

# Metagenomics for diagnosis and surveillance of viruses

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Supervisor and slides credit: Dr Sofia Morfopoulou

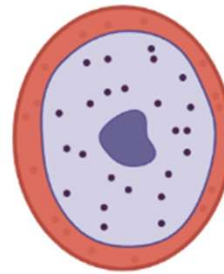
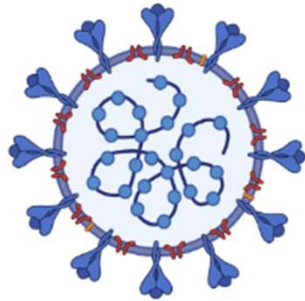
# Talk outline

## Sterile site metagenomics

- Clinical metagenomics service at Great Ormond Street Hospital, London
- Metagenomics methods evaluation

## Future work in clinical metagenomics

# Metagenomics



Metagenomics: sequencing all the nucleic acids in a sample.  
Allows detection of bacteria, viruses and eukaryotic microbes.

**No prior assumptions about  
microbes present needed**

**Clinically relevant sequence  
information**

**Composition of microbial  
community**

# Encephalitis

Characterized by inflammation of the brain.

4000-6000 cases per year in UK

~ 7-8% mortality

70% long lasting consequences

Fatal cases more likely in immunocompromised patients

Can be caused by:

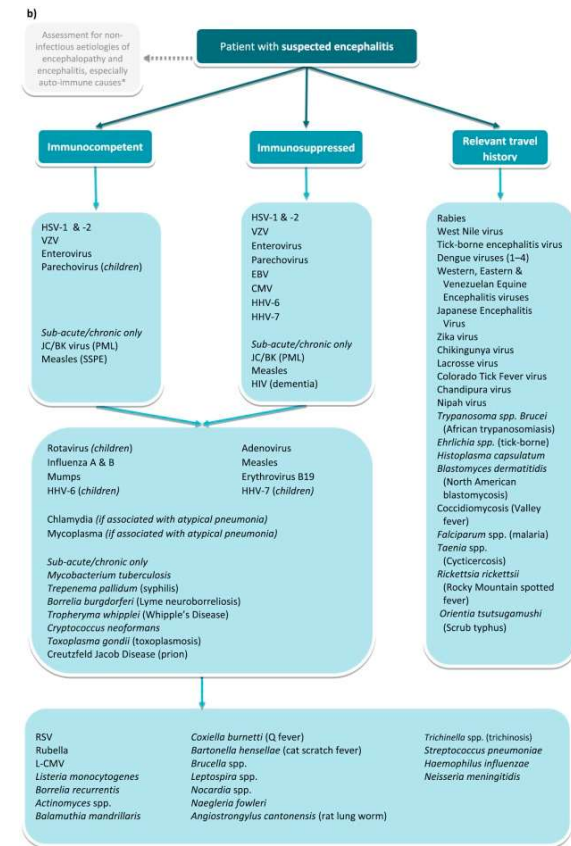
- Infection
- Autoimmune response
- Toxins

50-60% unknown aetiology

# Encephalitis diagnosis

Low sample volumes (CSF or brain biopsy)

Traditional tests require prioritisation



\* Not discussed in this review

The diagram is not fully comprehensive but illustrates the extensive potential pathogens and diagnostic tests associated with each case, based on known aetiologies. It is notable that there is overlap between acute/sub-acute and chronic cases.

Brown *et al*, Journal of Infection, 2018

# Great Ormond Street Hospital Clinical Metagenomics Service

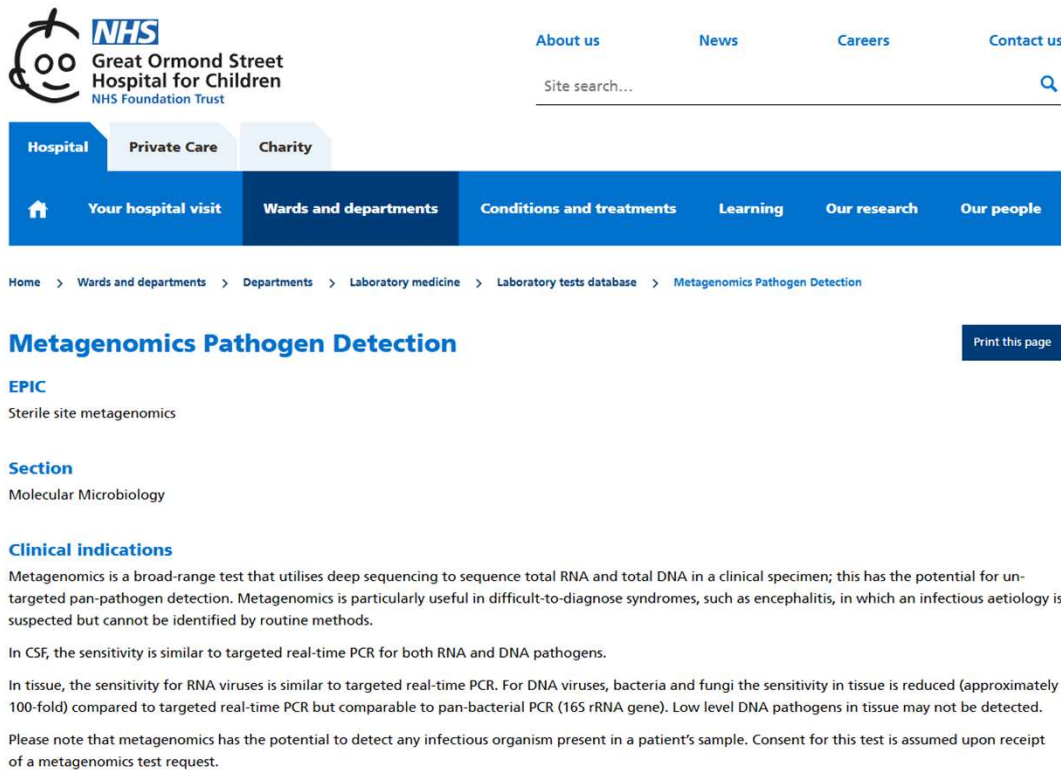


Mainly encephalitis diagnosis  
using brain biopsy and CSF



Also analyse blood and tissue  
samples

# Great Ormond Street Hospital Clinical Metagenomics Service



The screenshot shows the NHS Great Ormond Street Hospital for Children website. The header includes the NHS logo and hospital name. Navigation links for 'About us', 'News', 'Careers', and 'Contact us' are present. A search bar is located below these links. The main navigation bar includes 'Hospital', 'Private Care', and 'Charity' tabs, with a sub-menu for 'Your hospital visit', 'Wards and departments', 'Conditions and treatments', 'Learning', 'Our research', and 'Our people'. The breadcrumb trail indicates the path: Home > Wards and departments > Departments > Laboratory medicine > Laboratory tests database > Metagenomics Pathogen Detection. The page title is 'Metagenomics Pathogen Detection'. Below this, the 'EPIC' (Sterile site metagenomics) section is highlighted. The 'Section' is 'Molecular Microbiology'. The 'Clinical indications' section describes the test as a broad-range test using deep sequencing to sequence total RNA and total DNA in a clinical specimen, useful for difficult-to-diagnose syndromes like encephalitis. It also mentions that in CSF, the sensitivity is similar to targeted real-time PCR for both RNA and DNA pathogens, and in tissue, the sensitivity for RNA viruses is similar to targeted real-time PCR, while for DNA viruses, bacteria, and fungi, the sensitivity is reduced. A note at the bottom states that metagenomics has the potential to detect any infectious organism present in a patient's sample and that consent for this test is assumed upon receipt of a metagenomics test request.

**Metagenomics Pathogen Detection**

**EPIC**  
Sterile site metagenomics

**Section**  
Molecular Microbiology

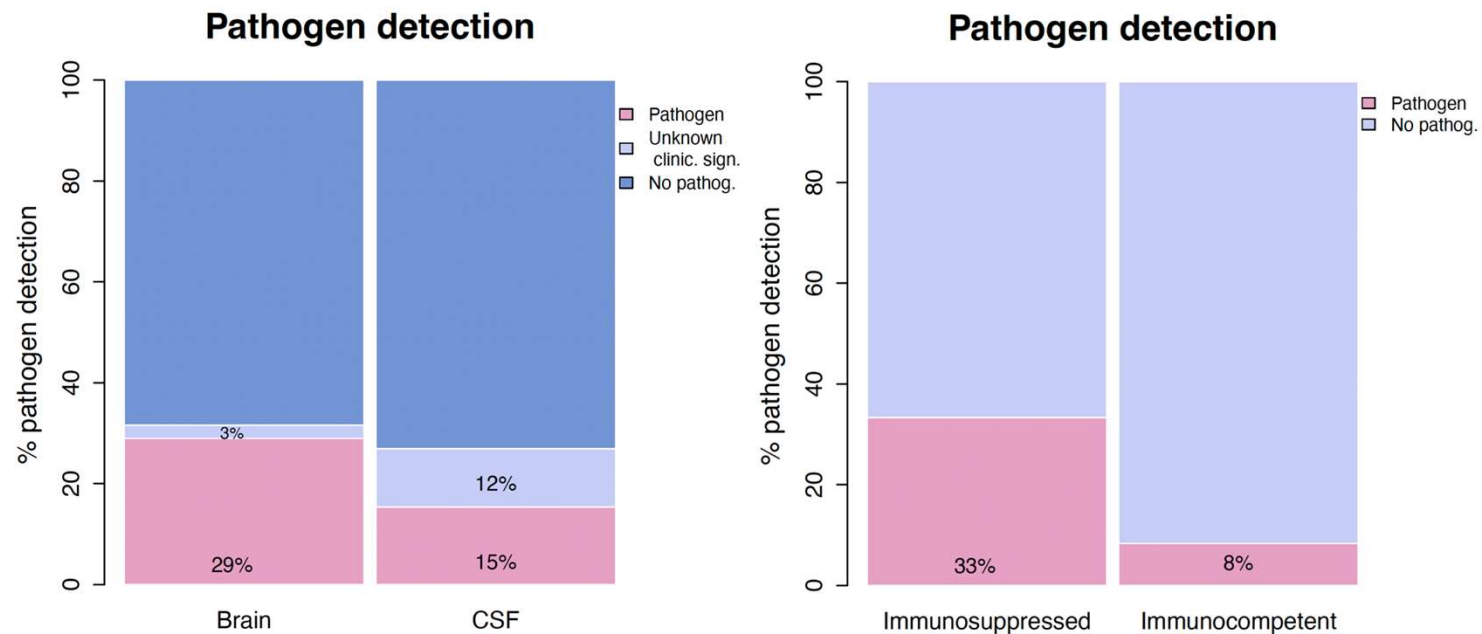
**Clinical indications**  
Metagenomics is a broad-range test that utilises deep sequencing to sequence total RNA and total DNA in a clinical specimen; this has the potential for un-targeted pan-pathogen detection. Metagenomics is particularly useful in difficult-to-diagnose syndromes, such as encephalitis, in which an infectious aetiology is suspected but cannot be identified by routine methods.  
In CSF, the sensitivity is similar to targeted real-time PCR for both RNA and DNA pathogens.  
In tissue, the sensitivity for RNA viruses is similar to targeted real-time PCR. For DNA viruses, bacteria and fungi the sensitivity in tissue is reduced (approximately 100-fold) compared to targeted real-time PCR but comparable to pan-bacterial PCR (16S rRNA gene). Low level DNA pathogens in tissue may not be detected.  
Please note that metagenomics has the potential to detect any infectious organism present in a patient's sample. Consent for this test is assumed upon receipt of a metagenomics test request.

Established 2014

Now a routine clinical service with a weekly sequencing run

Accredited by ISO 15189

# Evaluation of clinical service



Penner et al, Journal of Infection, 2023



# Changes in clinical management

22% pts CMg uncovered the infectious cause

13 cases: Targeted anti-infective treatment incl. 3 repurposed antivirals

Negative findings still clinically useful for informing immunomodulation

Clinical management changes 74% (n=42/57).

# Unexpected pathogens identified

## Astrovirus VA1/HMO-C: An Increasingly Recognized Neurotropic Pathogen in Immunocompromised Patients

CORRESPONDENCE

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## Human Coronavirus OC43 Associated with Fatal Encephalitis

Acta Neuropathol (2017) 133:139–147  
DOI 10.1007/s00401-016-1629-y



### CASE REPORT

## Deep sequencing reveals persistence of cell-associated mumps vaccine virus in chronic encephalitis

Sofia Morfopoulou<sup>1</sup>  · Edward T. Mee<sup>2</sup> · Sarah M. Connaughton<sup>2</sup> · Julianne R. Brown<sup>3</sup> · Kimberly Gilmour<sup>4</sup> · WK 'Kling' Chong<sup>5</sup> · W. Paul Duprex<sup>6</sup> · Deborah Ferguson<sup>2</sup> · Mike Hubank<sup>7</sup> · Ciaran Hutchinson<sup>8</sup> · Marios Kaliakatos<sup>9</sup> · Stephen McQuaid<sup>10,11</sup> · Simon Paine<sup>8,12</sup> · Vincent Plagnol<sup>13</sup> · Christopher Ruis<sup>1</sup> · Alex Virasami<sup>8</sup> · Hong Zhan<sup>14</sup> · Thomas S. Jacques<sup>8,15</sup> · Silke Schepelmann<sup>2</sup> · Waseem Qasim<sup>16,17</sup> · Judith Breuer<sup>1,3</sup>

# Pathogens detected

Incomplete list

Viruses	Bacteria	Fungi	Parasites
Adenovirus	Acinetobacter lwoffii	Aspergillus fumigatus	Toxoplasma gondii
Aichi virus	Enterococcus faecalis	Candida glabrata	
<b>Astrovirus*</b>	Mycobacterium avium		
<b>Avian orthoavulavirus*</b>	Mycobacterium Tuberculosis		
CMV			
<b>Coronavirus OC43</b>			
<b>Coxsackievirus*</b>			
EBV			
HHV6			
JC virus			
Measles			
<b>Mumps vaccine strain*</b>			
Rotavirus			
Rubella			

# Sample types

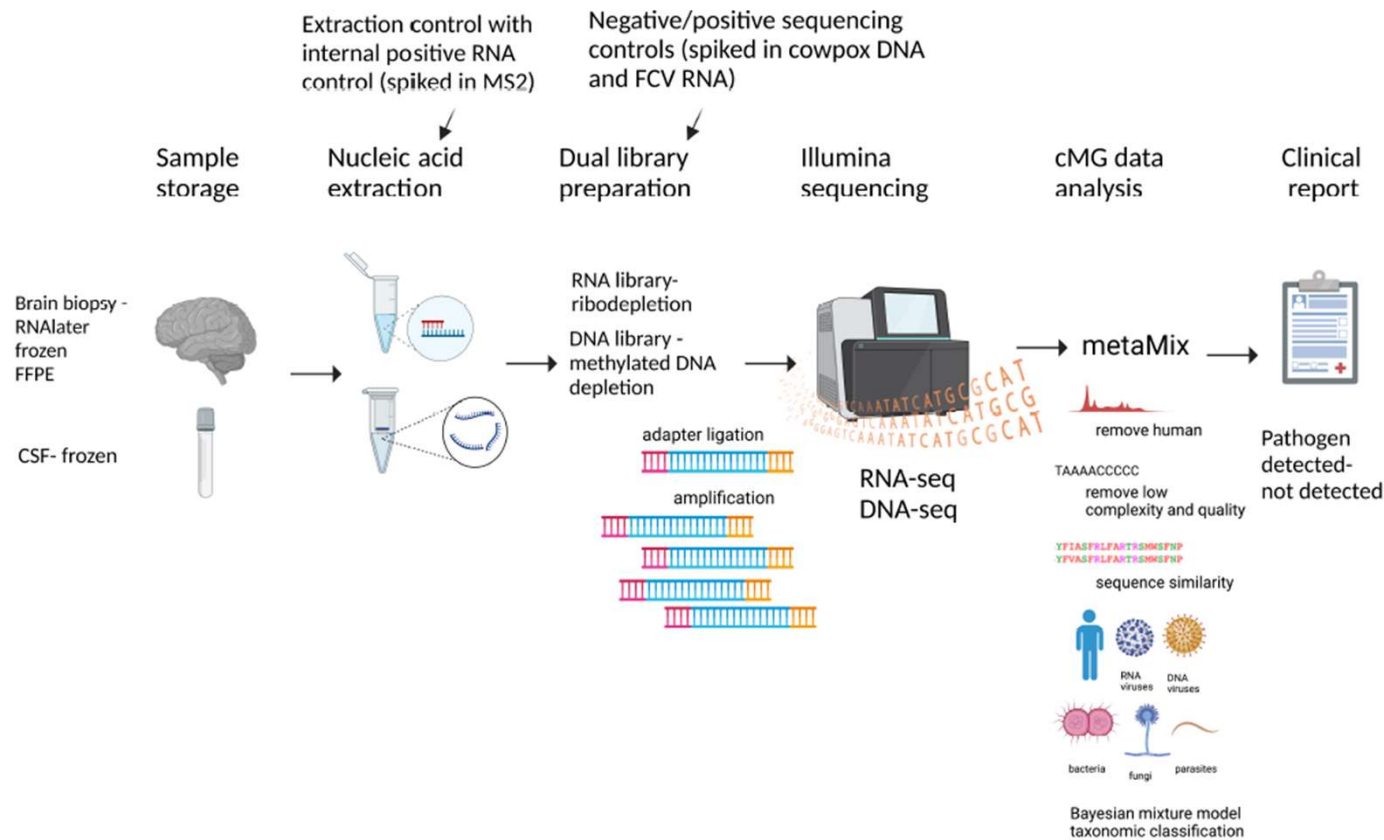
CSF & brain biopsy

Sometime pathogens found in brain but not CSF

High levels of human material

Low microbial diversity

# Metagenomics protocol



# Why not just sequence RNA?

	DNA-seq	RNA-seq
Total reads	31,052,510	68,105,008
HSV1	44,627	20
HSV2	47,344	8

# Removing contaminants and false positives

## Lab

Negative and positive controls

Physical separation

- Pre and post PCR
- Sterile site metagenomics from high microbial load samples

PCR confirmation of anything unusual

## Analysis and reporting

Specific tool: metaMix

Confirmatory mapping

Mini-MDT discussion before reporting

# Confirmatory mapping

Probable contaminant



Probably real





# Removing contaminants and false positives

## Lab

Negative and positive controls

Physical separation

- Pre and post PCR
- Sterile site metagenomics from high microbial load samples

PCR confirmation of anything unusual

## Analysis and reporting

Specific tool: metaMix

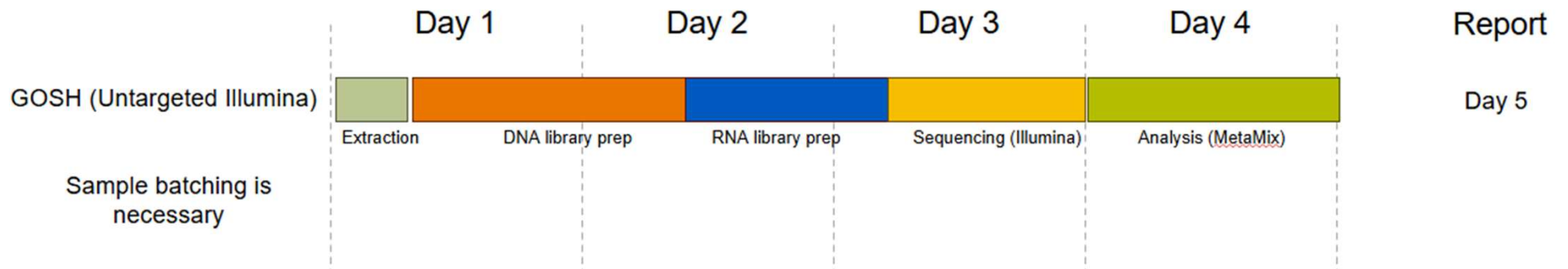
Confirmatory mapping

Mini-MDT discussion before reporting

# Potential improvements

Decrease  
turnaround time

# Turnaround times



# Potential improvements

Decrease  
turnaround time



Oxford Nanopore  
Technologies (ONT)  
Sequencing

Increase  
sensitivity

# Validation

## Spike in dilution series

- RNA-seq  $\approx$  qPCR - tissue and CSF.
- DNA seq  $\approx$  qPCR for CSF
- DNA-seq 100-fold less sensitive qPCR for tissue  $\approx$  16S pan-bacterial PCR

Mock Tissue – spiked dilution series results with model organisms

RNA virus (feline calicivirus)		DNA virus (cowpox virus)	
PCR Ct value	Detection by mNGS (No of reads)	PCR Ct value	Detection by mNGS (No of reads)
29	Detected (3,095)	28	Detected (676 reads)
32	Detected (5,412)	31	Detected (81 reads)
39	Detected (344)	34	Not detected
		36	Not detected

Mock CSF – spiked dilution series with model organisms

RNA virus (feline calicivirus)		DNA virus (cowpox virus)	
PCR Ct value	Detection by mNGS (No of reads)	PCR Ct value	Detection by mNGS (No of reads)
30	Detected (436 reads)	28	Detected (1329 reads)
33	Detected (1,090 reads)	31	Detected (127 reads)
37	Detected (87 reads)	34	Detected (32 reads)
41	Detected (20 reads)	37	Detected (11 reads)

# Potential improvements

Decrease  
turnaround time



Oxford Nanopore  
Technologies (ONT)  
Sequencing

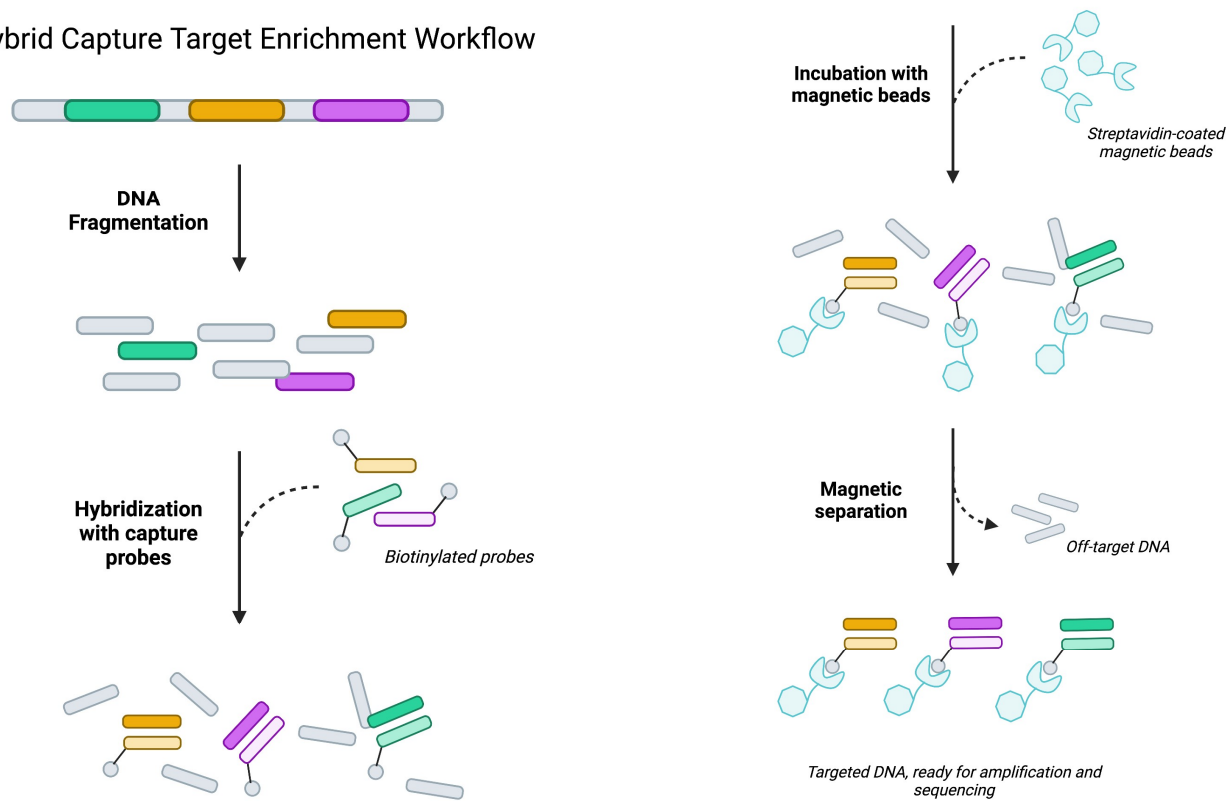
Increase  
sensitivity



Targeted  
approaches

# Hybridisation capture panels

Hybrid Capture Target Enrichment Workflow



# Potential improvements

Decrease  
turnaround time



Oxford Nanopore  
Technologies (ONT)  
Sequencing

Increase  
sensitivity



Targeted  
approaches

Confirm negative  
results and exclude  
infection



Host  
transcriptomics



# Methods comparison

## Untargeted Illumina Sequencing

Separate DNA & RNA Seq

Human genomic DNA  
depletion through CpG  
methylation

Ribodepletion

## Untargeted ONT Sequencing

Separate DNA & RNA Seq

Human genomic DNA  
depletion through CpG  
methylation

No ribodepletion

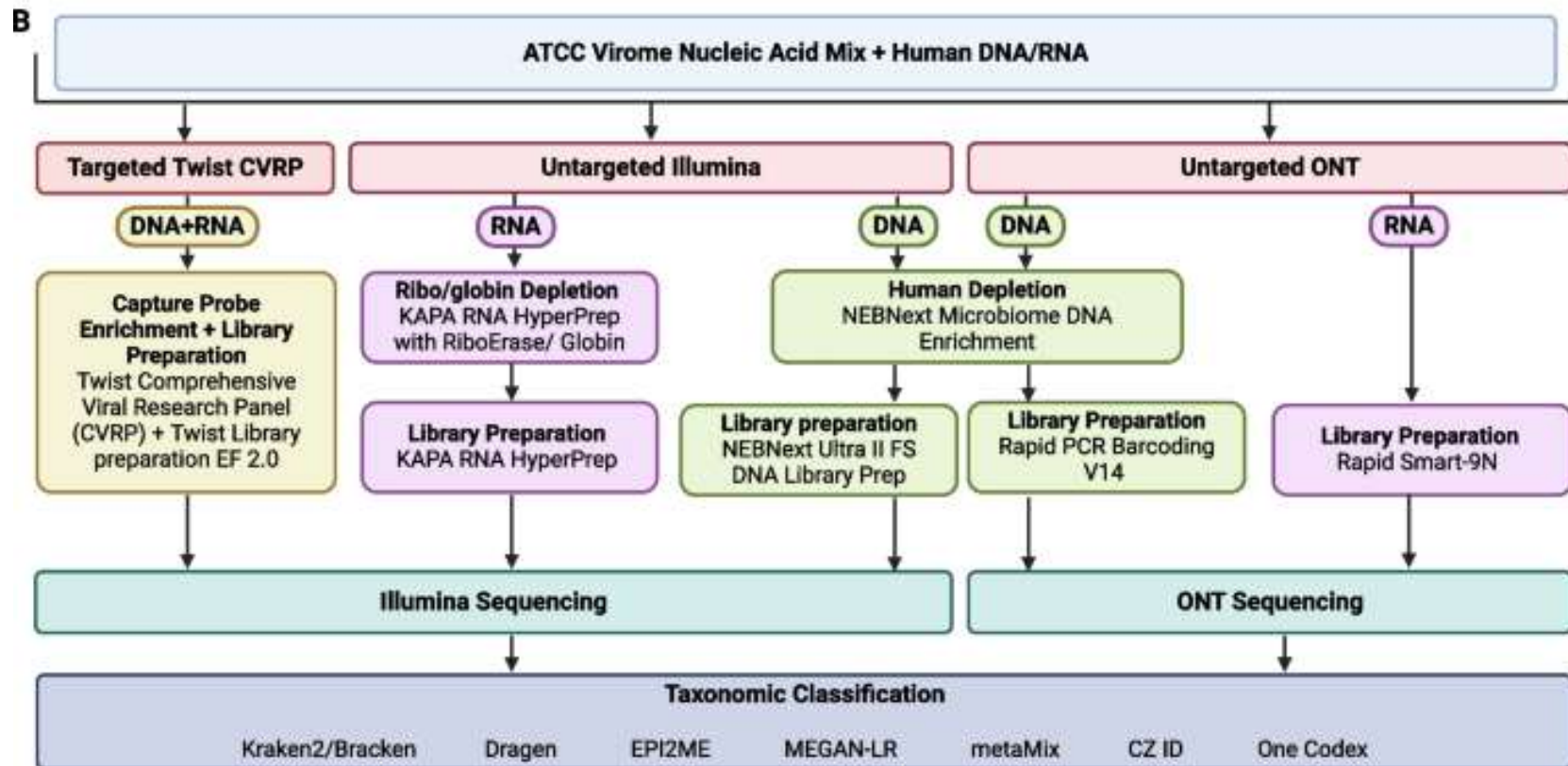
## Capture Probe Enrichment + Illumina

Twist Biosciences Viral  
Research Panel (3153  
species)

Combined DNA & RNA Seq

No human genomic DNA  
depletion or ribodepletion

# Methods comparison



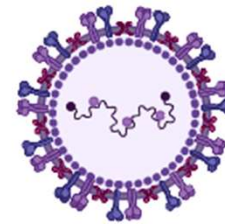
# Mock clinical samples



**Human mastadenovirus F (HAdV-F)**  
DNA  
34392



**Human betaherpesvirus 5 (HHV5)**  
(Cytomegalovirus, CMV)  
DNA  
229354



**Human orthopneumovirus**  
(Respiratory syncytial virus, RSV)  
-ve RNA  
15228



**Influenza B virus**  
-ve RNA  
18527

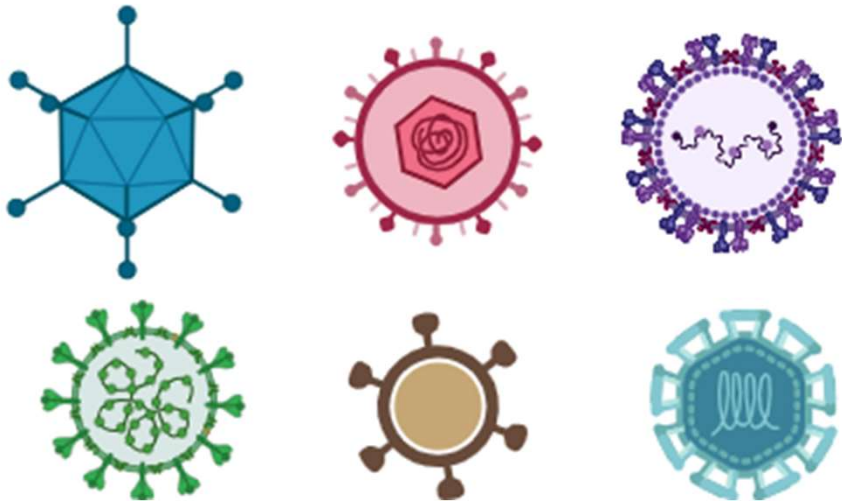


**Mammalian orthoreovirus**  
ds RNA  
23416

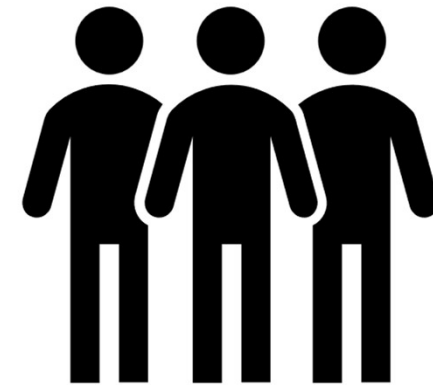


**Zika virus**  
+ve RNA  
10952

# Mock clinical samples



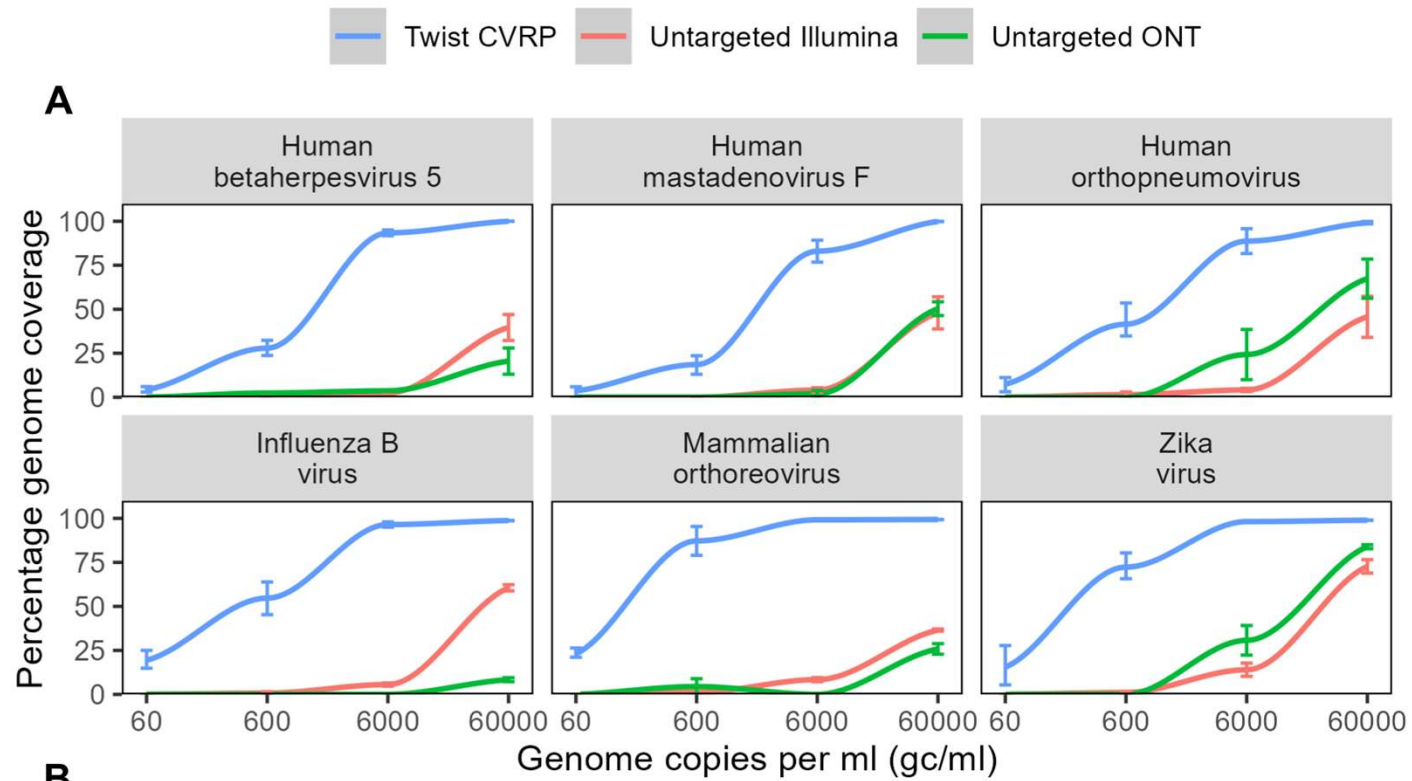
Viral mock community  
(4 dilutions:  $\sim 6 \times 10^1 - 6 \times 10^4$   
genome copies per ml)



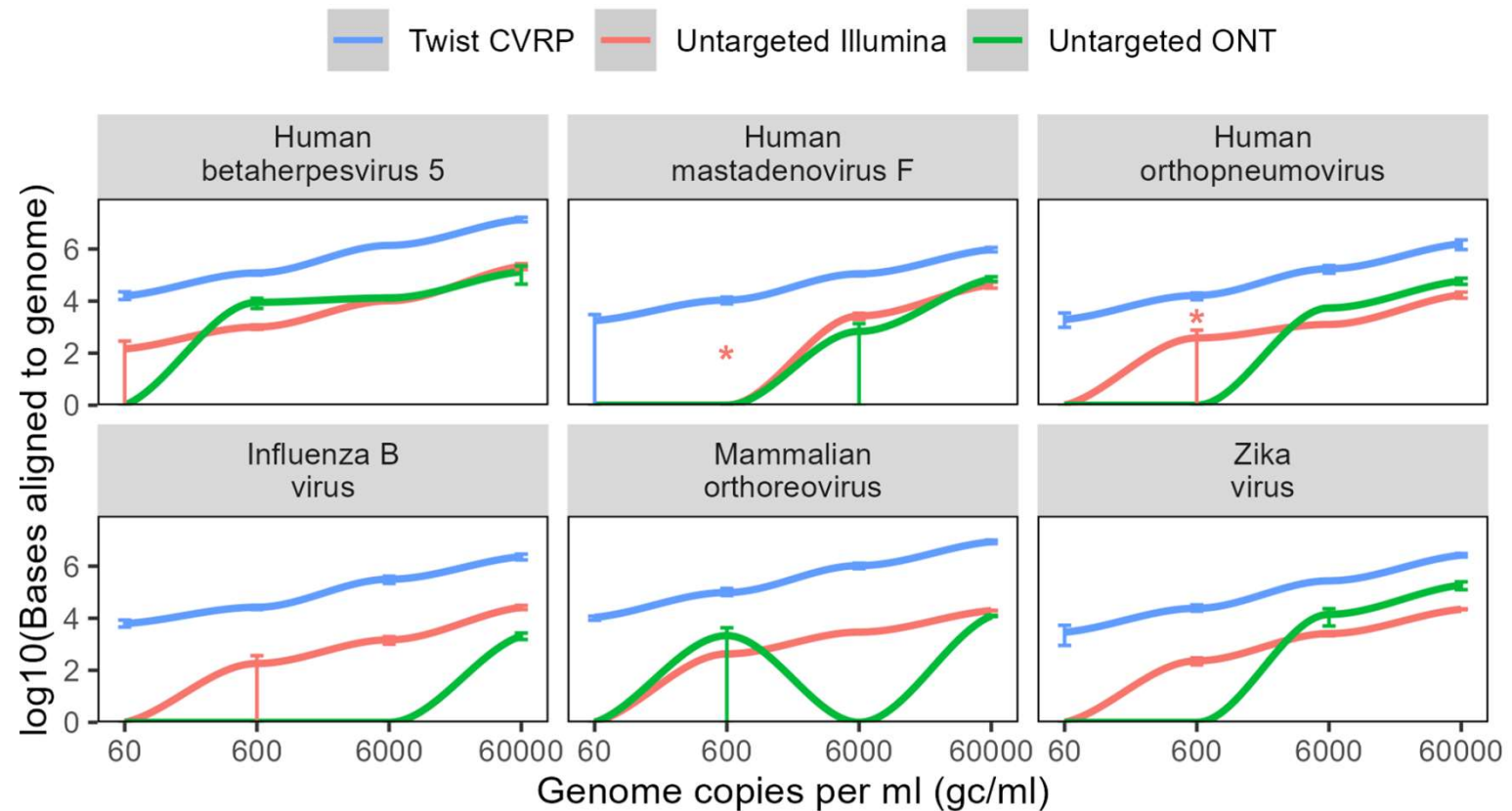
Human DNA + RNA

Negative controls – human DNA and RNA only

# Sensitivity



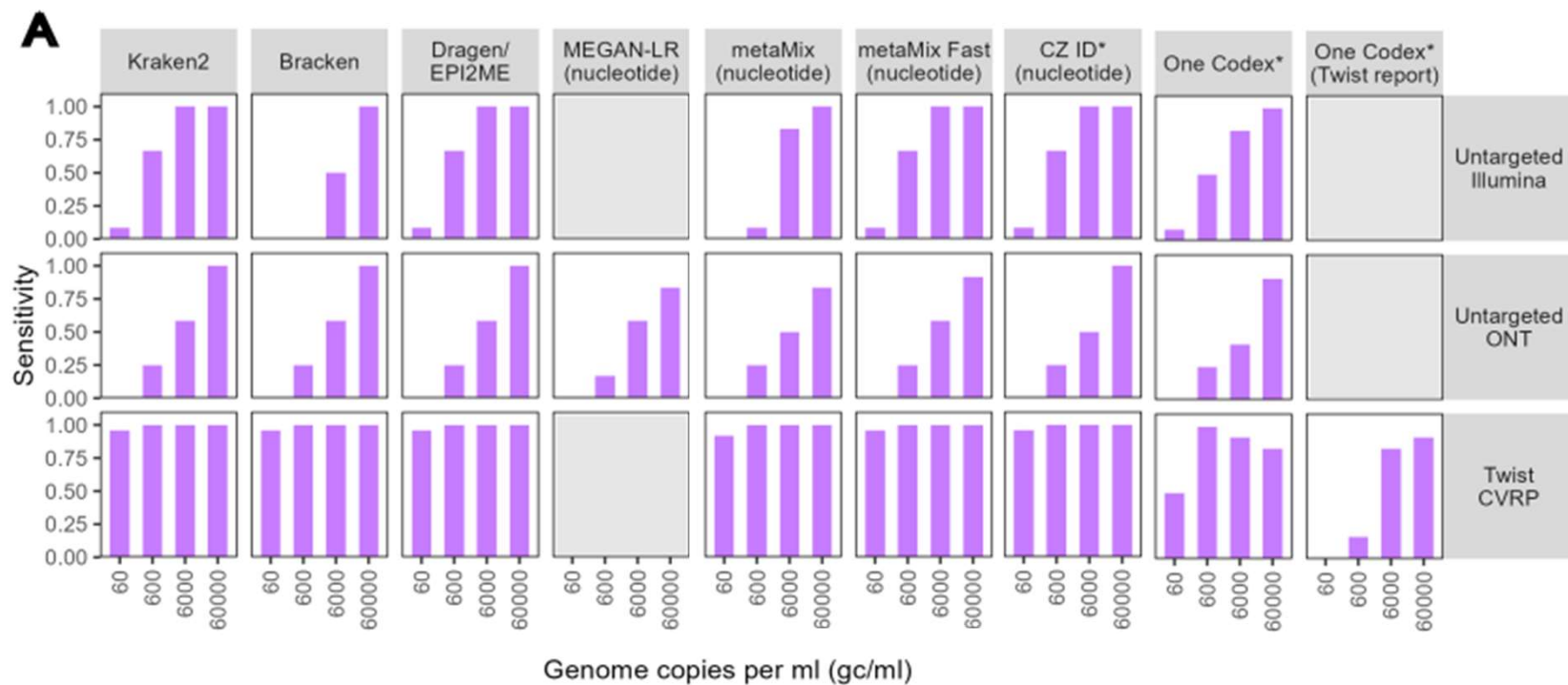
# Sensitivity



# Taxonomic classifiers

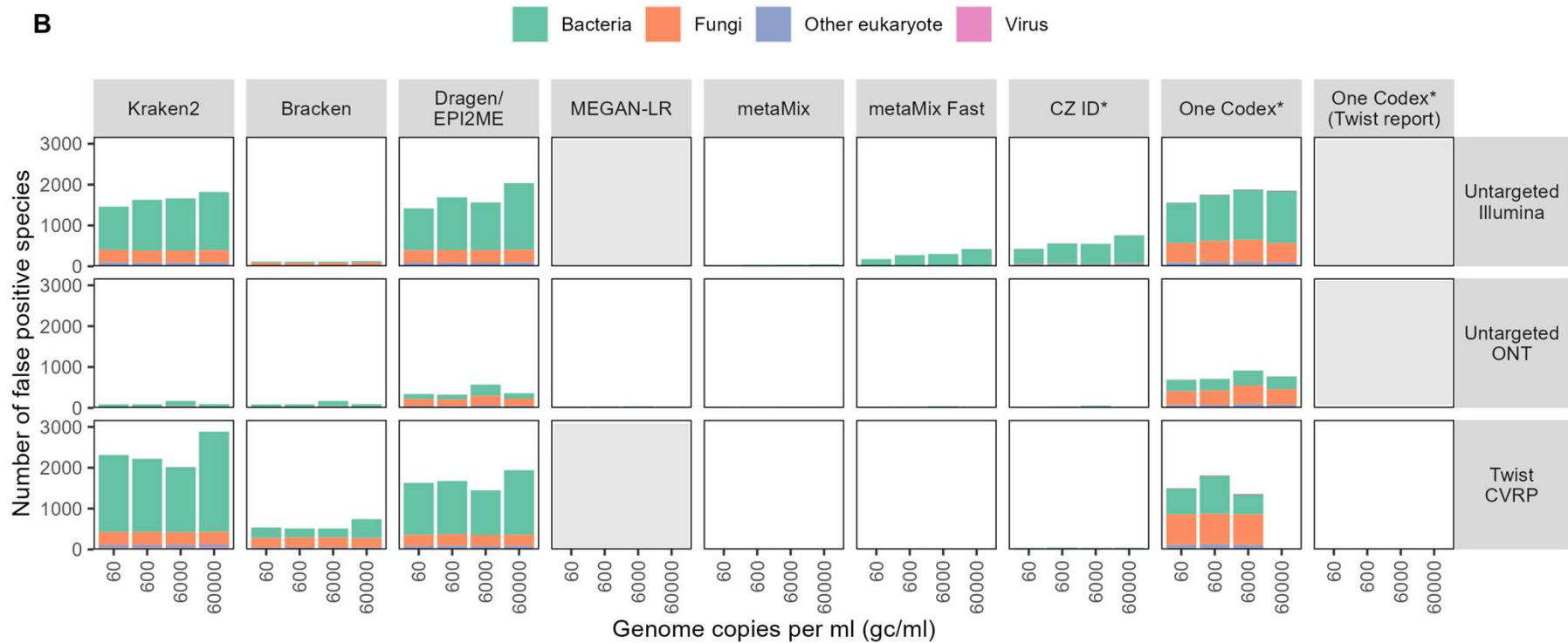
Classifier	Method	Reason included	Platform	GUI or CLI	Local or cloud	Database size	Approximate time taken (hours)*
<b>Kraken2 &amp; Bracken</b>	Kmer-based, lowest common ancestor	Very widely used	Illumina & ONT	CLI	Local	124 GB	1-3
<b>DRAGEN Metagenomics (Kraken2)</b>	See Kraken2	Illumina's platform	Illumina & ONT	CLI & GUI	Cloud	124 GB	1.5-3
<b>EPI2ME Labs wf-metagenomics (Kraken2 &amp; Bracken)</b>	See Kraken2	ONT's platform	ONT	CLI & GUI	Local. Cloud in development	124 GB	0.5-2
<b>MEGAN(-LR)</b>	Lowest common ancestor	Good performance in benchmarking study	Illumina & ONT	CLI required for preprocessing. GUI (free), CLI (paid for short reads)	Local	327 GB (Minimap2) 88 GB (DIAMOND)	5-8
<b>metaMix</b>	Bayesian mixture models	Good performance in benchmarking study, used clinically	Illumina & ONT	CLI	Local	148 GB (BLAST) 88 GB (DIAMOND)	5-12+
<b>CZ ID</b>	Alignment and assembly	Free, cloud-based platform	Illumina & ONT	CLI & GUI	Cloud	NA - inbuilt online database	0.5-2
<b>One Codex</b>	Kmer-based	Recommended platform for use with Twist CVRP	Illumina & ONT	CLI & GUI	Cloud	NA – inbuilt online database	~0.5-2

# Sensitivity





# Specificity



# Types of threshold

**Raw reads**

reads assigned to taxon

**Reads per million (rpm)**

$$\text{reads per million (rpm)} = \frac{\text{reads assigned to taxon} * 10^6}{\text{total raw reads in sample}}$$

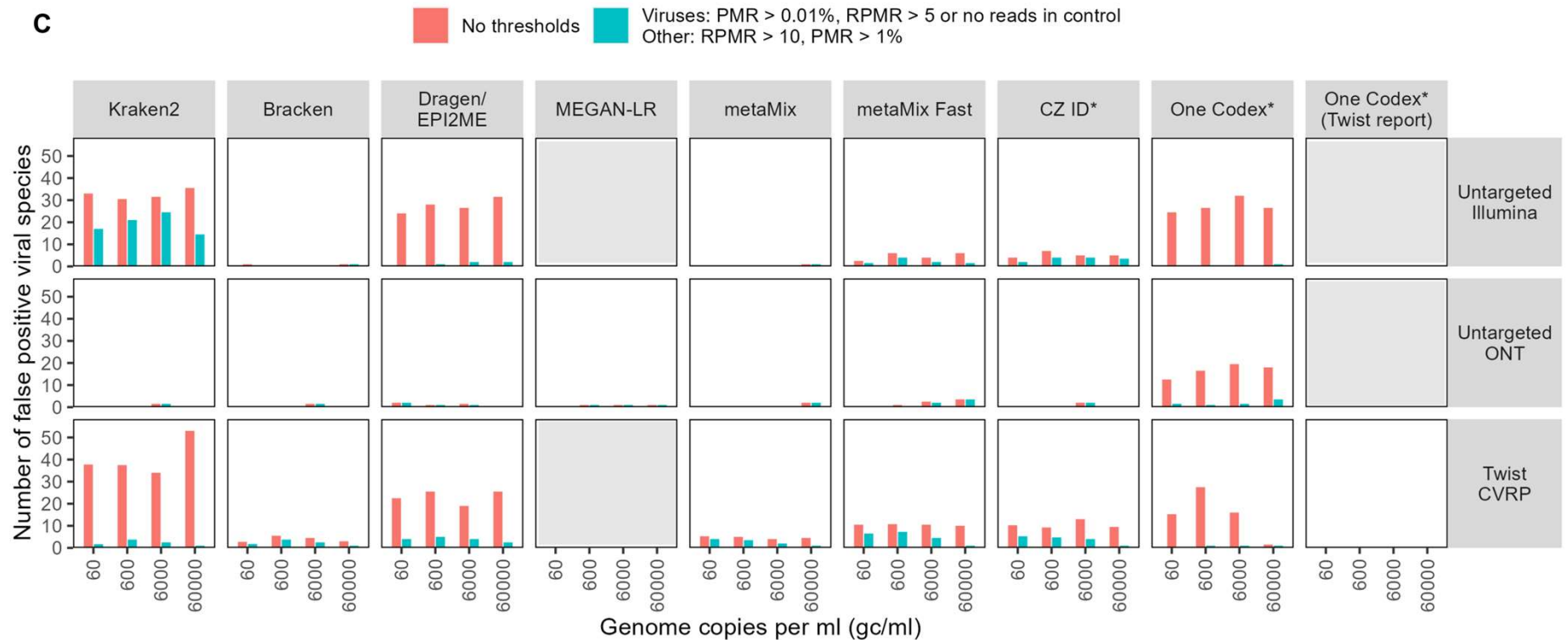
**Reads per million ratio**

$$\text{rpm ratio} = \frac{\text{sample rpm}}{\text{control rpm}}$$

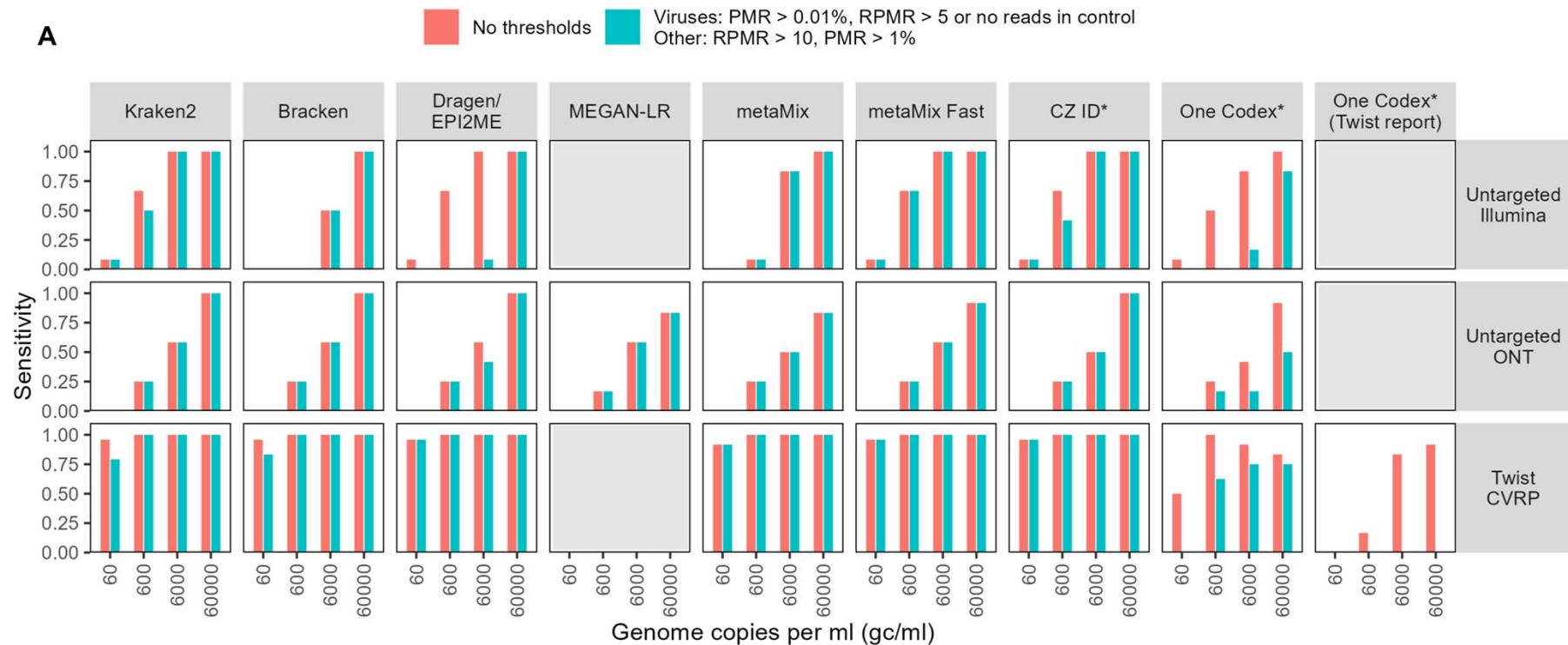
**Proportion of microbial reads**

$$\text{proportion microbial reads} = \frac{\text{reads assigned to taxon}}{\text{total nonhuman, classified reads in sample}}$$

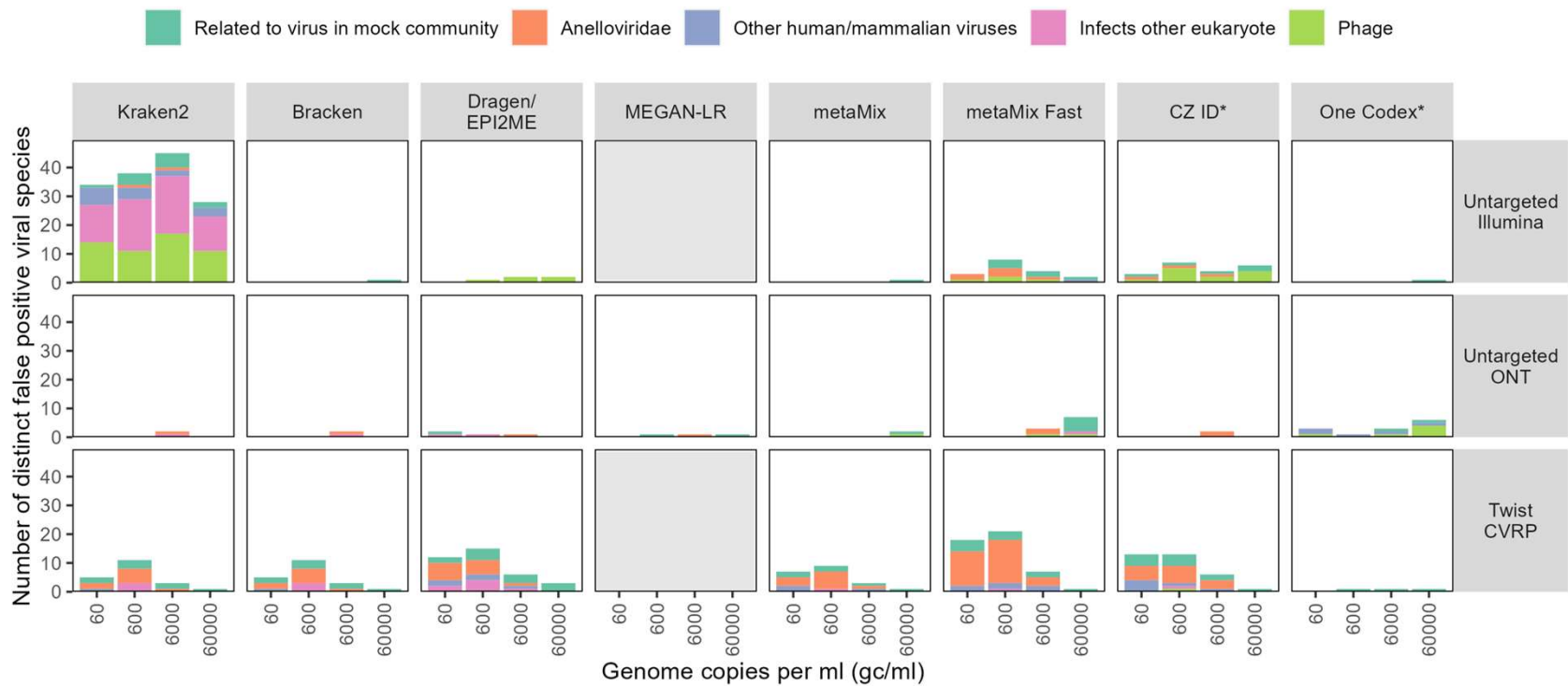
# False positive species



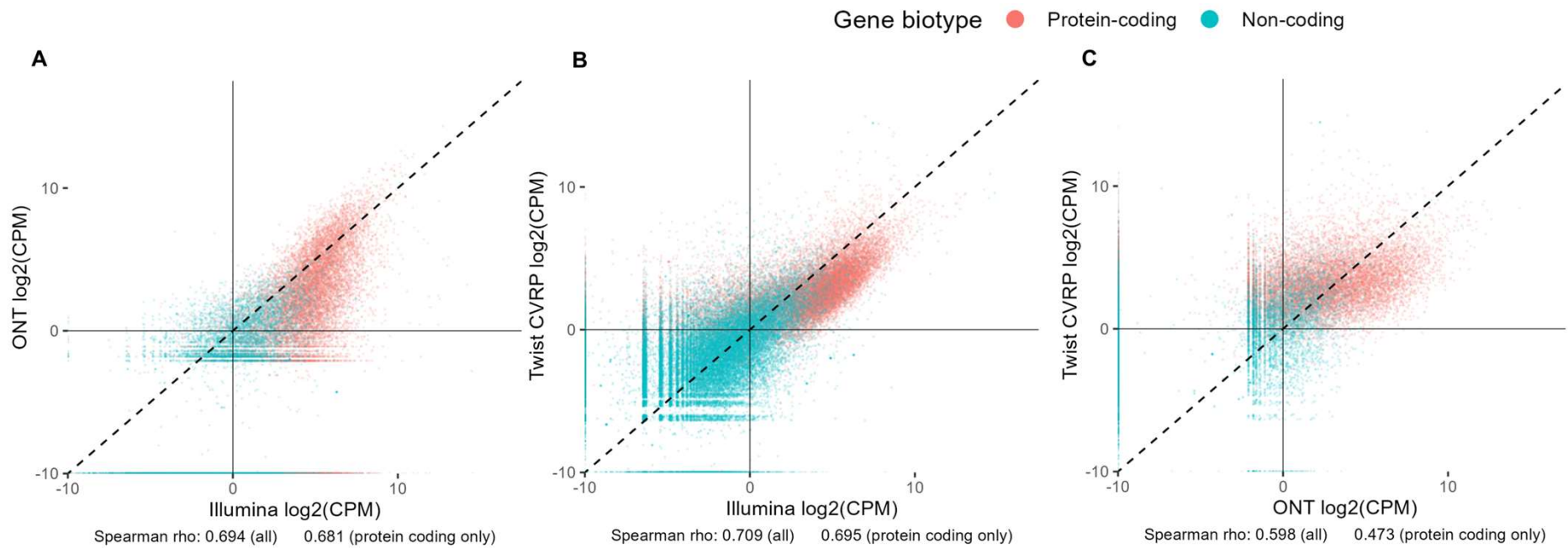
# Sensitivity with thresholds



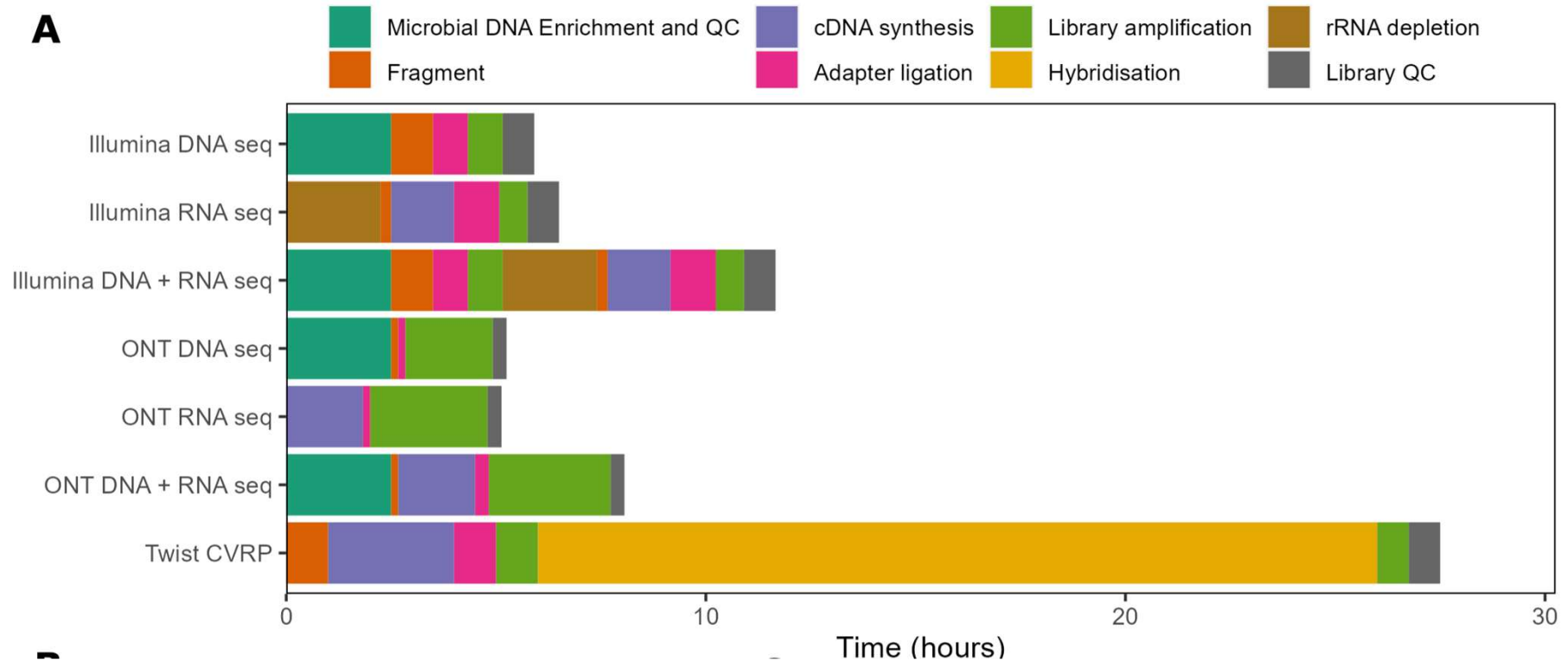
# False positive species



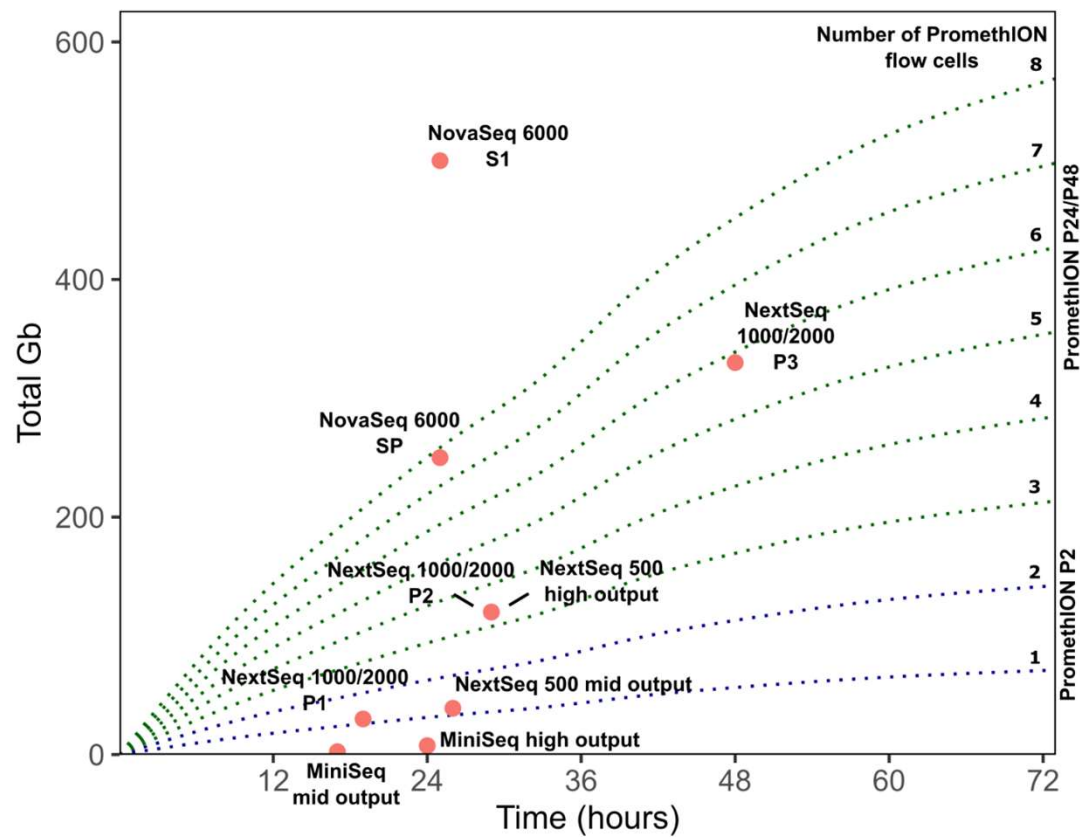
# Host transcriptomics



# Turnaround times

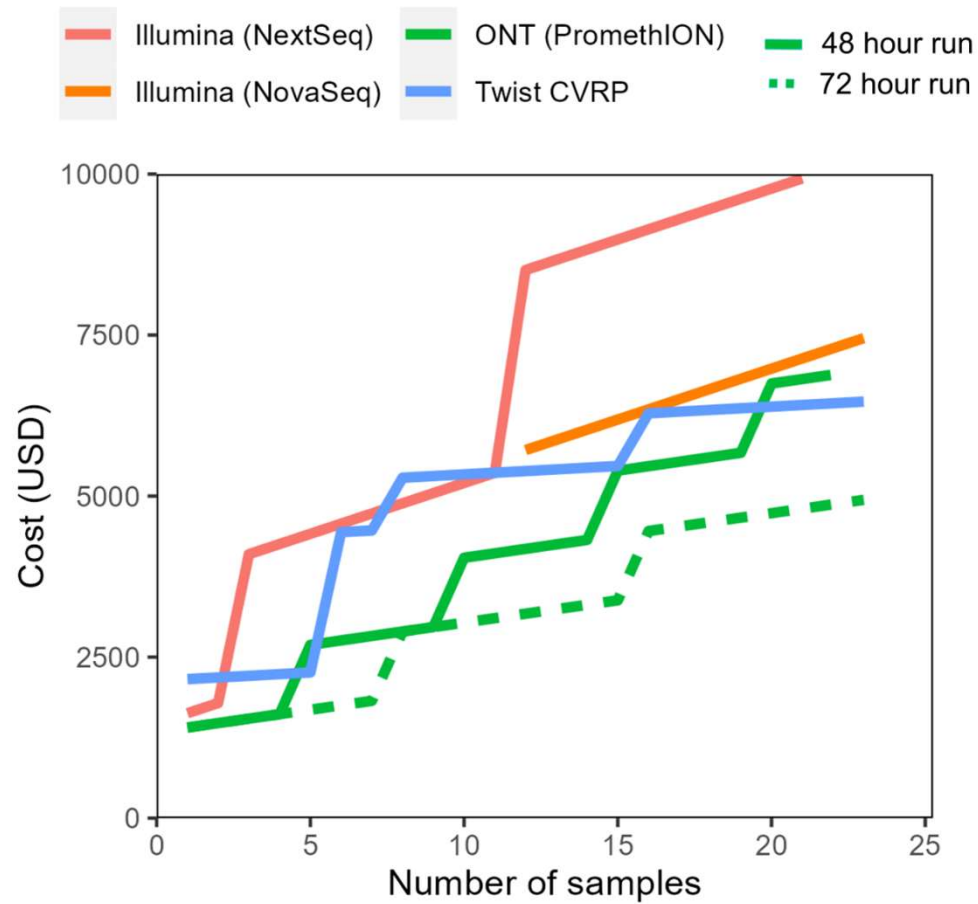


# Turnaround times





# Costs



# Conclusions

Sensitivity: Twist CVRP >> Untargeted Illumina > Untargeted ONT

ONT was the most specific approach

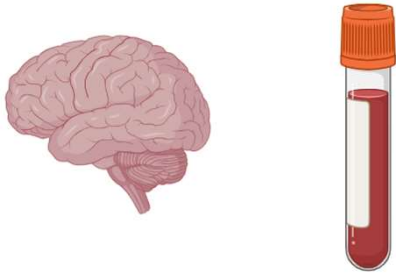
Use of thresholds can standardise results across classifiers

Host analysis is possible with all platforms.

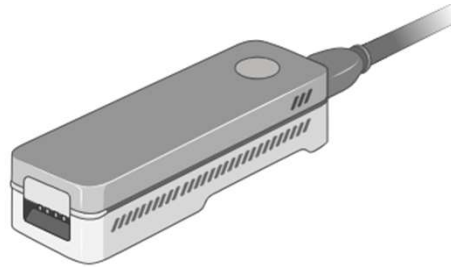
Cost and turnaround times vary with sample number, but ONT is quickest and cheapest for small sample numbers.

Paper: Buddle & Forrest et al, Genome Medicine, 2024

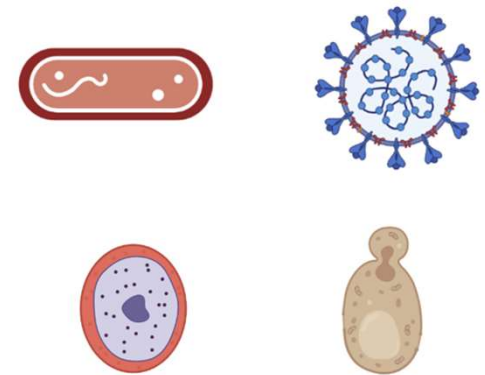
# Future directions



Clinical samples



Improving  
sensitivity of ONT



Targeted panels  
for encephalitis

# Other uses of blood and tissue metagenomics

Sepsis and bloodstream infection

Fever of unknown origin

Transplanted organs

# Respiratory metagenomics

Diagnosis of pneumonia in intensive care units

More complex microbial community

Faster turnaround times required

Surveillance potential

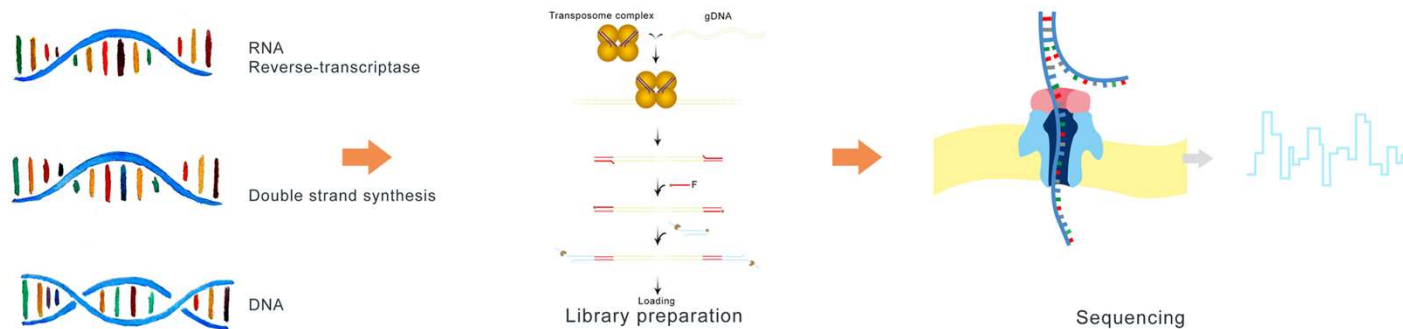
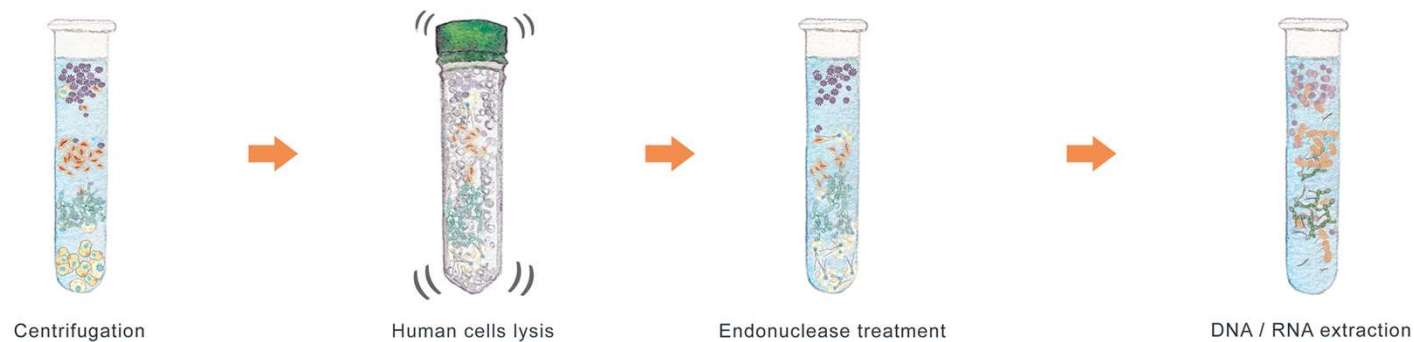
# Respiratory metagenomics with ONT

## Routine Metagenomics Service for ICU Patients with Respiratory Infection

Ⓒ Themoula Charalampous<sup>1\*</sup>, Adela Alcolea-Medina<sup>1,3\*</sup>, Luke B. Snell<sup>1,4\*</sup>, Christopher Alder<sup>1,4</sup>, Mark Tan<sup>1</sup>, Tom G. S. Williams<sup>4</sup>, Noor Al-Yaakoubi<sup>1</sup>, Gul Humayun<sup>1</sup>, Christopher I. S. Meadows<sup>2,5</sup>, Duncan L. A. Wyncoll<sup>5</sup>, Richard Paul<sup>5</sup>, Carolyn J. Hemsley<sup>4</sup>, Dakshika Jeyaratnam<sup>4</sup>, William Newsholme<sup>4</sup>, Simon Goldenberg<sup>4</sup>, Amita Patel<sup>1,4</sup>, Fearghal Tucker<sup>3</sup>, Gaia Nebbia<sup>4</sup>, Mark Wilks<sup>6</sup>, Meera Chand<sup>7</sup>, Penelope R. Cliff<sup>3</sup>, Rahul Batra<sup>1,4</sup>, Justin O'Grady<sup>8</sup>, Nicholas A. Barrett<sup>5</sup>, and Jonathan D. Edgeworth<sup>1,4†</sup>

<sup>1</sup>Centre for Clinical Infection and Diagnostics Research, Department of Infectious Diseases, School of Immunology and Microbial Sciences and <sup>2</sup>Faculty of Life Sciences and Medicine, King's College London, London, United Kingdom; <sup>3</sup>Infection Sciences, Synnovis, London, United Kingdom; <sup>4</sup>Department of Infectious Diseases and <sup>5</sup>Critical Care Directorate, Guy's and St Thomas' NHS Foundation Trust, London, England; <sup>6</sup>London School of Medicine and Dentistry, Queen Mary University, London, United Kingdom; <sup>7</sup>UK Health Security Agency, London, United Kingdom; and <sup>8</sup>Oxford Nanopore Technologies, Oxford, United Kingdom.

# GSTT Respiratory Metagenomics Protocol



Alcolea-Medina *et al*, Communications Medicine, 2024

# Surveillance

May require distinct bioinformatics pipelines and databases

Requires data/results sharing

Key challenges (in addition to general challenges of metagenomics)

- Sharing sensitive data, possibly internationally
- Validating pipelines for unknown organisms



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**NIHR** | Great Ormond Street  
Hospital Biomedical  
Research Centre

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