



Clinical Metagenomic Sequencing for Diagnosis of Infections

Charles Chiu, MD / PhD

Professor, Department of Laboratory Medicine and Medicine / Infectious Diseases

Director, UCSF-Abbott Viral Diagnostics and Discovery Center

Associate Director, UCSF Clinical Microbiology Laboratory

University of California, San Francisco

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Metagenomic Sequencing



ATTACCC ATACTGCATG TCGATCGTAC TAGACTAGCA TCGAAACP

CACTAGC CUCT CGCTCO ACCCCTATATI SCA

> A SCG M CGATCGAGCT) GCGAGACTCGA TACGTACGTCAGTCA **CATCGCGATCTAGAS** AGCGACCATCG CATCCATACGTASC ACGTCCCA3

GCA

JTACG AGCATCGTC GCATACGCAT GCGATCTAGA GATCGATCG CCCCTATAT ACCATCGAT TATCTCGCGC **UITTACAACCAACTAG** IGCATACGTACGCATACTGCATU **ETCAGTCAGCATCGATCATTCAGGCG** AGCATCAGCGTAACGATCGGCATCGA CTGCGATCGATCGATCGTACTGACTG ACTCTATCGTCACATGAGCTAGCTAC .GCGCGCTATAGCGCATCTAACGTCAG CCGATAGCTAGACTAGCATCACTAGC **ATACGCGCGACTACGCGATCAGATCGC** ATATCTCTATTTTAGGCGCGCTAGCGA1 GATCGGATCGAAACGCGGCT GAGCCC JCGCGAGCGGAACCCGCGCT/ GACCA CGCGCGCATCAGATAGCGCGC ATATA AGCGC CCACGCGATCGAGCTA TTACA ATCA FACTCAGTACGCATGC ACGTA CAGTACGACTGACTCAC CAGCA TGA! *'CCC* **TCGCGAGACTCGAGCA1** AGCG1 **FCGATGCTGACTAGCTGC** TCG/ CATC **GCTATGCTATGCTGACTC** ACTGA **TCG** CTAGC CGTACGTCAGTCACGCGC CTAT AACG] GCATCGTCGTCAATCCGA AGCT CATACGCATCAGCATACGCGCGA CGATCTAGACGTCATATCTCTAT ATCGATCGATAGCGATCCG ATC CCCTATATTTAGAGCGCC CATCGATC ATCTCGCC GATAGCG AACCAAC AGCGATC/ ACGCAT/ FGCATGA

AAACGCG ECACGCGATCGA GATCGCGAGACT GCTACGTACGTCA AGATCGCGATCT CTAGCGACCAT TGCATA

> 1Ô0 ACGTAC GATCGCG TAGCGA TGCAT **IG** CA AT CC) CGT

GCATO ATCGTACTO GACTAGCAT GAAACGCC GCGAT

Nearly All Microbes can be Uniquely Identified by Metagenomic Next-Generation Sequencing (mNGS)

Bacteria



Viruses



Fungi



Parasites



CLIA-Validated mNGS Assay at UCSF



For Providers For Patients Technology Our Vision

Our Diagnostic Lab

Only at UCSF: the next generation of diagnostic tests.

The UCSF Clinical Microbiology Laboratory offers a validated test for diagnosis of meningitis /encephalitis from cerebrospinal fluid in our CLIA-certified laboratory. Results are interpreted by laboratory physicians, and consultation services are available upon request.



SURPI (Sequence-Based Ultra-Rapid Pathogen Identification)

SURPI+



Miller and Chiu, et al., Genome Research, 2019

The Precision Diagnosis of Acute Infectious Diseases (PDAID) Study





Highest diagnostic yield results from combination of mNGS of CSF and conventional microbiologic testing (including serology and testing of different specimen sources)

Wilson et al., 2019 N Eng J Med 380:2327-2340

Unknown Case – Patient with Chronic Meningoencephalitis

- 60 y/o male from New England with history of mantle cell lymphoma in remission, on maintenance rituximab since 2014, developed fatigue, arthralgias, and weight loss over 6 months
- He was empirically treated for Lyme disease without improvement, developed progressive insomnia, inattention, and was admitted for workup of rapidly progressive dementia
- On exam, he had impaired arousal and attention (Montreal Cognitive Assessment score was 6 of 30)
- Cranial nerve exam, muscle tone, strength, sensory, and reflex exams all normal. No ataxia.
- Brain MRI unremarkable; PET scan showed global hypometabolism
- CSF from multiple lumbar punctures → mild lymphocytic pleocytosis, elevated protein, and normal glucose
- Extensive laboratory workup was normal.



Solomon, et al., Emerging Infectious Diseases, 2020, in press



Microbiology Report

Metagenomic next-generation sequencing

LABORATORY PHYSICIAN INTERPRETATION:

Organism Type: DNA Viruses:

Not Detected

RNA Viruses:

California encephalitis virus**

Bacteria:

Not Detected

Fungi:

Not Detected

Parasites:

Not Detected

**Detected viral sequences most closely match Jamestown Canyon virus, and map to 2 of the 3 segments of the viral genome.

	NGS_101_1900	NGS 101 1900	NGS_101_1901	NGS_101_1901	NGS_101_1902	NGS_101_1902	NGS_101_1903	NGS_101_1903	NGS_101_1904	NGS 101 1904
California encephalitis virus										
Torque teno virus			A	nal	ytic	al,	RN	IA I	ore	p 23
SEN virus			CE	ell r	ead	ds				23
Human immunodeficiency virus 1			Sa	amp	ole	rea	ads		3	36
*			sp	bec	ies	rea	ads		1	23
GB virus C Human barnesvirus 5			to B	last	rea t No	cB	l nt	5	72	47
numan nerpesvirus 5	6		-	-	_	=	-	_	=	-



AP **AP NEWS**

California recall Coronavirus pandemic Afghanistan Politics Sports Entertainment Photog



NH adult infected with Jamestown Canyon Virus dies

Clinical mNGS Testing

August 6, 2021

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CONCORD, N.H. (AP) — An adult who became infected with the Jamestown Canyon Virus has died, the New Hampshire Department of Health and Human Services said Friday.

The virus is transmitted by the bite of an infected mosquito.

The adult, from Dublin, New Hampshire, was "hospitalized with worsening neurological symptoms and ultimately died," the department said in a news release. "JCV infection was identified as a contributing cause to their death." No further information was released about the person.

The department said this has been the first detection of the virus in a person in the state this year.

The risk of transmission of mosquito-borne diseases to people in Dublin will be increased to high

Solomon, et al., Emerging Infectious Diseases, 2020, in press

- mNGS testing was positive for California encephalitis virus most closely matching Jamestown Canyon virus (JCV); detected reads mapped to 2 of the 3 segments of the viral genome
- Another CSF sample, obtained 3 weeks later, was negative for JCV by RT-PCR; however, serum JCV RT-PCR was positive
- JCV IgM and neutralizing antibody testing was negative in both CSF and blood.
- Patient was treated with IVIg (2 g/kg) followed by 2-week course of favipiravir (an experimental inhibitor of viral RNA polymerase), without clinical improvement
- He became comatose and was transitioned to comfort care and died, approximately 1 year from suspected symptom onset

Plasma mNGS at UCSF



The UCSF clinical metagenomic next-generation sequencing (mNGS) assay is now available for use with plasma samples. This clinically validated test broadens the offerings from the <u>UCSF Center for Next-Gen Precision Diagnostics</u>, which until now had been restricted for cerebrospinal fluid (CSF) samples only.

Some clinical indications for the mNGS plasma assay may include:

- Culture-negative endocarditis
- Fever of unknown origin (FUO) with suspected infectious etiology, for both pediatric and adult patients
- Difficult-to-biopsy end-organ disease
- Immunocompromised and transplant patients with suspected infections
- ICU patients, most on empiric antibiotics, with infections not identified in conventional testing

Unknown Case

- 40 y/o male with AML s/p allogeneic stem-cell transplant in October of 2019 admitted with cough, fever, and found to have relapse of AML
- Developed acute respiratory decompensation requiring intubation and progression with new nodular consolidation in the upper lobes that was concerning for invasive mold infection
- Repeat chest CT → evolution of upper lobe opacities, less nodular and more diffuse, with tree-in-bud abnormalities
- Workup for viral etiologies (RVP, adenovirus, CMV, HHV6) and PCP (beta-D-glucan, cytology) unrevealing, tracheal aspirates/BAL cultures negative
- On pip-tazo and ambisome but with increasing oxygen requirement
- Discussion to transition to comfort care







Unknown Case

- Patient started on azithromycin
- Improved rapidly and was extubated, on room air, and working with physical therapy
- Also had received steroids for possible pulmonary graft-versus-hostdisease that was continued
- Notably, he had received a five-day course of azithromycin as an outpatient, but this was thought insufficient to treat his fulminant disease given his degree of immunocompromise

Clinical Nanopore Metagenomic Sequencing





SAMPLE PROCESSING (1 hr)

BIOINFORMATICS ANALYSIS (15 min) CLINICAL DX (<2 hr)

Gu, et al., 2021, *Nature Medicine*, 25:115-124. Zhang, et al., 2021, manuscript in preparation



Metagenomic Sequencing of Body Fluids from Infected Patients



Article | Published: 09 November 2020

Rapid pathogen detection by metagenomic nextgeneration sequencing of infected body fluids

Wei Gu, Xianding Deng, Marco Lee, Yasemin D. Sucu, Shaun Arevalo, Doug Stryke, Scot Federman, Allan Gopez, Kevin Reyes, Kelsey Zorn, Hannah Sample, Guixia Yu, Gurpreet Ishpuniani, Benjamin Briggs, Eric D. Chow, Amy Berger, Michael R. Wilson, Candace Wang, Elaine Hsu, Steve Miller, Joseph L. DeRisi & Charles Y. Chiu 🖂

Nature Medicine 27, 115–124 (2021) | Cite this article 8963 Accesses | 13 Citations | 174 Altmetric | Metrics



Wei Gu, MD/PhD

Gu, et al., 2021, Nature Medicine, 25:115-124.

Unknown Case – 2 year old with new-onset seizures and large left brain abscess

- History of multiple ear infections and cellulitis
- treated with ceftriaxone and azithromycin
- Presented with seizures, wobbly gait, decreased use of right hand, hearing difficulties (associated with otitis media)
- No significant exposure history
- Admitted for workup



2-year with new-onset seizures and large left brain abscess

- Workup for immunodeficiency (lymphocyte subsets, HIV testing)
- Extraction of 40 cc of purulent fluid from abscess
- <u>Differential diagnosis</u>:
 - Anaerobic infection
 - Balamuthia mandrillaris
 - Neurocysticercosis
 - Nocardia spp.
 - Mycobacterium tuberculosis
 - Toxoplasmosis
 - Listeria monocytogenes
 - Non-infectious etiology (malignancy)

Streptococcus pyogenes abscess

- Direct DNA extraction \rightarrow nanopore sequencing
- First read detected in <u>40 minutes</u>
- Overall turnaround time from sample to answer: <u>3 hours</u>
- 16S universal PCR also positive for *S. pyogenes*, cultures negative



Clinical Nanopore Metagenomic Sequencing





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Gu, et al., 2021, *Nature Medicine*, 25:115-124. Zhang, et al., 2021, manuscript in preparation

Nanopore Sequencing of Borrelia burgdorferi

1 copy/mL



Spirochaetaceae

Spirochaetaceae

Pseudomonadaceae Enterobacteriaceae Enterobacteriaceae Propionibacteriaceae Comamonadaceae Methylophilaceae Pseudomonadaceae Pseudomonadaceae Borrelia

Borrelia

Pseudomonas Escherichia * Propionibacterium Acidovorax * Pseudomonas

Pseudomonas

*

Borrelia burgdorferi

Pseudomonas pseudoalcaligenes Escherichia coli

Propionibacterium acnes Acidovorax sp. KKS102

*

Pseudomonas sp. TKP

RNA Host Response Profiles of Febrile Infection



25 30

20 log(p-value)

Role of Pattern Recognition Receptors in Recognition of Bacteria and Viruses Role of Macrophages, Fibroblasts and Endothelial Cells in Rheumatoid Arthritis TREM1 Signaling NF-kB Signaling Toll-like Receptor Signaling Phagosome Formation Altered T Cell and B Cell Signaling in Rheumatoid Arthritis Neuroinflammation Signaling Pathway Dendritic Cell Maturation Colorectal Cancer Metastasis Signaling Role of PKR in Interferon Induction and Antiviral Response Inflammasome pathway Communication between Innate and Adaptive Immune Cells Systemic Lupus Erythematosus In B Cell Signaling Pathway Osteoarthritis Pathway Hepatic Cholestasi Granulocyte Adhesion and Diapedesis Crosstalk between Dendritic Cells and Natural Killer Cells Hepatic Fibrosis / Hepatic Stellate Cell Activatio Inhibition of ARE-Mediated mRNA Degradation Pathway IL-6 Signaling iNOS Signaling HMGB1 Signaling Lyme (n=29)^{STAT3 Pathway} Interferon Signaling Phaoosome Formation Gustation Pathway

Hepatic Fibrosis / Hepatic Stellate Cell Activation Role of Macrophages, Fibroblasts and Endothelial Cells in Rheumatoid Arthritis Complement System Granulocyte Adhesion and Diapedesis II.15 Production Dendritic Cell Maturation Inhibition of Matrix Metalloproteas **TREM1 Signalin** Axonal Guidance Signaling Osteoarthritis Pathwa Activation of IRF by Cytosolic Pattern Recognition Receptor Endocannabinoid Neuronal Synapse Pathway Autoimmune Thyroid Disease Signaling White Adipose Tissue Browning Pathway Communication between Innate and Adaptive Immune Cells Salvage Pathways of Pyrimidine Deoxyribonucleotider Hepatic Fibrosis Signaling Pathwa Systemic Lupus Erythematosus In B Cell Signaling Pathwa Role of Pattern Recognition Receptors in Recognition of Bacteria and Viruse GP6 Signaling Pathway Pathogenesis of Multiple Sclerosis log(p-value)

Ng, et al., 2020, manuscript under review

Lyme Disease Gene Classifier (LDC) for Diagnosis of Early Lyme Disease



Transcriptome Profiling of Human (Patient) Host Responses using Machine Learning Analyses of RNA-Seq Data





Predictive Model from CSF RNA-Seq (Transcriptome) Data



Santos and Chiu, et al., 2021 (manuscript in preparation)

CSF Host Response Classifier Algorithm



Performance of the Spinal Fluid Classifier

- **Bacterial infection** (86% sensitivity, 93% specificity)
- Viral infection (81% sensitivity, 93% specificity)
- Fungal infection (75% sensitivity, 95% specificity)
- **Parasitic infection** (60% sensitivity, 100% specificity)
- Autoimmune / non-infectious etiology (83% sensitivity, 96% specificity)

Host Response Classification of Metagenomic RNA-Seq Data for Infection Diagnosis

Patient Dx	mNGS result	AINI	Bacterial	Fungal	Parasitic	Viral	Classifier Result
subthreshold Mycobacterium tuberculosis	negative	0.61%	64.07%	21.18%	1.30%	12.84%	Bacterial
GABA-receptor mediated encephalitis	negative	80.92%	8.10%	1.36%	2.34%	7.29%	AINI
unknown, likely viral / autoimmune	multiple bacterial taxa, including P. acnes, Micrococcus luteus, and Corynebacterium sp.	35.20%	11.80%	8.74%	6.93%	37.33%	Viral
subthreshold Aspergillus	negative	7.32%	17.68%	65.71%	0.86%	8.43%	Fungal
Zika virus	Zika virus	16.24%	4.93%	0.91%	2.13%	75.78%	Viral

Diagnosis of Infections by "Nearest Neighbor" Histoplasma capsulatum Mycobacterium K. pneumoniae Aspergillus Angiostrongylus Fusobacterium Cryptococcus Toxoplasma gondii Neisseria meningitidis Haemophilus influenzae Cocci Taenia solium Yersinia pestis neurosarcoidosis Acanthoamoeba Fungal anti GFAP rubella MSSA HHV2 auto myelitis S. maltophilia Citrobacter koserii MS HHV3 HHV1 S. pneumoniae vasculitis amyloid Neisseria meningitidis meningitis astrovirus E. gallinarum hepatitis E scleroderma bunyavirus Streptococcus autoantibody multiple_classifications S. aureus powassan H. influenzae anti_NMDA WNV adenovirus Nocardia brain abscess anti GAD SLEV idiopathic intracranial hypertension myasthenia gravis VZV non_infectious_vascular anti GABA Borrelia burgdorferi enterovirus non infectious other other auto non infectious malignancy (n=2) S. viridans Behcet's A. baumannii anti MOG HLH Citrobacter koseri non infectious toxic metabolic lupus S. epidermidis PRES Treponema pallidum Nocardia farcinica non infectious structural Borrelia burgdorferi Non-infectious, Bacterial tuberculosis Non-infectious, autoimmune (atypical) Non-autoimmune Parasitic **Bacterial** Viral (typical)

FINAL REPORT mNGS for pathoge	en detection in CSF				
STUDY ID	n/a	Library Type		Analytical	
PATIENT NAME		Description		Clinical	UNKNOWN Case
MRN		mNGS ACCESSION #		NGS_368_5359	
INSTITUTION					
FAX (Lab Result)					
SENDER MRN					
SENDER SAMPLE ID					
SAMPLE TYPE	CSF				
SAMPLE ACCESSION #					
COD	9/30/21 12:15				
Run prepared by					
Date: D/M/YYYY		Supervisor Revi	iew	СС	
CLS comments		C	Date	10/15/21	

Organism Type	Taxonomic Name / Not Detected / Pending	Synonym	Interpretive Note
	Not Detected		
DNA VIRUSES			
	Not Detected	• Elderly male	presenting with acute
RNA VIRUSES		encephalopa	thy with lymphocytic
	Not Detected	pleocytosis ir	n CSF
BACTERIA			
		— • Microbiologi	cal workup negative
	Not Detected	• Differential D	Dx: parasitic infection (positive
FUNGI			
		— <i>Toxocara</i> Ab)	versus autoimmune disease
	Not Detected		
PARASITES			

Host Response Classifier Analysis

AINI	81%
Bacterial	8%
Fungal	1%
Parasitic	2%
Vir	7%
Consensus	AINI

CSF Host Response Classifier Algorithm



Results from the Binary AINI / Parasite Classifier



- Scores on the y-axis (high = more like AINI, low = more like Parasitic
- 4 of the 5 parasites have reasonable scores
- The 5th parasite indicates that it is possible that a non-represented species could have a higher score
- Overall, however, this binary classifier suggests that this is not a parasitic sample

Linear Discriminant Analysis Plot

(top 27 genes in AINI/parasitic binary classifier)



Tickborne Infections in the United States

- Anaplasmosis
- Babesiosis
- Bourbon virus disease
- Colorado tick fever
- Ehrlichiosis
- Heartland virus disease
- Powassan disease

Lyme disease

- Tickborne relapsing fever
- *Rickettsia parkeri* rickettsiosis
- Rocky Mountain spotted fever
- Borrelia miyamotoi infection
- Tularemia
- STARI
- 364D rickettsiosis

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<u>Web: https://chiulab.ucsf.edu</u>