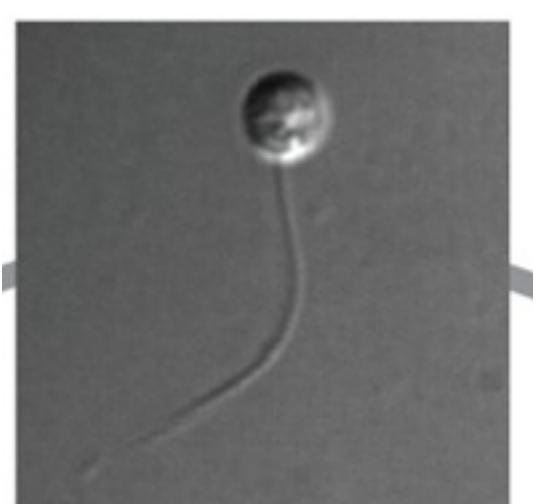
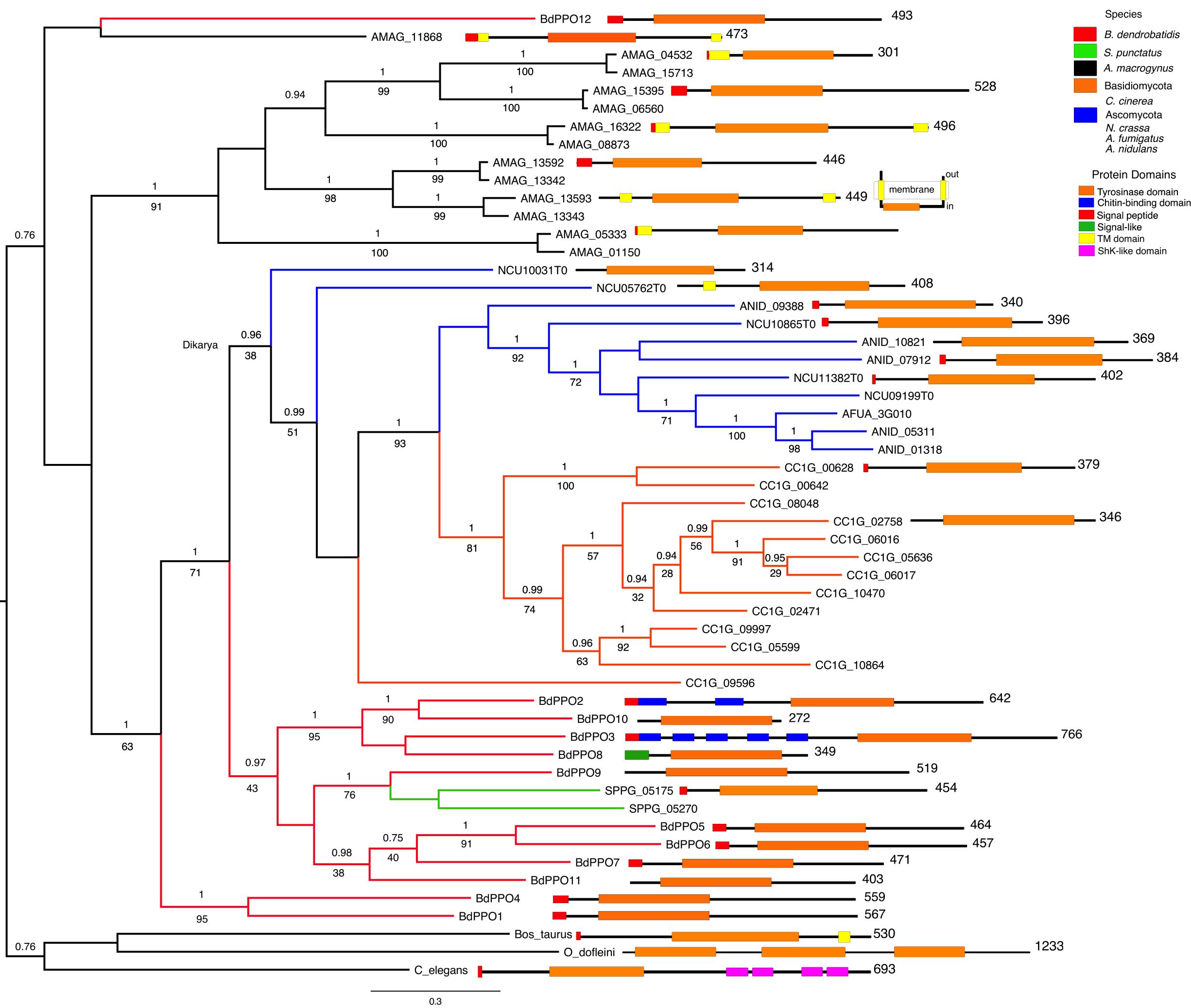
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- Largest copy number of CBM18 in all fungi, and most number of domains (11) in a single locus
- Evidence for positive selection among copies of the domains based on codon analyses
- CBM18 thought to bind chitin, could be involved in binding its own chitin to cloak the cells from the host immunity
- Could also bind chitin-related molecules in animals attach more firmly to the animal cells

# Tyrosinase expansions in *Bd* and other fungi

Allomyces

Synthesis of  
melanin,  
pigments  
and other  
polyphenols



E.Medina

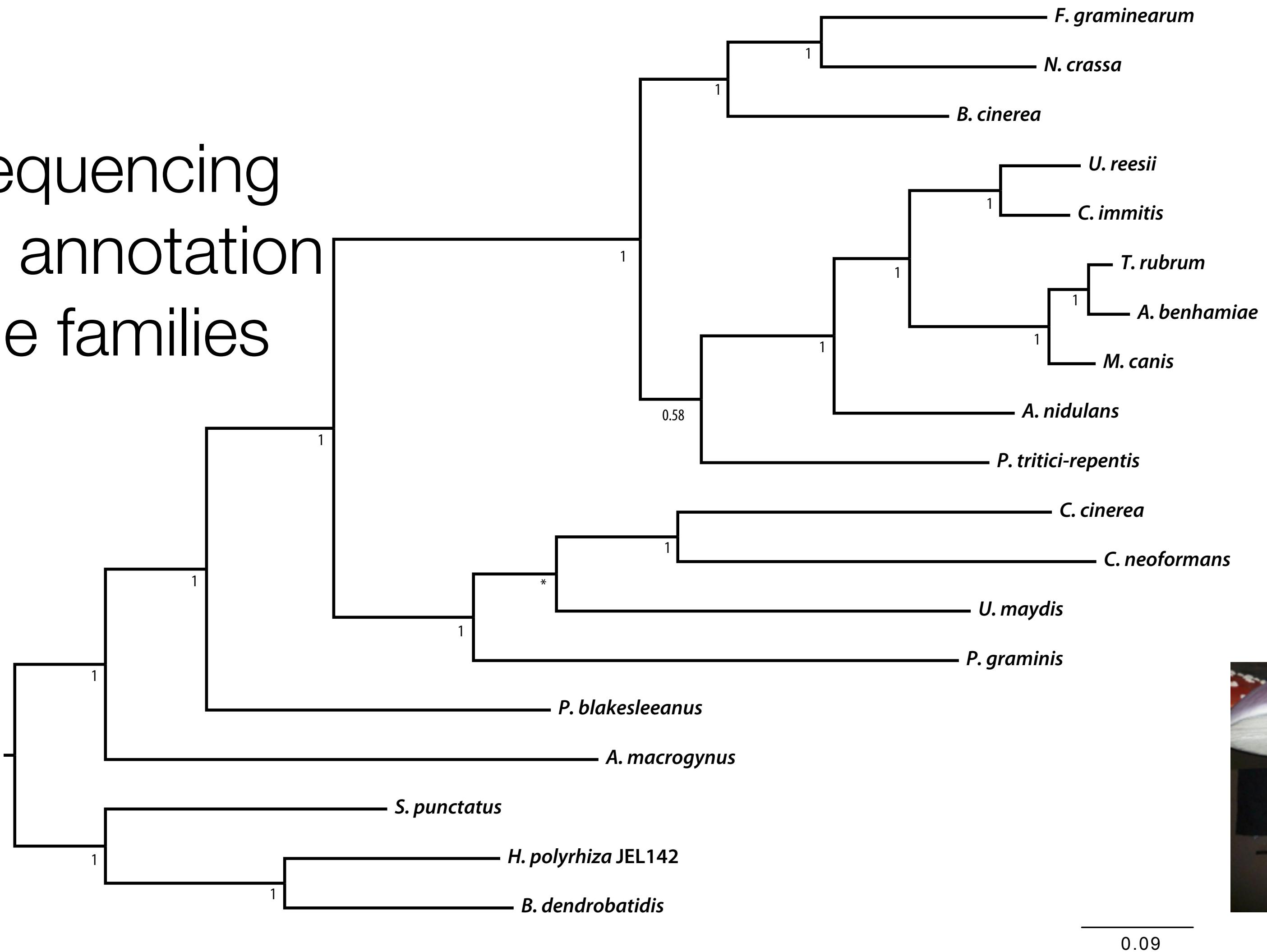
# But are these changes important?

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- Just observing big families in a genome is nice, but does it mean that changes are really related to recent adaptation?
  - The branches on some gene trees are short, indicating duplications are recent
- A better is to polarize the changes to the *Bd* branch by having a closer species than 50-100 Mya...
- So is there a species closer to *Bd* we can use? ...

# *Homolaphylictis polyrhiza* JEL142 is a close(ish) relative

454 genome sequencing  
MAKER genome annotation  
OrthoMCL gene families



# Contrasting some family sizes among the Chytrids

	<b>M36</b>	<b>S41</b>	Tyrosinase	<b>CBM18</b>
<i>Allomyces</i>	31	0	16	3
<i>Spizellomyces</i>	3	3	3	3
Hp	3-5	3	15	5
<b>Bd</b>	<b>38</b>	<b>32</b>	12	<b>14-16</b>

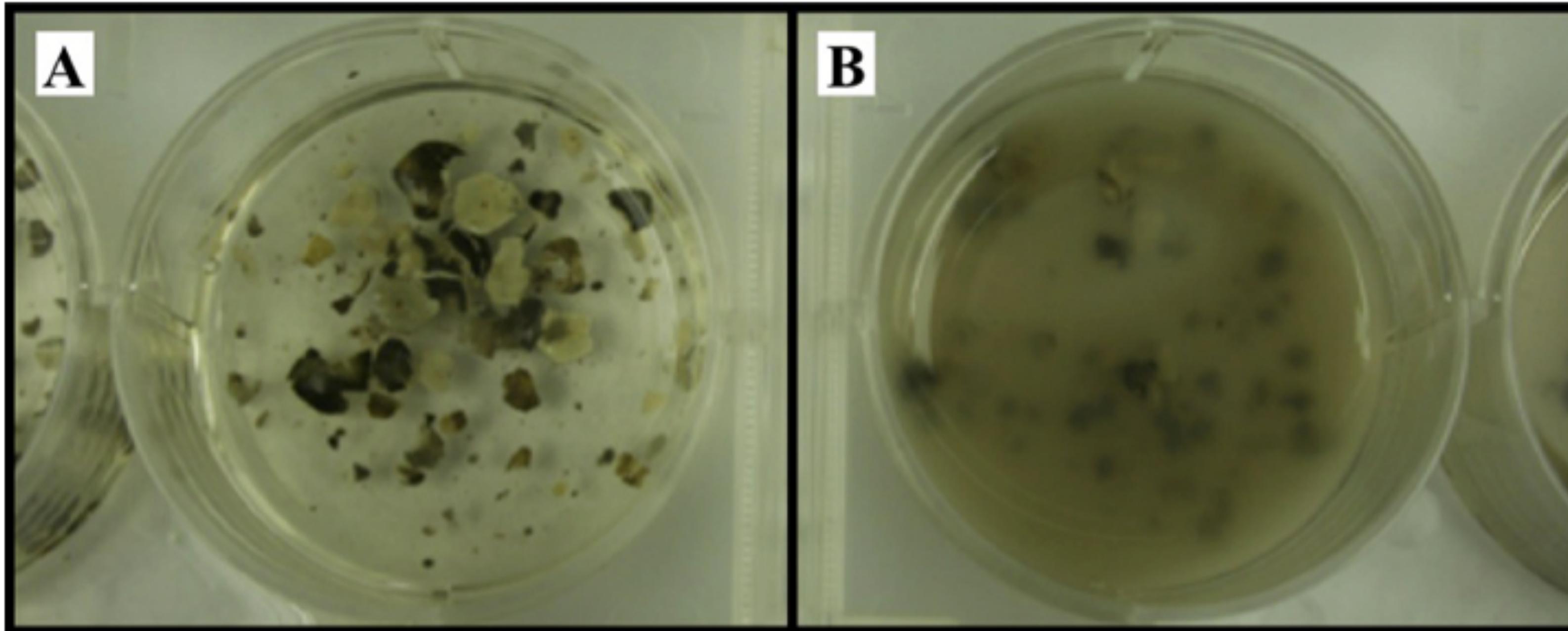
## Fungalysin      Serine protease

Fungalysins - thought to be keratinases (break down keratin in an amphibian skin...)

Serine protease expansions in *Coccidioides* and relatives maybe related to breaking down on animal matter

*H. polyrhiza* won't grow on frog skin; doesn't cause mortality in frogs

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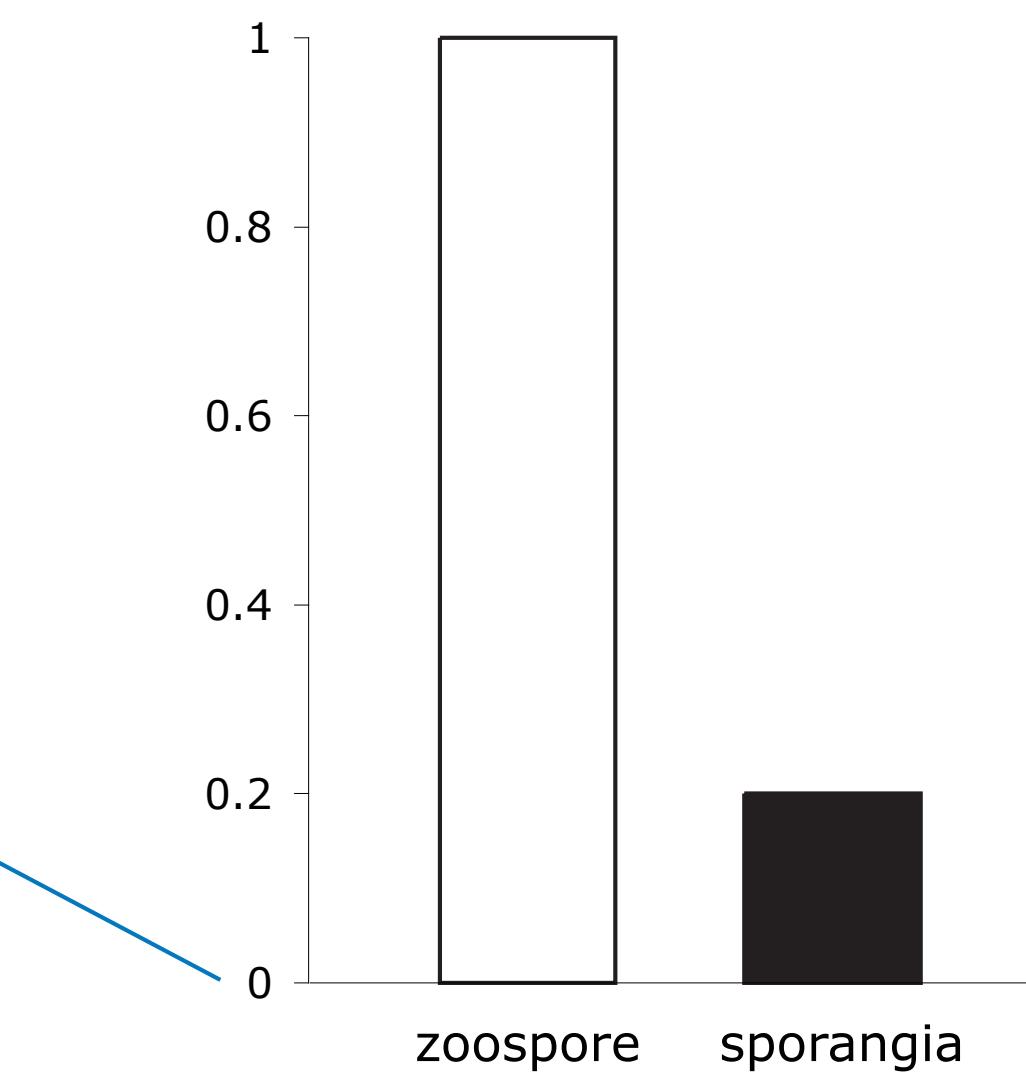
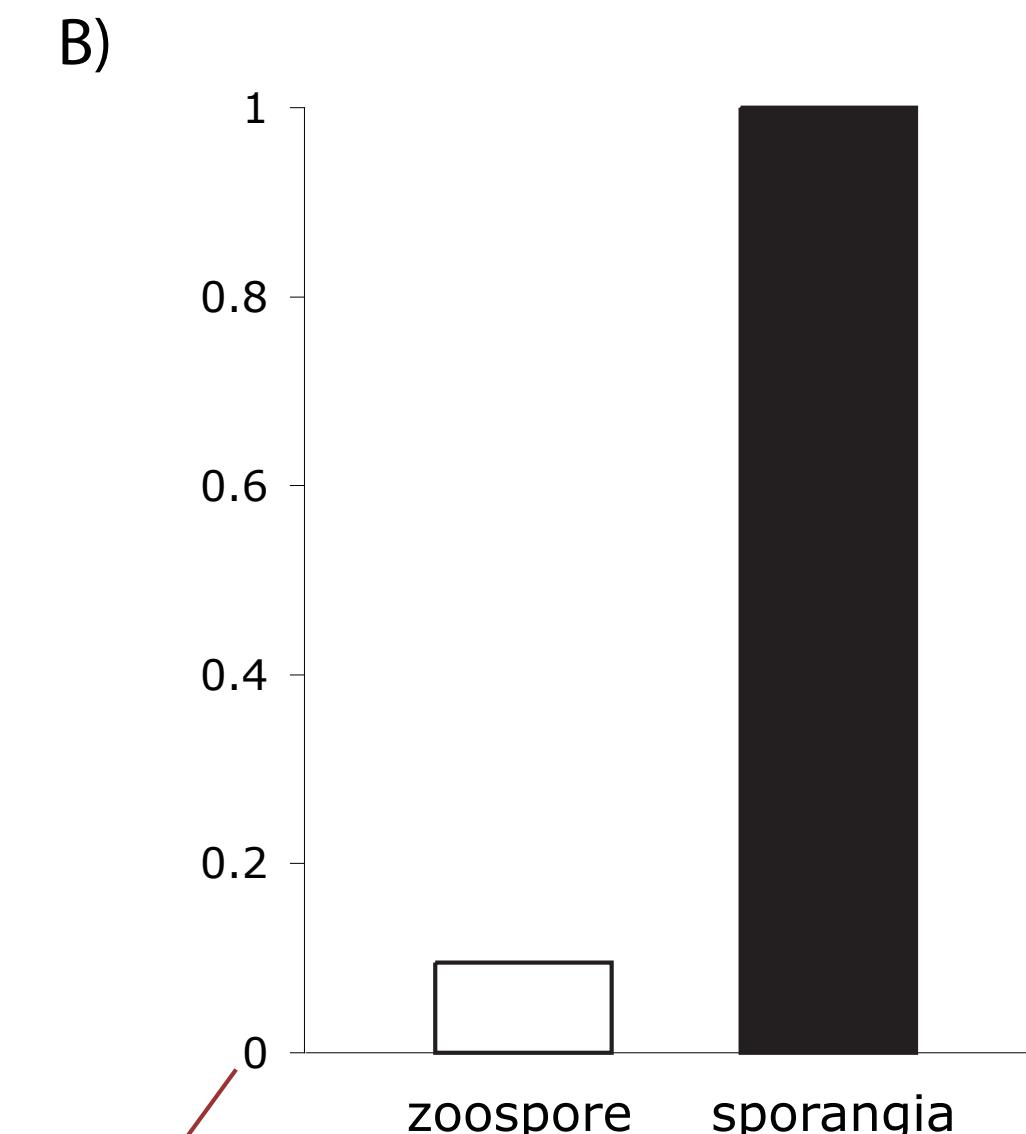
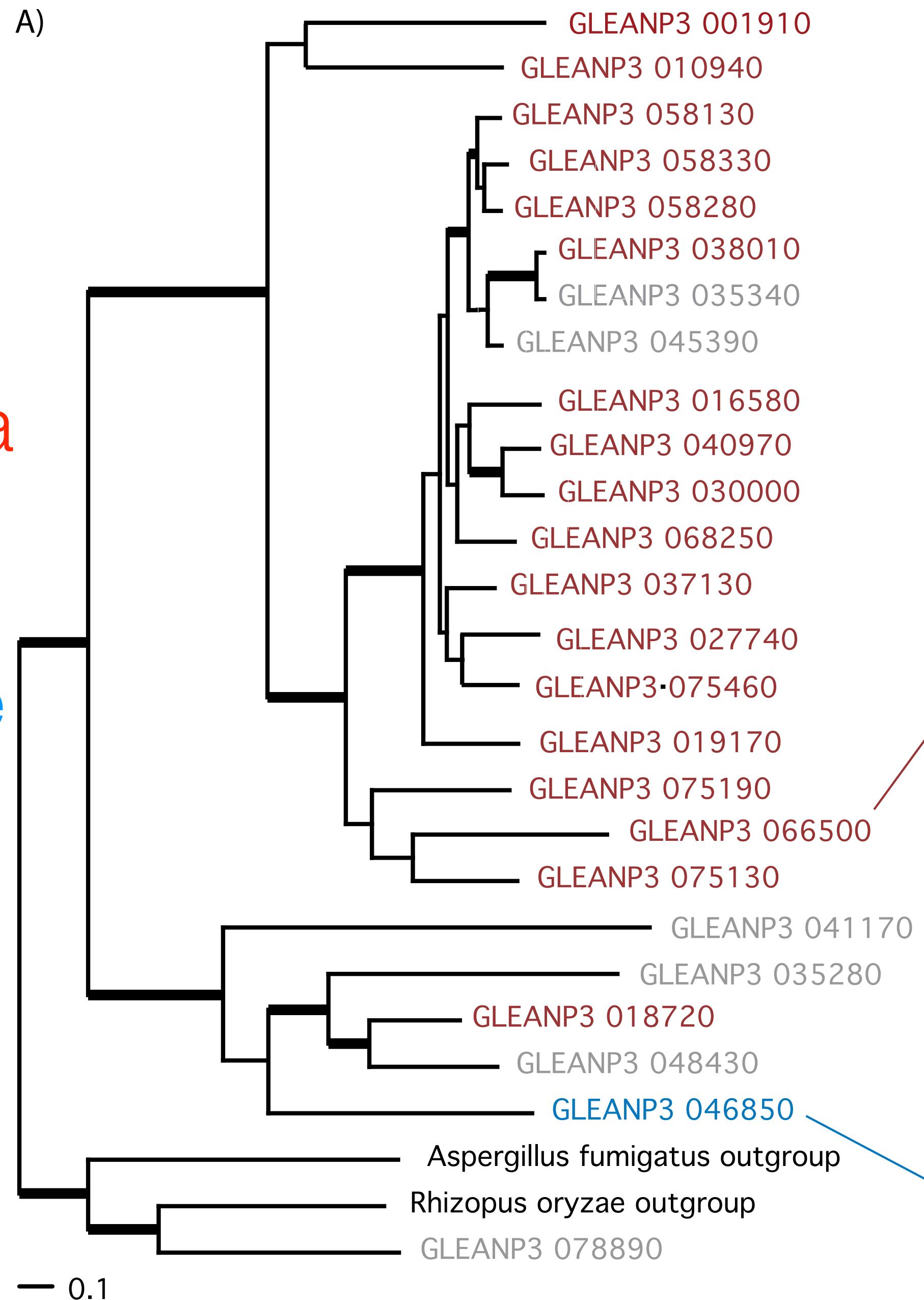
*Hp-* frog skin intact

*Bd-* frog skin degraded

Fungalysin  
M36

up in sporangia  
no expression  
diff

up in zoospore



# Bd summary

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- Comparisons to close species can polarize some differences in lineage specific expansions
  - Findings of M36, S41 expansions seem to be recent to *Bd* and could be a functional link to pathogenesis
  - Expansion of Tyrosinase from counts is less compelling, but gene tree analyses suggests recent expansions on *Bd-Hp* branch
  - Lack of FKS1 in early Chytridiomycota lineages suggests a more recent origin of this gene than origin of the Fungi and predicts timing of some changes in fungal cell wall composition
  - CBM18 expansion may be related to adhesion, future experiments to test this
- Future: We are employing a population genomic approach, resequencing 24 strains of *Bd* and hope to understand more about origins and variation in the genome from these data.

# Summary

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- Unraveling the evolution of pathogens can be tricky, more so when mode of pathogenesis is not obvious (e.g. not just a toxin gene)
- Comparative genomics at the scale of gene and gene families can suggest changes that may be important in adaptation of a species.
- Connecting these molecular changes to pathogenecity is still needed to understand the role these expansions may play - but provides rich experimental fodder for the laboratory.

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