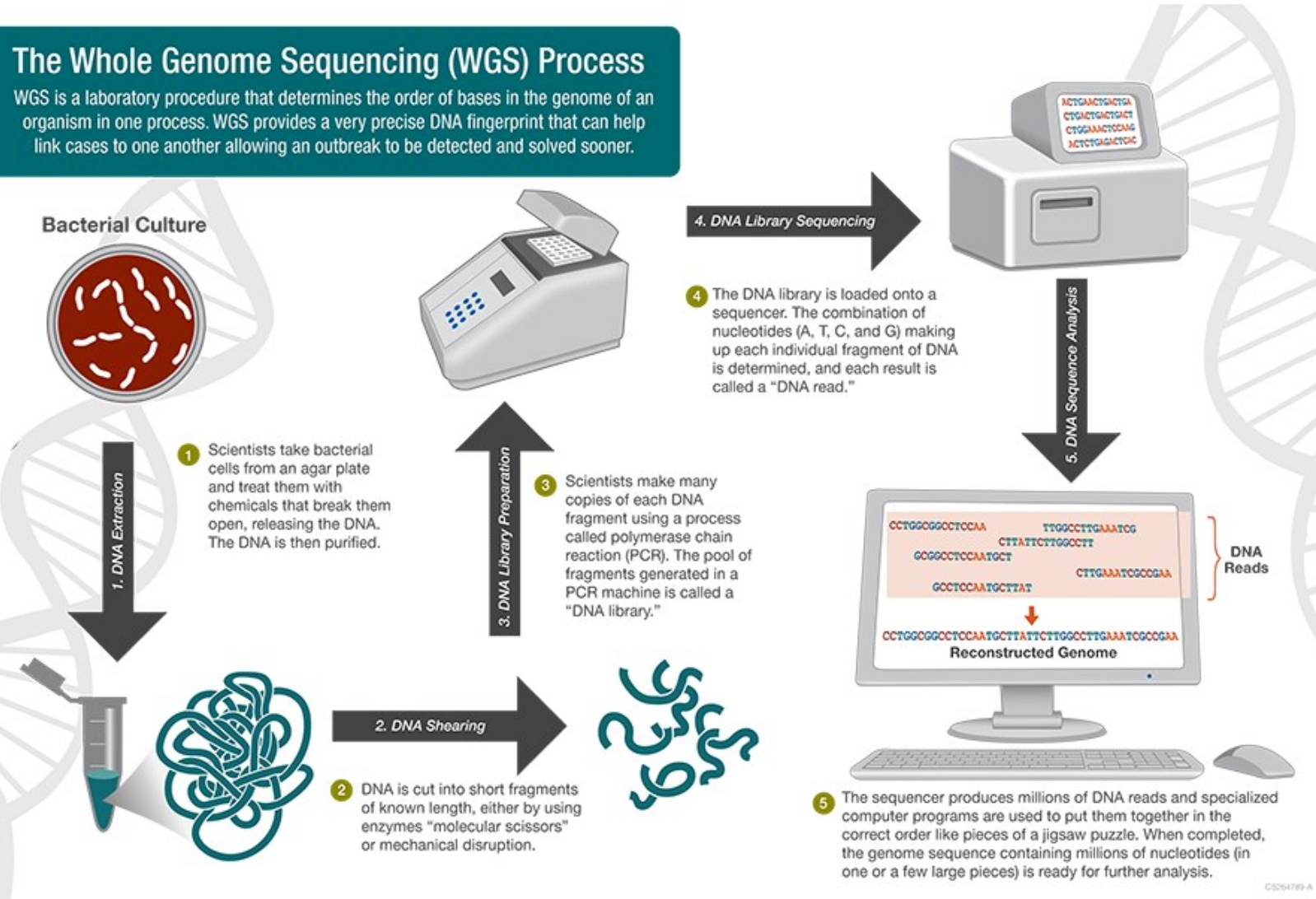


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Technical University of Denmark

# Review on WGS-based methods for AMR prediction

# WGS-BASED ANALYSIS OF BACTERIA - OVERVIEW



# CURRENT EUROPEAN UNION AND INTERNATIONAL GUIDANCE

(ADAPTED FROM EURGEN-REFLABCAP)

## ECDC

2016: "Expert opinion on whole genome sequencing for public health surveillance"

2016: "ECDC roadmap for integration of molecular and genomic typing into European-level surveillance and epidemic preparedness"

2019: "ECDC strategic framework for the integration of molecular and genomic typing into European surveillance and multi-country outbreak investigations"

## EFSA

2019: "Whole genome sequencing and metagenomics for outbreak investigation, source attribution and risk assessment of food-borne microorganisms"

## ISO

TBA: ISO/DIS 23418 standard "Microbiology of the food chain – Whole genome sequencing for typing and genomic characterization of foodborne bacteria – General requirements and guidance"

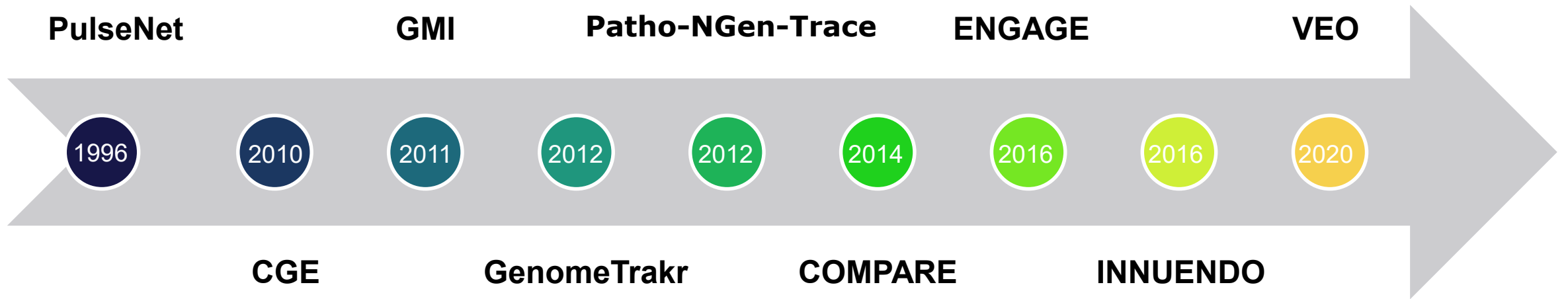
## WHO

2018: "Landscape paper on whole genome sequencing for foodborne disease surveillance"

2020: "Global Antimicrobial Resistance and Use Surveillance System (GLASS) document on whole-genome sequencing for surveillance of antimicrobial resistance"

# BIOINFORMATICS DEVELOPMENT INITIATIVES

(ADAPTED FROM EURGEN-REFLABCAP)



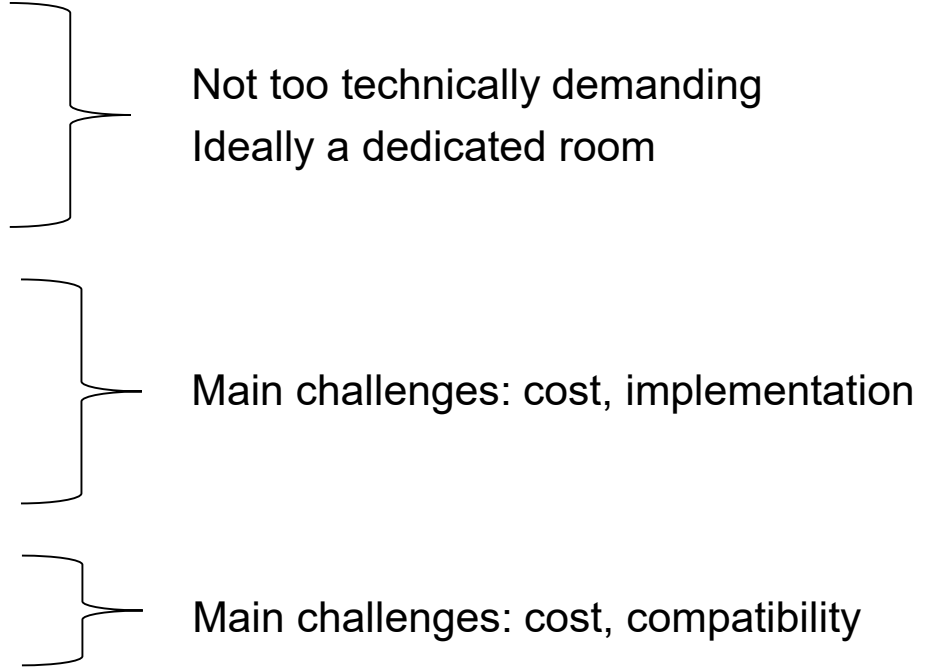
*CGE: Centre for Genomic Epidemiology*

*GMI: Global Microbial Identifier*

*VEO: Versatile Emerging Infectious Disease Observatory*

# WGS-BASED ANALYSIS OF BACTERIA - REQUIREMENTS

- Expertise on DNA extraction methods
- Expertise on library preparation methods
- Access to sequencing platform
- Access and expertise on bioinformatics tools
- Data management infrastructure



Not too technically demanding  
Ideally a dedicated room

Main challenges: cost, implementation

Main challenges: cost, compatibility

# WGS-BASED ANALYSIS OF BACTERIA - QUALITY CONTROL

Many different:

- DNA extraction kits
- Sequencing platforms
- Bioinformatics approaches
- Bioinformatics tools



Is harmonization feasible?



## Well defined set of QC parameters

- For the raw data
  - E.g. nr. and length of raw reads, depth of coverage*
- For the assembled genomes
  - E.g. N50, nr. of contigs, genome size*
- For the performance of the tools
  - E.g. accurately detect PMs and ARGs in sets of benchmarking data*

# BIOINFORMATICS TOOLS - OVERVIEW

## Purpose

Quality control  
 Assembly  
 Taxonomic analysis  
 Phylogeny  
 Serotyping/Subtyping  
 Detection of AMR determinants  
 Detection of other determinants

## Accessibility

Web-based  
 Command line  
 Local vs. server

## Maintenance

Benchmarked  
 Curated

## Data

Raw data as input  
 Assemblies as input  
 Integration of metadata

## Cost

Open access  
 Subscription

# BIOINFORMATICS TOOLS FOR PREDICTION OF AMR

Tool	Target species	Reference database	Output	Comments
<b>ARIBA</b>	All	CARD, ResFinder, ARG-ANNOT, MEGARes, NCBI Bacterial AMR Reference Gene Database, PubMLST, or others defined by user	Reference sequences and respective % of identity, % of coverage	Also phylogeny, VFs and plasmids, depending on provided databases (such as plasmidfinder, VFDB, VirulenceFinder)
<b>ResFinder</b>	All	Own	ARGs and respective % of identity, % of coverage, position in genome, predicted phenotype	NA
<b>RGI</b>	All	CARD	Reference sequences and respective % of identity, % of coverage, other options	Integrated in the Galaxy server; allows proteome analysis
<b>SSTAR</b>	All	Own (resGANNOT created by merging ResFinder and ARG-ANNOT)	Reference sequences and respective % of coverage, depth	Can be used with other reference databases
<b>CARD</b>	All	Own	ARGs and point mutations, respective prevalence and predicted phenotype	Highly focused on ontology and standardization. VFs and mobile genetic elements currently being added



# BIOINFORMATICS PIPELINES FOR PREDICTION OF AMR

Tool	Target species	Reference database	Output
<b>Enterobase</b>	Limited	Tools' databases	Genome assembly and annotation, serotyping, MLST, cgMLST, rMLST, phylogenetic analysis
<b>NCBI Pathogen Detection</b>	Limited	Own	ARGs, VFs, SNP-based phylogenetic analysis
<b>Ridom SeqSphere+</b>	All	Own, tools' databases; Includes NCBI AMRFinder and VFDB	Assemblies, QC, taxonomy, ARGs, VFs, MLST, cgMLST, phylogenetic analysis



# LIMITATIONS OF WGS-BASED PREDICTION OF AMR

## Limitations:

- Can't predict phenotypes



- Can't detect new mechanisms of resistance



- Can't account for over-expression mechanisms



## Future perspectives:

Genotype-phenotype correlation studies

Sentinel surveillance  
Machine learning

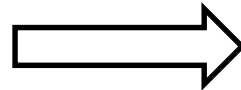
Transcriptomics / proteomics

There's no one-size-fits-all approach  
There's no perfect bioinformatics tool

### Essential requirements:

QC

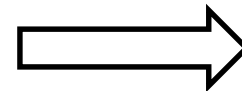
Benchmarking datasets



Ensuring accuracy of your approach

Knowing which database supports each tool

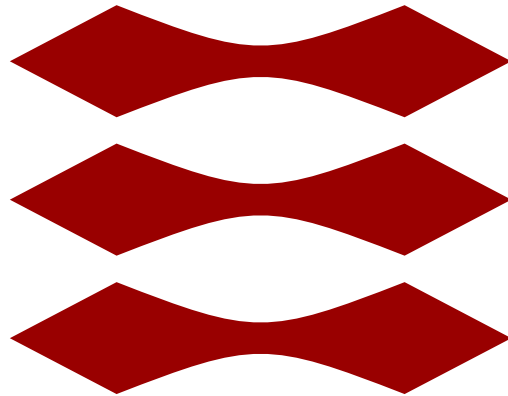
Understanding how the tool works



Knowing what data to provide  
Knowing the limitations of your results

**THANK YOU ON BEHALF OF THE FWD AMR-REFLABCAP**

**DTU**



**ANRIRE@FOOD.DTU.DK**