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# *Microbial Ecology and Metagenomics for the Environment*

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Departments of Microbiology and Molecular Genetics  
and of Crop and Soil Sciences

Michigan State University and Yonsei University

2012 Metagenomics Workshop  
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Yonsei University, Seoul



MICHIGAN STATE  
UNIVERSITY

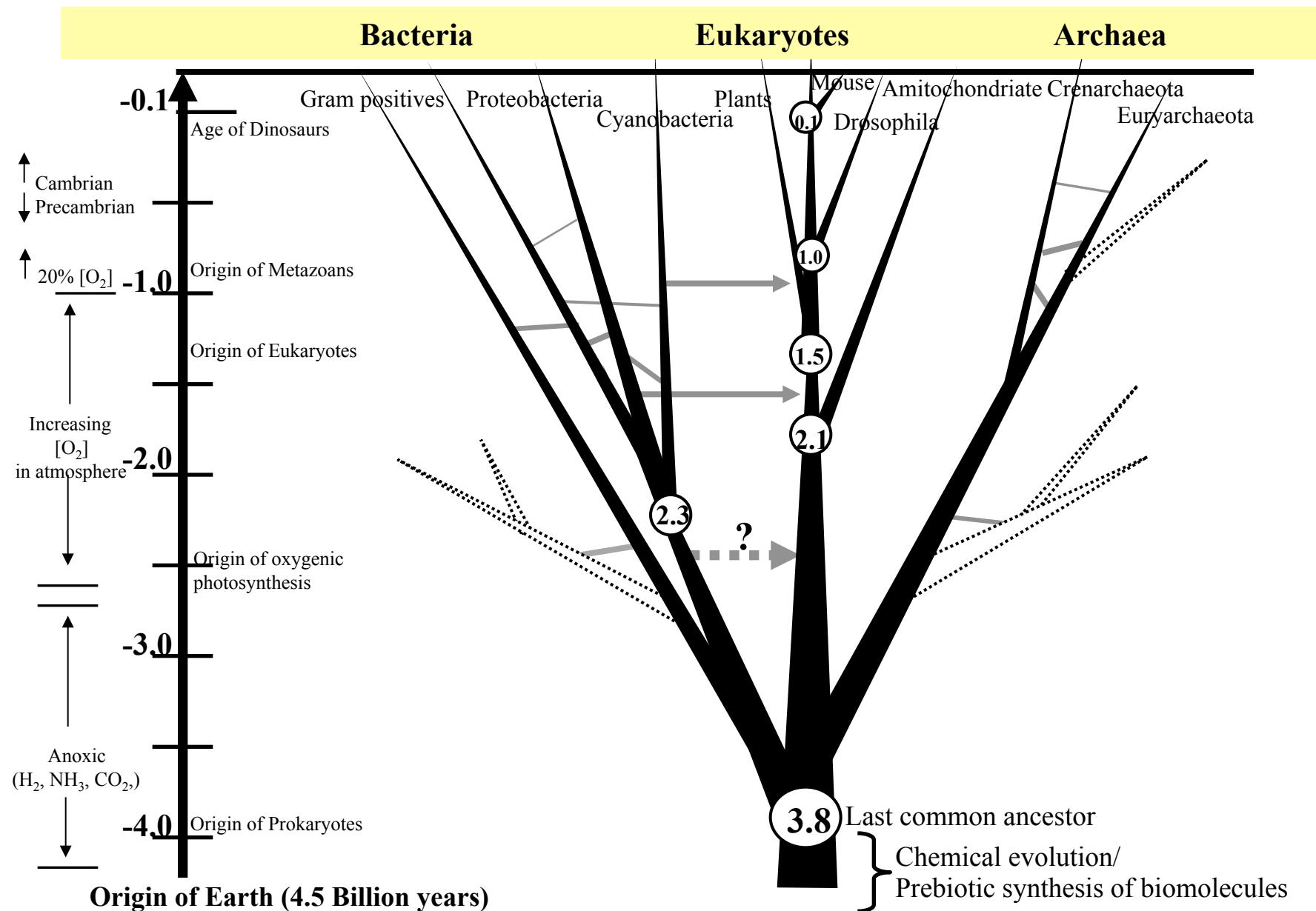


# Why is microbial diversity so high in soil?

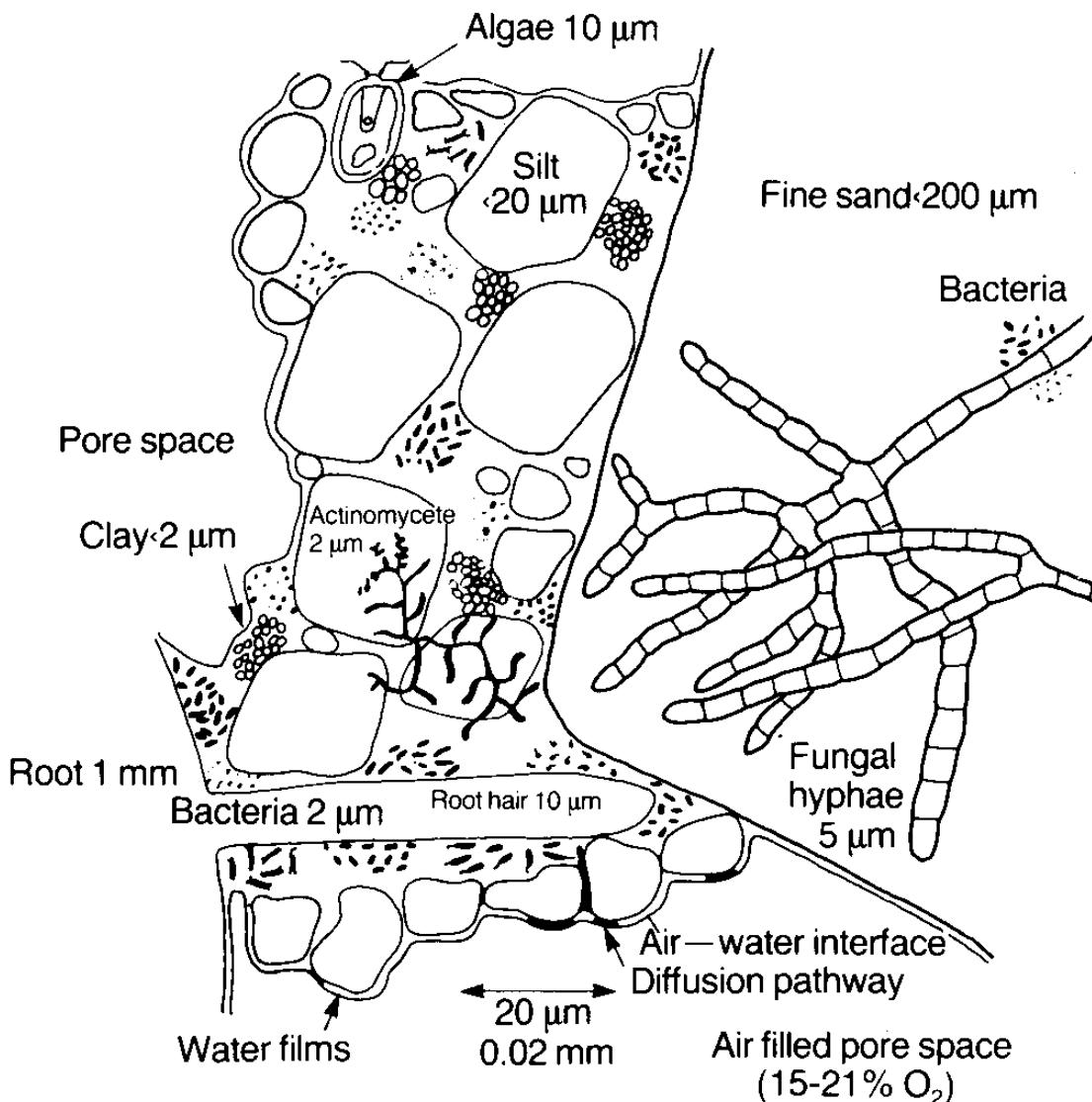
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- Current microbes are the product of 3.5 billion years of evolution, many remaining and adapting to the soil habitat.
- The soil environment has an almost infinite range of conditions, complex gradients, multiple resources and is very protective.
- The pangenome is the rule for microbial “species” and providing in huge gene diversity within each “species”.

# The Tree of Life: the Microbial World is OLD



# The soil habitat is complex, many niches



Soil is a composite of communities, a complex of subhabitats.

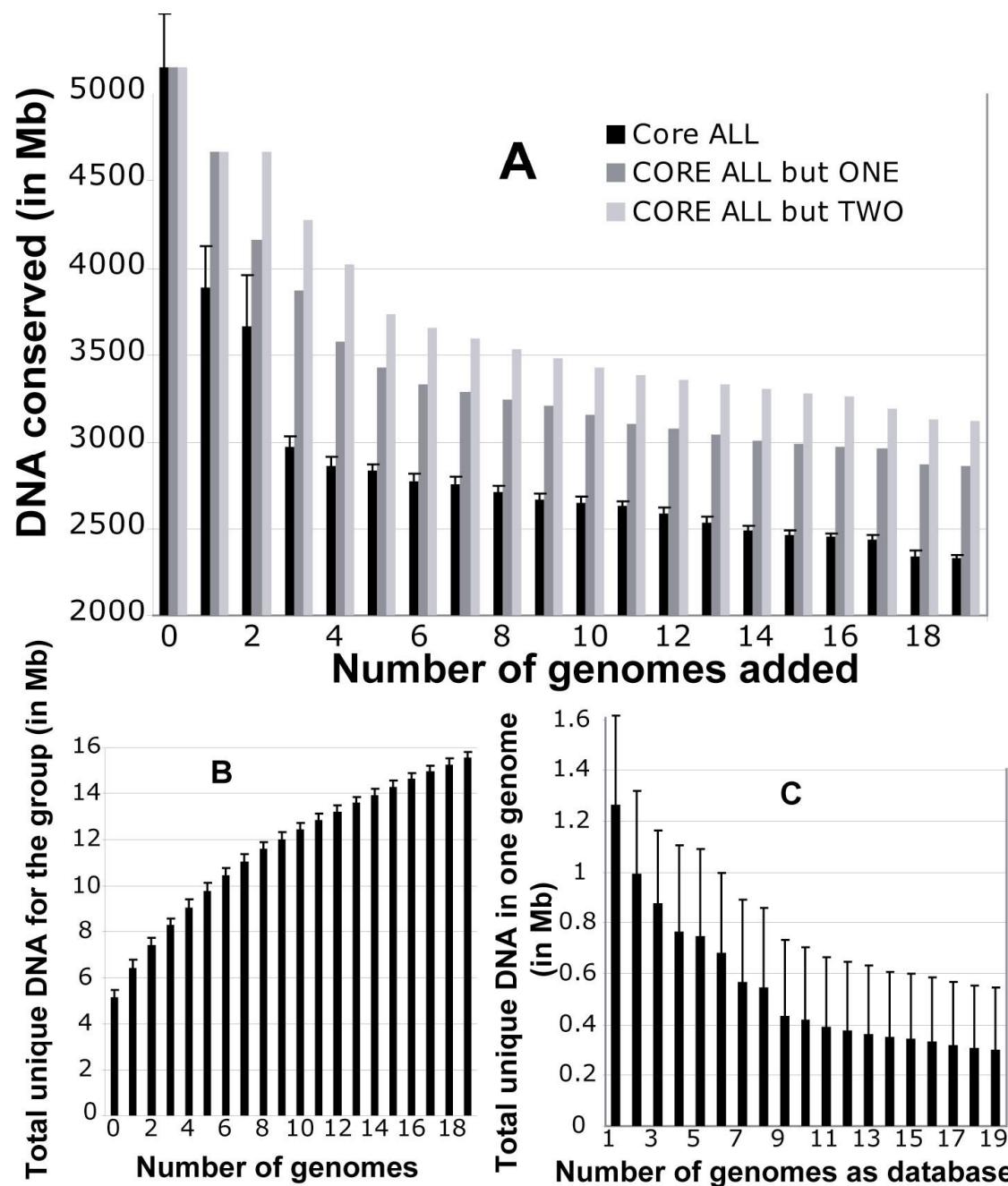
- microaggregates
- rhizosphere
- mycosphere
- fauna
- pore surfaces
- OM coatings

It's relatively

- stable,
- extensive,
- ancient,
- protective

## One example: *E. coli*

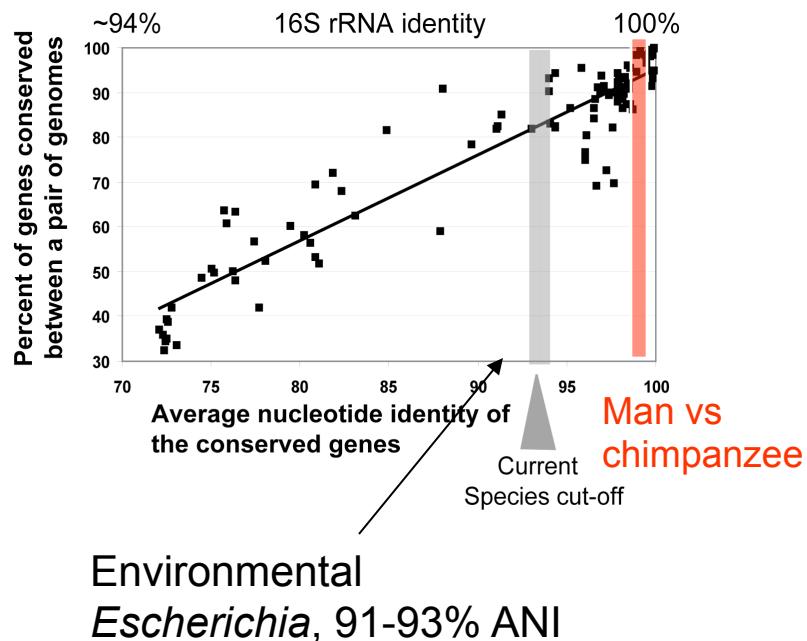
Size, 5.1Mb  
Core, 3,000  
Each new genome,  
300 genes  
16,000 genes explored  
(the pan genome)



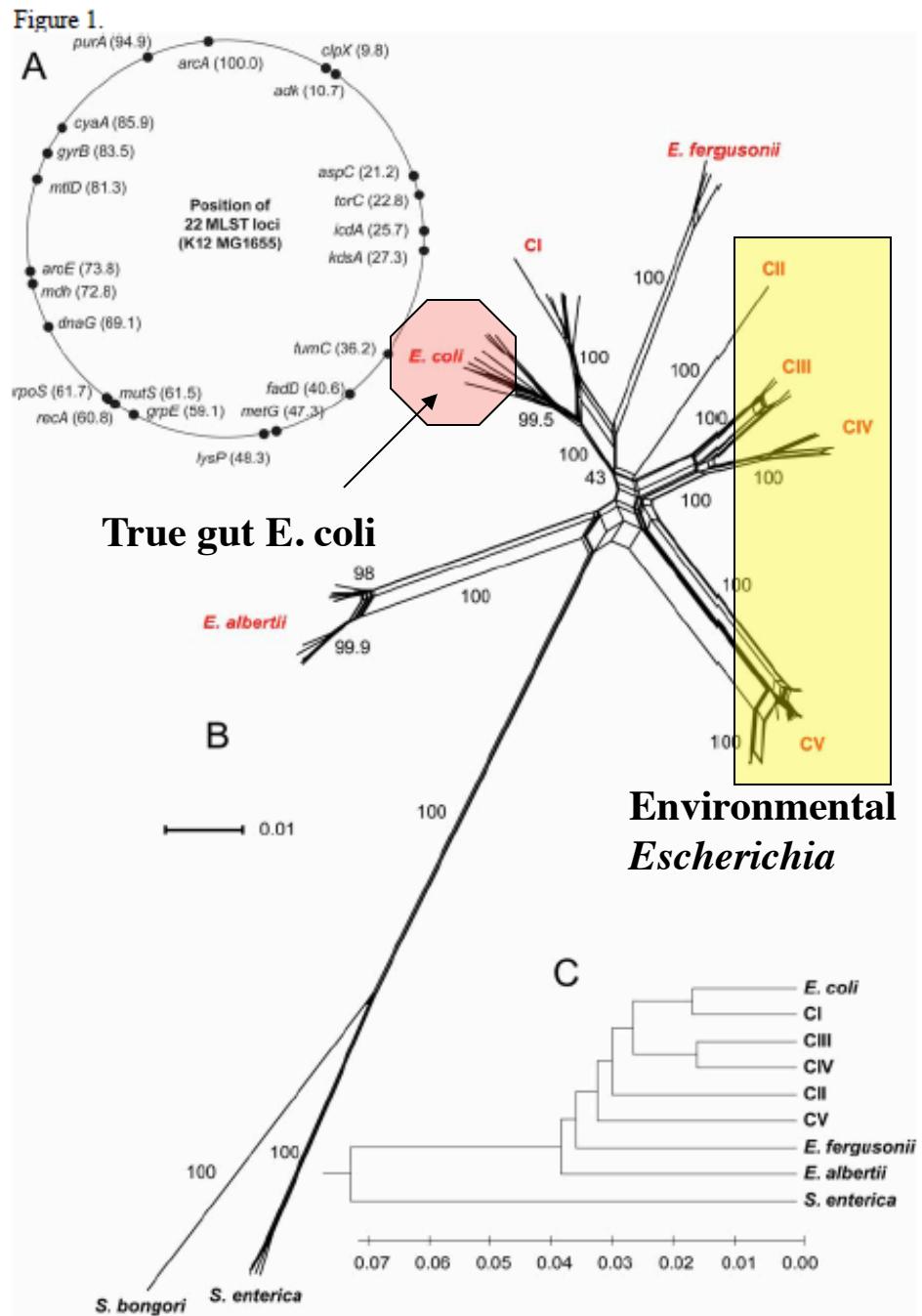
Konstantinidis et. al  
Trans Royal Soc.,  
London: B, 2006

# *Escherichia* is a broad genus

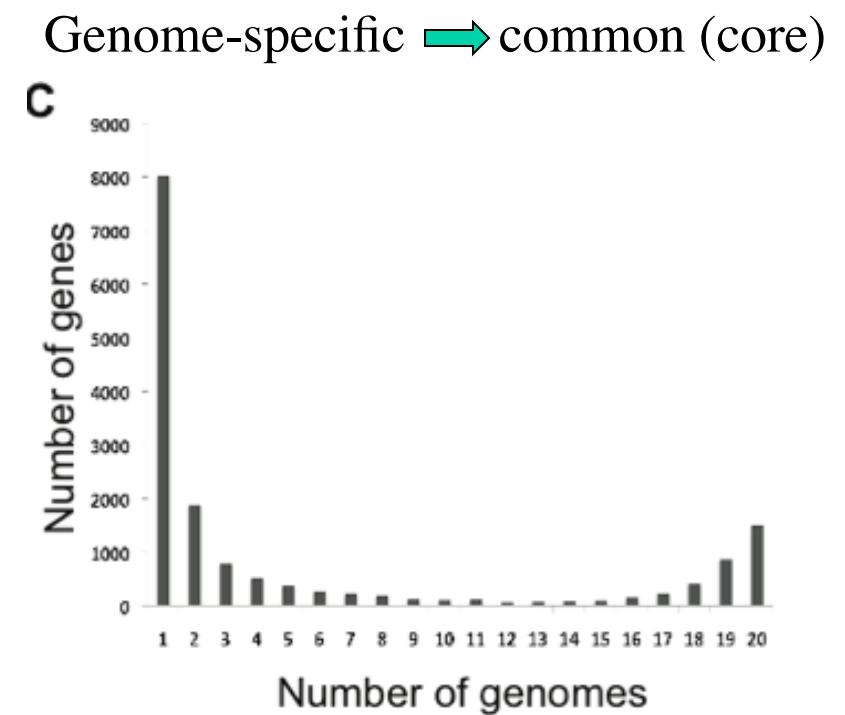
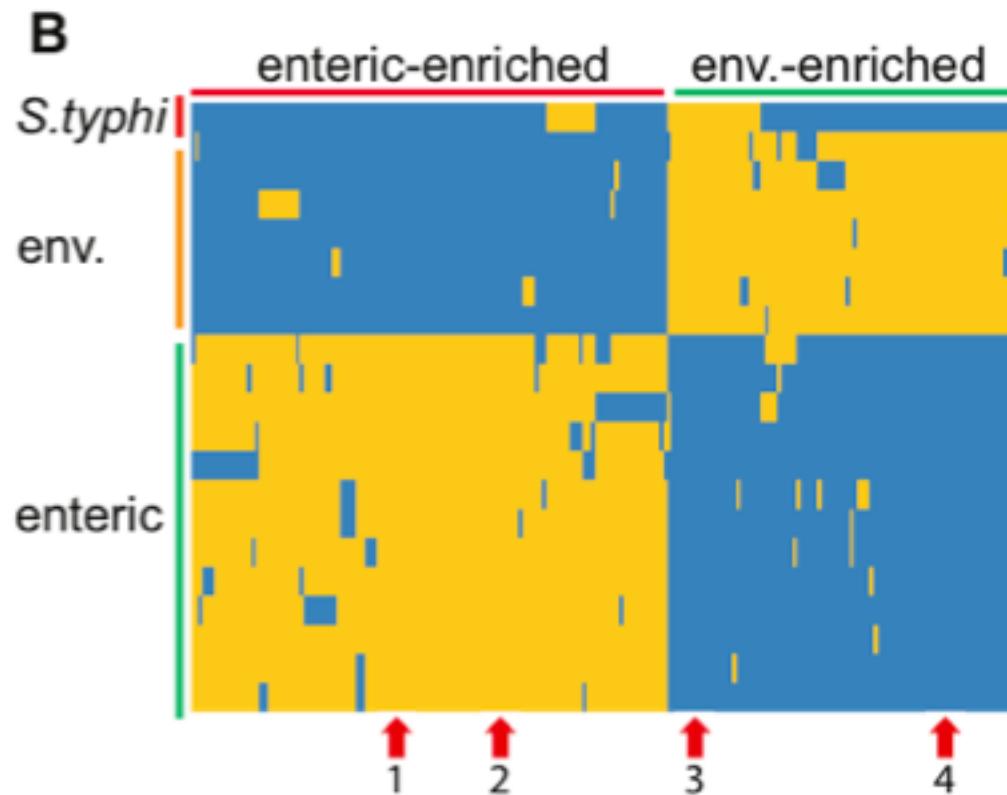
The phenotypic traits for *E. coli* do not distinguish the environmental *Escherichia*



Cryptic lineages of *Escherichia*  
Walk, et. al., AEM, 2009



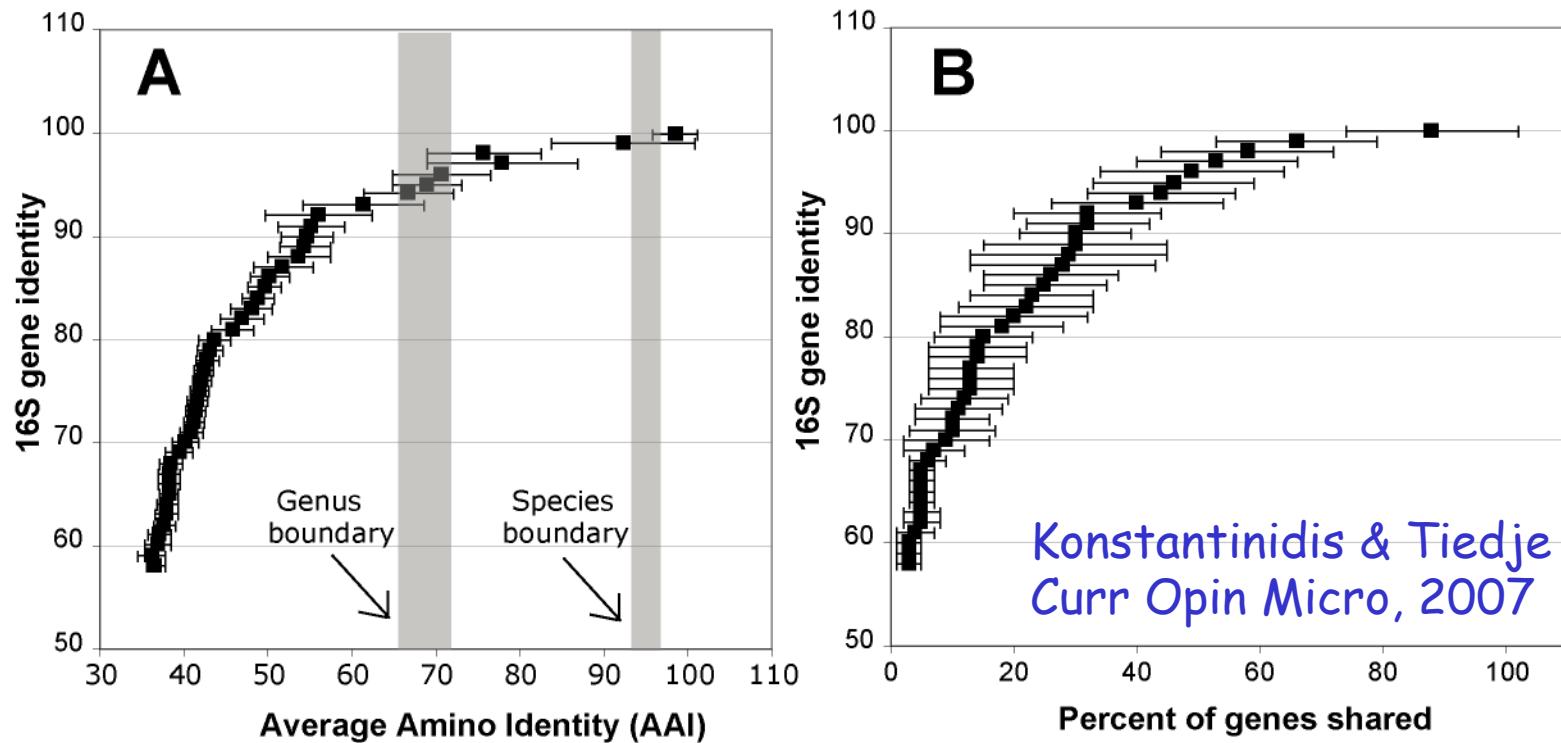
# Genes more common in environmental vs enteric strains



Luo, et. al, Tiedje and Konstantinidis, PNAS 108:7200-7205 (2011)

# What is a species & what is a genus?

In terms of common gene content



**Species > 70%; Genus 20 - 40% common genes**

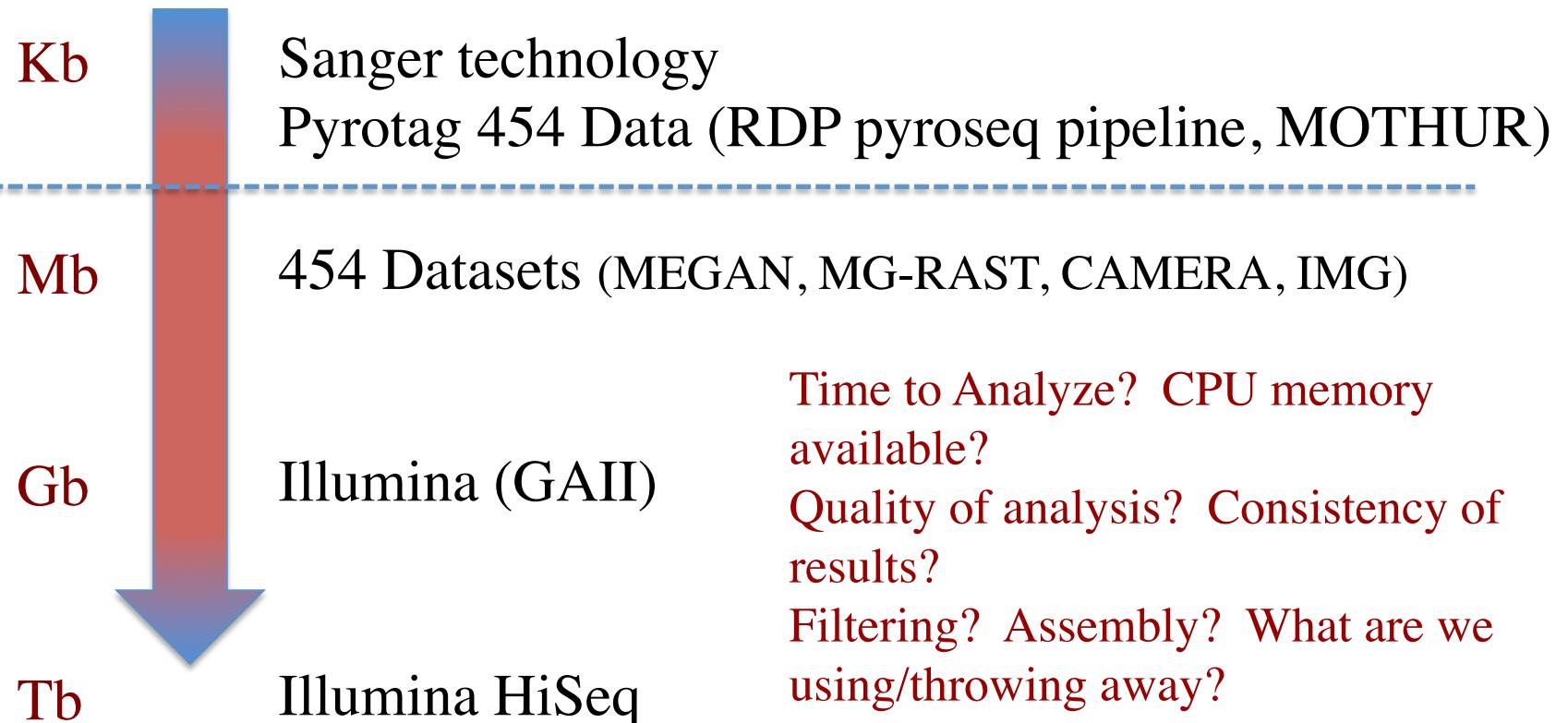
Humans and sea urchins have 70% of their genes in common

# Why is microbial diversity so high in soil?

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- Current microbes are the product of 3.5 billion years of evolution, many remaining and adapting to the soil habitat.
- The soil environment has an almost infinite range of conditions, complex gradients, multiple resources and is very protective.
- The pangenome is the rule for microbial “species” and providing in huge gene diversity within each “species”.

# Growth of Sequencing Output



# Tackling Metagenomes' Largest Challenge:*The GREAT PRAIRIE*

Now at 1.9Tbp



Coordinators:

James Tiedje (MSU), Janet Jansson (LBL)

Plus many collaborators

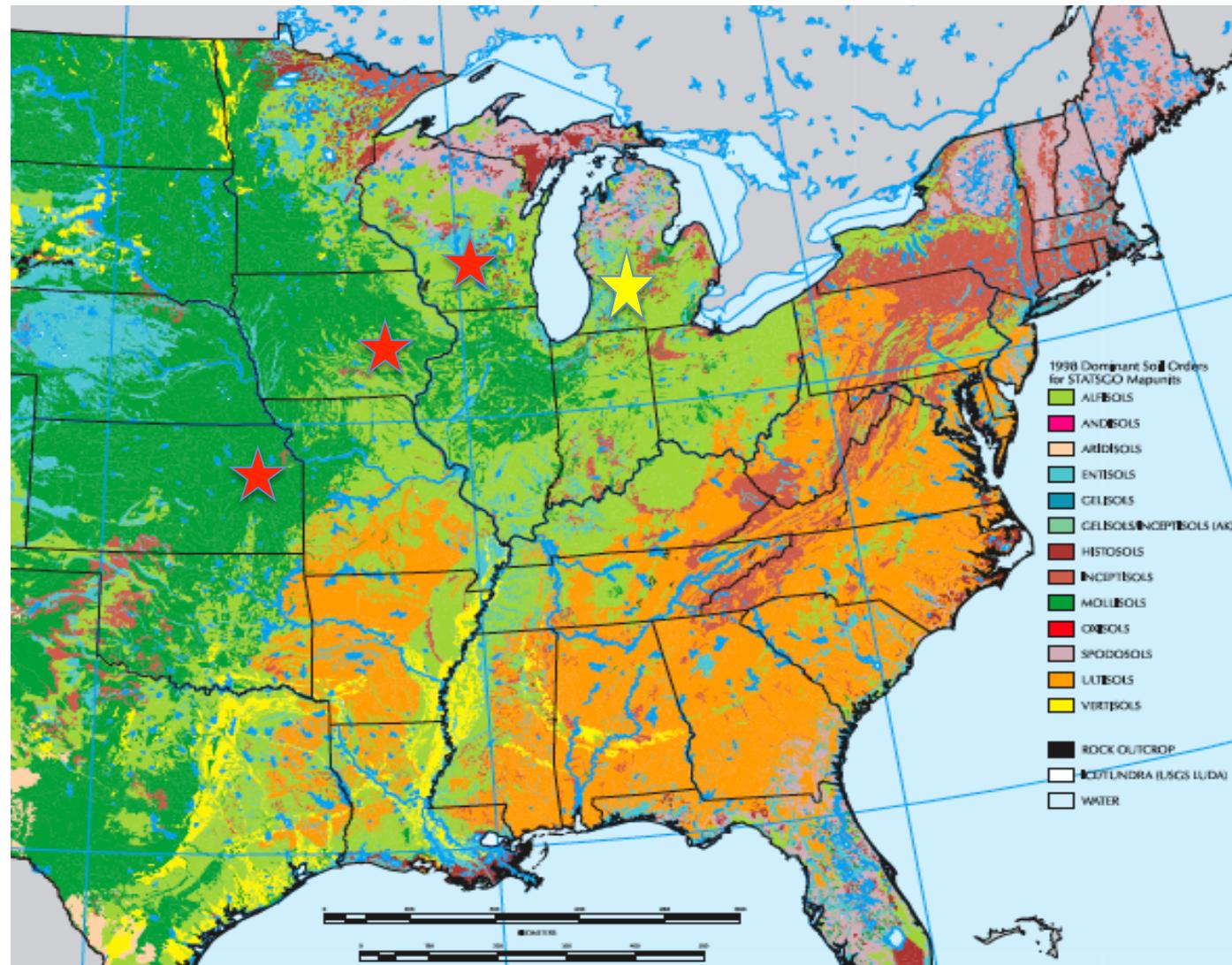
at JGI, LBNL, MSU and the sites

Paired native prairie and long-term agriculture sites:

- Wisconsin (Goose Pond)
- Iowa (Morris Prairie)
- Kansas (Konza Prairie area)

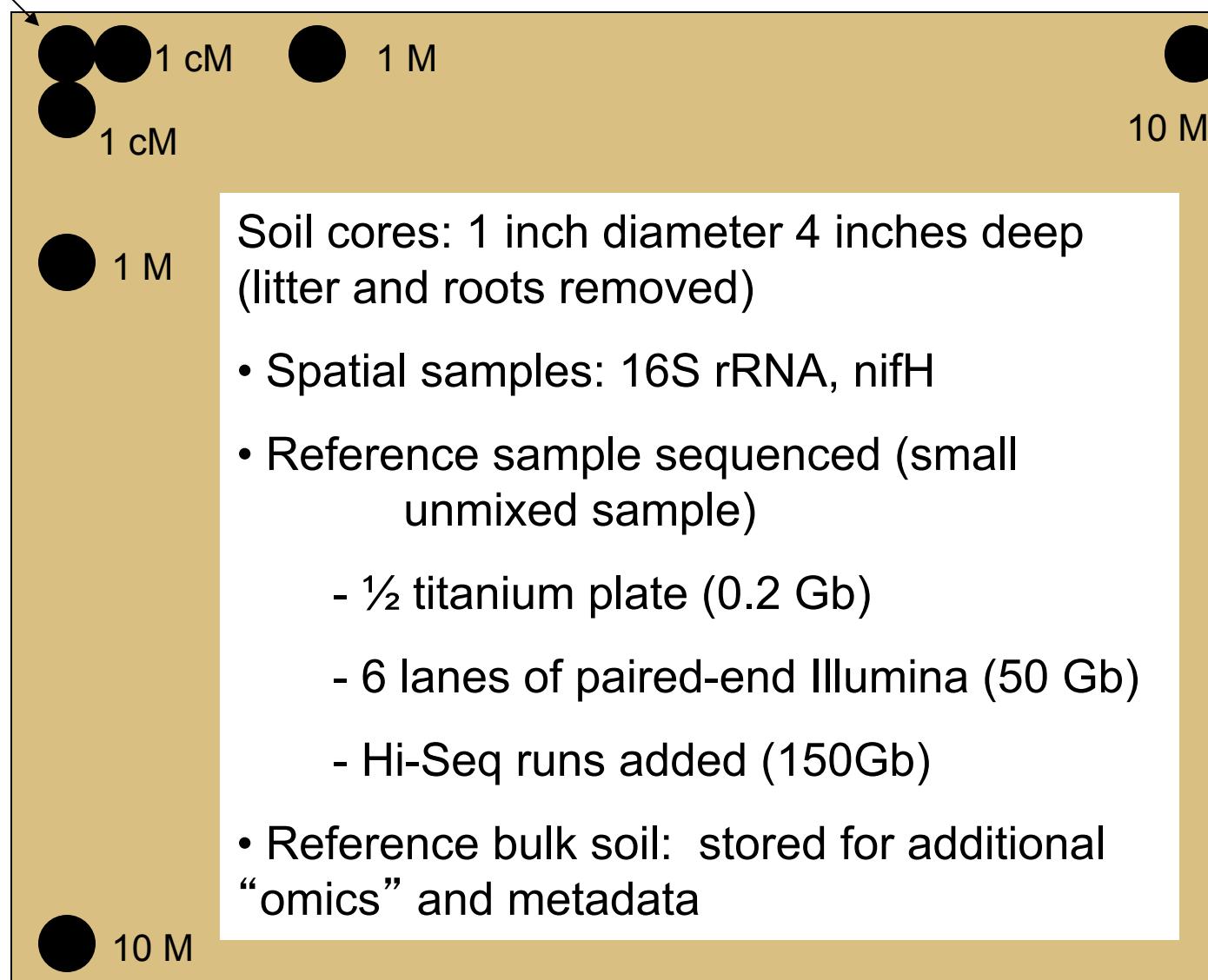
# The US Great (Midwest) Prairie

*Holds about 1/3 of US soil carbon stocks & vital to food security*

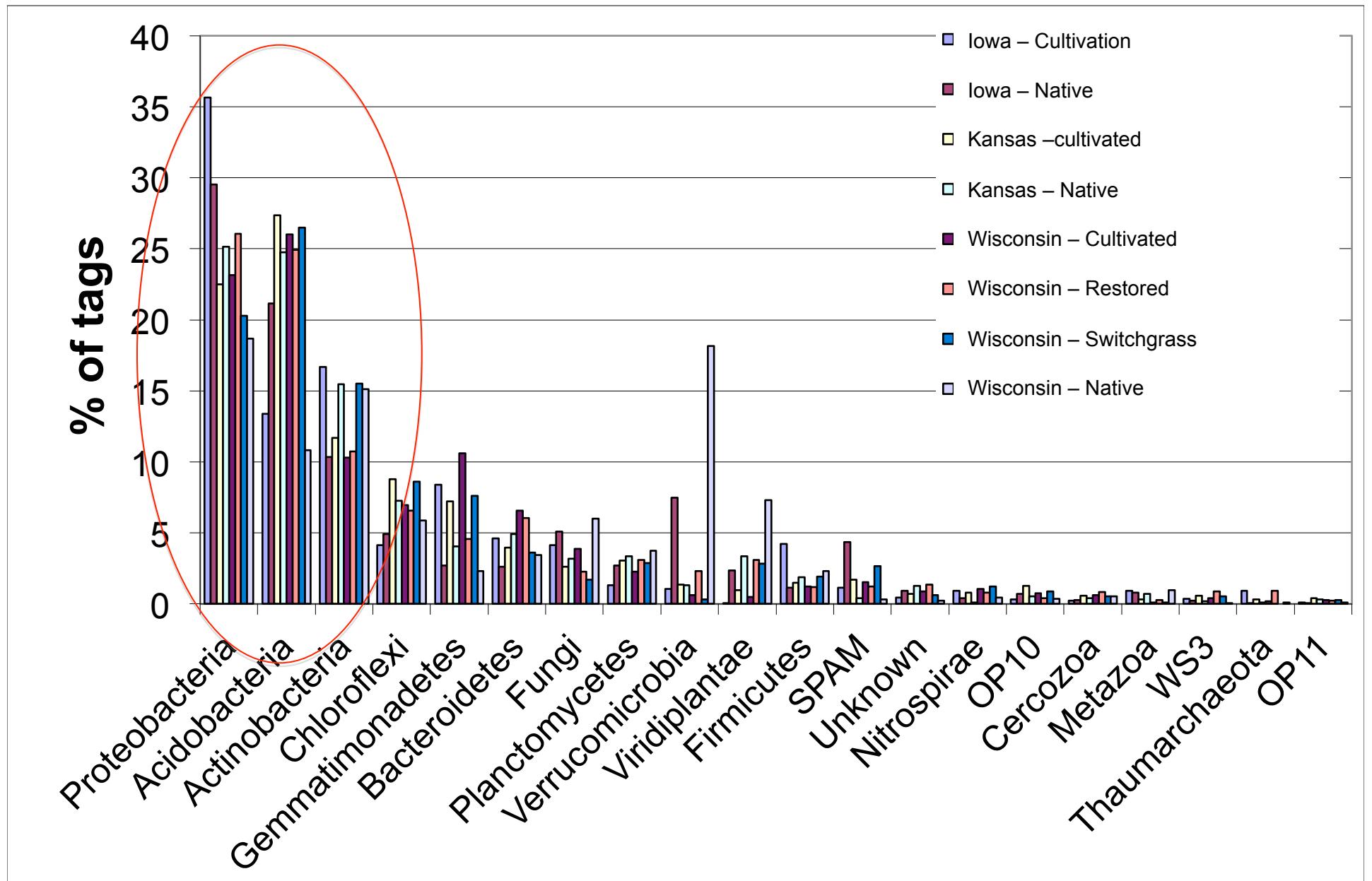


Reference  
core

## Great Prairie sampling design

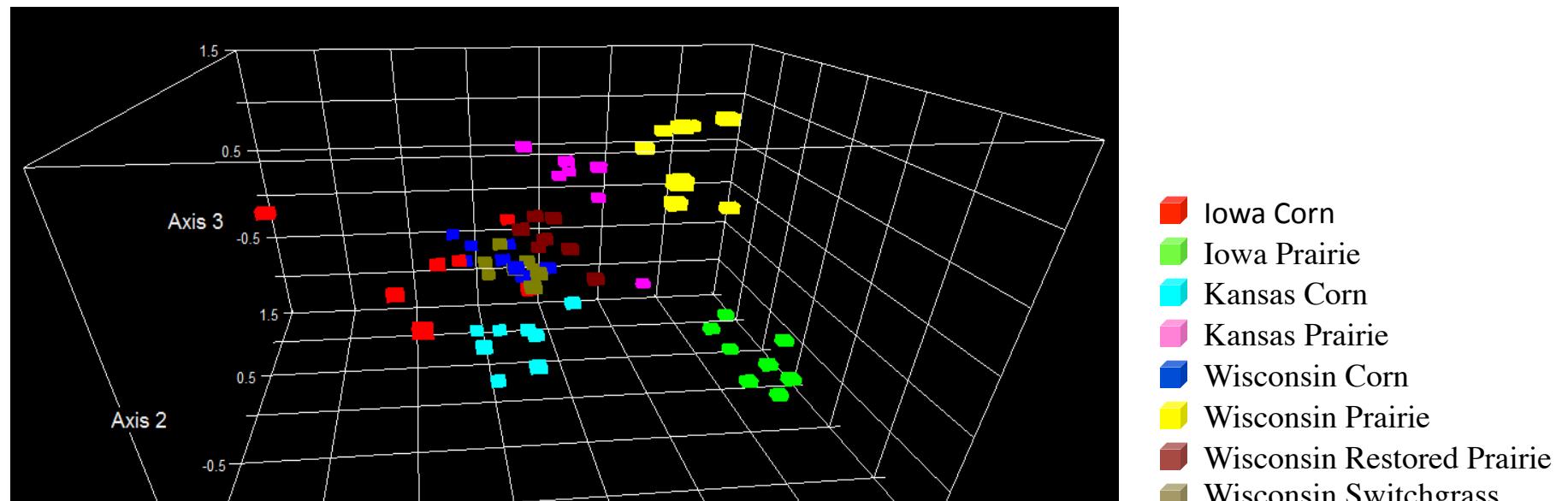


# Who lives in the Great Prairie's soil?



# Do the microbial communities differ among sites?

*16S rRNA gene (Pyrotag analysis)*

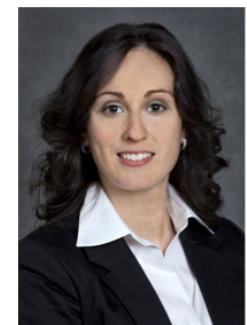


Non-metric Multi Dimensional Scaling (nMDS) using PCORD v5 software

Bray Curtis distance measure

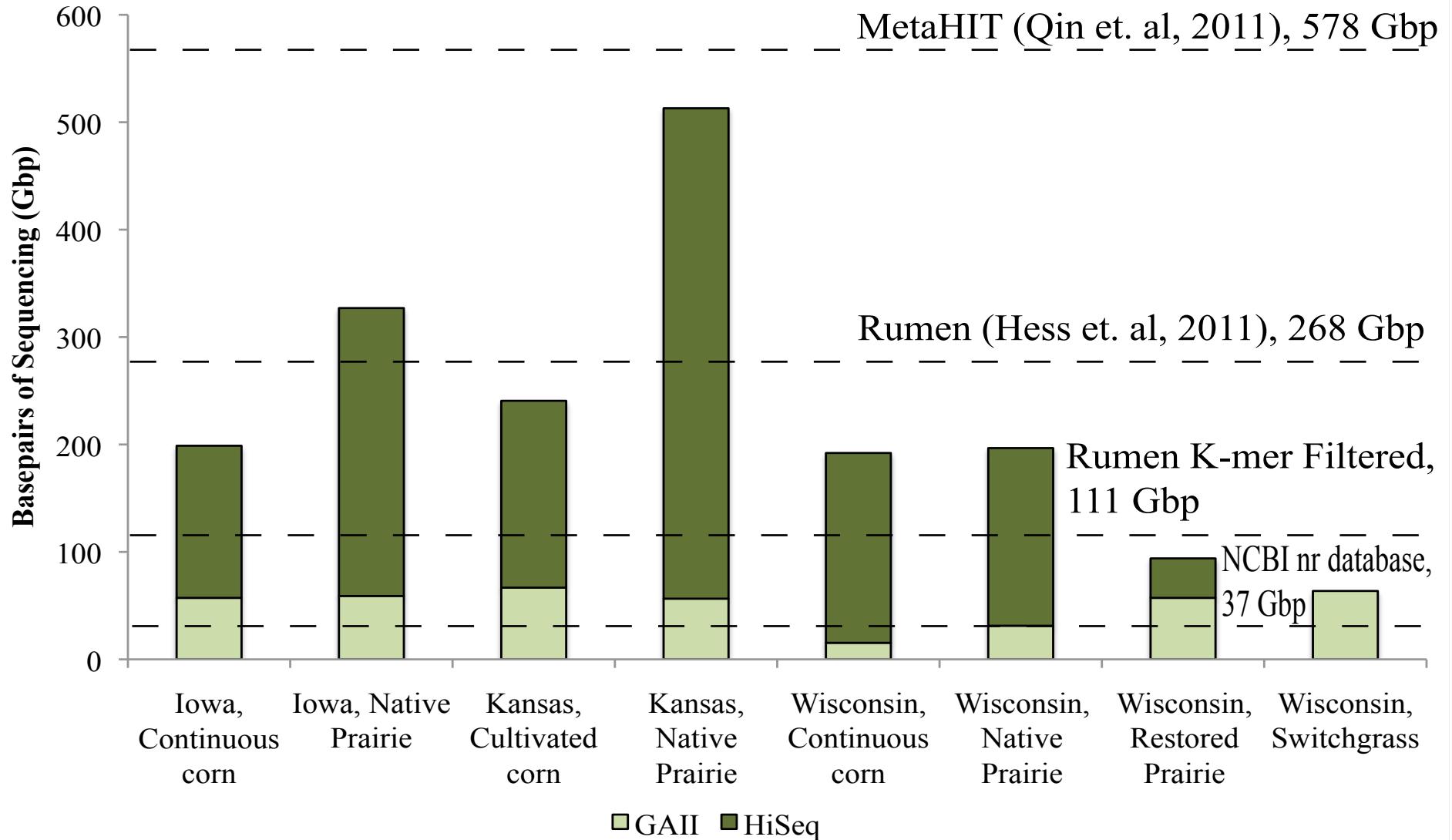
Final stress for 3-D solution = 13.04

Regina Lamendella,  
LBNL



# Great Prairie Sequencing Summary

Total: 1,846 Gbp soil metagenome



# What can we do with Illumina short reads?

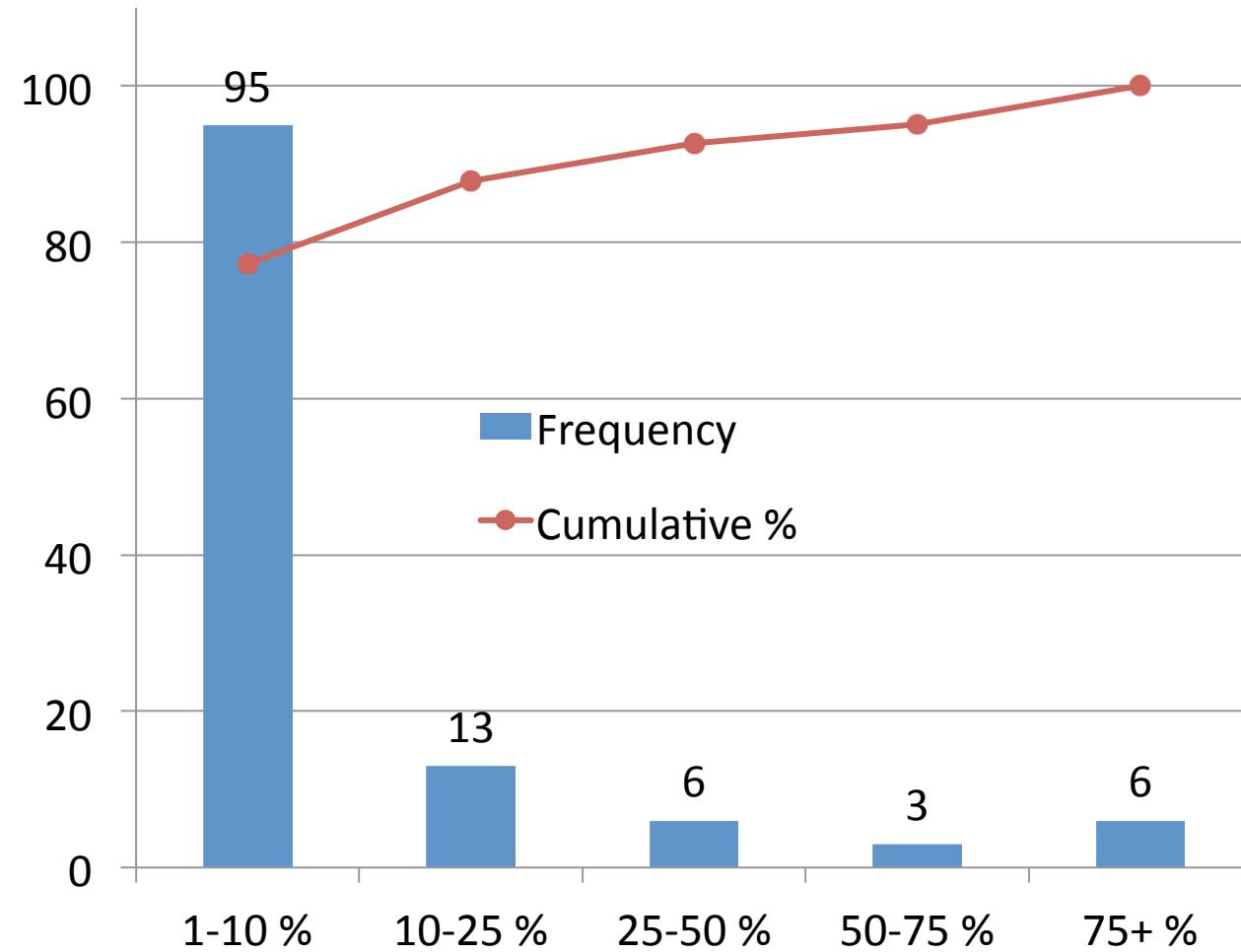
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- Search for rRNA and ecogenes (will replace tag pyrosequencing)
- Map reads to sequenced genomes
- Target ecofunctional genes
  - By amplicon targeting (Gene-targeted metagenomics)
  - By computational walking to assemble genes of interest
- Assemble shotgun reads into contigs and more
  - New approaches being developed for the massive data

*Each can be used to link to taxonomy*

- *but is dependent on database, which is deficient for soil*
- *assumes horizontal gene transfer is minor, but not always the case*

# Distribution of detected organisms by their genome recovery



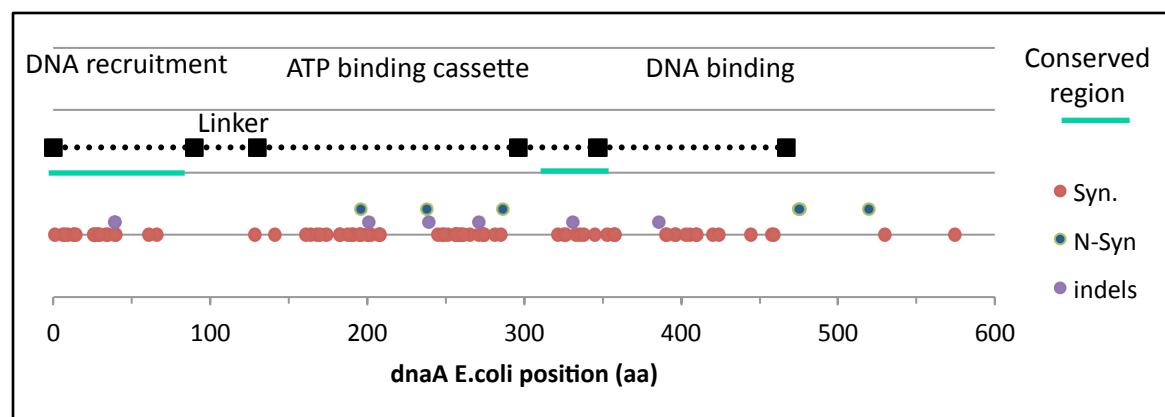
# Best Genome Matches for One Soil

- *Metagenome sequences map to which sequenced strains?*
- *How much of the genome is present (%), what ‘x’ coverage (%)*
- *How many and where are SNPs and indels*

Reference	Genome	MSR1		
		SNP count	Recovery	Coverage (X)
AE007869	Agrobacterium_tumefaciens_C58 circular chromosome	203	93.79%	4.4
AE007870	Agrobacterium_tumefaciens_C58 linear chromosome	159	92.70%	5.9
CP000712	Pseudomonas_putida_F1	141	88.44%	5.0
CP001635	Variovorax_paradoxus_S110	546	75.41%	7.1
CP001636	Variovorax_paradoxus_S110 plasmid	51	47.17%	5.1
CP002248	Agrobacterium_sp_H13-3	68	84.74%	2.7
CP002249	Agrobacterium_sp_H13-3	77	92.00%	3.9
CP002505	Rahnella_sp_Y9602	120	97.33%	384.0
CP002506	Rahnella_sp_Y9602 plasmid	17	91.81%	327.0
CP002585	Pseudomonas_brassicacearum_NFM421	338	94.91%	24.3

# What genes were most commonly affected by sequence changes?

Annotation (unique organisms affected)	Syn. SNP	Non-Syn. SNP	Indels
Hypothetical protein (61)	29	16	258
Conserved hypothetical (46)	17	11	226
DNA replication initiator <i>dnaA</i> (40)	86	7	6
<i>gyrB</i> (13)	20	4	0
<i>gyrA</i> (9)	12	1	4



# What can we do with Illumina short reads?

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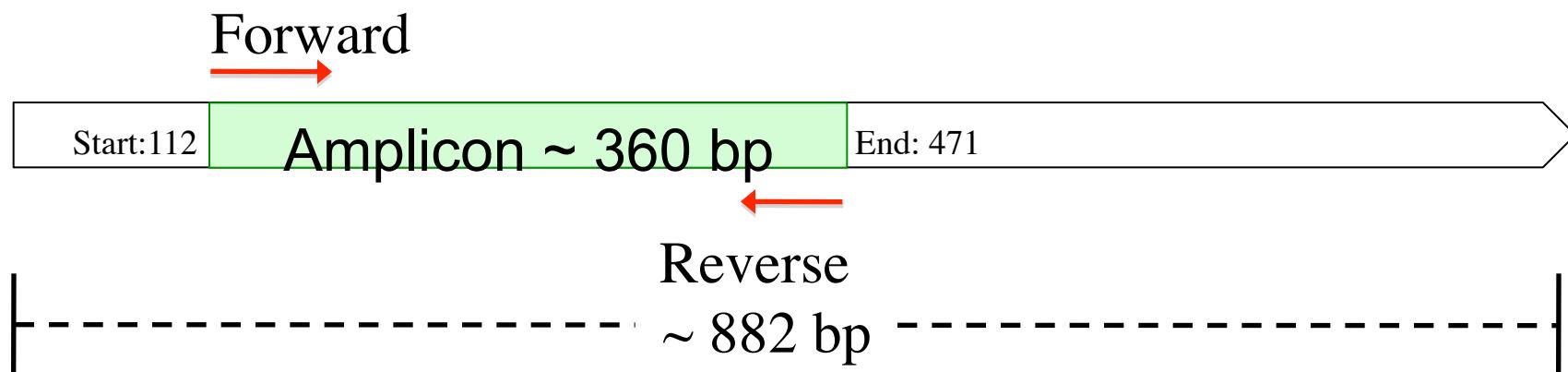
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# The nifH gene is a key gene in nitrogen fixation

Example: *Trichodesmium thiebautii*



Zehr et al., 1989.

Forward TGYGAYCCNAARGCNGA

Reverse ADNGCCATCATYTCNC

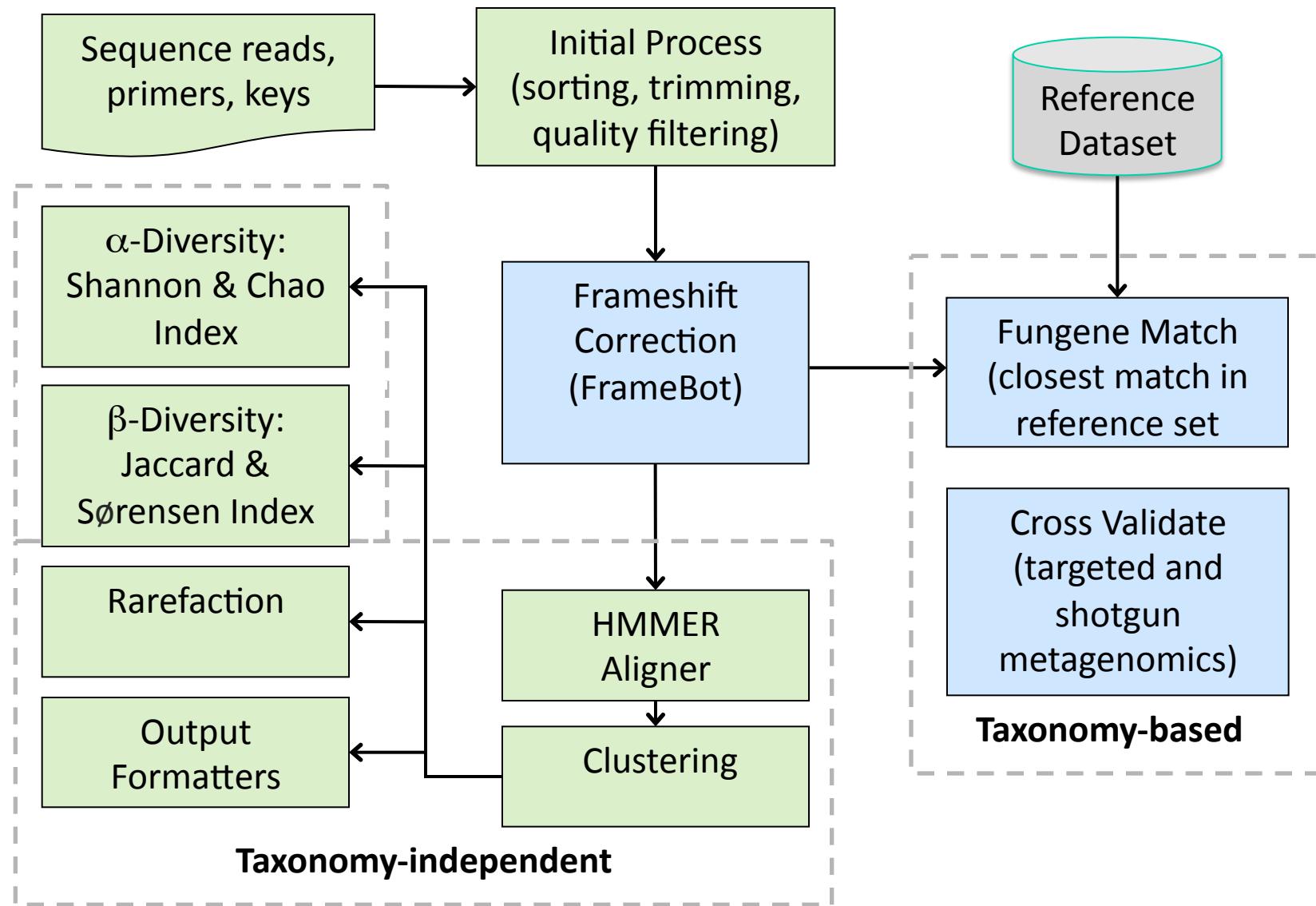
Poly et al., 2001.

Forward TGCGAYCCSAARGCBGACTC

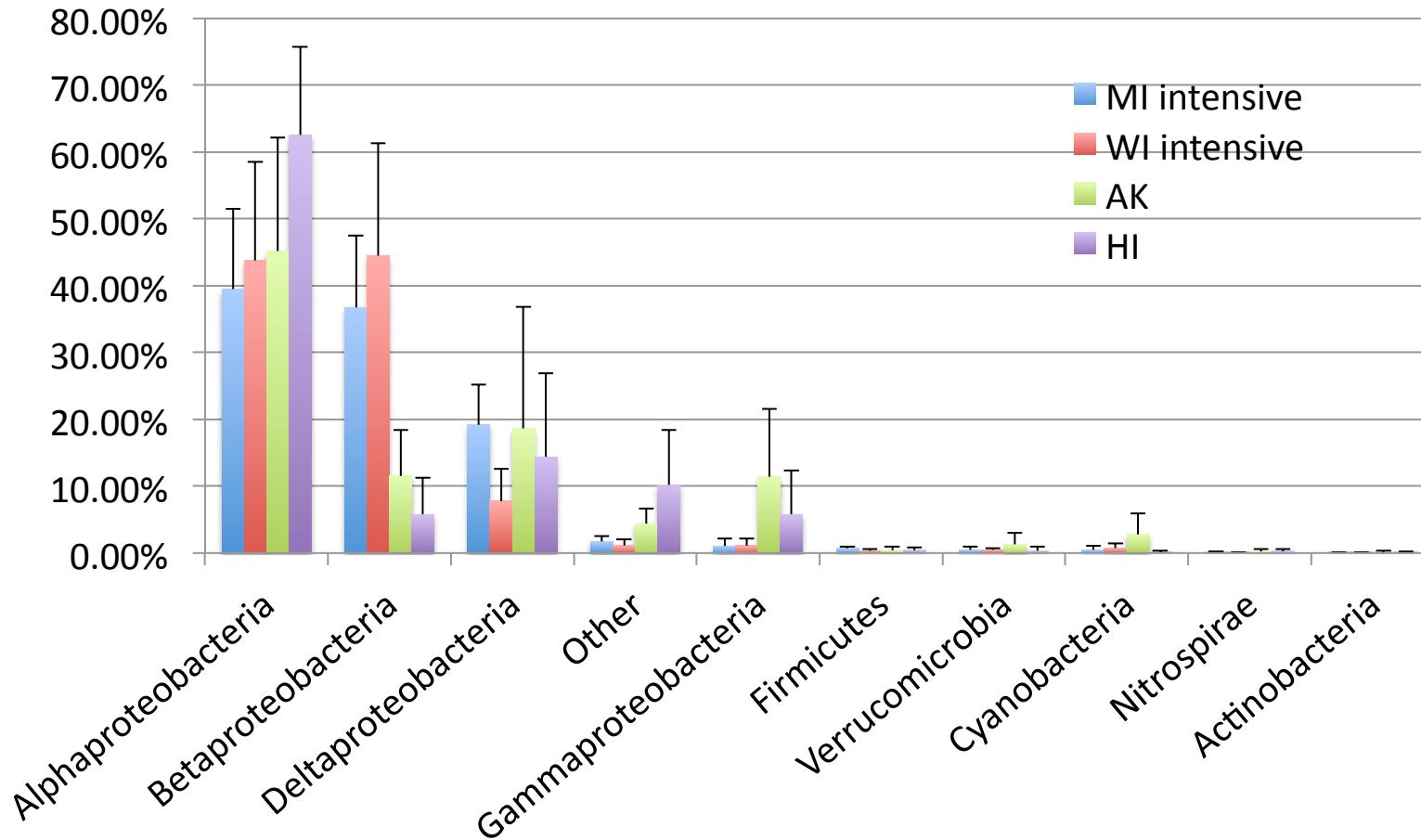
Reverse ATSGGCCATCATYTCRCCGGAA

<http://rdp.cme.msu.edu>

# Gene-Targeted Metagenomics Pipeline



# Phylum Level NifH FunGene Match



8 hrs to process 222 samples (1.1 million reads)

92.7% within 90% aa identity of best reference sequence

# How to find genes from short (Illumina) reads?

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Two versions of the same theme: assemble:

1. Target genes of interest (ecofunctional genes) & assemble, e.g. Xander
  - Focus resources early on genes of interest
  - Use more of the data
2. Assemble and then search for genes of interest

Xander developers

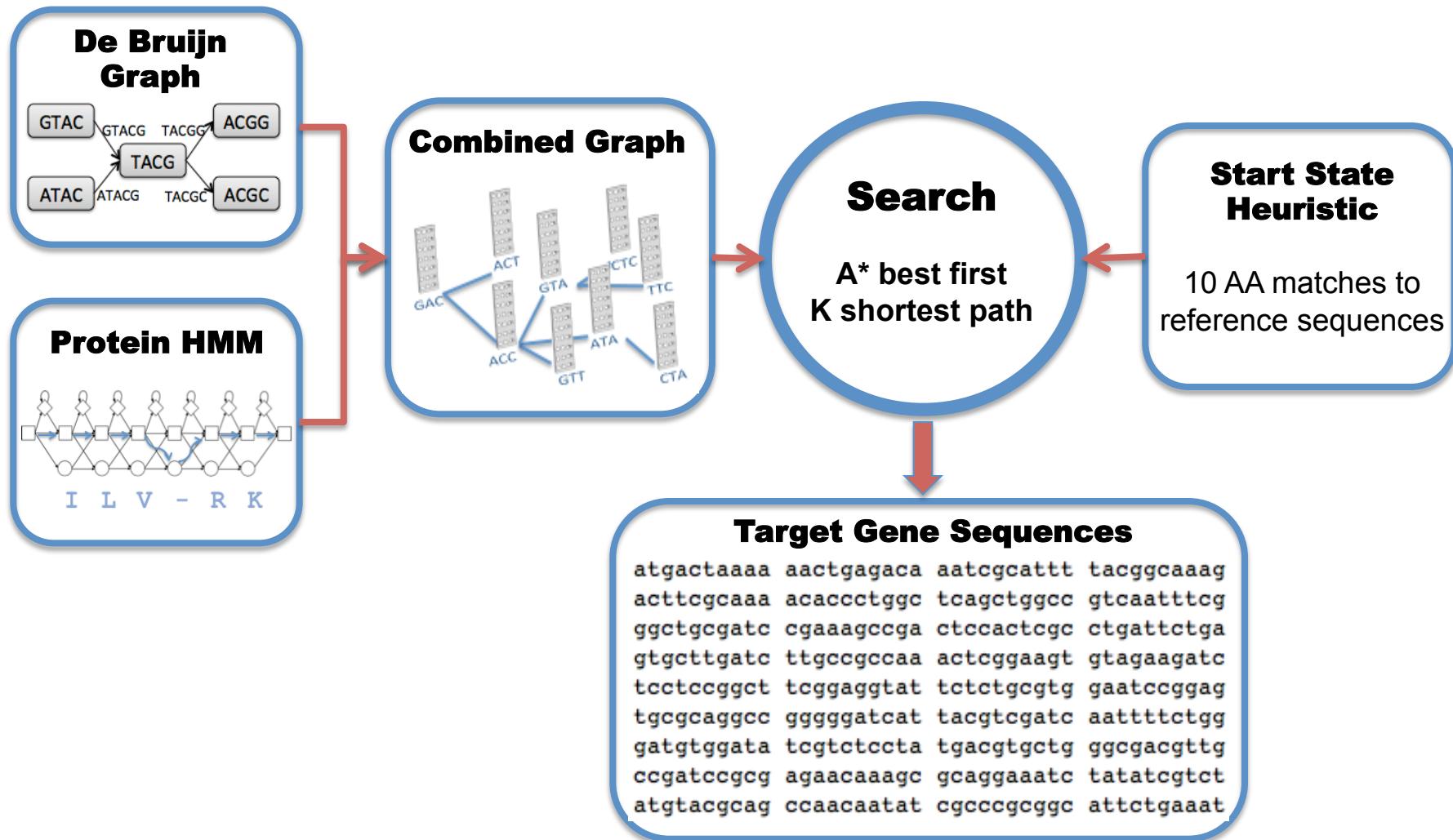


Jordan Fish



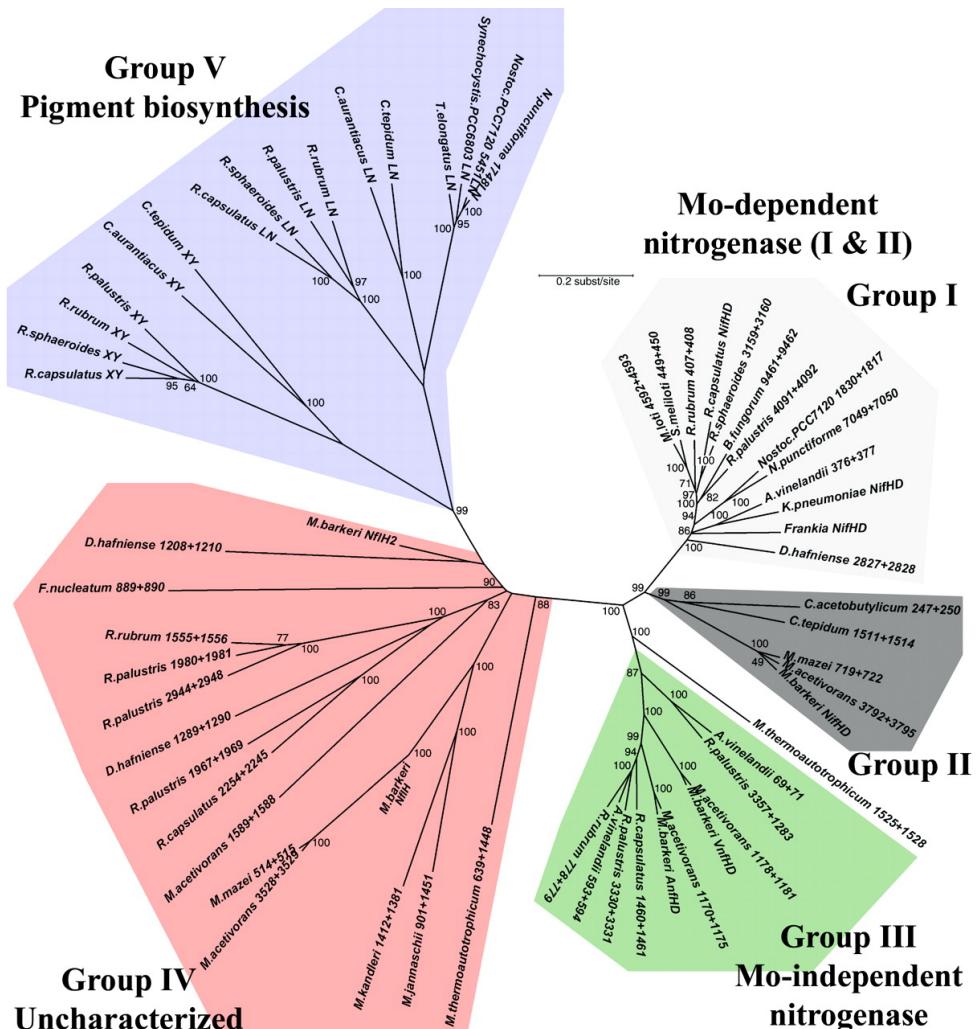
Jim Cole

# Xander: Gene-Targeted Metagenome Assembler



# Targeting the N-Cycle; a Key Process in Most Ecosystems

*Example; nifH of Nitrogenase*

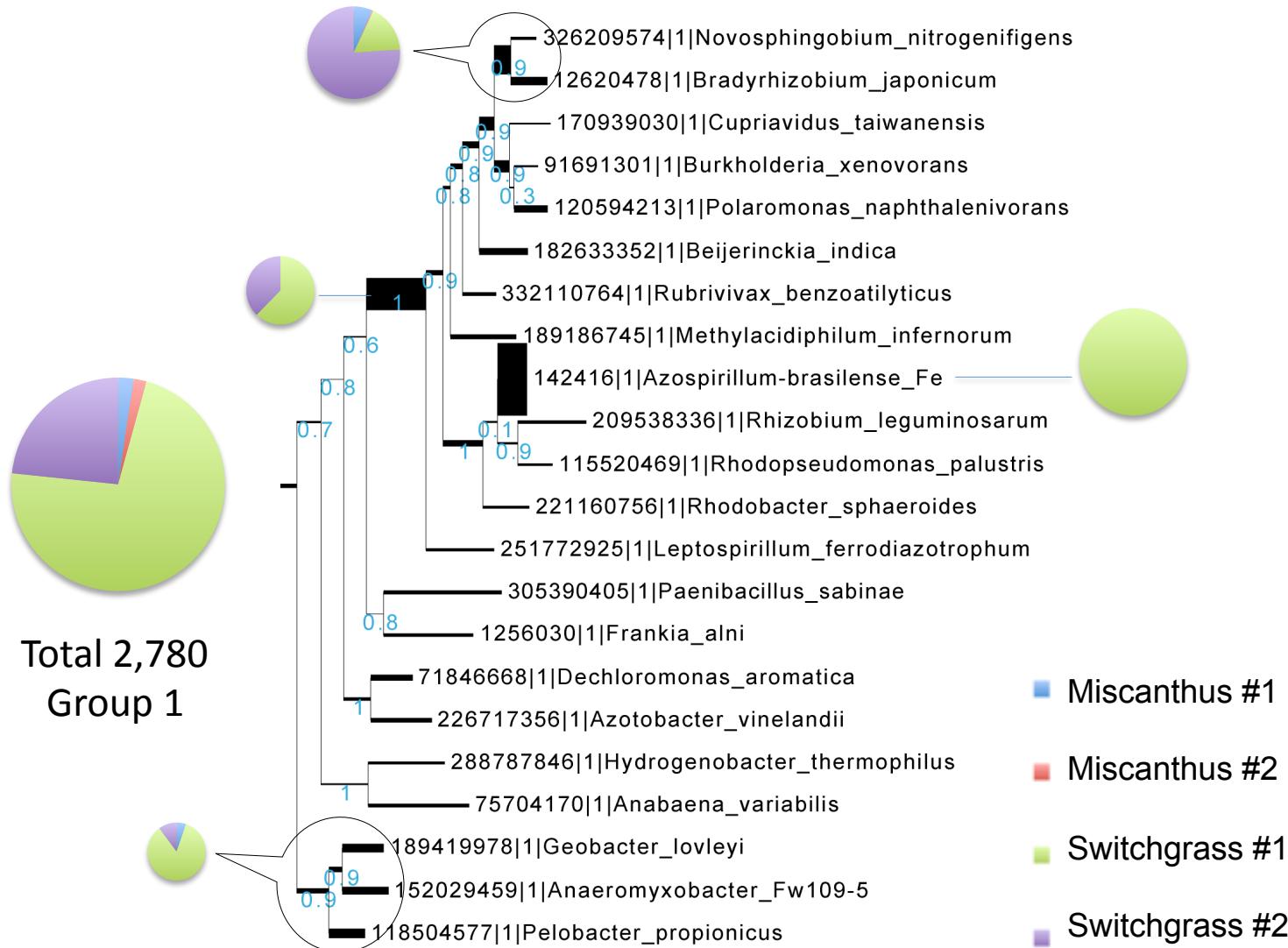


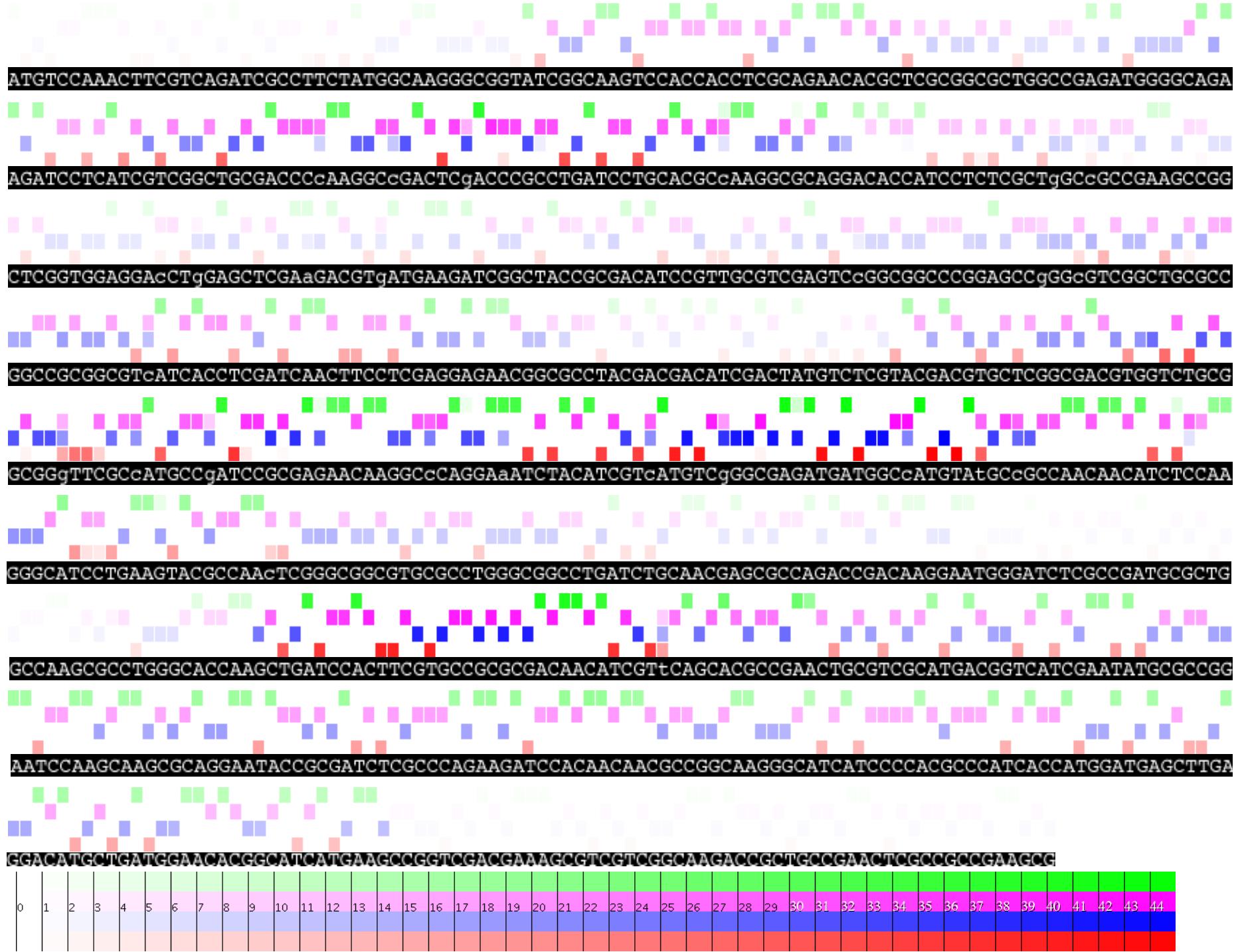
A key standards issue:  
Claims based on unproven reference data

Five phylogenetic groups from concatenated phylogenetic tree composed of NifH and NifD homologs found in complete genomes.

Raymond J et al. Mol Biol Evol 2004;21:541-554

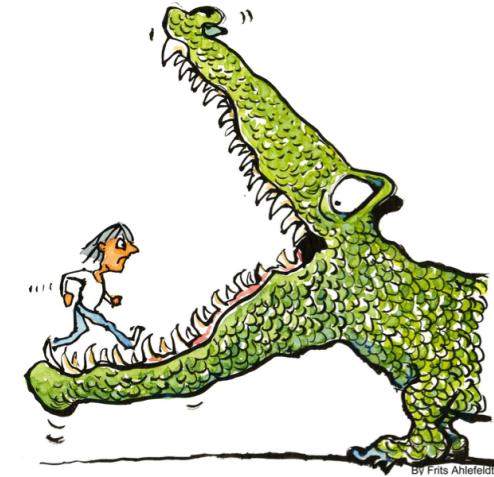
# Group-1 nifH genes found using Xander (single-path search) in four soil metagenomes





# *Soil Assembly* Obstacles → New solutions

- ✖ Scalability
- ✖ Diversity of soil
- ✖ Non uniform coverage
- ✖ Availability of computational resources
- ✖ Lack of reference genomes



*Dragon slayers*

## **New assembly approach**

- *Memory efficient*
- *Digital normalization*
- *Partitioning*
- *Artifact removal*
- *Assembly*



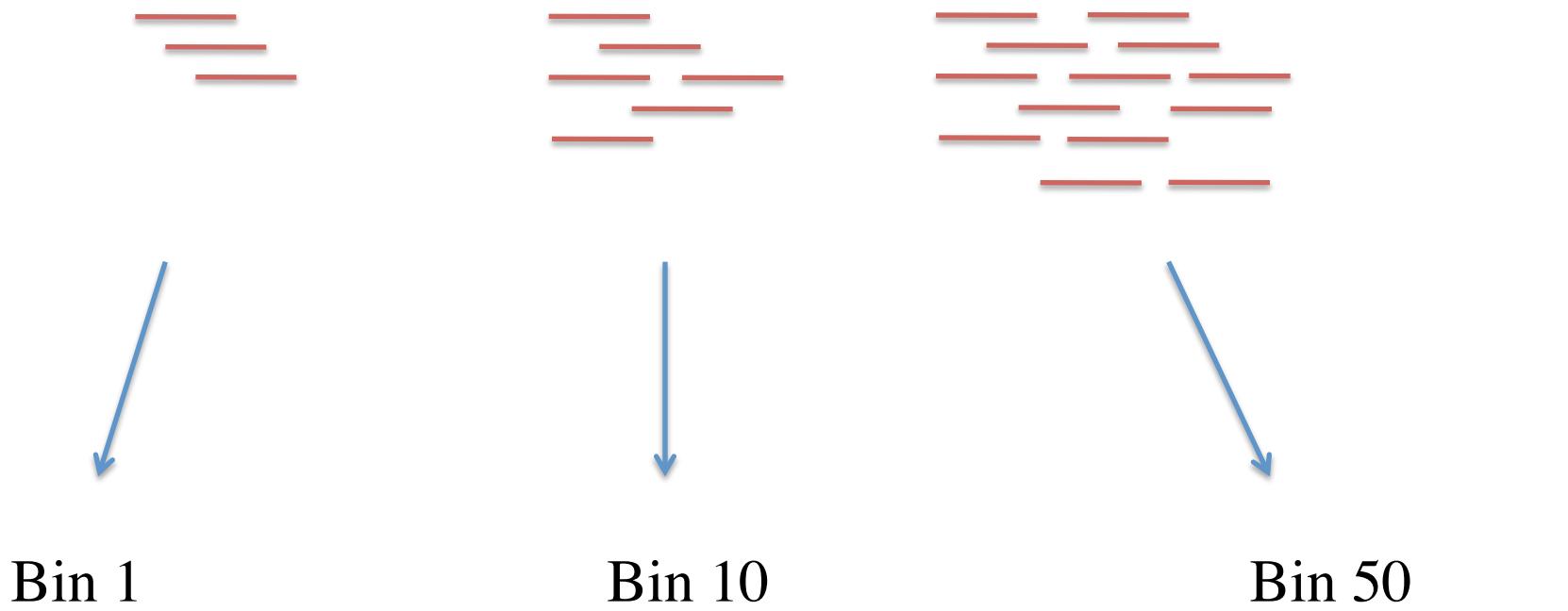
C. Titus Brown,  
Asst Prof of Computer Sci,  
MSU



Adina Howe,  
Brown/Tiedje Labs  
MSU 

# The Basic Idea of the Assembly Solution

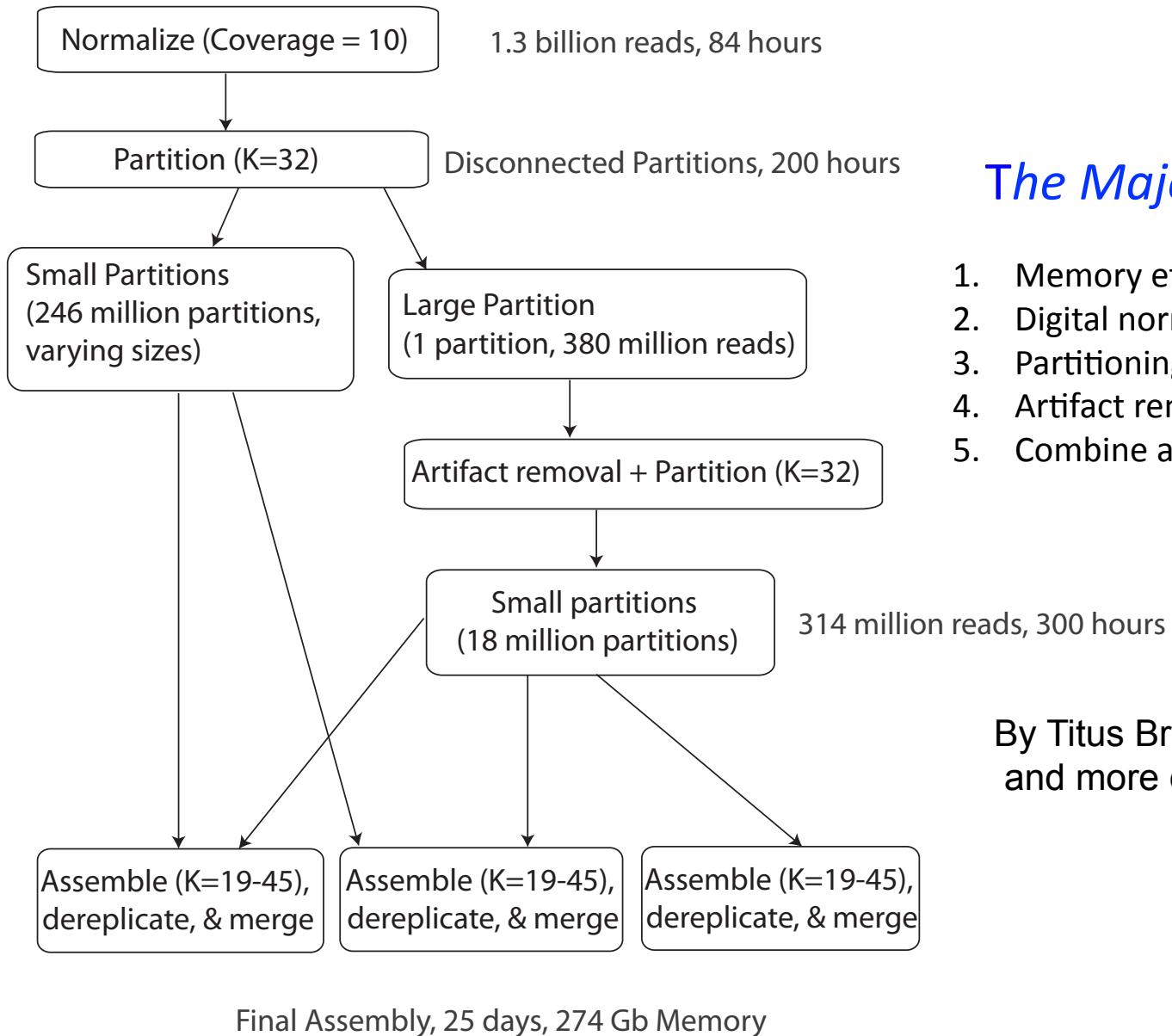
Separate disconnected (non-overlapping) sets of reads into different bins



Assembling these bins independently => identical to global assembly

*No kmer filtering to discard less common sequences*

# Summary of New Assembly Method Applied to Corn Soil Metagenome (1.8 billion reads)



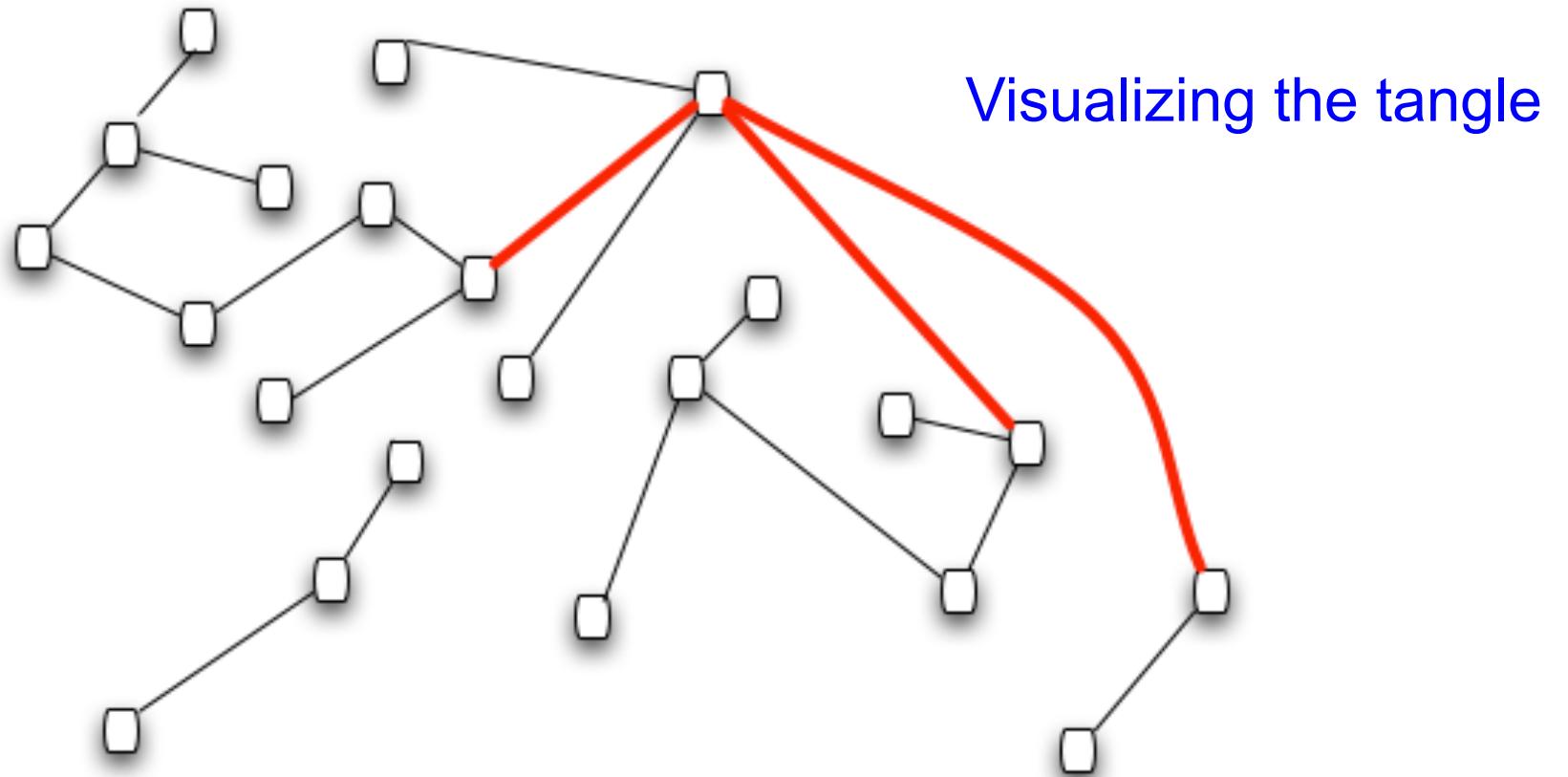
## *The Major Advances*

1. Memory efficient Bloom filter
2. Digital normalization
3. Partitioning
4. Artifact removal
5. Combine assemblies

By Titus Brown, Adina Howe  
and more of Titus' group

# Problem: more sequence, less assembly

## Why?



Illumina sequencing error causes more reads to link

# Successful assembly of Iowa corn and prairie metagenomes

*For ~\$10,000 of sequencing:*

454 Titanium  
(300 bp **raw** reads)



166 Mbp

Illumina HiSeq  
(>300 bp contigs **assembled**)

2,545 Mbp



179 Mbp

3,522 Mbp

**Putting it in perspective: Assembly equivalent of:**

- *~1200 bacterial genomes*
- *Human genome (~3 billion bp)*

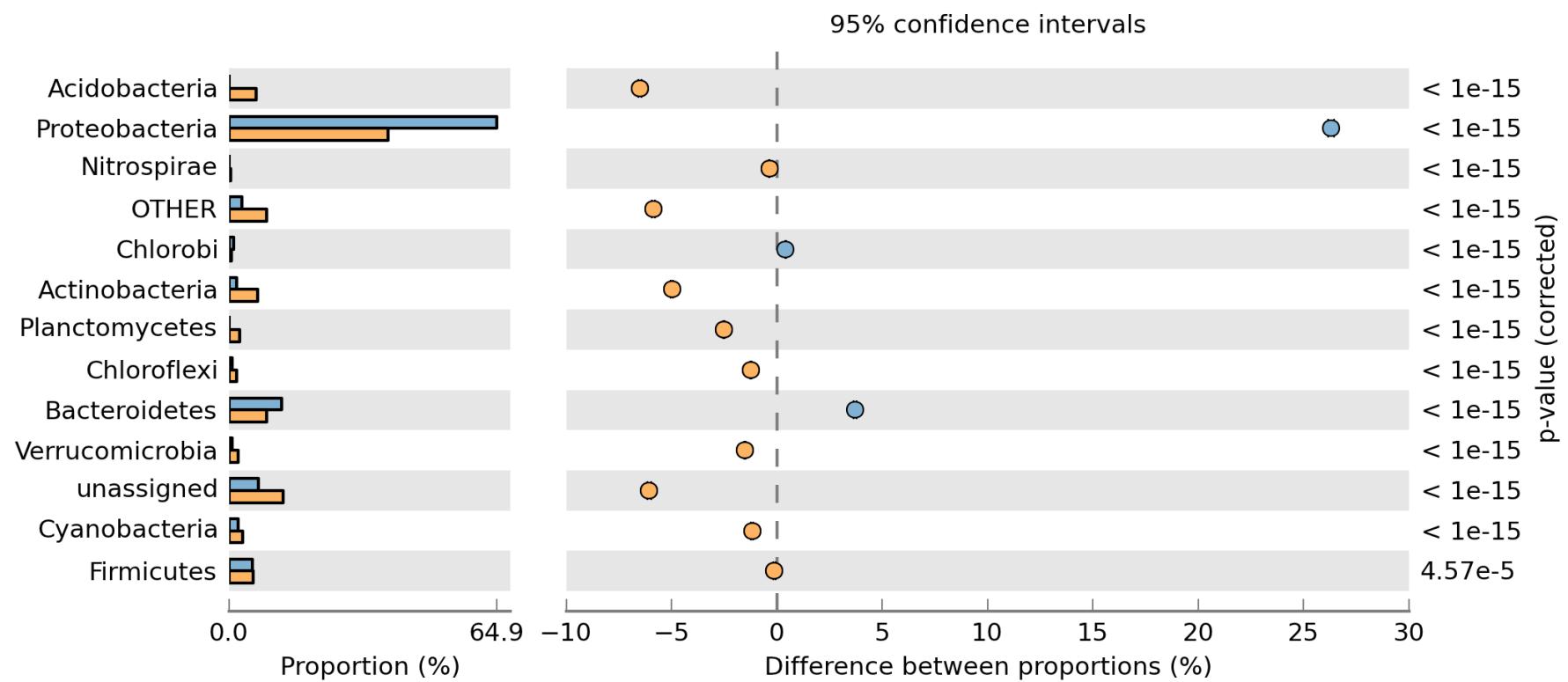
# Largest Soil Metagenomes Assembled To Date: Iowa Corn and Prairie

	Assembly Length (bp)*	Reads Used for Assembly	<i>rplB</i> genes	% of Lump remaining after artifact removal	% GC
Iowa Corn	2.5 bill	19%	391	73%	62%
Iowa Prairie	3.5 bill	23%	466	84%	59%

- Putatively identified *rplB* genes cover diversity of existing *rplB* references and indicate several novel clades.
- Longest contigs 69,000 and 104,000 bp, respectively

\*Contigs > 300 bp

# Rhizosphere enrichment



All subsystems = yellow   Only N metabolism = blue

# Soil is *very* diverse, so how much sequence is needed for “good” assembly

Currently we see < 10x coverage for *deepest* contig. That is insufficient for good short-read assembly!

Depth estimates, based on linear extrapolation from k-mer mark/recapture analysis:

Iowa prairie (136 GB):

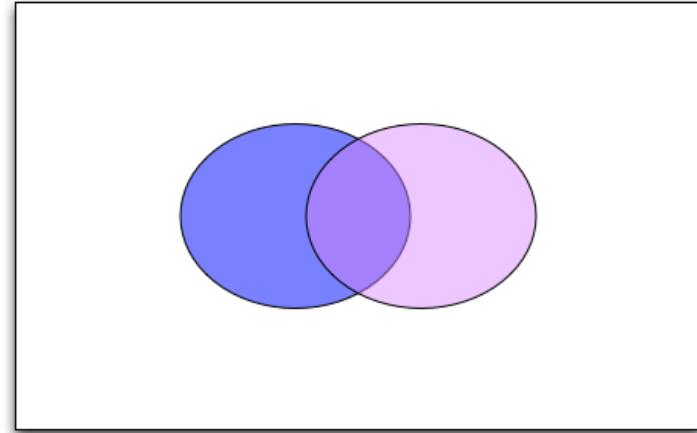
est 1.26 x

Iowa corn (62 GB):

est 0.86 x

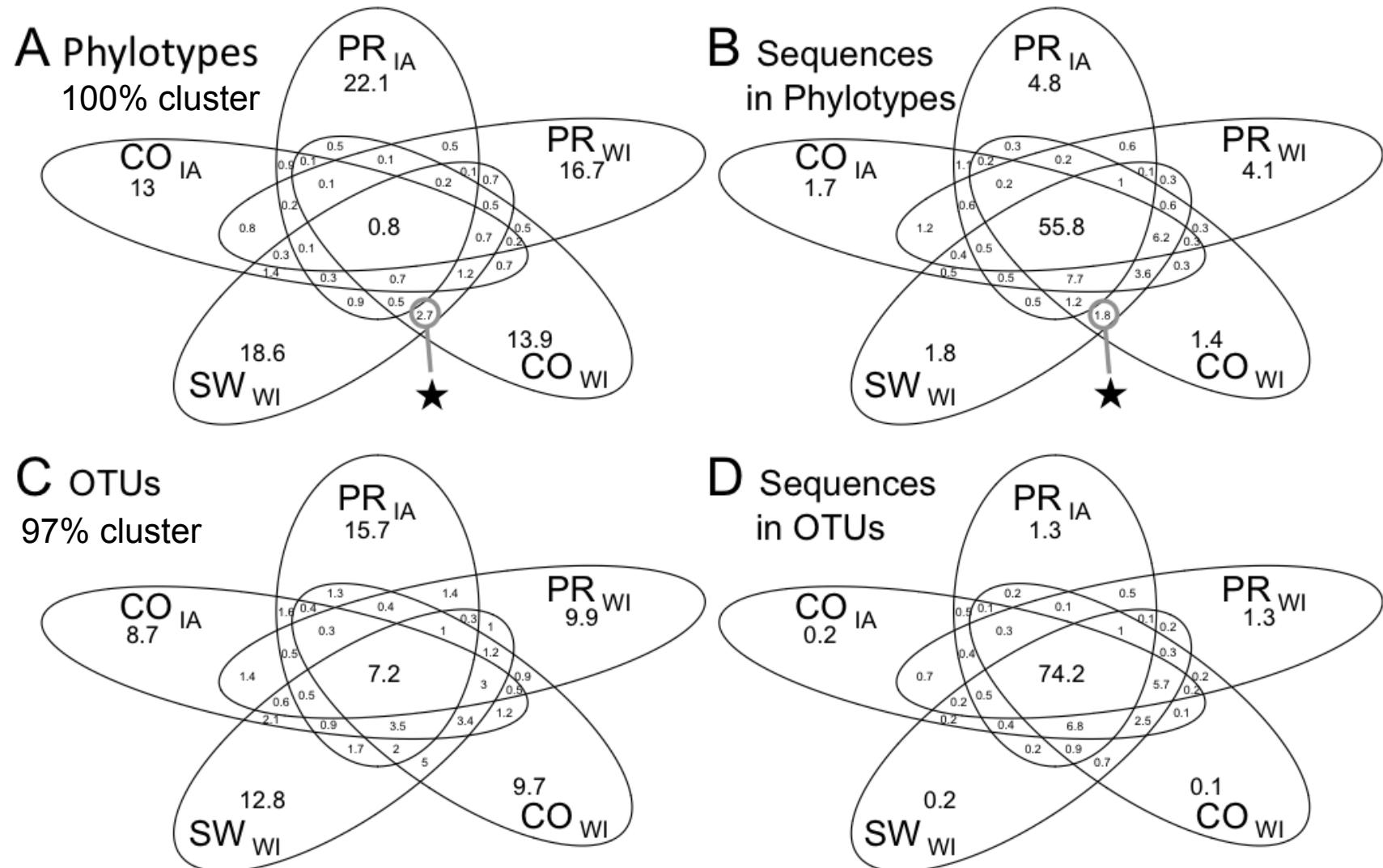
Wisconsin corn (190 GB):

est 2.17 x



- Need 1-2 TB of sequence to see majority of current critters @ ~5-10x coverage. Compare with rumen at avg 56x coverage, ~300 GB.
  - Need 2-5 TB of sequence to get good read content on top 80%
- Q: What is the size of the soil sample? An aggregate vs an area composite

# Commonality of individual aggregate communities over 500 km distance of US midwest prairie soil

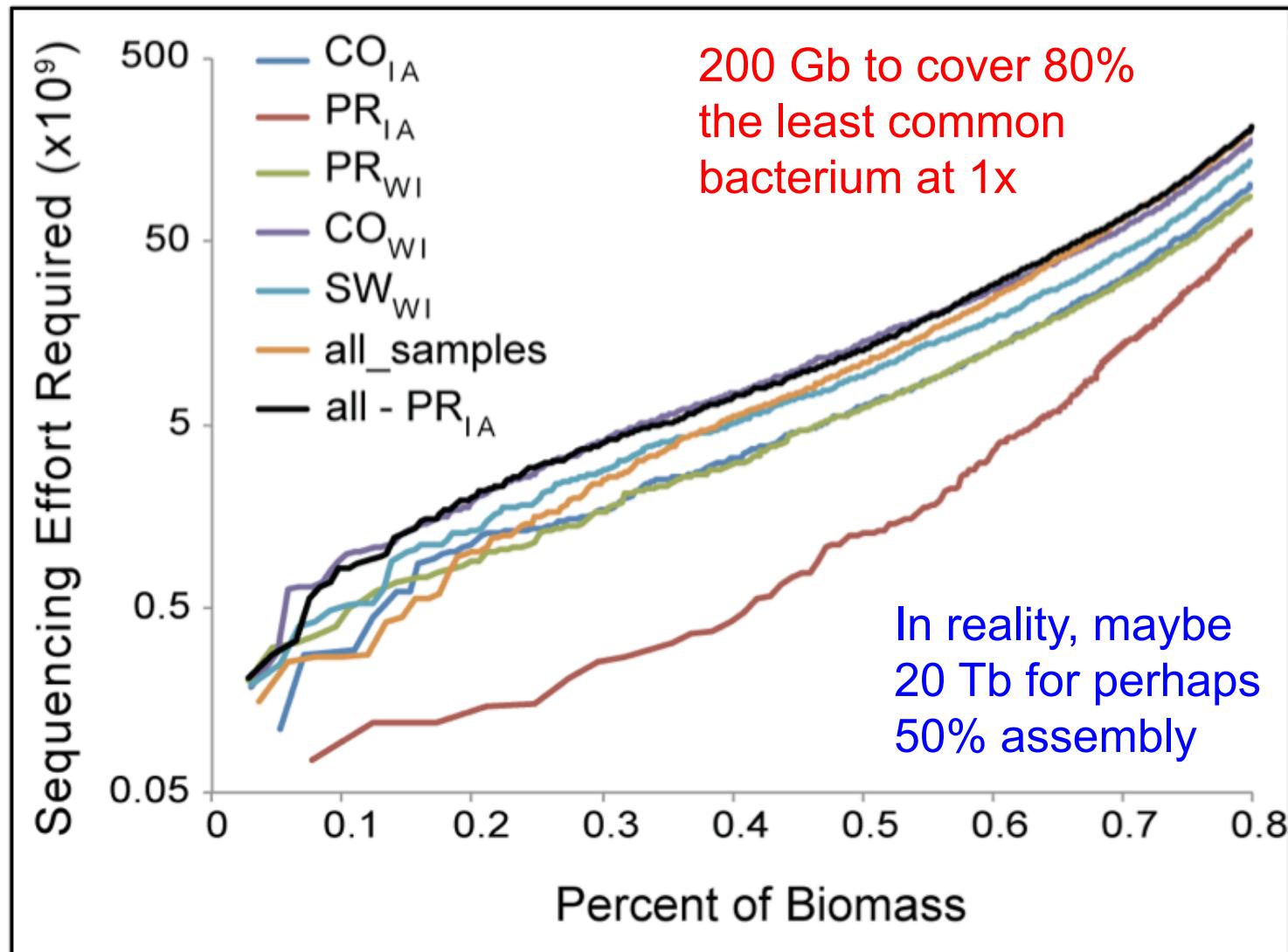


# Summary

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- ~1-1.5 mil 16S rRNA sequences/ sample
- ~20,000 OTUs (97% cluster distance)/ 0.25 g soil
- But, ~ 40% are singletons
- 3,900 OTUs are common for all samples, contain 74% of sequences
- 4,700 phylotypes are common and contain 56% of the sequences.
- 646,585 total phylotypes and 54,000 OUT's in 5 soil samples
- There are a huge number of phylotypes and OTUs/ 0.25 g soil, but they are very rare and mostly unique to one sample and make up a very small portion of the total sequences.

# Estimated sequencing effort for 1 x coverage, not considering pangenomes



# GSC Metadata standards (MIMARKS): Also SRA Prekit [At RDP]

Google docs ★ Copy of RDP\_MIMARKS    Private to only me    Saved    Share

File Edit View Insert Format Form Tools Help MIMARKS Export

Formula: Structured Comment Name    Show all formulas

	A	B	C	D
1	Structured Comment Name	Item	User Input Template	Units Template
2	project_name	project name		
3	submitted_to_insd	submitted to insdc		
4	investigation_type	investigation type		
5	experimental_factor	experimental factor		
6	geo_loc_name	geographic location (country and/or sea,region)		
7	lat_lon	geographic location (latitude and longitude)	46.49 N, 84.35 W	
8	collection_date	collection date		
9	biome	environment (biome)		
10	feature	environment (feature)		
11	material	environment (material)		
12	env_package	environmental package		
13	subspecf_gen_lin	subspecific genetic lineage		
14	extrachrom_elements	extrachromosomal elements		
15	source_mat_id	source material identifiers		
16	biotic_relationship	observed biotic relationship	Is it free-living or in a host and if the latter what type of relationship is observed	
17	trophic_level	trophic level		
18	rel_to_oxygen	relationship to oxygen		
19	isol_growth_condt	isolation and growth condition		
20				

Plant-associated\_Metadata   Sediment\_Metadata   Soil\_Metadata   Wastewater\_Metadata   Water\_Metadata

orange rows = mandatory info.

color rules on blank or "unit is req'd" cells

helpful validation

items defined in comments

validation Genetic lineage below lowest rank of NCBI taxonomy, which is subspecies (Specimen only). Syntax: {text}

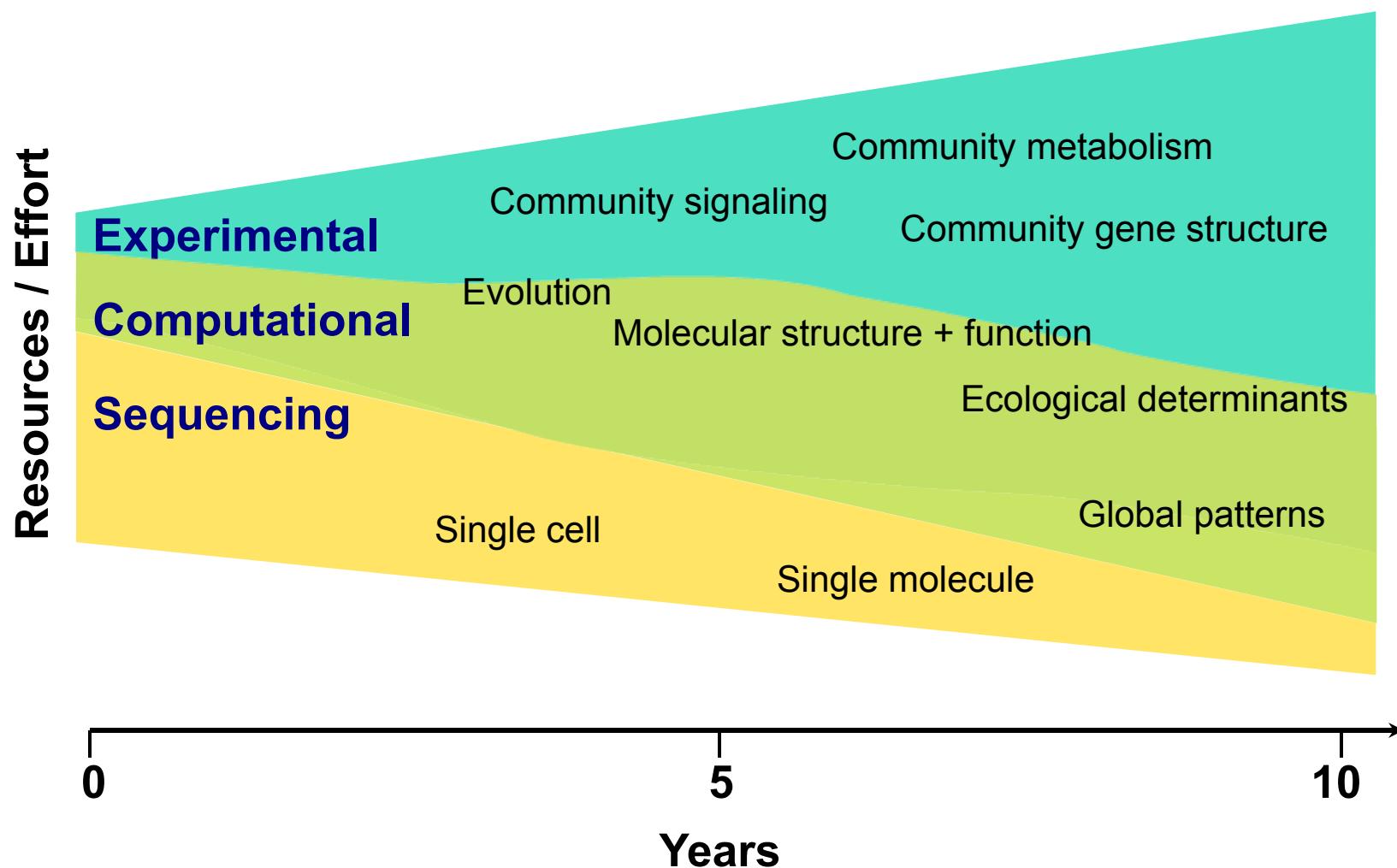
# What is Needed?

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- Greater resolution of community composition, faster clock gene(s)
- More computational tools especially for short reads
- More reference genomes AND improved annotation/reference data
- Ability to sample and analyze at soil community scale
- Delineating the active from the inactive
- Ability to link sequence to function
- Much longer reads

*A question: how important is it to know in which microbe (species) a ecofunctional gene resides?*

# Possible Shifts in Emphasis as the Field of Metagenomics Develops



# Acknowledgements



## Michigan State Univ.

- Kostas Konstantinidis
- WooJun Sul
- Debbie Himes-Yoder
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- Ederson Jesus
- Ryan Penton
- Adriana Lopez
- Jorge Rodrigues
- John Quensen

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- Vivian Pellizari,
- Sui Tsai
- Brigitte Feigl
- Jorge Rodrigues
- Klaus Nuesslein
- Brendan Bohannan

## RDP team at MSU

- |               |                   |
|---------------|-------------------|
| • Jim Cole    | • Jordan Fish     |
| • Benli Chai  | • Donna McGarrell |
| • Ryan Farris | • Qiong Wang      |

## Burkholderia team:

- J. Davies, L. Eltis, B. Mohn, UBC
- Eshwar Mahenthiralingam, Cardiff
- John LiPuma, U of Michigan

## Metagenomics team:

- |                  |                  |                          |
|------------------|------------------|--------------------------|
| • C. Titus Brown | • Jiarong Guo    | • Susannah Tringe        |
| • Adina Howe     | • Aaron Garoutte | • Tijana Glavina del Rio |
| • Patrick Chain  | • Janet Jansson  | • Rachel Mackelprang     |
| • Erick Cardenas |                  | • Gina Lamendella        |

