



# Genomic approaches to the epidemiology and diagnostics of plant pathogens: tracking the global spread of agrobacteria

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Hairy root disease



graft union



cuttings



Nurseries and Orchards

# Epidemiology, diagnostics, and the big questions

- How has modern genomics (DNA sequencing) revolutionized our ability to diagnose pathogens and track their movement?
  - Can we use these tools to better understand and diagnose disease?
- 2020: International year of plant health
- Epidemiology *-also timely*
  - How do pathogens spread?
  - What factors lead to disease prevalence?
  - What factors reduce incidence of disease?





# Modern science is an interdisciplinary and collaborative effort



Jeff Chang



Melodie Putnam



Nik Grunwald



Walt Ream



Joyce Loper



Marilyn Miller



Javier Tabima



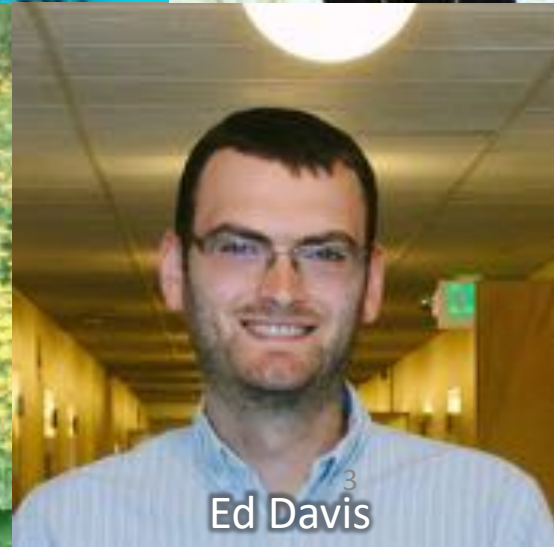
Michael Belcher



Chih-Horng Kuo



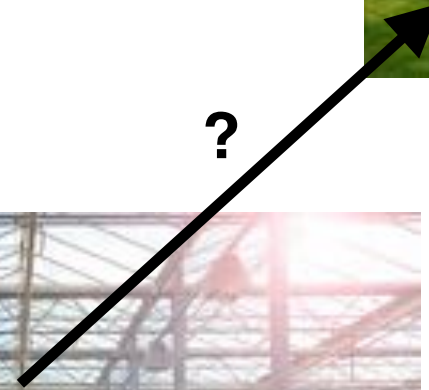
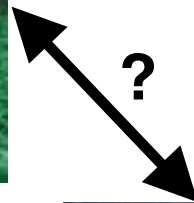
Erh-Min Lai



Ed Davis



# How do plant associated bacteria spread? How do mobile genetic elements affect plant/microbe symbiosis or pathogenesis?



Are strains shared between sites?  
Are there multiple infection genotypes?  
How long do genotypes persist?  
Does horizontal gene transfer/plasmid conjugation play a role in infection?

How does this impact disease?  
Other traits are beneficial  
What role does human activity play?



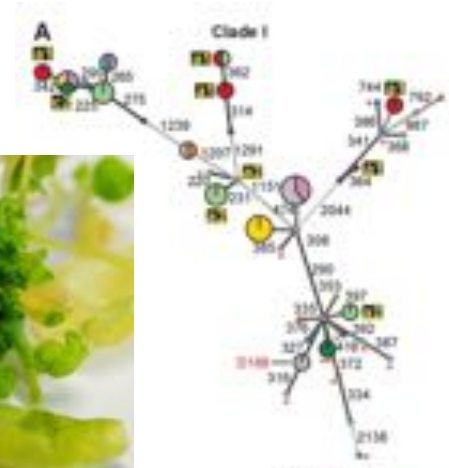
## ***Agrobacterium tumefaciens***

Crown gall disease

Evolution of Ti plasmids

Global transmission patterns

Weisberg et al., 2020 Science



## ***Rhodococcus fascians***

Leafy gall disease

Tracking spread of *Rhodococcus*  
in nurseries

Savory et al., 2017 eLife

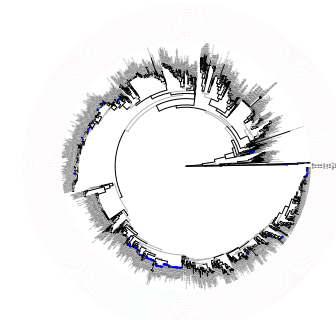


## ***Bradyrhizobium***

Nitrogen fixation symbiosis

Characterizing ineffective “cheater” strains

Collaboration with Joel Sachs, UC Riverside



## ***Streptomyces scabiei***

Potato common scab disease

Collaboration with Chris Clarke, USDA

# What we are interested in (and an outline)

- Evolution of *Agrobacterium tumefaciens*
- Evolution and emergence of Ti plasmids
- How the agro genotype/plasmid combination affects degree of pathogenicity and host range
  - Look to nature, what combinations work with what plants?
- The spread of *Agrobacterium*

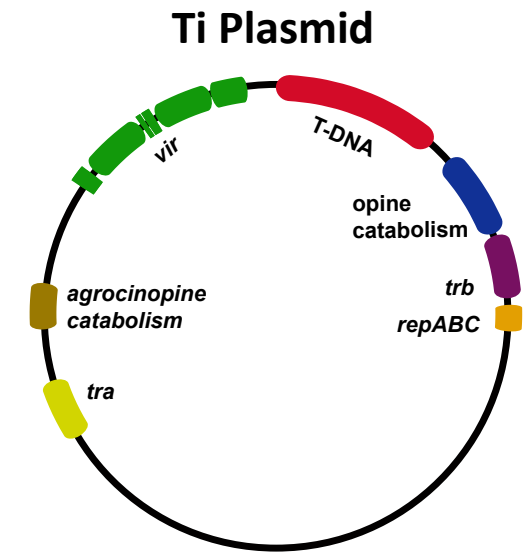
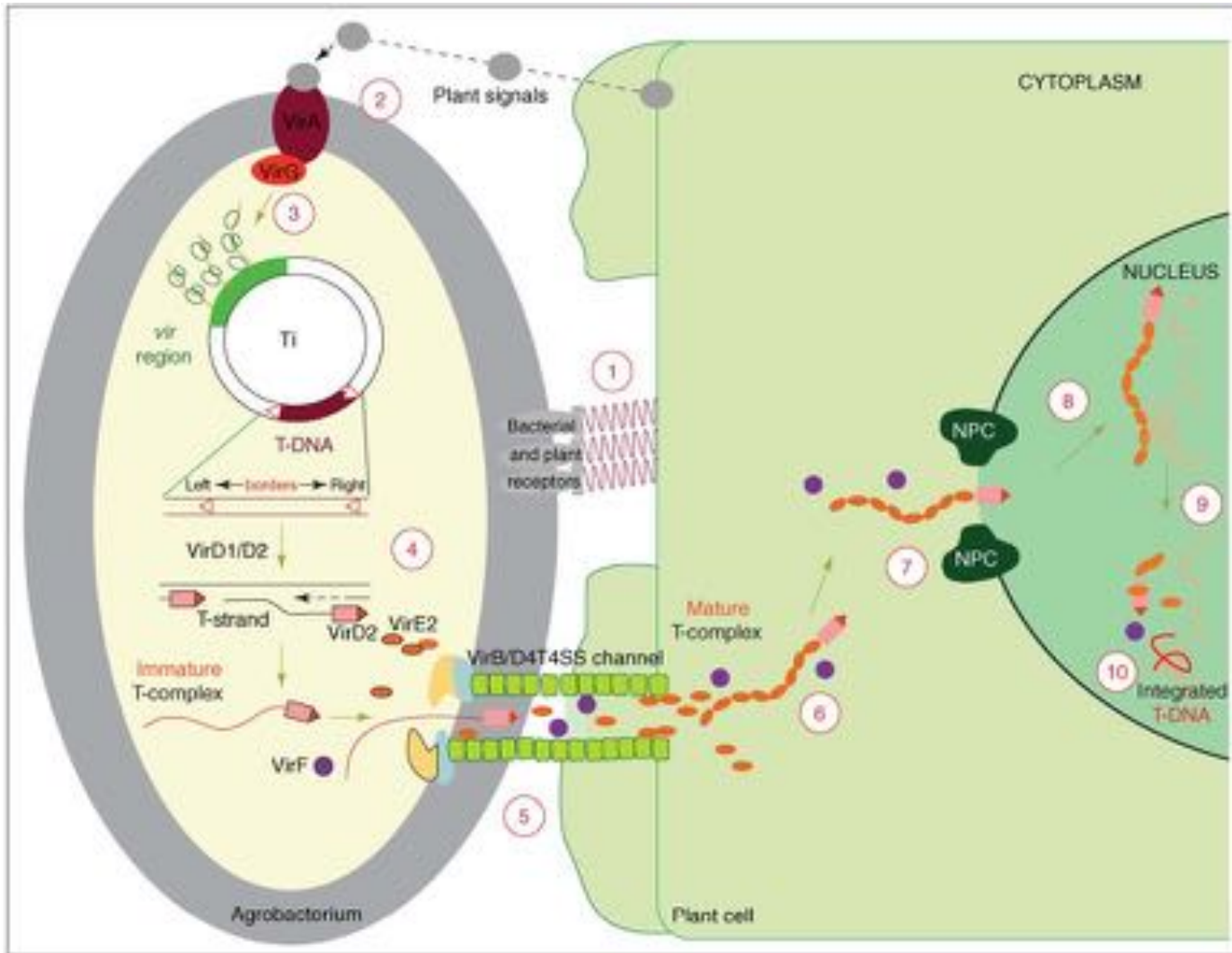


# Crown gall disease is a major problem for US agriculture

- masses of undifferentiated tissue
- millions \$ in damages each year to nurseries, orchards, vineyards
- wide range of plant hosts
- Graft failure, reduced fruit yield/quality
- Constriction of the vascular tissue
- not always fatal but disfiguring for nursery plants
- no cure, plants must be destroyed



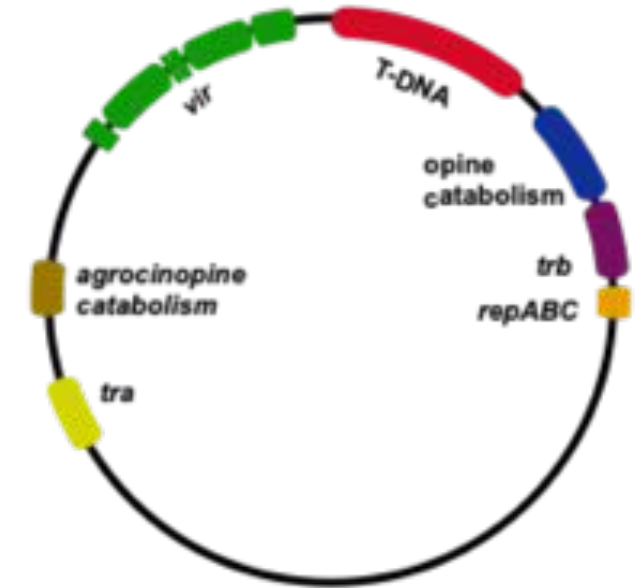
# *Agrobacterium tumefaciens* genetically modifies plants and causes crown gall disease





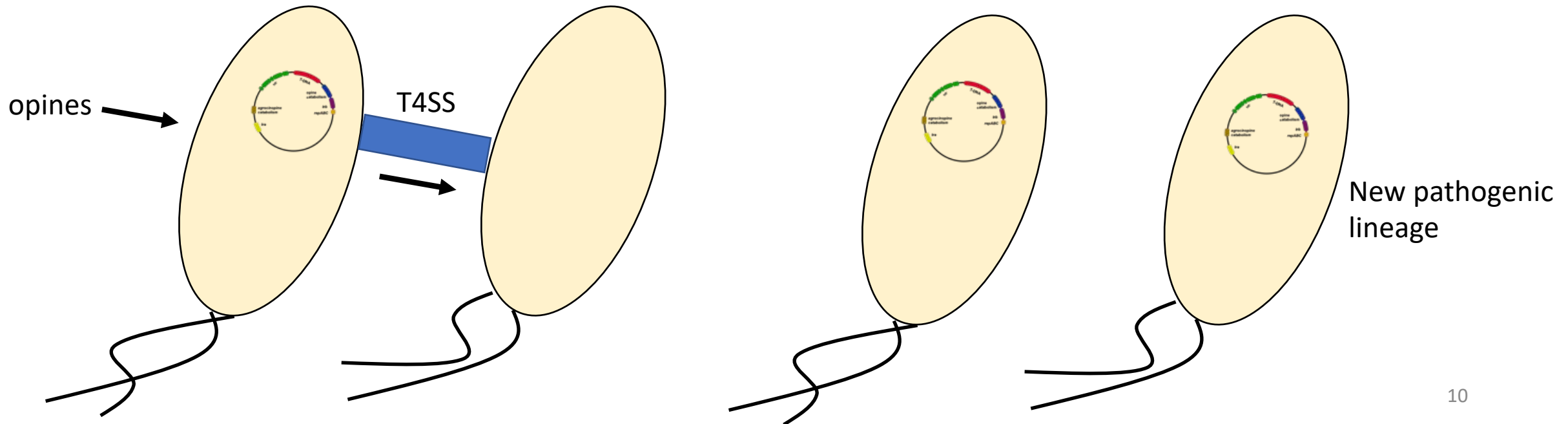
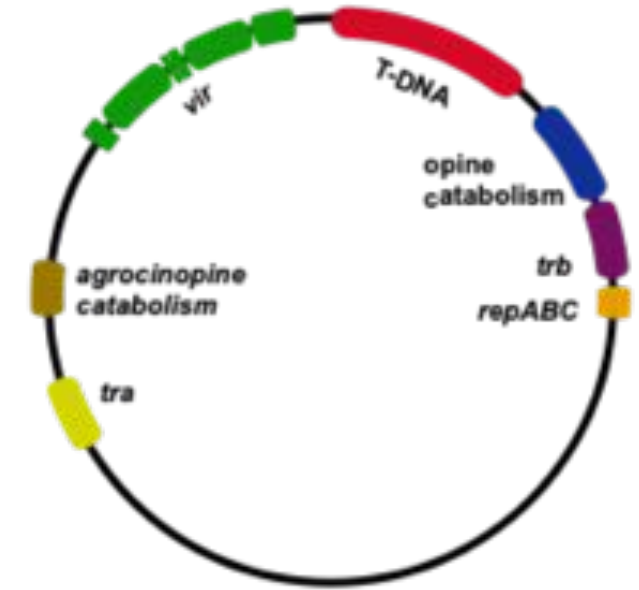
# What's on a Ti plasmid?

- Essential elements:
  - T-DNA - oncogenes and opine synthase(s)
  - *virABCDE* operons
  - opine catabolism
  - plasmid replication (*repABC*) and conjugation (*tra/trb*)



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# What are inherent challenges to epidemiology studies in agriculture?

- Non pathogens have many features in common to pathogens
  - Ex. T3SS in commensals
- Genetic diversity of taxonomic groups is very high
  - Have to account for that in comparisons
- *Agrobacterium* - 4 polyphyletic lineages/biovars
  - More than 20 species-level groups (ANI)
- A conjugative plasmid confers virulence
  - Plasmids spread horizontally and create new pathogenic lineages
  - Tools for epidemiology are not applicable to plasmids
  - Virulence plasmids are genetically diverse –change rapidly



Source: news-medical.net

# Experimental design

## 1. Ecological sampling

Melodie Putnam  
OSU Plant Clinic



Larry Moore  
Culture Collection



## 2. Whole genome sequencing



3. *De novo* genome assemblies, genome analyses,  
chromosome (vertical) vs MGE (horizontal),  
phylogenetic trees, network analyses



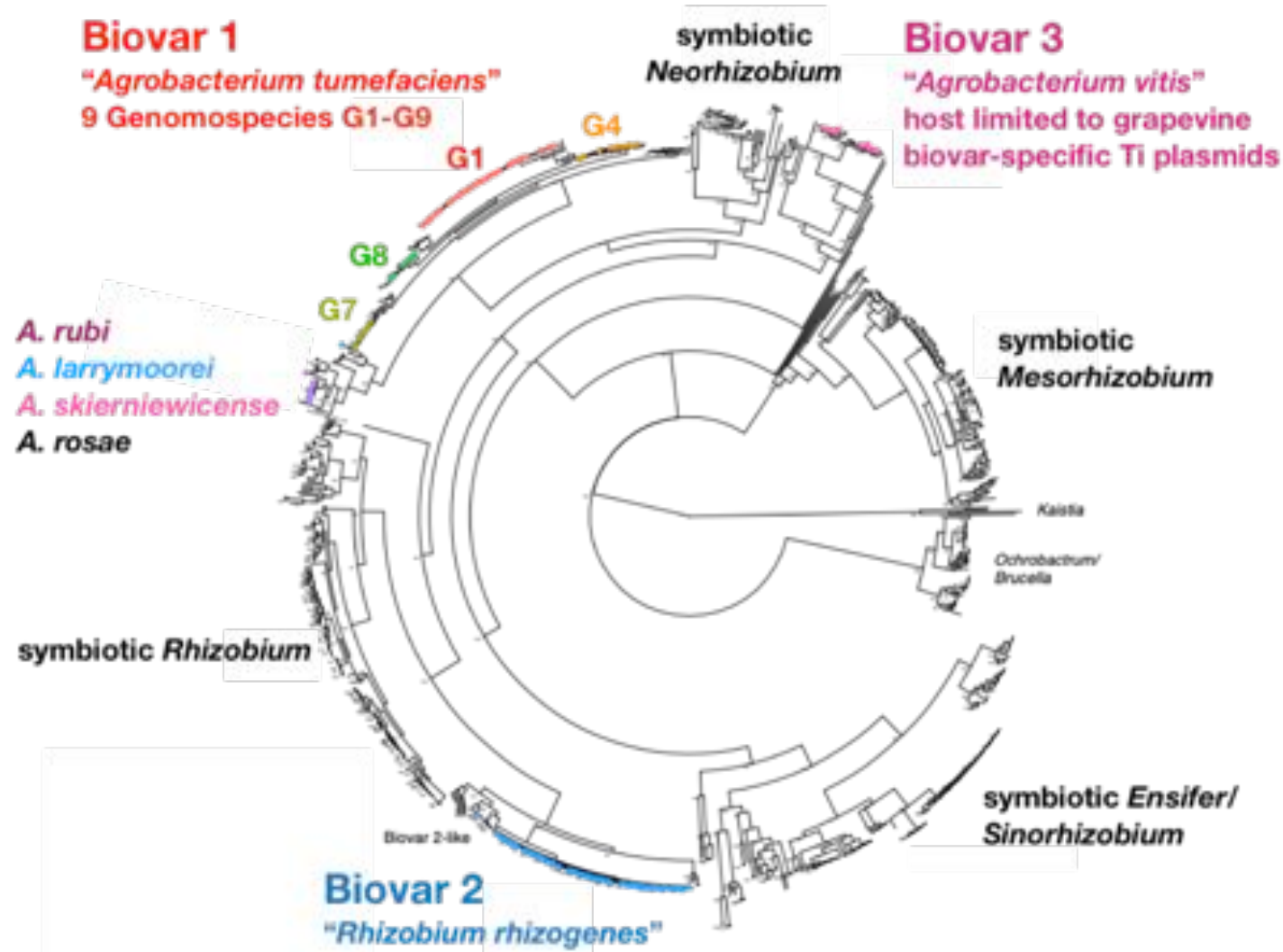


# Generating a diverse dataset to provide a framework for comparison

- >150 diverse *Agrobacterium* strains
- 1927-2016
- >50 plant host species
- Also >60 contemporaneous strains from nurseries

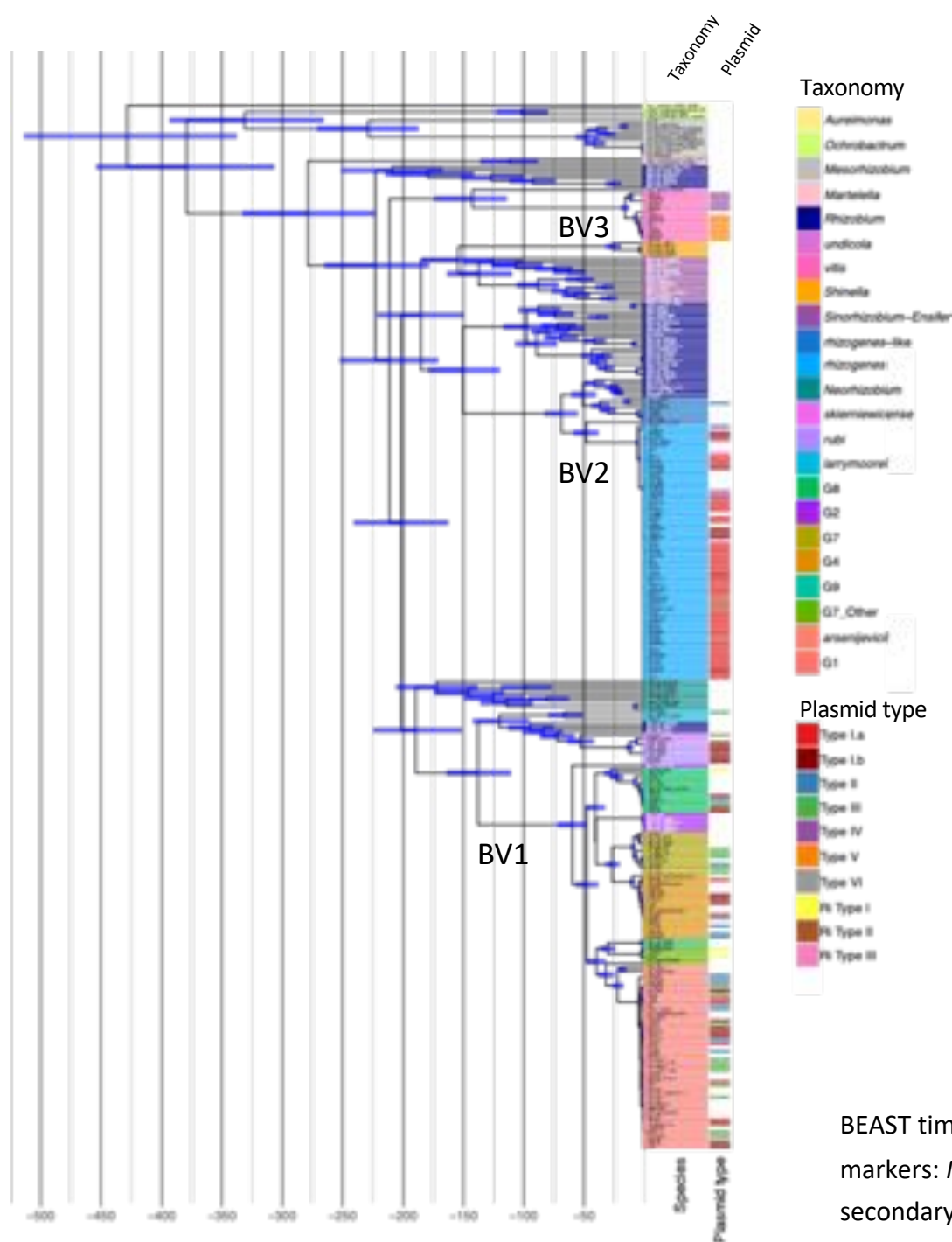


# Agrobacteria comprises three polyphyletic clades interspersed with Rhizobium



Whole genome-based approaches (ANI, POCP) are consistent with these groupings





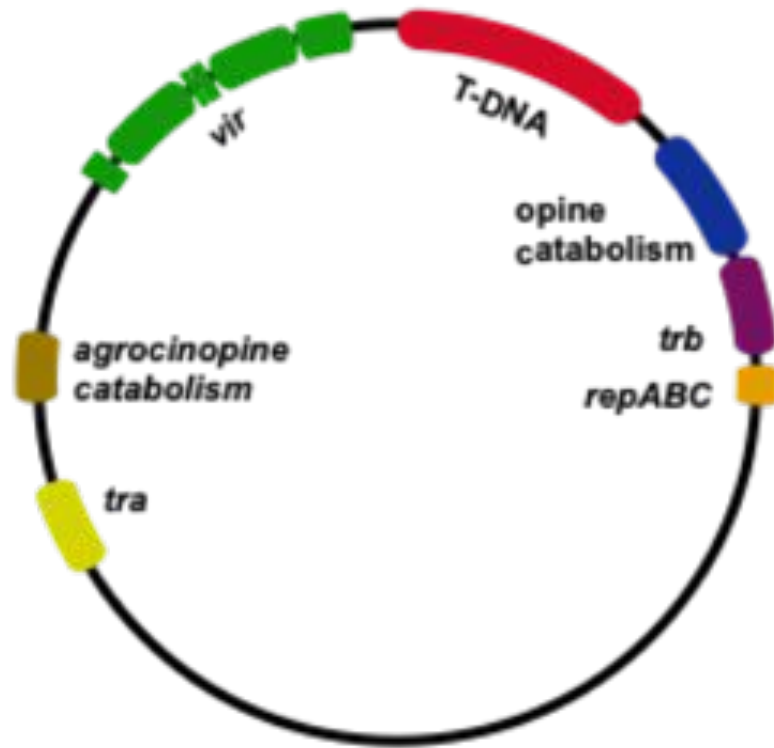
# Biovar 1 diversified earliest, biovars 2 and 3 are recent

Biovar 1: ~59 Mya

Biovar 2: ~1.6 Mya (bottleneck)

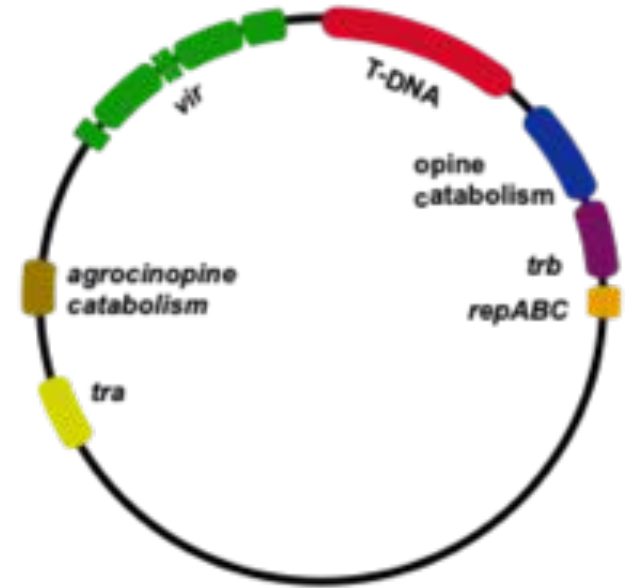
Biovar 3: ~16 Mya

# Ti/Ri Plasmids drive the phenotype



# Ti plasmids are diverse, highly recombinogenic

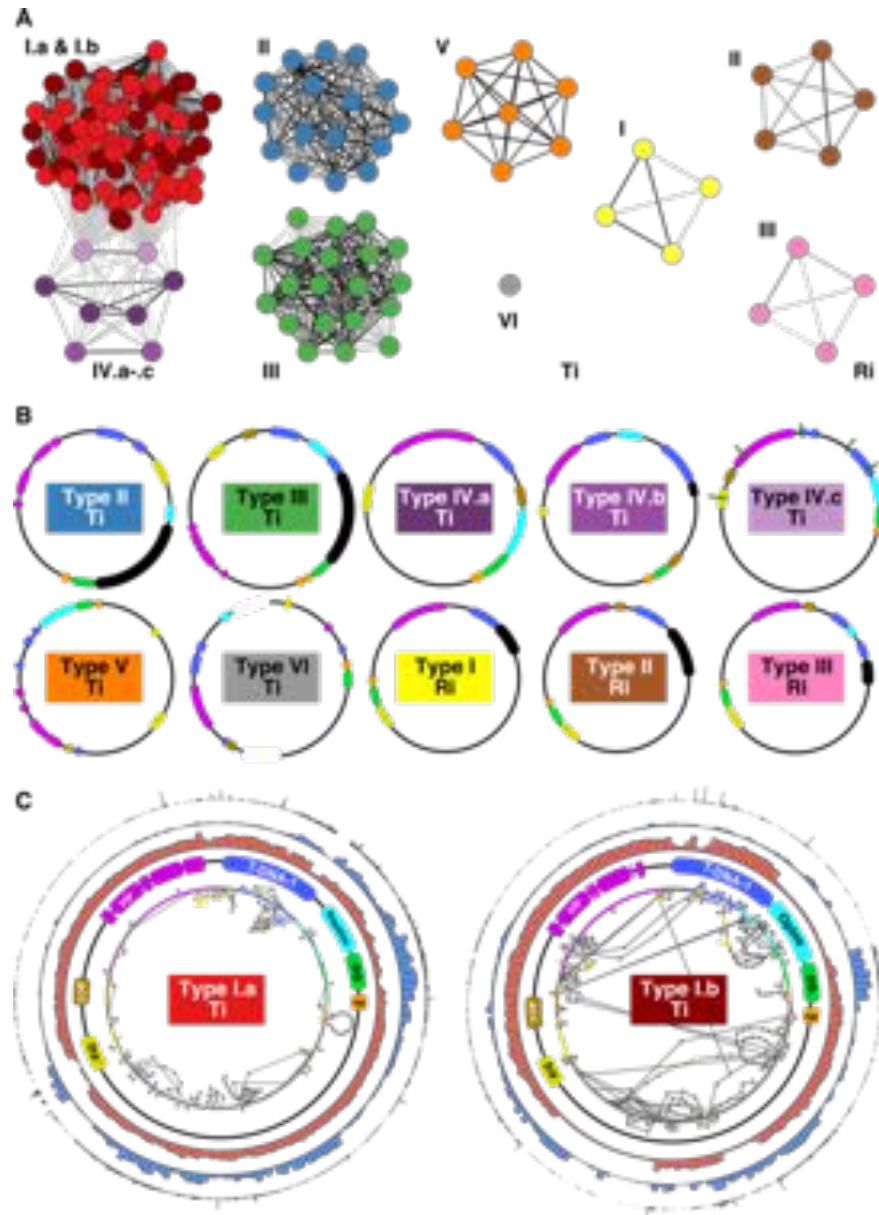
- Essential elements:
  - T-DNA - oncogenes and opine synthase(s)
  - *virABCDE* operons
  - opine catabolism
  - plasmid replication and conjugation
- 5 available sequenced plasmids are all different
- Hypothesized plasmids evolved by recombination:



*“Frequent horizontal gene transfer makes the construction of phylogenetic trees for ... pTi/pRi plasmids ... practically impossible. Even if thousands of Agrobacterium genomes were available, it might still be impossible to establish phylogenetic trees” (Chen and Otten 2017)*

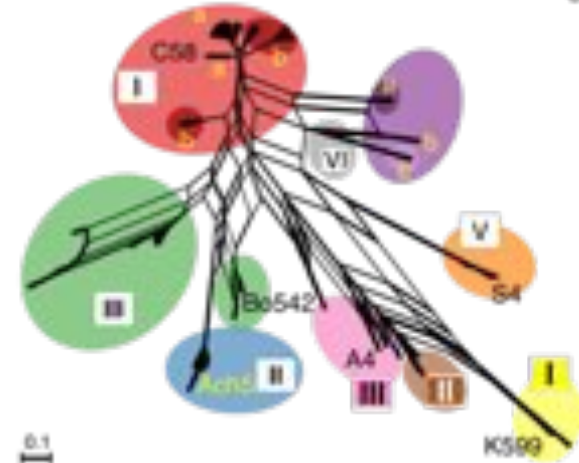


# Classification and evolution of the Ti plasmids

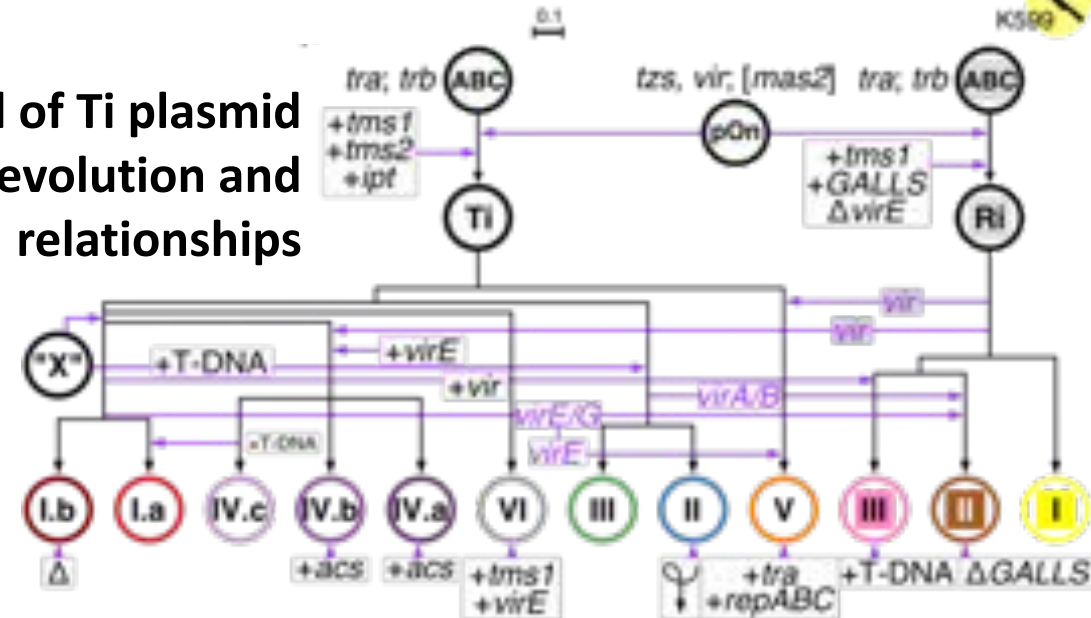


## Categorized Ti plasmids using K-mers, gene content, phylogeny, structure

**Ti plasmids represent 6 types**  
**Ri plasmids have 3 types**



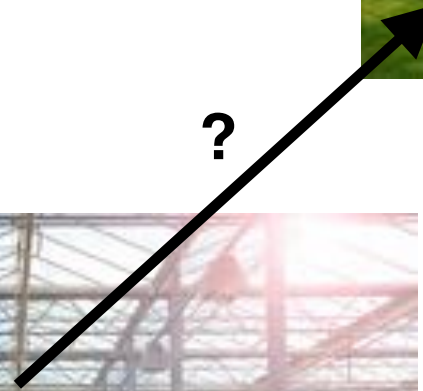
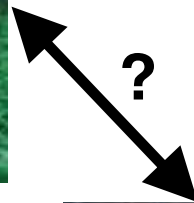
# Model of Ti plasmid evolution and relationships



## Gene synteny

### Networks to visualize variation/indels

# How does *Agrobacterium* spread? How do virulence plasmids impact the spread of disease and creation of new lineages?

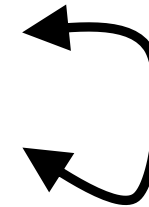


Are strains shared between nurseries?

Are there multiple infection genotypes?

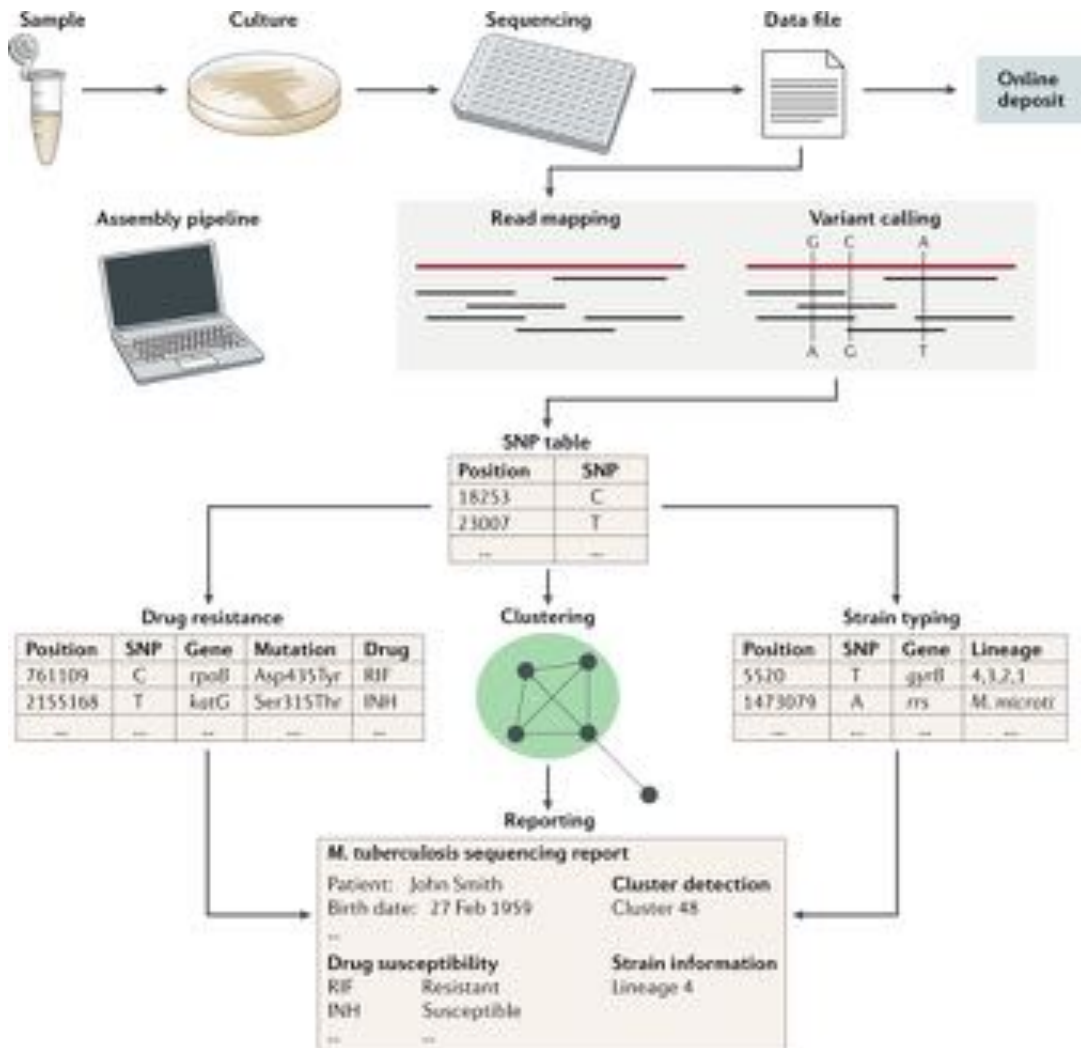
How long do genotypes persist?

Does Ti/Ri plasmid conjugation play a role in infection?

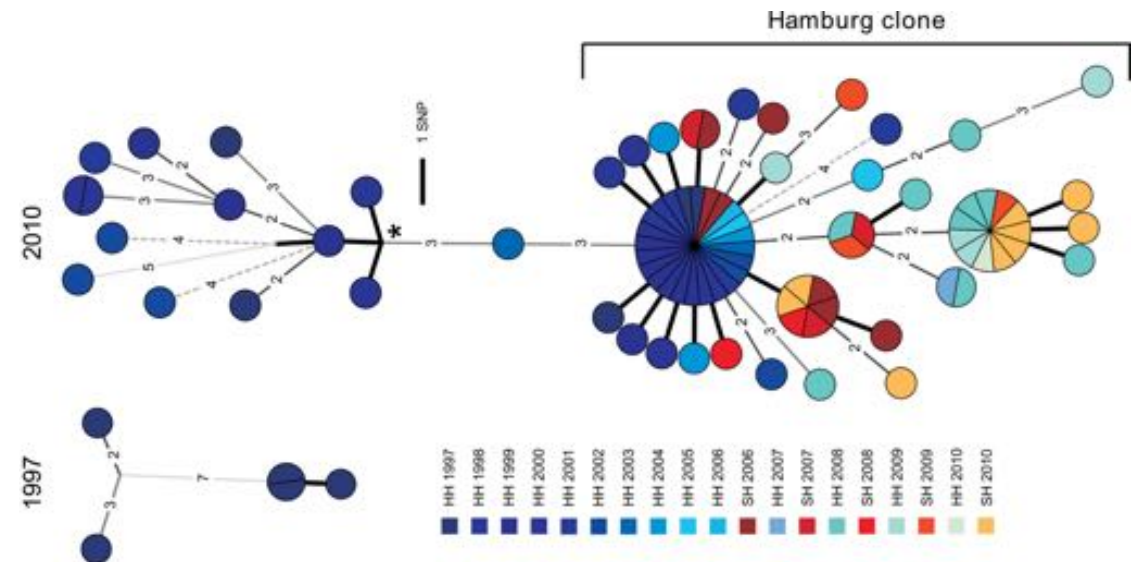




# Typical epidemiology approaches track outbreaks using whole genome SNPs



- Compare against a common reference genome
- Identify single nucleotide polymorphisms (SNPs)
- Cluster strains into genotypes based on pairwise SNP differences (0 -10 or 25 SNP threshold)
- Track outbreaks by comparing genotypes



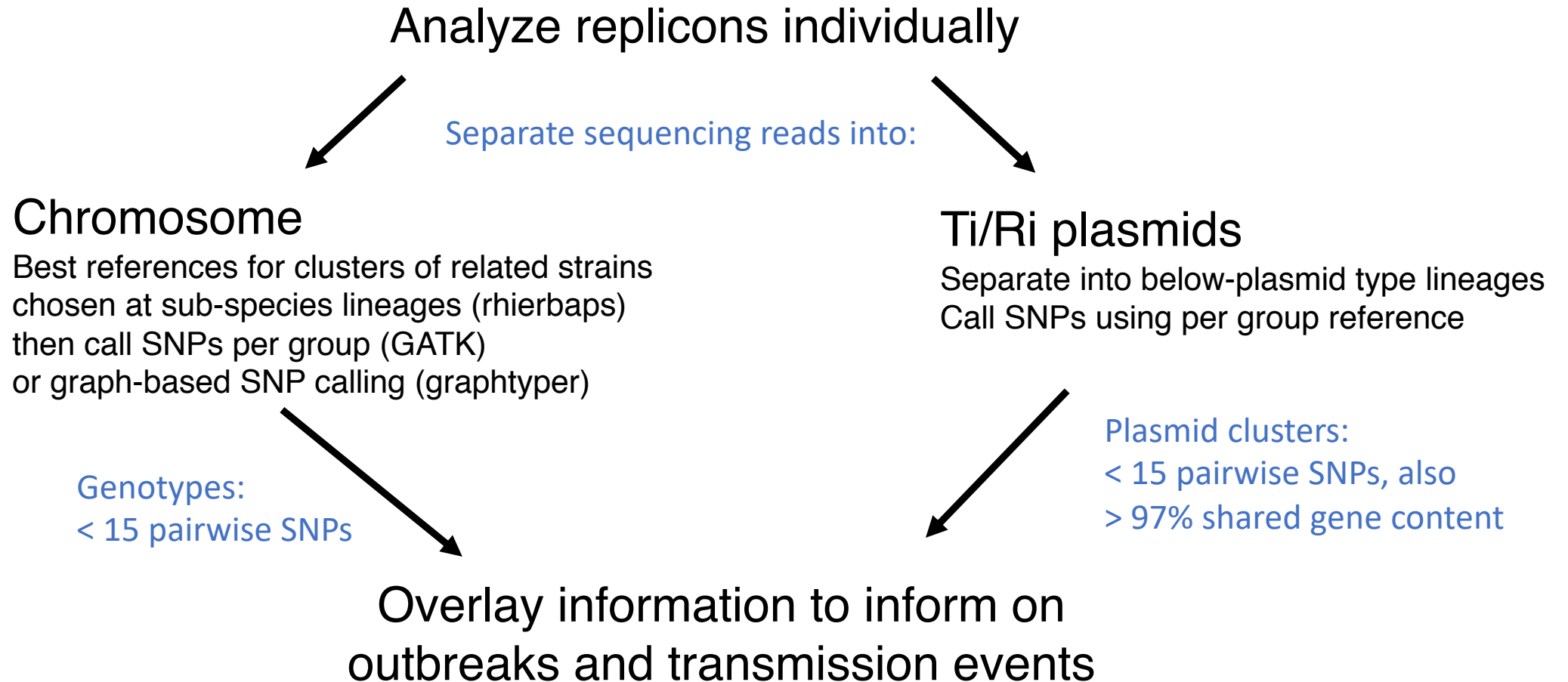


# Why studying the epidemiology of agrobacteria is difficult

- *Agrobacterium* has high genetic diversity
  - 4 polyphyletic lineages/biovars
  - > 20 species-level groups (ANI)
  - No single common reference genome (leads to noise)
    - Poor reference choice = greater # of false positives, negatives
- A conjugative plasmid confers virulence
  - Plasmids spread horizontally and create new pathogenic lineages
  - Tools for epidemiology are not applicable to plasmids
  - Plasmids change as well

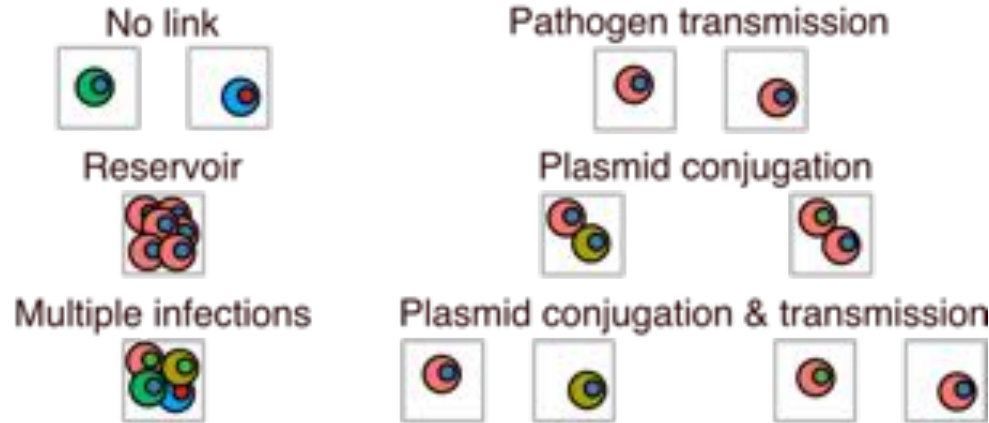
# How did we approach this?

- Model transmission of chromosome and plasmids as uncoupled replicons

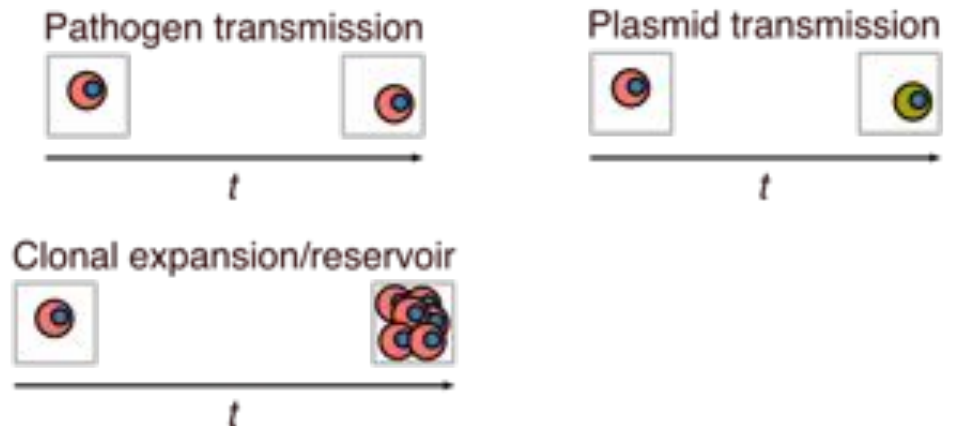


# Predicted epidemiological patterns

## Spatial patterns



## Temporal patterns



Transmission of chromosome and plasmid modelled independently

Chromosome & plasmid in phase -> **transmission**

Chromosome & plasmid out of phase -> **conjugation occurred**

Cannot draw conclusions on direct vs indirect

Growers were deidentified  
S# = state; C# = country; N# = nursery/location



# Epidemiological patterns

Two networks were combined:

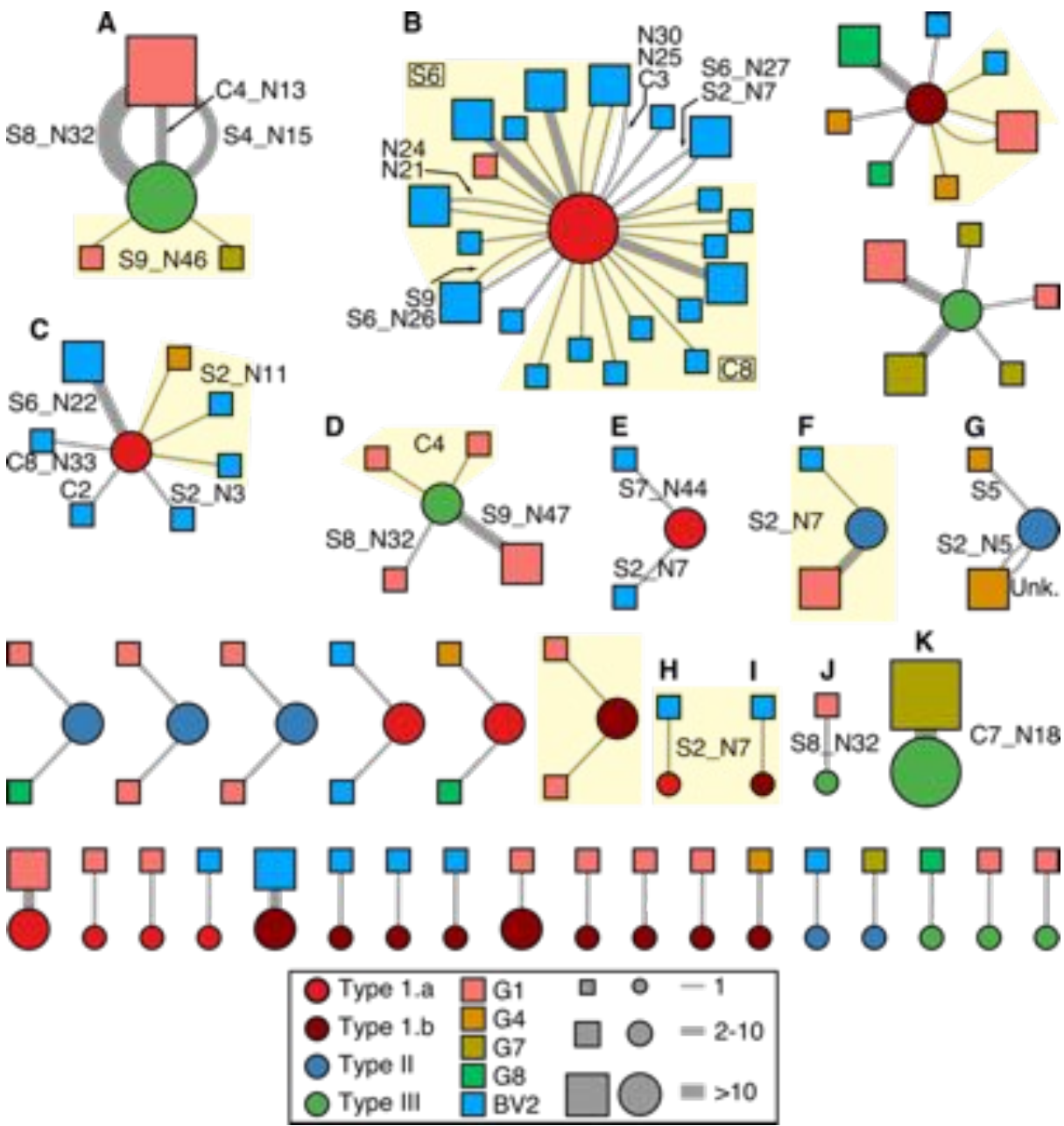
● Circle: plasmid **cluster**  
(≤15 SNPs; ≥97% genes)

■ Square: strain **genotype**  
(≤15 SNPs)

■—● Edge: strain at same **location**

BV2 I.a Colored according to  
classification  
(genomospecies, plasmid type)

Scaled to count

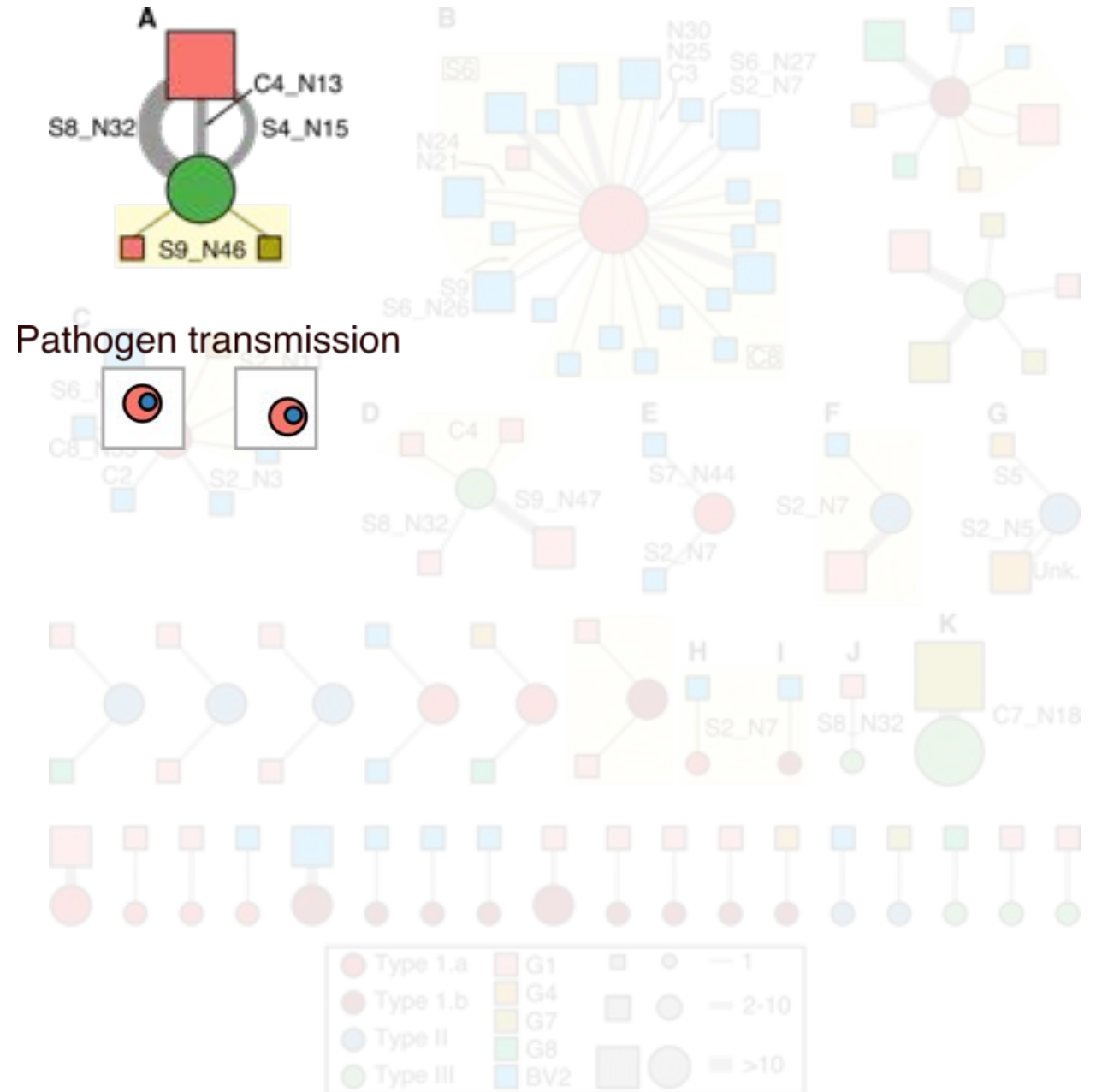
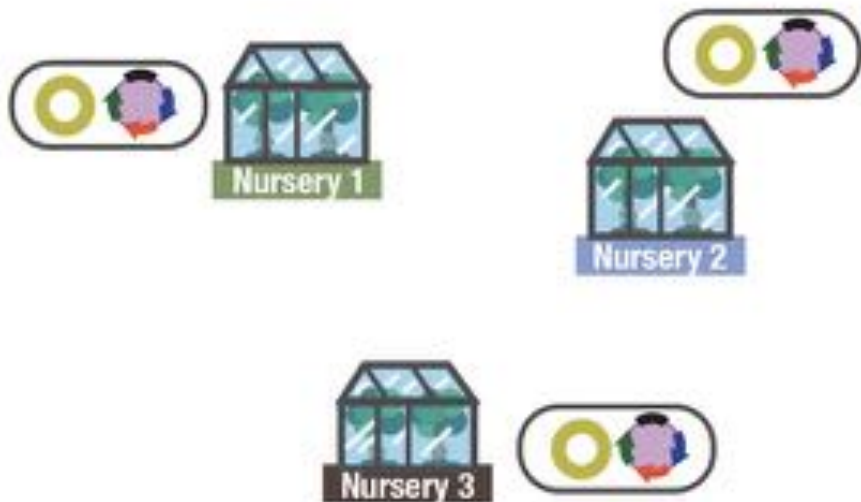


# 7 indicative of strain/plasmid transmission

$\geq 2$  edges between strain + plasmid

Example shows 2 countries, 3 locations

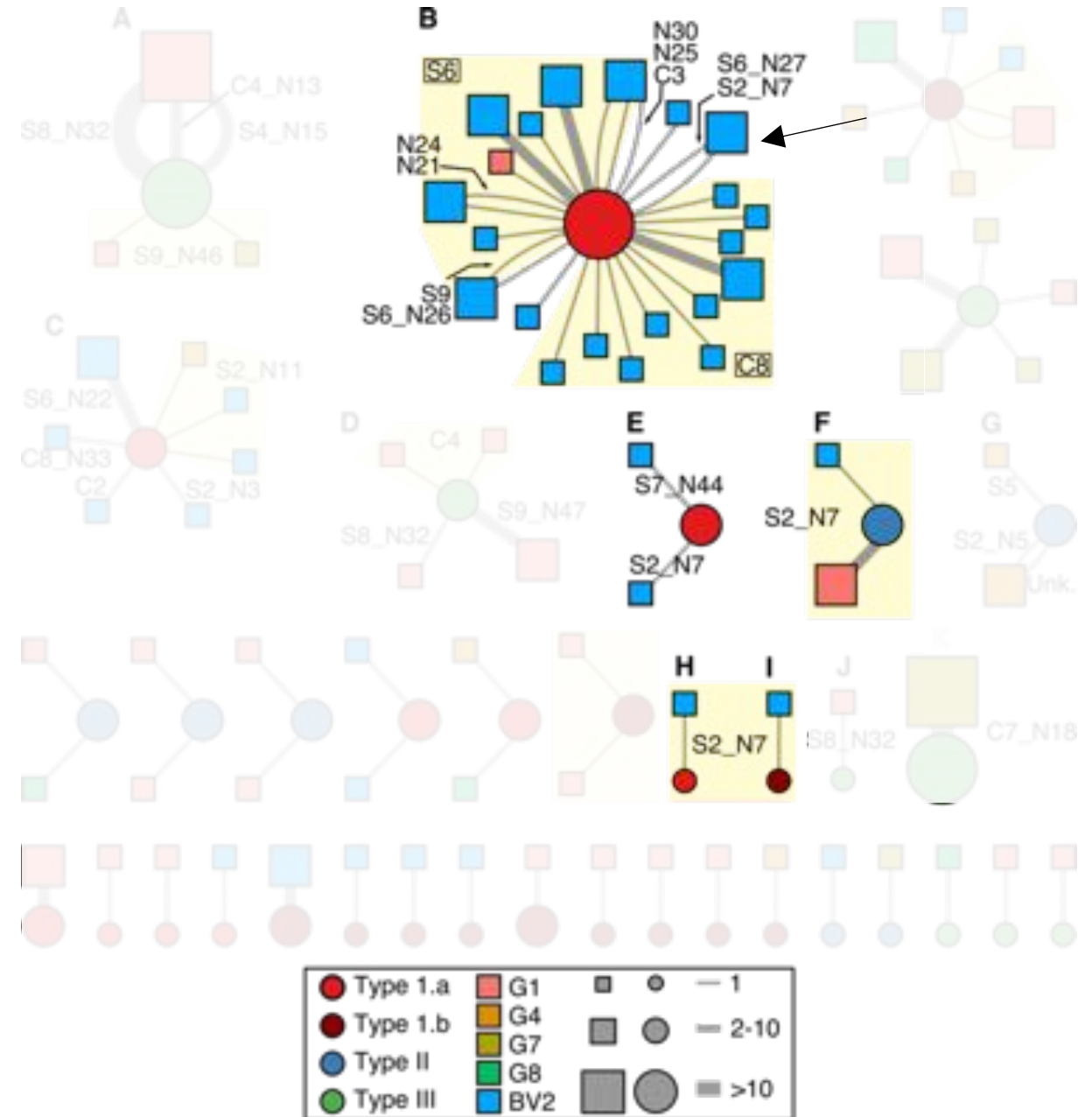
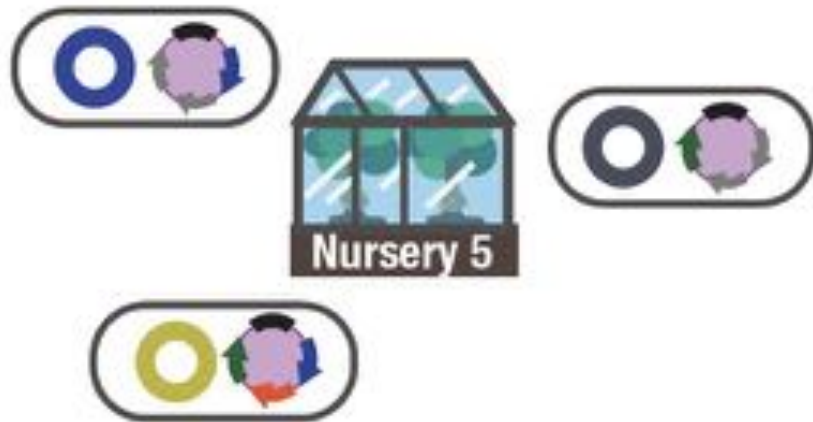
Potential common source; one is a supplier



# Some nurseries have multiple infections

One particularly unfortunate grower (S2\_N7) has 7 unique genotype/plasmid combinations.

Multiple infections co-occurring and multiple introductions of pathogens

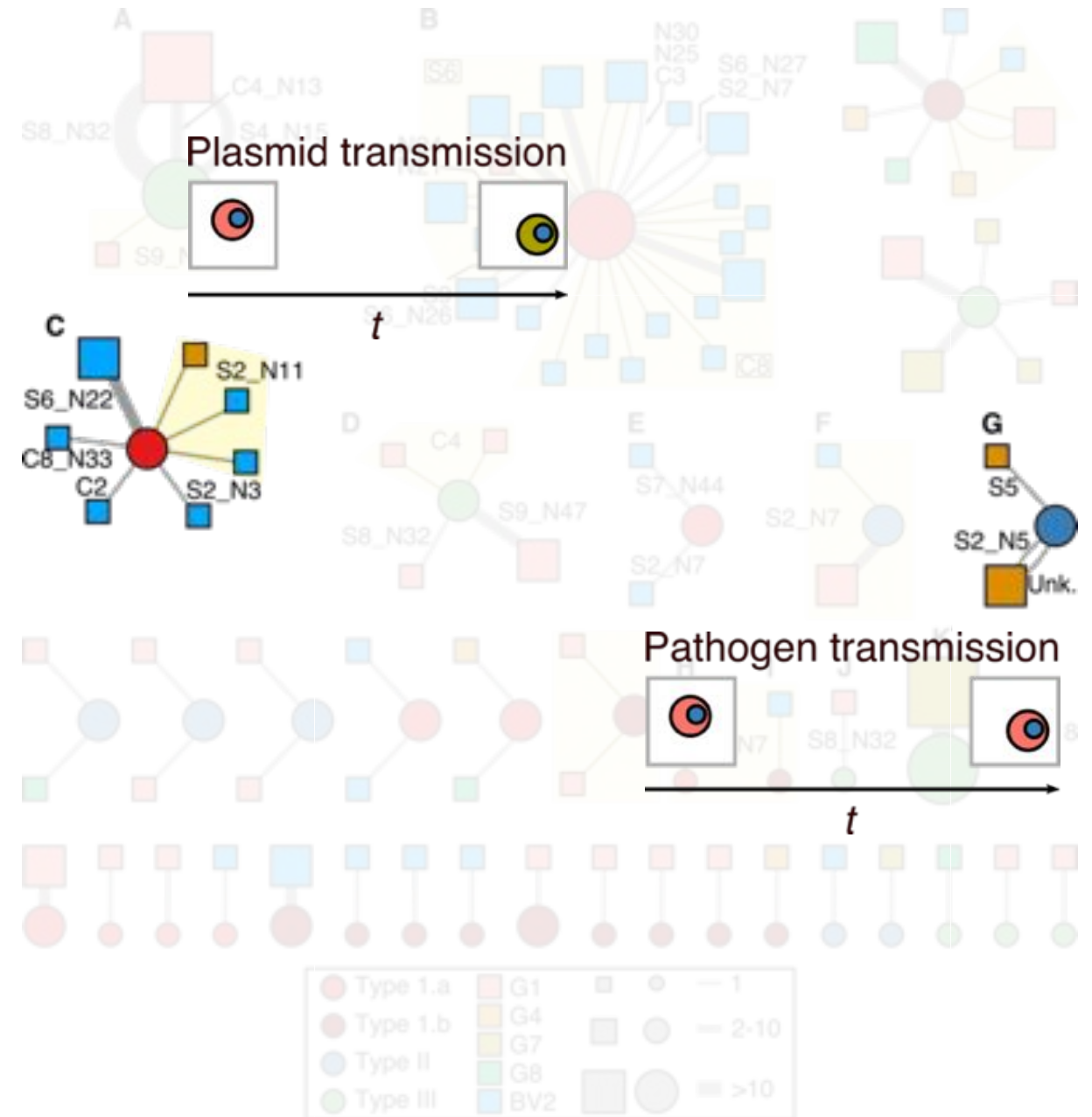




# 2 indicative of long-term persistence

C) C2 collected in 1964; others 1995-2009  
Plasmids have  $\leq 2$  SNPs

G) Strains (7 SNPs) + plasmids (0 SNPs)  
sampled 60 years apart

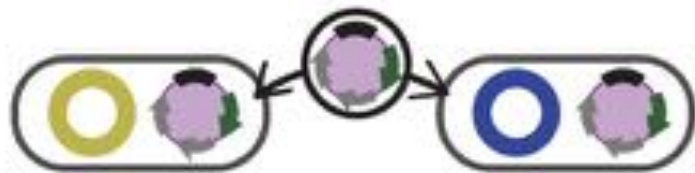


# 15 suggesting plasmid conjugation causes spread

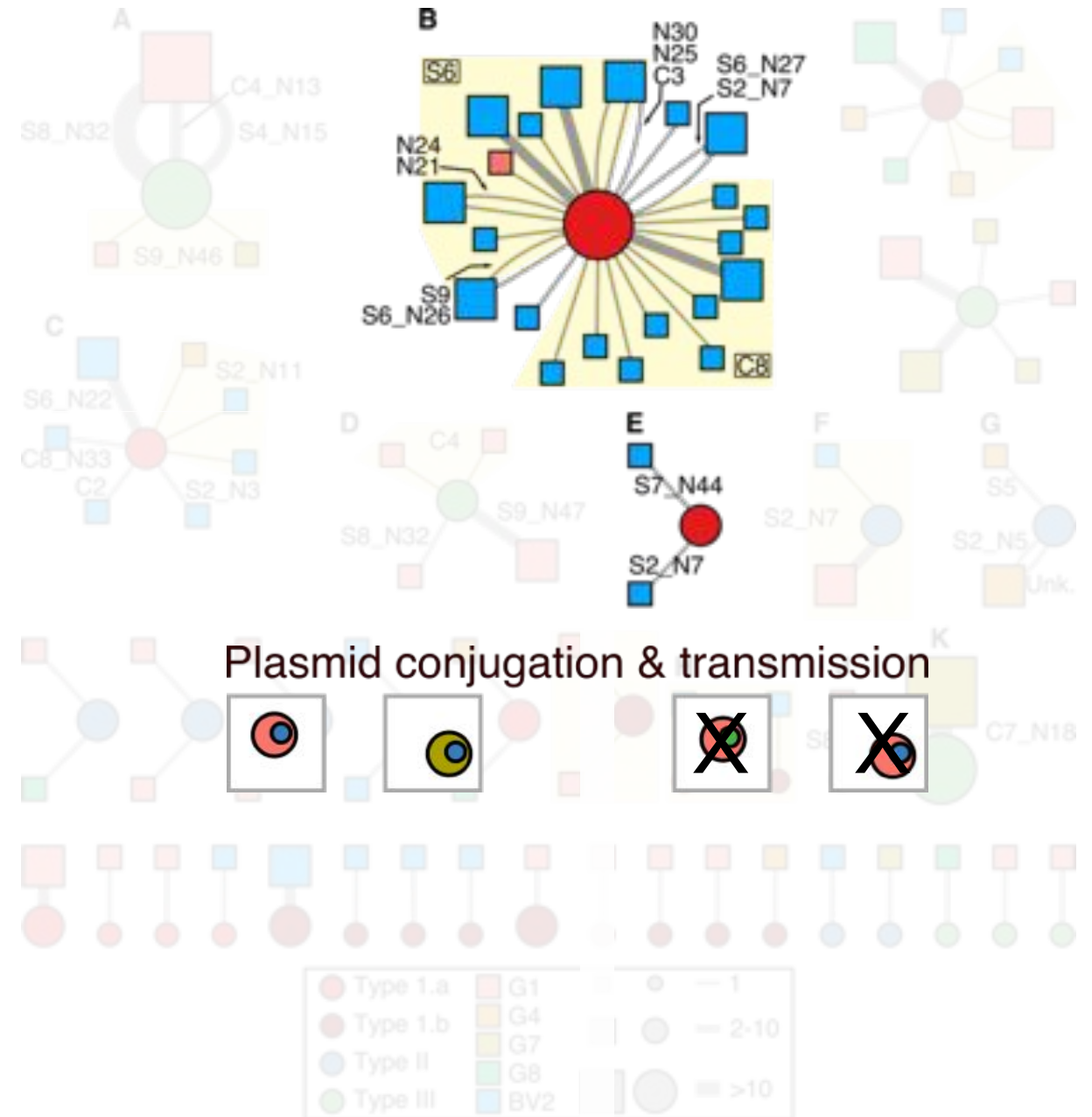
Plasmids (circle) as central hub = associated with multiple strain genotypes

B) 1 plasmid lineage ( $\leq 13$  SNPs)  $\rightarrow$  21 genotypes  
3 states & 3 countries

E) 1 plasmid lineage (2 SNPs)  $\rightarrow$  2 genotypes (22,000 SNPs)

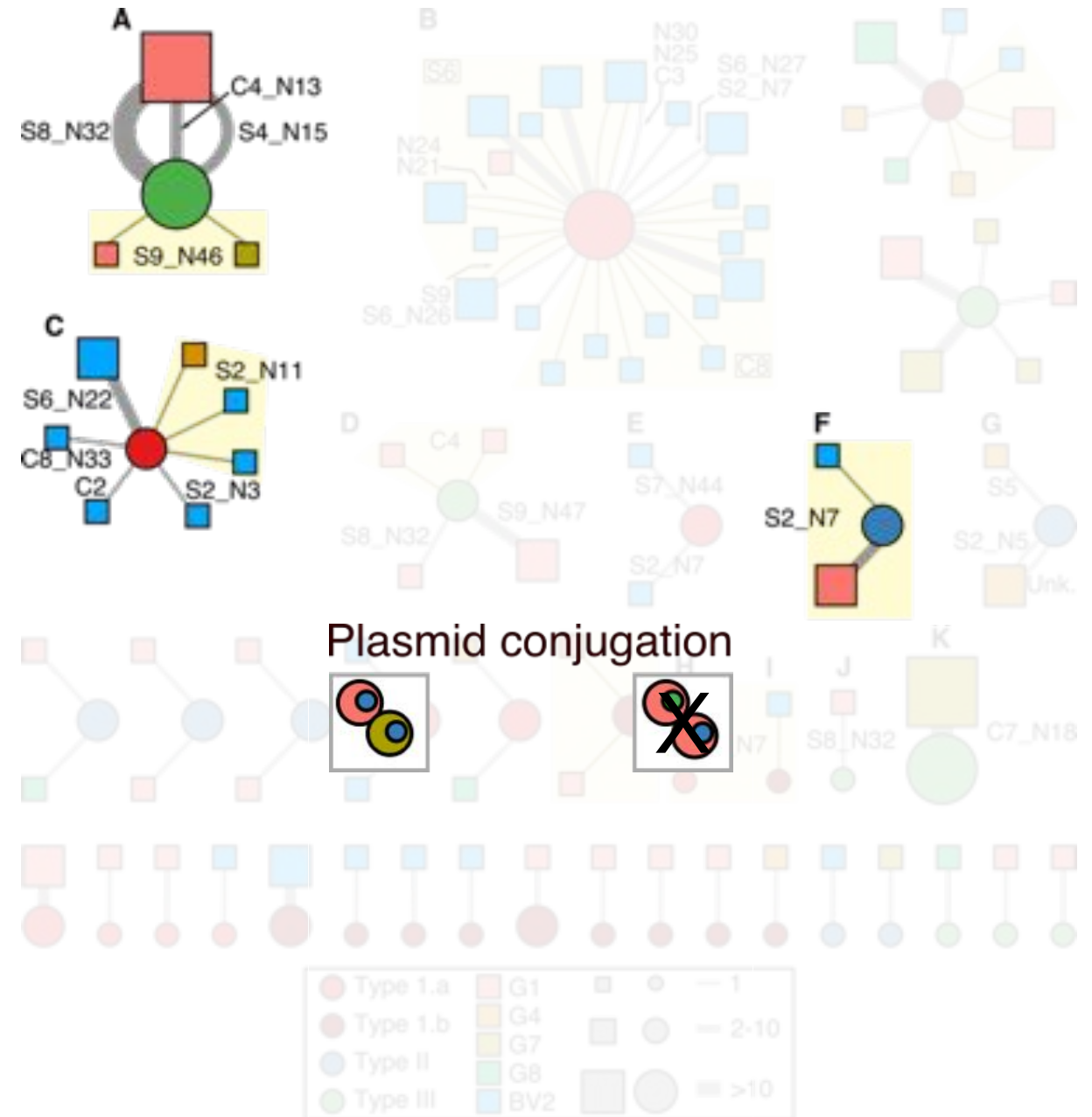


Where? When?

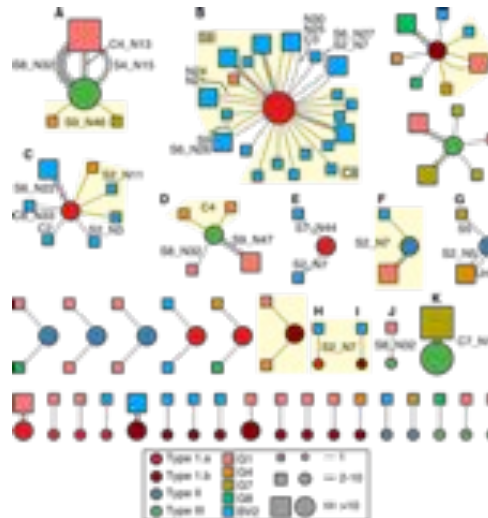
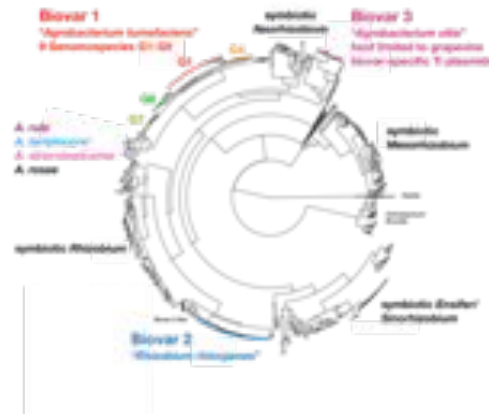
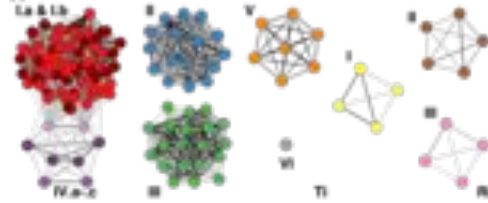


# 3 consistent with plasmid conjugation at a single location

Plasmids (circle) as central hub = associated with multiple strain genotypes & collected from same location (highlighted in yellow)



# Summary



- WGS is extremely cost effective
  - Already being used to track foodborne pathogens
  - Time is ripe for implementing in agriculture
- Applied in a unique way to track pathogens and their mobile genetic elements
- Clarified relationships of agrobacteria + rhizobia
- Overcame challenges inherent to plasmids
  - Classified Ti/Ri plasmids + modeled their evolution
  - Used as a framework for epidemiology
- HGT of plasmids diversifies pathogens, plasmids, and promotes persistence and spread of disease
- Human activities (plant production industry) escalate the process



# Acknowledgements

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Melodie Putnam



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Marilyn Miller  
Walt Ream  
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