#### **ORIGINAL ARTICLE**

### Whole-Genome Sequencing and Social-Network Analysis of a Tuberculosis Outbreak

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> jclub 07/20/2017

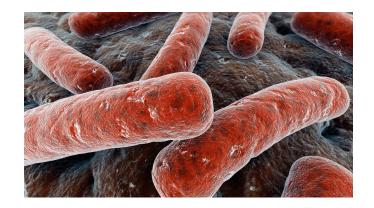
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### Preface (Subjective)

- Not a technically rigorous/intense publication (not a single p-value)
- Interest in the integration of data

### Mycobacterium Tuberculosis

- Important bacteria, spread through air, that infects lungs, brain, and spine, causing infectious disease, tuberculosis
- Possible symptoms: pain, cough, fever, weight loss, death!
- Smear positive and smear negative (main types)
- While it is increasingly uncommon in the 21<sup>st</sup> century, those who have TB suffer from long antibiotic courses, as well as a high potential for spreading the disease
- Control programs for TB exist, even in developed countries



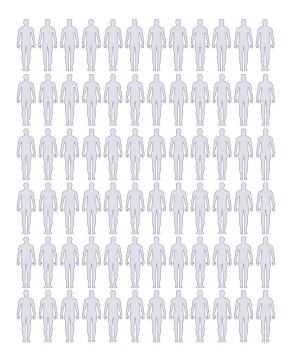


### Mycobacterium Tuberculosis Outbreak in British Columbia, Canada

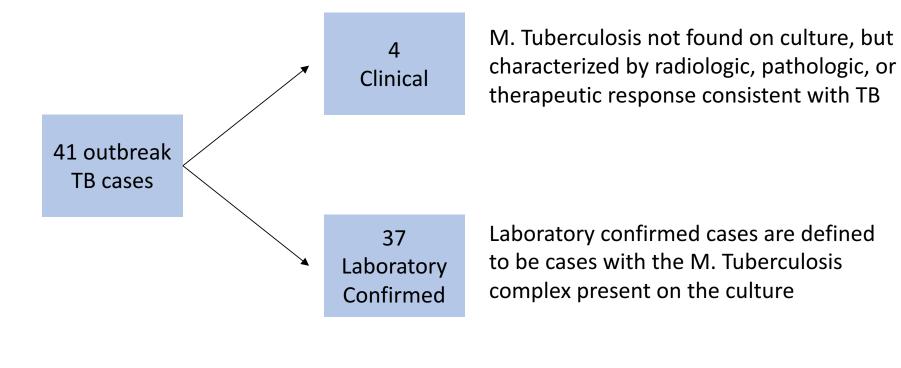
2007 National Average<sup>+</sup>



2007 British Columbia community outbreak<sup>+</sup>



# Cases of Tuberculosis in one region of B.C. between May 2006 to December 2008.



4 Historical isolates

### Dual approach to understanding the outbreak

Establishing a Community Network

- Contact Tracing
- Social-Network Questionnaire

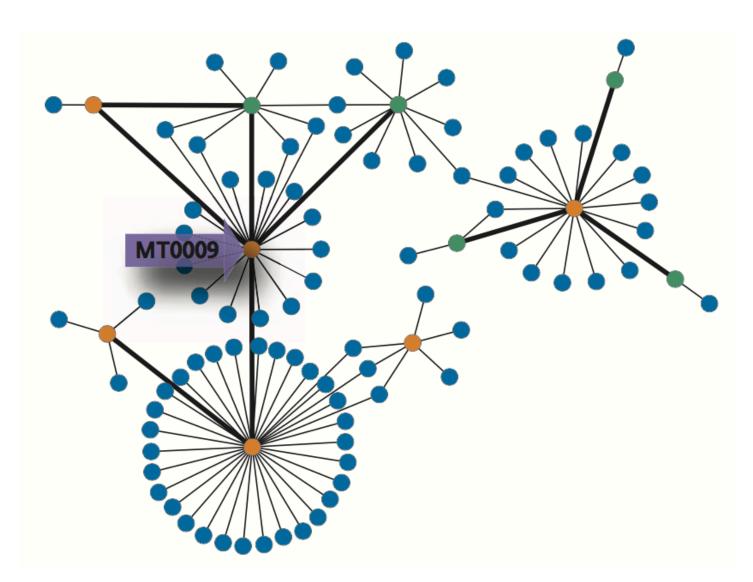
Genomic Analysis from VNTR and WGS

- Hierarchical clustering
- Bayesian MCMC phylogenetic inference
- Maximum-likelihood phylogenetic inference

# Social Network Approach

## **Contact Tracing**

- Involves identifying the people who are infected and who they have come in contact with.
- Here, a bias is shown towards patient MT0009, a pediatric case, an unlikely source.
- Potentially, an incomplete network is present



### Social-Network Questionnaire

Example topics included:

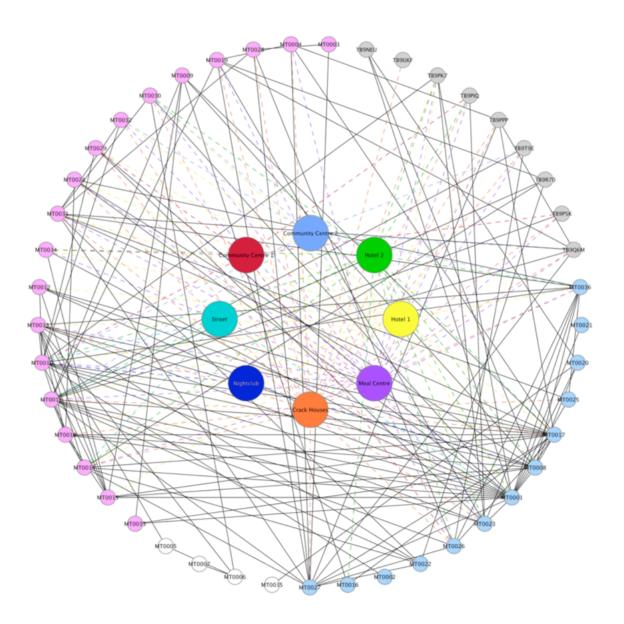
- Medical History
- Places of aggregation
- Drug and Alcohol History

Example questions included:

- Who are your closest friends or the people you hung out with the most in the last year?
- Do you share drugs with them? (If yes, which drugs and how are they shared)
- Are you infected with HIV?

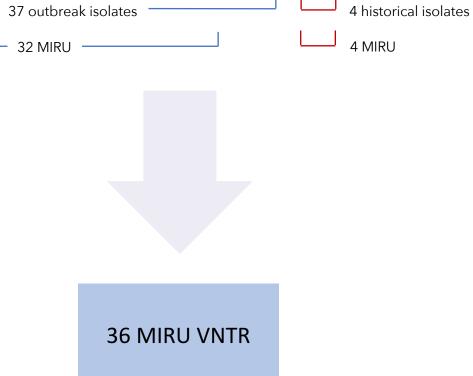
Table 1. Characteristics of 41 Patients with Laboratory-Confirmed or ClinicalTuberculosis in a British Columbia Community from May 2006 throughDecember 2008, According to Tuberculosis Lineage.\*

Characteristic	Lineage A (N=13)	Lineage B (N=19)	Not Known (N=9)
Age — yr			
Median (range)	37 (21–55)	33 (1–71)	38 (4–52)
Mean (range)	36 (21–55)	34 (1–71)	32 (4–52)
Female sex — no. (%)	6 (46)	13 (68)	4 (44)
Canadian-born — no. (%)	13 (100)	19 (100)	9 (100)
Tuberculosis type — no. (%)			
Pulmonary	10 (77)	12 (63)	6 (67)
Pleural	3 (23)	4 (21)	3 (33)
Extrathoracic	0	1 (5)	0
Disseminated	0	2 (11)	0
Sputum smear positive for AFB — no. (%)	5 (38)	8 (42)	1 (11)
Culture-positive tuberculosis — no. (%)	13 (100)	19 (100)	5 (56)
Treatment outcome — no. (%)			
Death	1 (8)	3 (16)	0
Cure or treatment completed	11 (85)	16 (84)	8 (89)
Treatment not completed	0	0	1 (11)
Relapse	1 (8)	0	0
Risk factor — no. (%)			
Alcohol use	11 (85)	13 (68)	3 (33)
Crack cocaine use	7 (54)	12 (63)	6 (67)
Crack cocaine or alcohol use	11 <b>(85)</b>	16 (84)	7 (78)
HIV seropositivity	0	0	0



# Genomics Approach

	MIRU-VNTR Tree
37 or	154/MIRU02 580/MIRU02 580/MIRU04 960/MIRU04 960/MIRU20 1644/MIRU20 2059/MIRU20 2059/MIRU20 3007/MIRU23 312/MIRU39 802/MIRU39 802/MIRU39 802/MIRU39 3171/Mtub34 2347/Mtub29 4156/QUB415 4156/QUB415
32	1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 2 3 4 4 2 3 3 5 3 MT0005 1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 2 3 4 4 2 3 3 5 3 MT0006 1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 2 3 4 4 2 3 3 5 3 MT0006 1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 2 3 4 4 2 3 3 5 3 MT0007 1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 2 3 4 4 2 3 3 5 3 MT0007 1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 2 3 4 4 2 3 3 5 3 MT0007 1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 2 3 4 4 2 3 3 5 3 MT0001 1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 2 3 4 4 2 3 3 5 3 MT0001 1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 2 3 4 4 2 3 3 5 3 MT0001 1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 2 3 4 4 2 3 3 5 3 MT0001
	Date of Symptom Onset   2005 Q4 2007 Q1 2008 Q1   2006 Q2 2007 Q2 2008 Q2   2006 Q4 2007 Q4 1995-2001   1 2 5 3 2 2 4 2 3 2 3 4 4 2 3 5 3 MT0010   1 2 5 3 2 5 1 5 3 2 4 4 2 3 5 3 MT0011   1 2 5 3 2 1 5 3 2 4 2 3 5 3 MT0012   2006 Q4 2007 Q4 1995-2001 1 5 3 2 4 2 3 2 3 4 2 3 5 3 MT0017   1 2 5 3 2 4 2 3 2 3 4 2 3 5 3 MT0017   1 2 5 3 2 5 3 2
Mycobacterium	1 2 5 3 2 2 4 2 3 3 5 3 MT0025   1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 5 3 MT0025   1 2 5 3 2 5 1 5 3 2 2 4 2 3 3 5 3 MT0027   1 2 5 3 2 2 4 2 3 3 5 3 MT0027   1 2 5 3 2 2 4 2 3 3 5 3 MT0029   1 2 5 3 2 2 4 2 3 2 3 4 4 2 3 5 3 MT0029   1 2 5 3 2 2 4 2 3 2 3 4 4 2 3 5 3 M
Low resolution	2 2 8 2 2 5 1 1 3 2 2 2 3 4 3 2 4 4 4 3 3 4 8 3 RC07-1 2 2 8 2 2 5 1 1 3 2 2 2 3 4 3 2 4 4 4 2 2 4 6 3 RC04-1 2 2 8 2 2 5 1 1 3 2 2 2 3 4 3 2 4 4 4 2 3 3 7 3 RC05-1 2 2 8 2 2 5 1 1 3 2 2 2 3 4 3 2 4 4 4 2 3 3 7 3 RC05-1 2 2 8 2 2 5 1 1 3 2 2 2 3 4 3 2 4 4 4 2 3 3 7 3 RC04-2 2 2 8 2 2 5 1 1 3 2 2 2 3 4 3 2 4 4 4 2 3 3 7 3 RC04-3 2 2 8 2 2 5 1 1 3 2 2 2 3 4 3 2 4 4 4 2 3 3 8 3 RC06-1 2 2 8 2 2 5 1 1 3 2 2 2 3 4 3 2 4 4 4 2 3 3 6 3 RC04-3 2 2 8 2 2 5 1 1 3 2 2 2 3 4 3 2 4 4 4 2 3 3 6 3 RC04-3 2 3 4 3 2 5 1 5 3 3 2 3 4 4 1 4 4 4 2 2 3 3 5 2 RC06-2 2 3 4 3 2 5 1 5 3 3 2 3 4 4 1 4 4 4 2 2 3 3 5 2 RC05-2 2 5 4 3 2 3 1 5 3 3 2 3 4 4 1 4 3 4 2 2 3 3 9 2 RC06-3



Mycobacterium interspersed repetitive units (multiple locus VNTR)

Low resolution way to determine the outbreak as clonal

Whole-Genome Sequencing Tree

A

B

MT0005

CDC1551

MT0006 MT0007 MT0002 MT0036 MT0008 MT0016

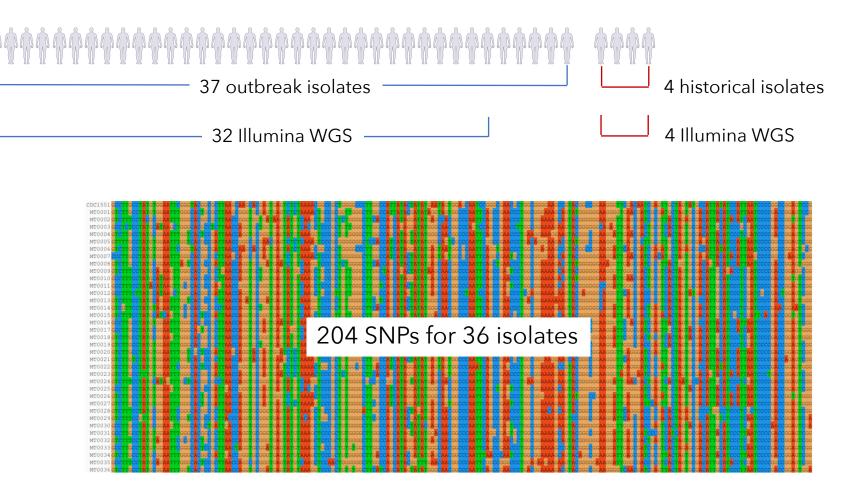
MT0017 MT0020 MT0021 MT0022 MT0001 MT0023 MT0026 MT0027

MT0024 MT0013 MT0014 MT0035 MT0012 MT0003

MT0015 MT0011 MT0009 MT0028 MT0029 MT0033 MT0034 MT0031 MT0030

MT0004 MT0010

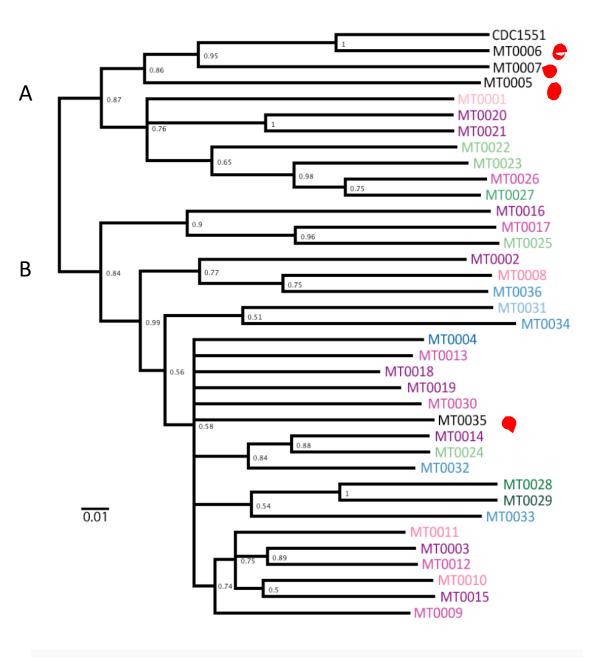
MT0018 MT0019 MT0032

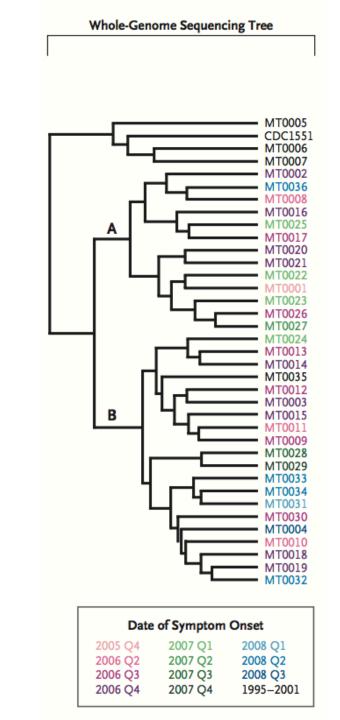


Hierarchical clustering of SNPs suggests two simultaneous outbreaks Lineage A, Lineage B

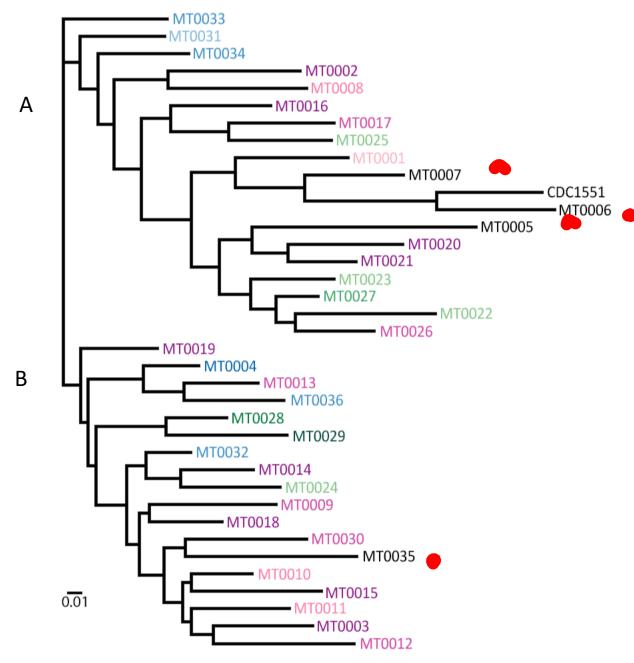
1			
	Date of Symptom Onset		
	2005 Q4	2007 Q1	2008 Q1
	2006 Q2	2007 Q2	2008 Q2
	2006 Q3	2007 Q3	2008 Q3
	2006 Q4	2007 Q4	1995-2001

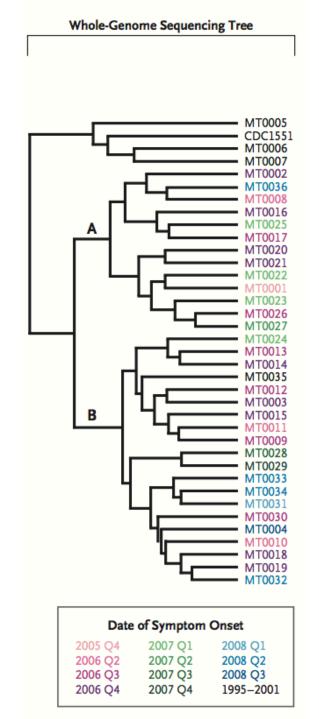




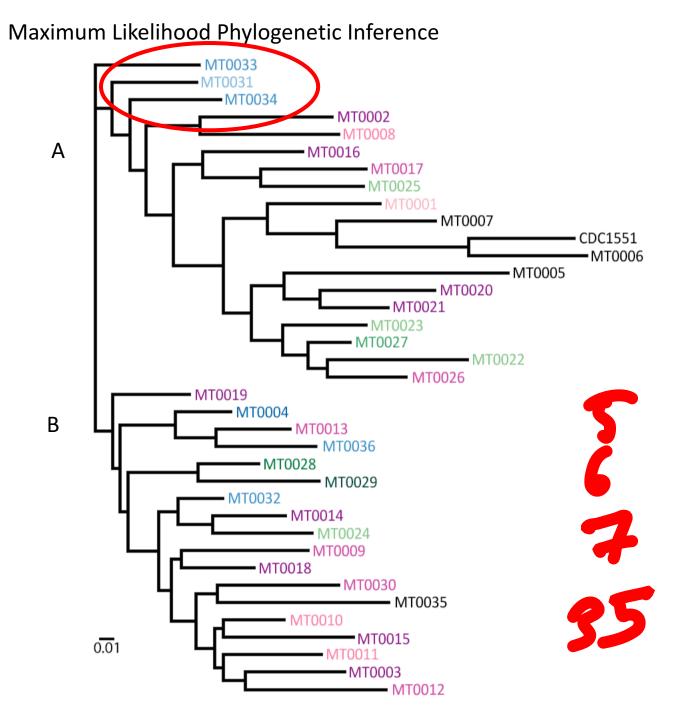


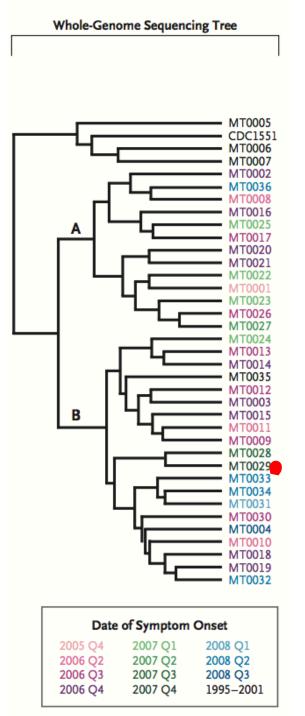
#### Maximum Likelihood Phylogenetic Inference

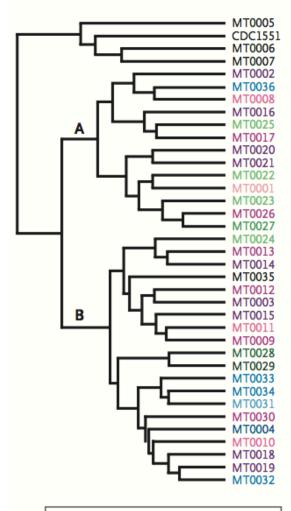




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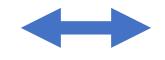


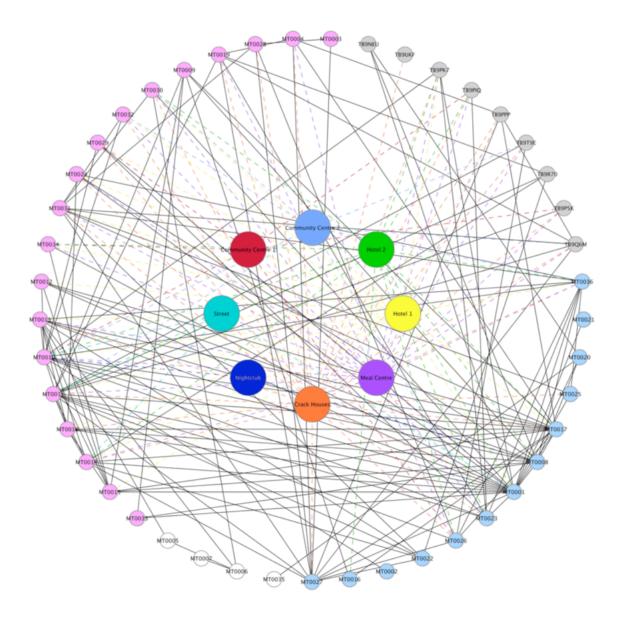




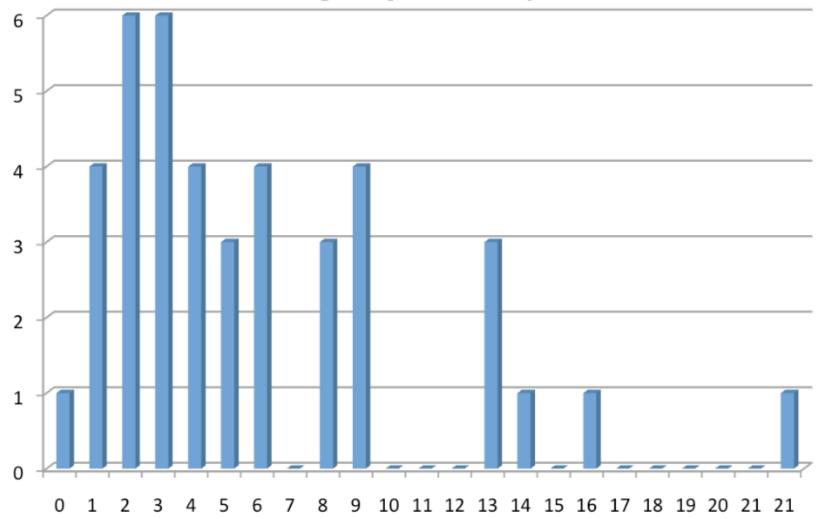
Date of Symptom Onset				
2005 Q4	2007 Q1	2008 Q1		
2006 Q2	2007 Q2	2008 Q2		
2006 Q3	2007 Q3	2008 Q3		
2006 Q4	2007 Q4	1995-2001		

Overlay the social network on to the phylogenetic tree





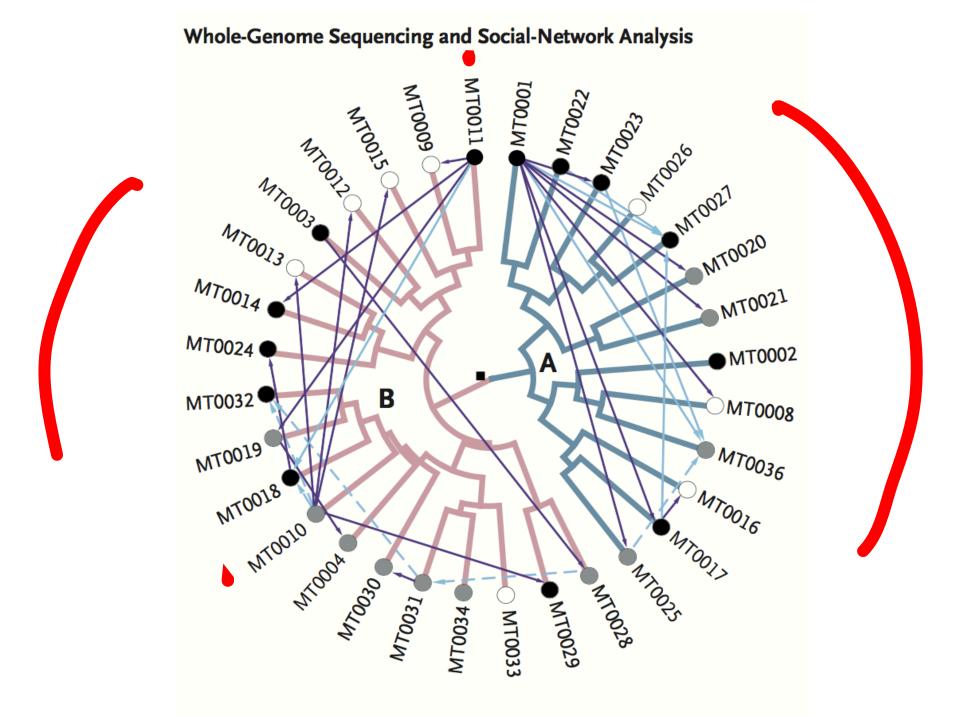
**Transitivity of the Social Network.** The degree of an individual case – the number of direct social contacts with other cases – is shown along the x axis, while the number of cases with that degree is plotted on the y axis.



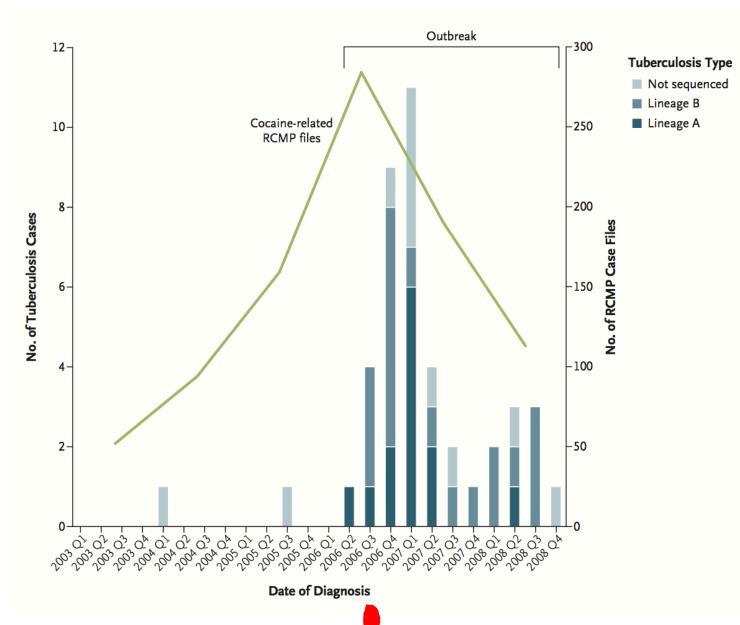
### Transmission Rules

0\*) Transmission can only occur within a lineage (A or B)

- 1) Transmission moves forward in time
- 2) A person with only a single previously infected contact must have been infected by that person
- 3) In cases where a person has multiple infected, upstream contacts, smear-positive contacts are more likely to transmit than smear-negative contacts



### The True (Unproven) Cause?



The simultaneous reappearance of two extant lineages suggests that a social or environmental factor, not a genetic change in the organism, most likely triggered the outbreak.

### In conclusion

- Low resolution VNTR suggests a clonal outbreak
- High resolution Illumina sequencing suggests lineages A, B
- Social network questionnaire allows for creation of network between isolates
- Integration of social network and phylogeny allows for transmission network
- The main 'selling' point (indicated by the authors) of using WGS is to allow for a more detailed approach in analyzing the social network (i.e. separation into two lineages)