

Challenges and opportunities for whole-genome sequencing–based surveillance of antibiotic resistance

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WvSchaik

Sequence-based pathogen surveillance



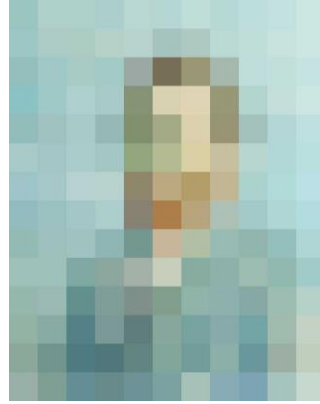
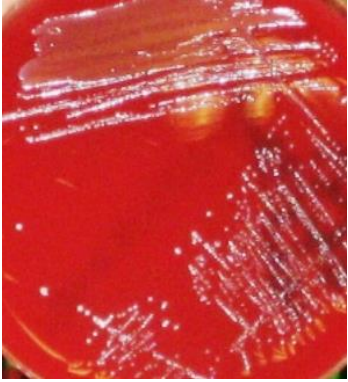
use sequence data to infer relatedness of strains



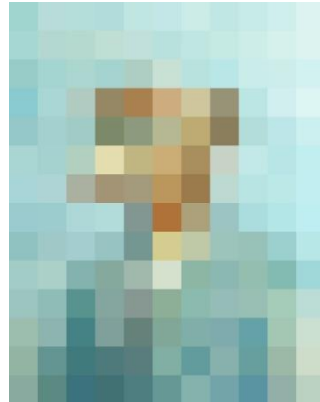
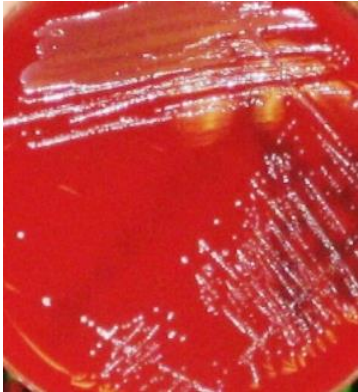
MLST

(allelic profile of 5 – 7 housekeeping genes)

Strain A



Strain B



Low resolution

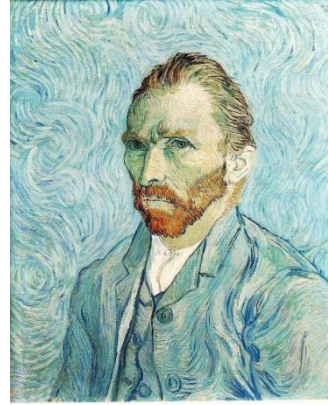
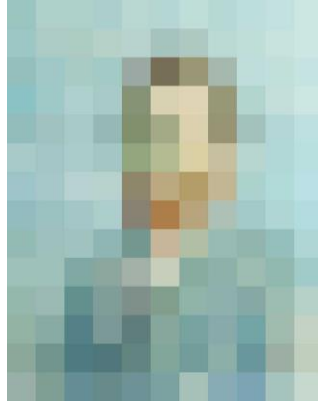
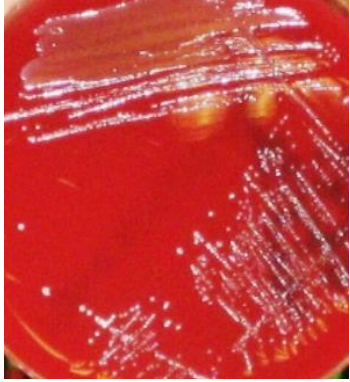
Differences may be apparent, but not clear

Provides a nomenclature to describe clones (e.g. *E. coli* ST131)

MLST

WGS

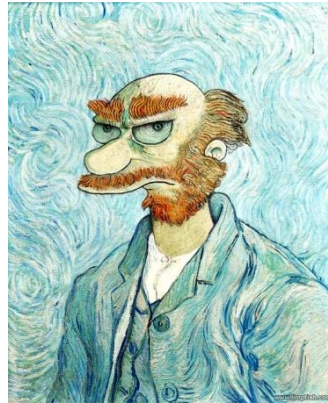
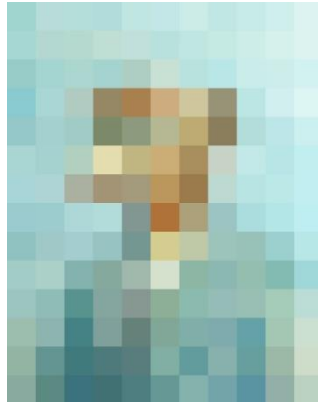
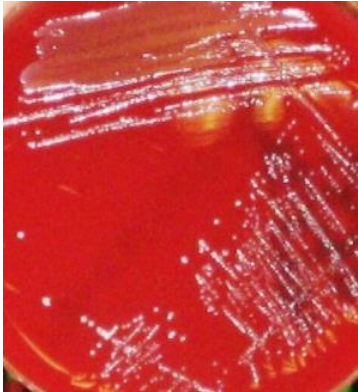
Strain A



High resolution

Core genome phylogeny
(SNP-based, core
genome MLST)

Strain B



Whole genome
phylogeny
(whole genome MLST)

Many tools

Which ones to choose?

Or use the tools
developed by
Torsten Seemann
(Univ of
Melbourne)



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Clinical Microbiology
Reviews®

Whole-Genome Sequencing of Bacterial Pathogens: the Future of Nosocomial Outbreak Analysis

Scott Quainoo,^a Jordy P. M. Coolen,^b Sacha A. F. T. van Hijum,^{c,d}
Martijn A. Huynen,^c Willem J. G. Melchers,^b Willem van Schaik,^e
Heiman F. L. Wertheim^b

Clin Microbiol Rev 30:1015–1063

But there is more in a whole genome sequence...

Antibiotic resistance genes

Presence of mobile genetic elements

Outbreak vancomycin-resistant *Enterococcus faecium*



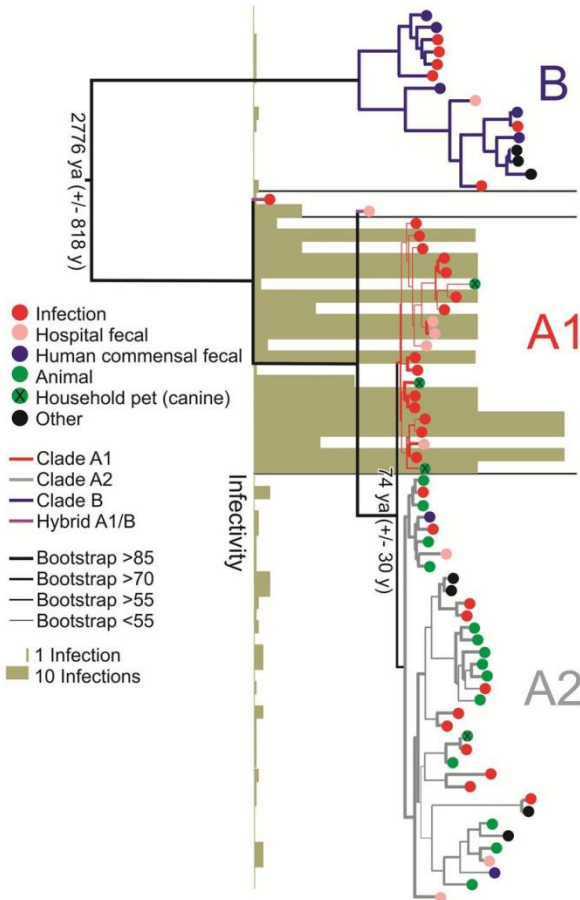
Heartlands Hospital, Birmingham, United Kingdom

Patients colonised and infected with vancomycin-resistant *Enterococcus faecium*

Clonal outbreak of strains?

Spread of identical vancomycin resistance plasmids?

Vancomycin-resistant *Enterococcus faecium*



“Human commensal”

“Clinical isolates”

“Animal isolates”

Maximum likelihood tree: concatenated alignment of 1344 core genes in 73 *E. faecium* genomes

WHO priority list of pathogens

Priority 1: CRITICAL[#]

Acinetobacter baumannii, carbapenem-resistant
Pseudomonas aeruginosa, carbapenem-resistant
*Enterobacteriaceae**, carbapenem-resistant, 3rd generation cephalosporin-resistant

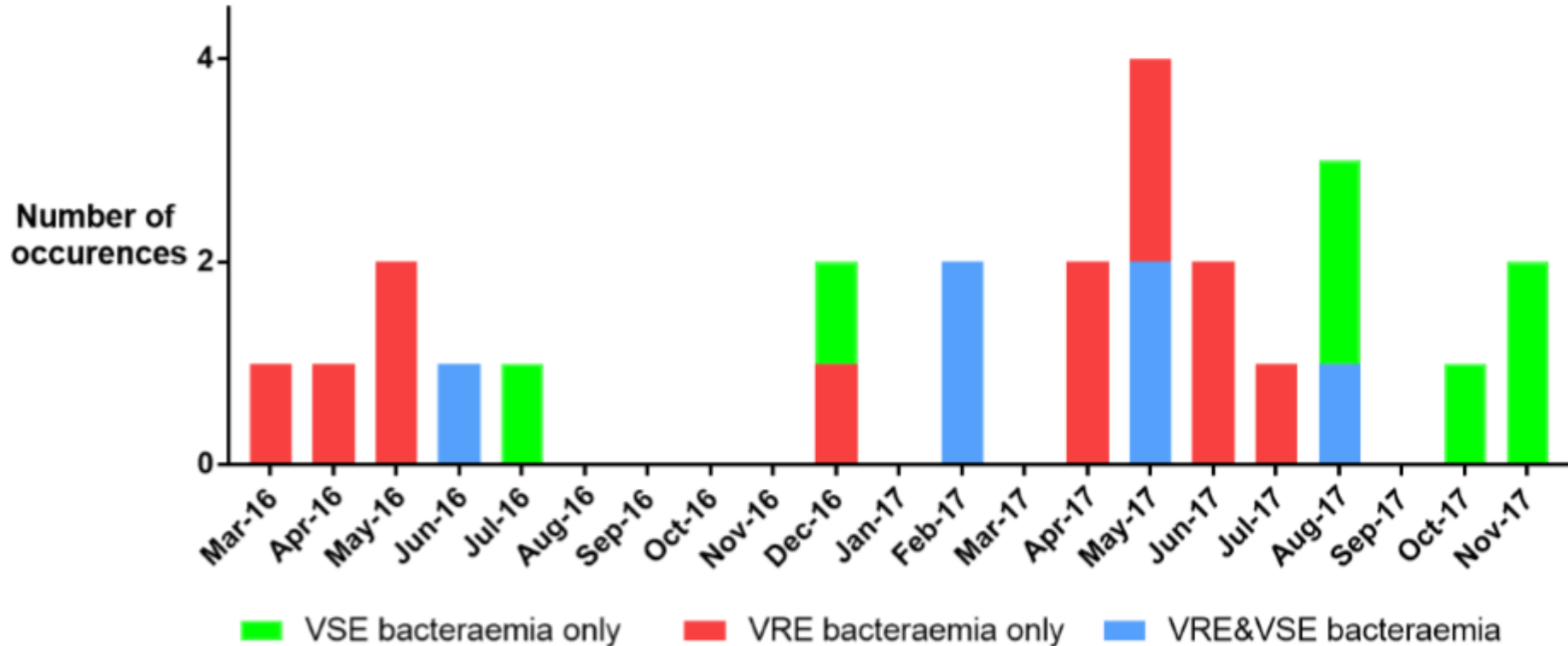
Priority 2: HIGH

Enterococcus faecium, vancomycin-resistant
Staphylococcus aureus, methicillin-resistant, vancomycin intermediate and resistant
Helicobacter pylori, clarithromycin-resistant
Campylobacter, fluoroquinolone-resistant
Salmonella spp., fluoroquinolone-resistant
Neisseria gonorrhoeae, 3rd generation cephalosporin-resistant, fluoroquinolone-resistant

Priority 3: MEDIUM

Streptococcus pneumoniae, penicillin-non-susceptible
Haemophilus influenzae, ampicillin-resistant
Shigella spp., fluoroquinolone-resistant

VRE Outbreak Heartlands Hospital



VRE Outbreak Heartlands Hospital

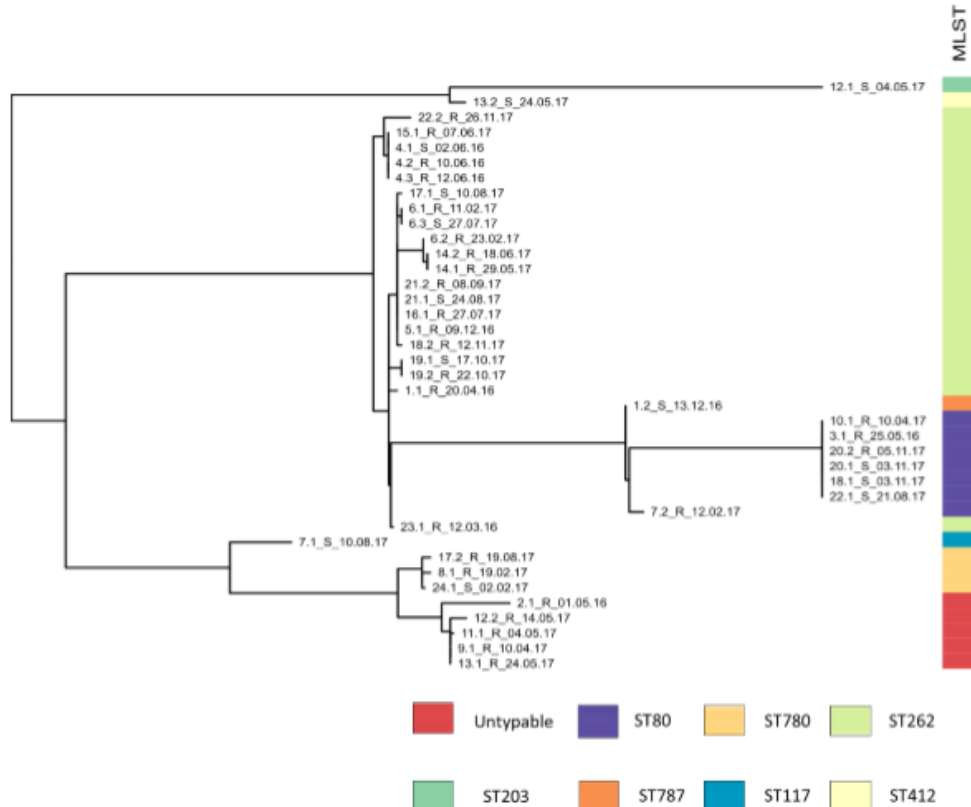
Specimen	Resistant	Sensitive	Total
Blood Culture	21	13	34
Rectal sample	5	0	5
Total	26	13	39

26 isolates VRE, 13 isolates VSE



Sequencing on Illumina platform, 2 x 150 nt

VRE Outbreak Heartlands Hospital



Identify SNPs against reference (*E. faecium* E745) using Snippy 3.2

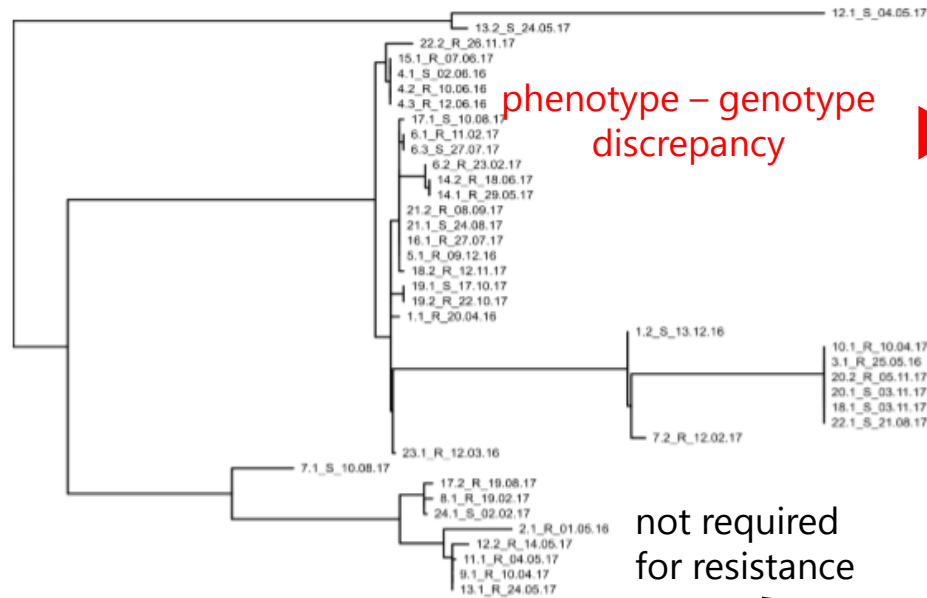
Recombination filtering using Gubbins

Maximum likelihood tree

Sequence types (MLST) determined using mlst 2.8; 5 strains untypable due to missing *pstS* allele

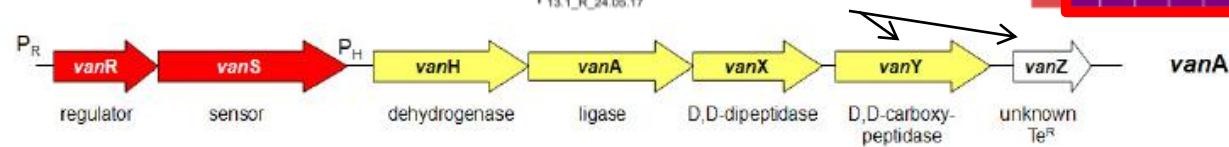
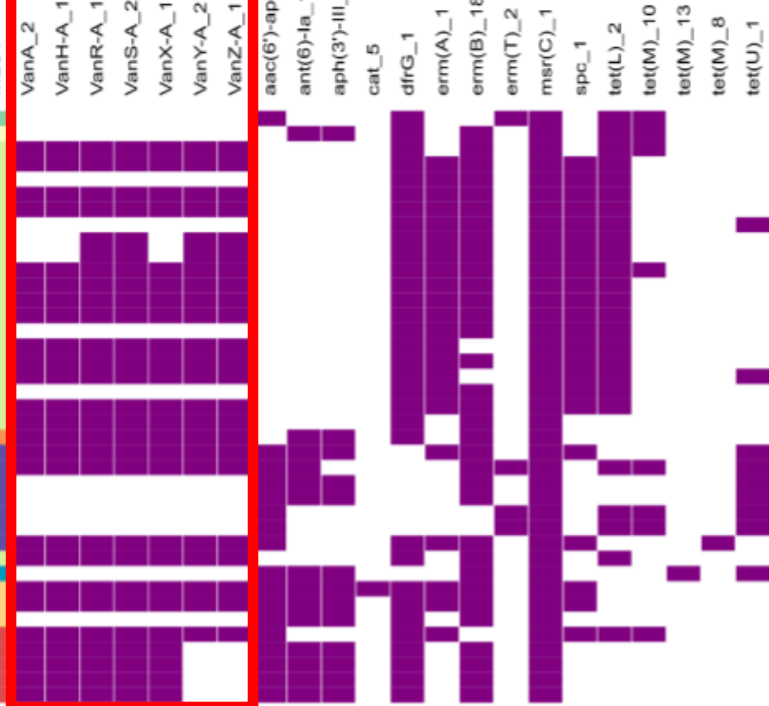
Outbreak is multi-clonal

VRE Outbreak Heartlands Hospital



not required
for resistance

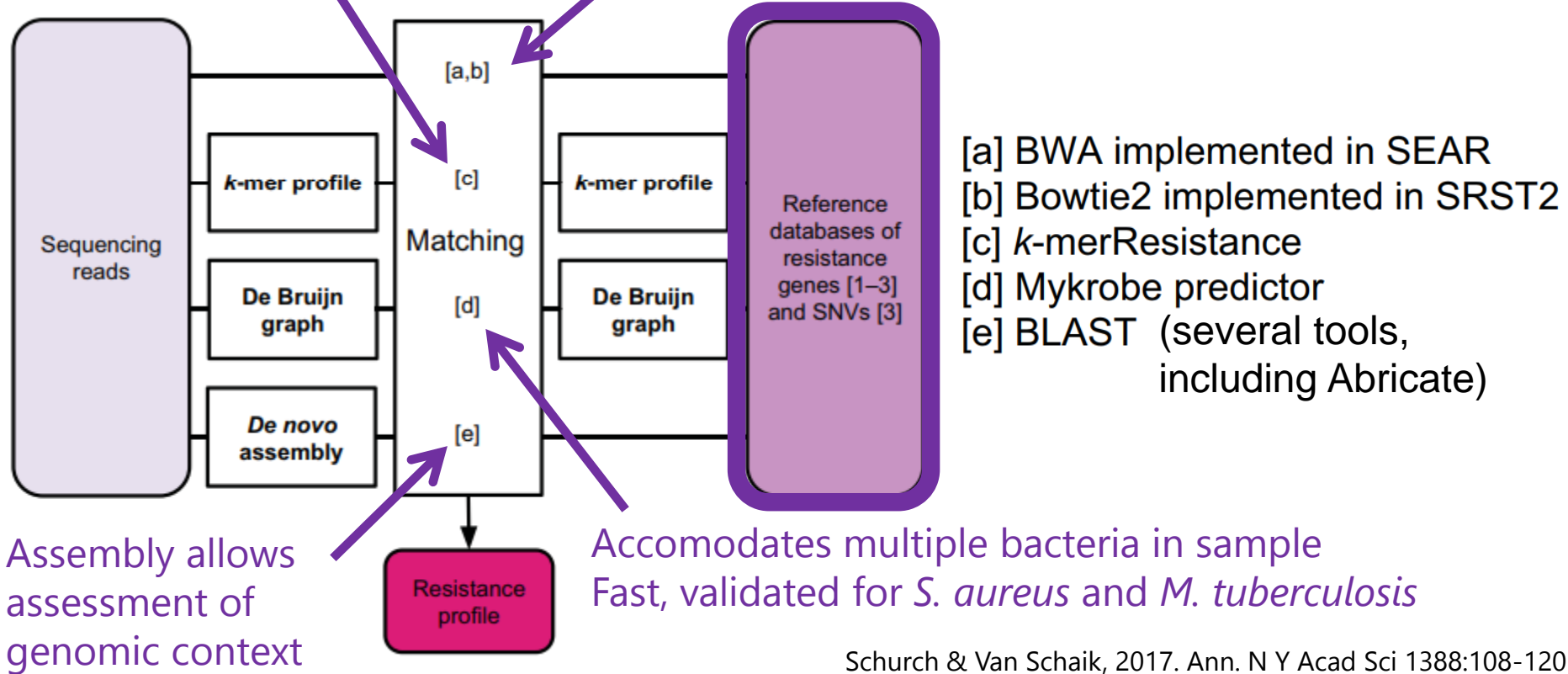
MLST



Presence of antibiotic resistance genes identified using Abricate 0.7, using ResFinder database

Fastest option

Direct mapping of reads: no loss of data




What is an antibiotic resistance gene?

“a gene that confers resistance to an antibiotic in an otherwise susceptible microbial host”

 Horizontally acquired resistance genes: e.g. *bla*KPC, *erm*B, *van*A
associated with mobile genetic elements

Mutations in housekeeping genes that confer resistance
e.g. target modification, porin mutation 

 Conserved genes that make a species intrinsically resistant
e.g. efflux pumps

Antibiotic Resistance Gene Databases

ARDB: no updates, many intrinsic resistance genes: do not use

CARD: frequently updated, based on ARDB. Contains some intrinsic resistance genes; database for 'resistance SNPs' but can give false positives

ResFinder	}	Frequently updated. Acquired resistance genes only, small number of intrinsic resistance genes.
ARG-ANNOT		

ResFams: prediction of resistance genes from metagenomes, many false positives or unvalidated genes

Antibiotic Resistance Gene Databases

Subject Section

ARGs-OAP v2.0 with an Expanded SARG Database and Hidden Markov Models for En-

hanc
of A
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SOFTWARE

Open Access

Xiaole
R. Col

DeepARG: a deep learning approach for predicting antibiotic resistance genes from metag



MEGARes: an antimicrobial resistance database for high throughput sequencing

Gustavo Arangi

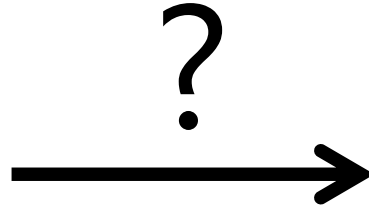
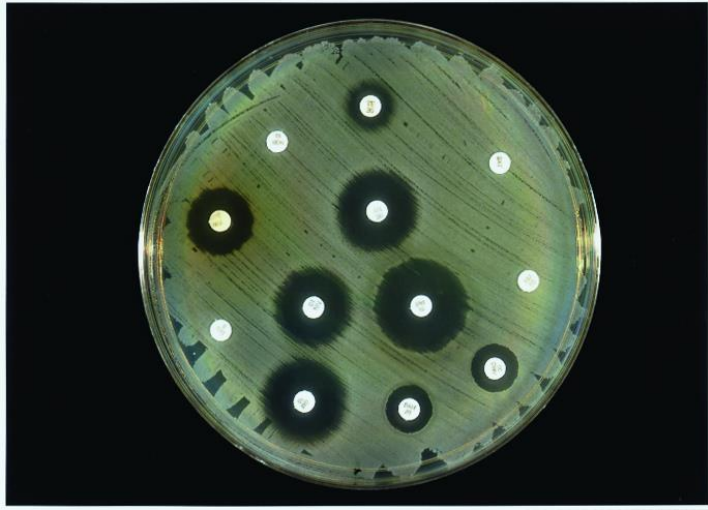
Steven M. Lakin^{1,†}, Chris Dean^{2,†}, Noelle R. Noyes^{2,†}, Adam Dettenwanger³, Anne Spencer Ross³, Enrique Doster¹, Pablo Rovira⁴, Zaid Abdo², Kenneth L. Jones⁵, Jaime Ruiz⁶, Keith E. Belk⁴, Paul S. Morley¹ and Christina Boucher^{6,*}

Antibiotic Resistance Genes

When reporting antibiotic resistance genes....



Sequence-based diagnostics of antibiotic resistance genes?



Sequence-based diagnostics of antibiotic resistance genes?

Mycobacterium tuberculosis



Very slow growth

No horizontal gene transfer

Large collection of strains +
resistance phenotypes

WGS accurately predicts
susceptibility 93.6% – 99.0%
to four key antibiotics

CRyPTIC Consortium and the 100,000 Genomes
Project. New Engl J Med. 2018 379:1403

Sequence-based diagnostics of antibiotic resistance genes?

Common causes of bloodstream infections

Escherichia coli
Staphylococcus aureus
Enterococcus

Fast growth

Horizontal gene transfer

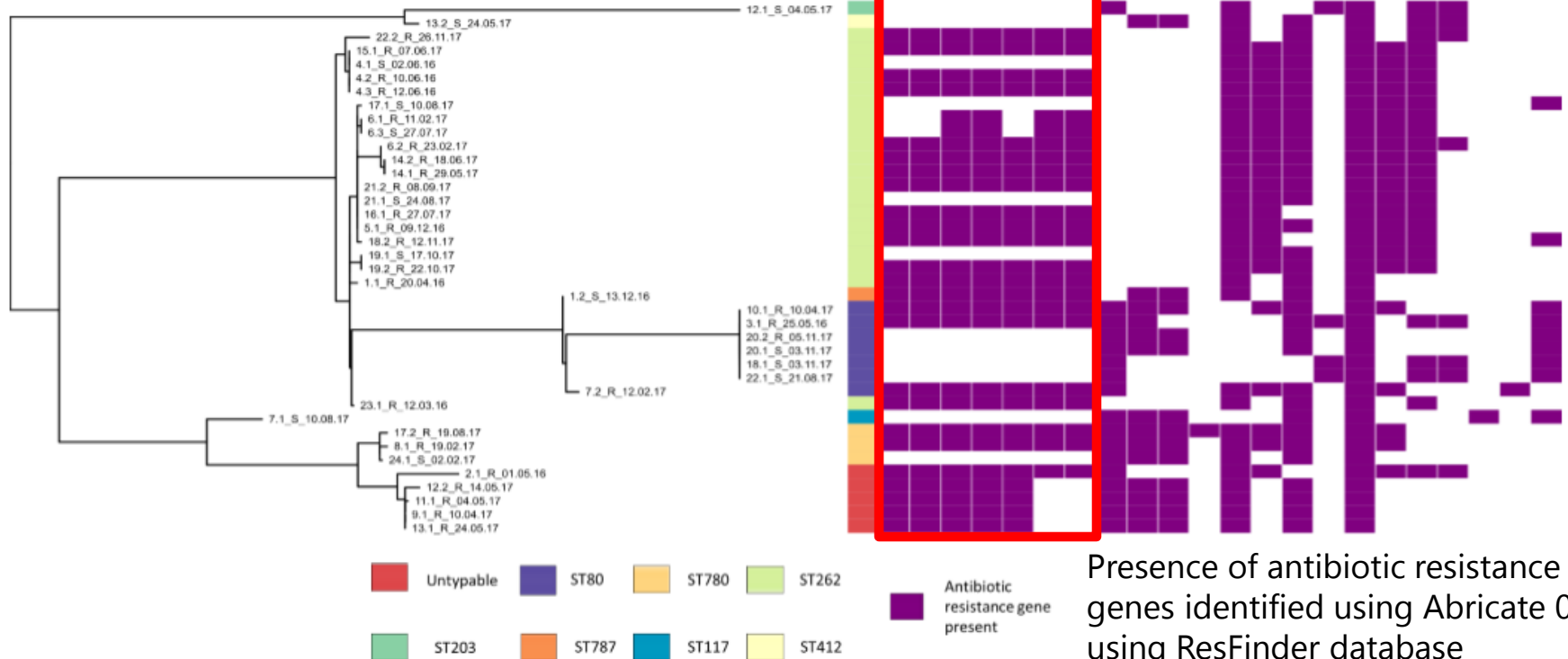
Emergence of new resistance determinants (e.g. *mcr*)

Fast WGS (e.g. of bloodstream cultures) for screening while susceptibility testing is ongoing



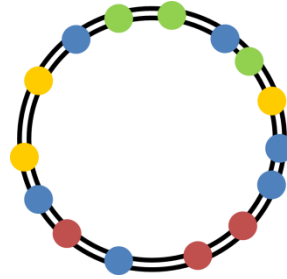
VRE Outbreak Heartlands Hospital

same plasmid? →



Presence of antibiotic resistance genes identified using Abricate 0.7, using ResFinder database

Prediction of Plasmids from Illumina Data



Sequence repeats in
plasmid sequences
complicates assembly

42 completely assembled genomes
12 genera
148 plasmids (1.5 – 339 kbp)

?

Illumina + PacBio sequences
available

Prediction of Plasmids from Illumina Data

MISSION: IMPOSSIBLE

or

MISSION: POSSIBLE

Comparison of completely automated approaches

PlasmidFinder: web-based tool to detect replicon sequences in contigs *Carattoli et al., Antimicrob Agents Chemother. 2014 58:3895*

cBar: detects differences in k-mer composition between plasmids and chromosomes *Zhou & Xu Bioinformatics 2010 26:2051*

Recycler: extracts circular sequences from De Bruijn assembly graphs *Rozov et al. Bioinformatics 2017 33:475*

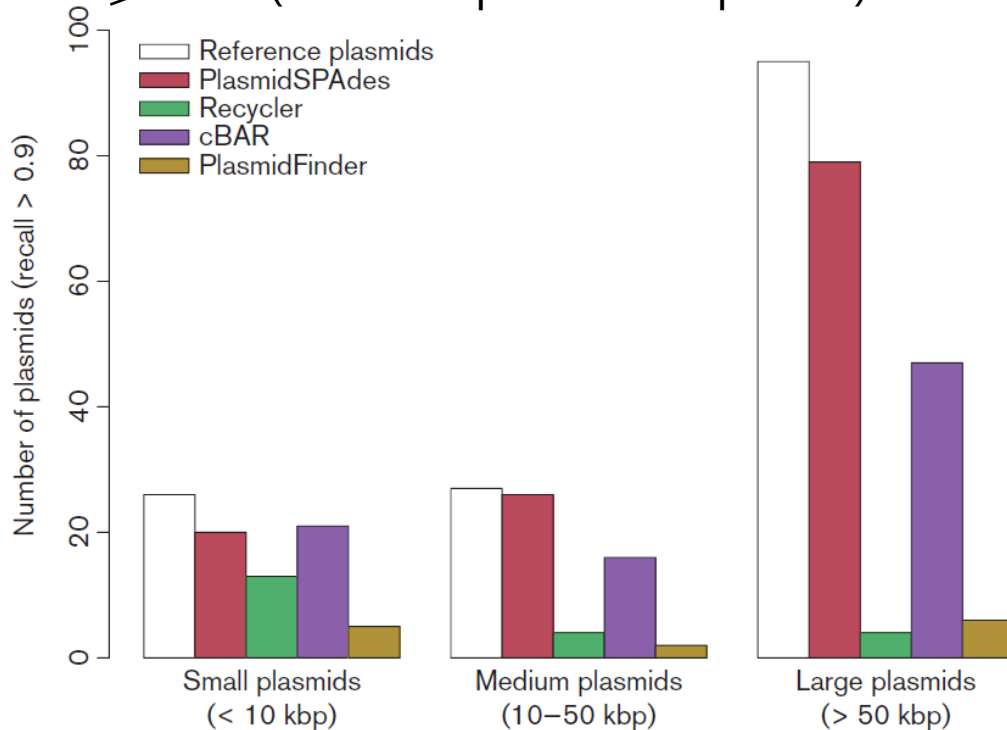
PlasmidSPAdes: plasmids have different coverage (higher copy number) than chromosome *Antipov et al. Bioinformatics 2016 32:3380*

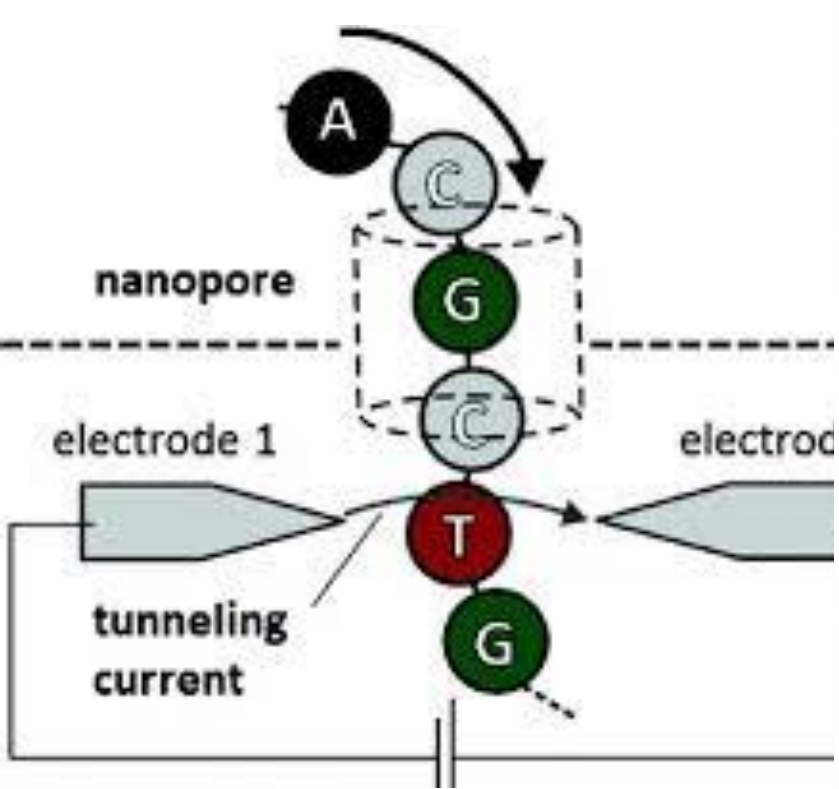
Prediction of Plasmids from Illumina Data

Number of plasmids correctly predicted
(>90% of plasmid sequence)

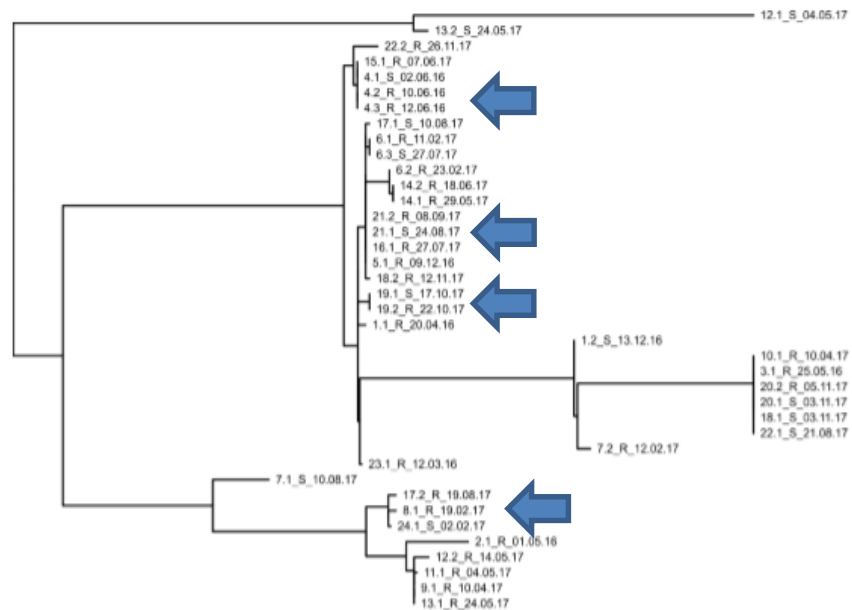
Results are variable

Good performance
PlasmidSPAdes, but all
plasmids in single bin



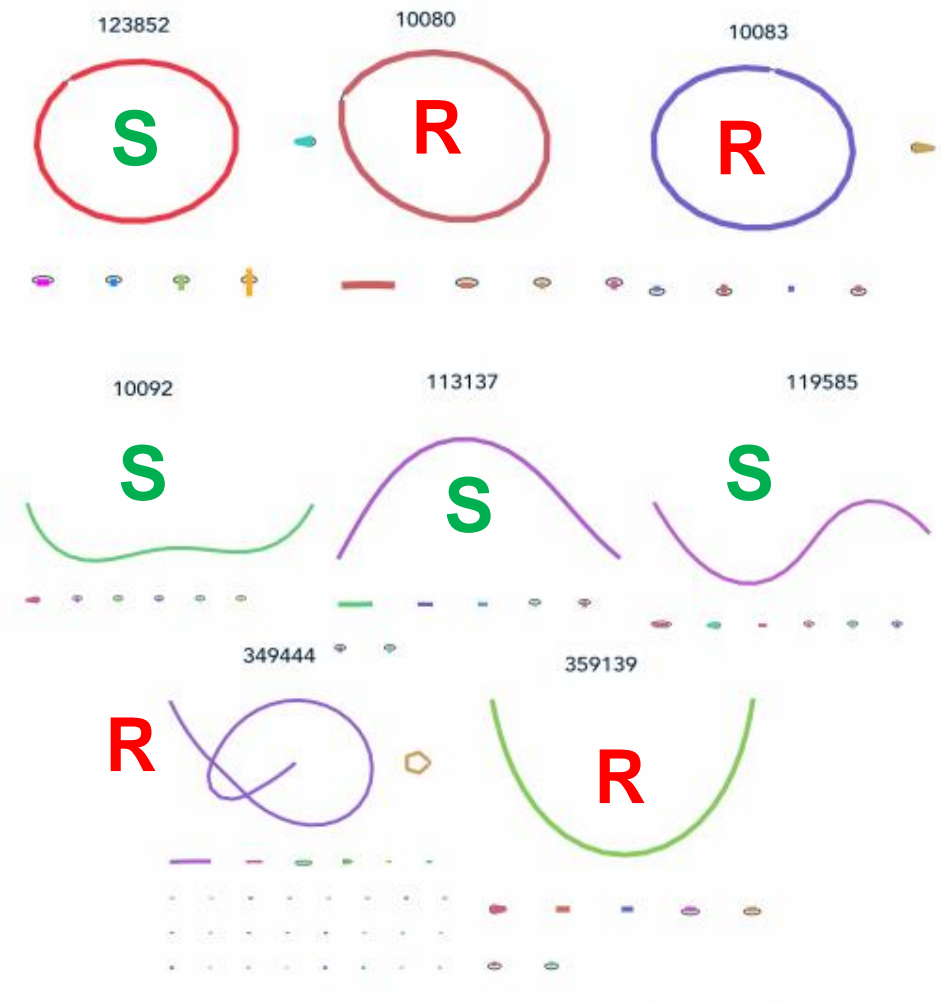


Long reads can cover repeats



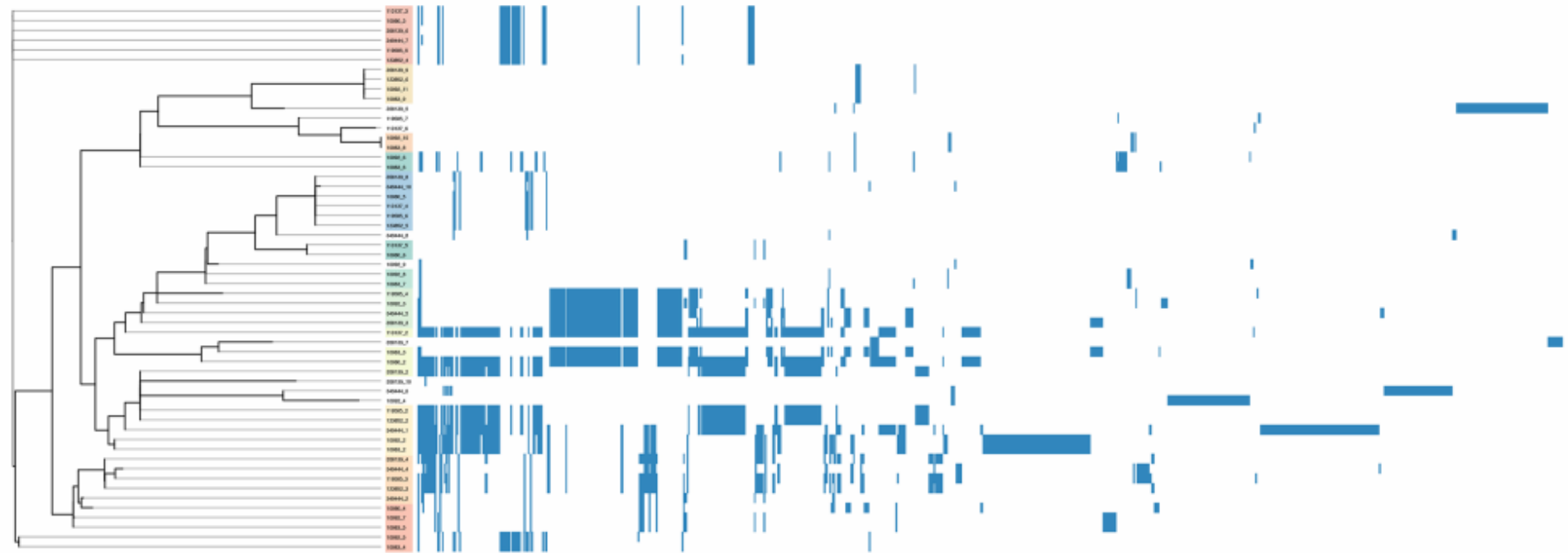
Four susceptible/resistant strain-pairs
 <5 SNPs core genome
 Acquisition of vancomycin resistance genes?

Steven Dunn



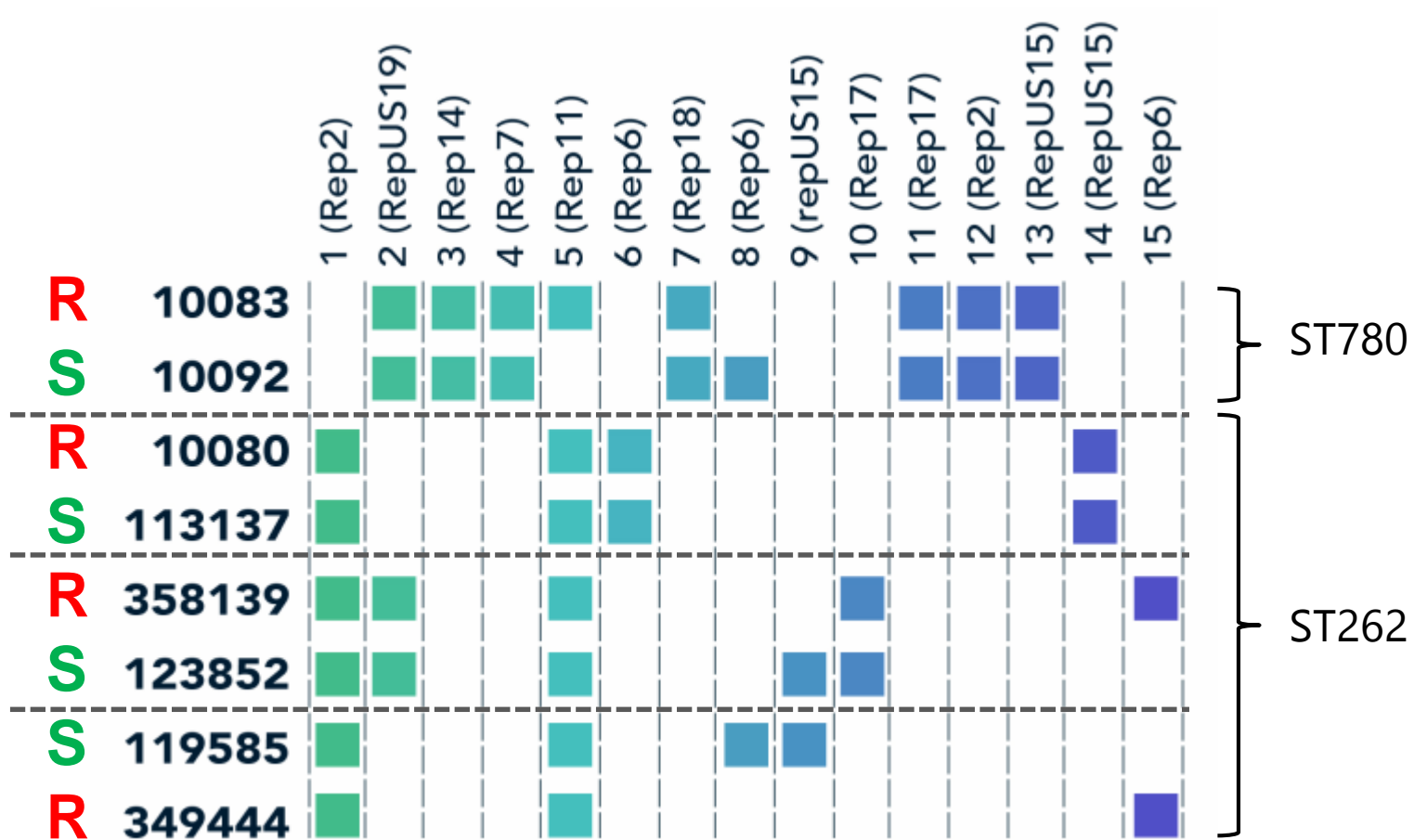
Hybrid assemblies (Illumina + MinION): Unicycler

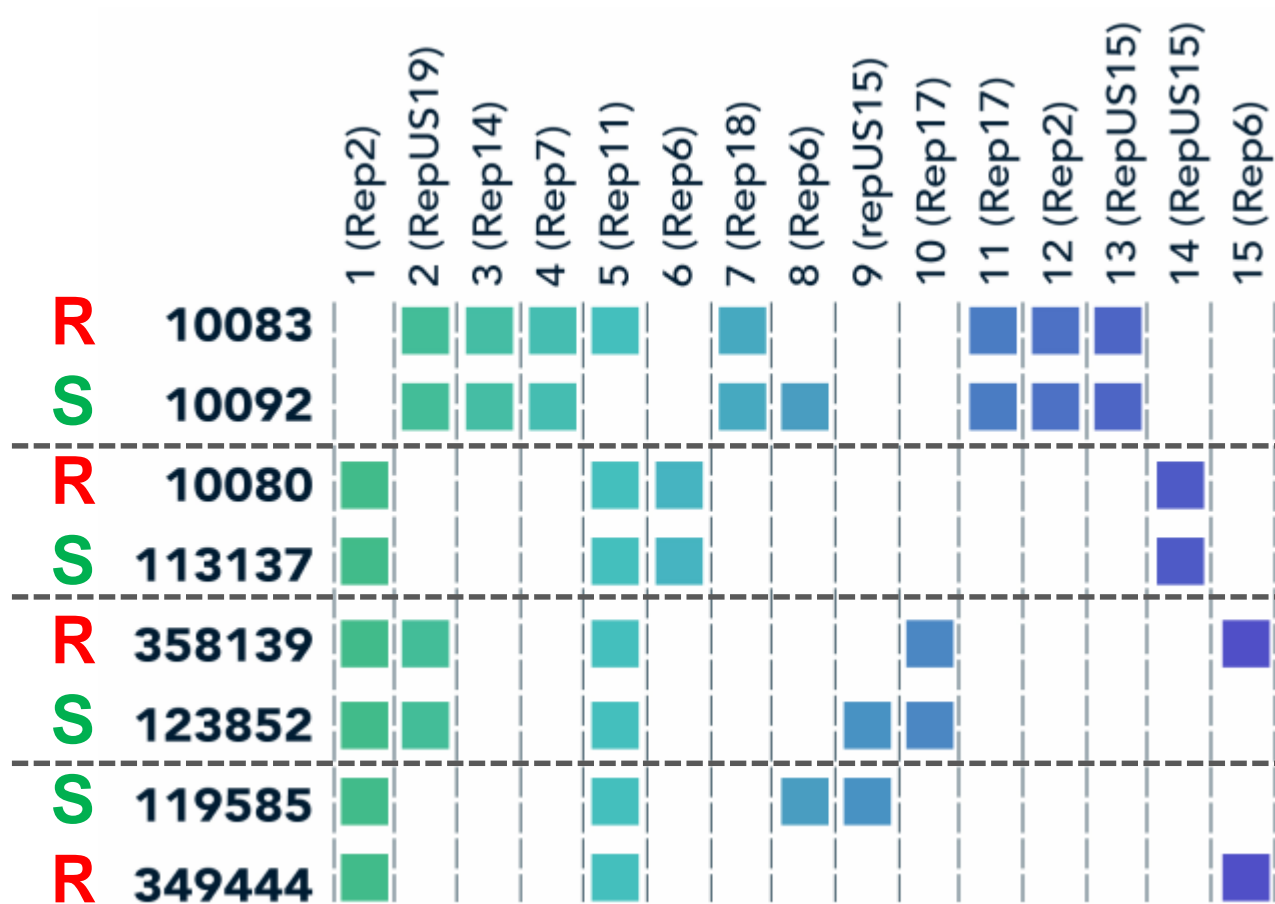
Phylogeny of non-chromosomal contigs



Minhash phylogeny
visualised with Mashtree

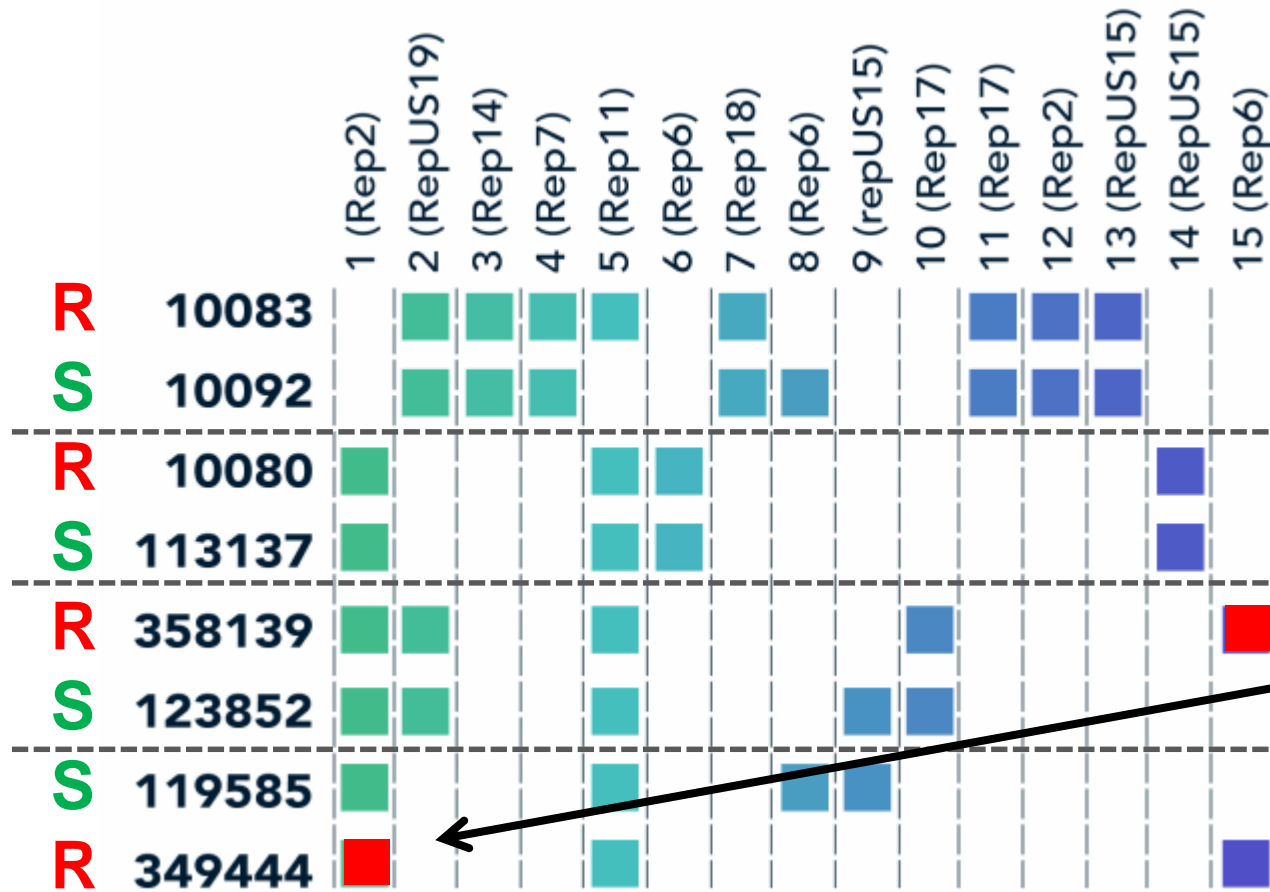
Gene presence/absence determined by Roary
Visualisation by Phandango





? Vancomycin
resistance
transposon not
resolved
?

Multiple insertion
sites? Intra-strain
transposition?

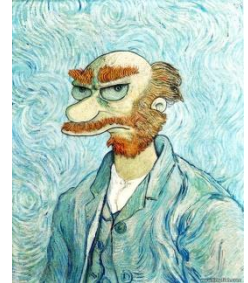


Acquisition of vancomycin resistance plasmid

Insertion of vancomycin resistance transposon into a circulating plasmid

Summary

Whole genome sequencing is required for high-resolution typing





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