



# **Clinical Metagenomic and Host Response RNA Sequencing for Diagnosis of Infection- Associated Chronic Illnesses**

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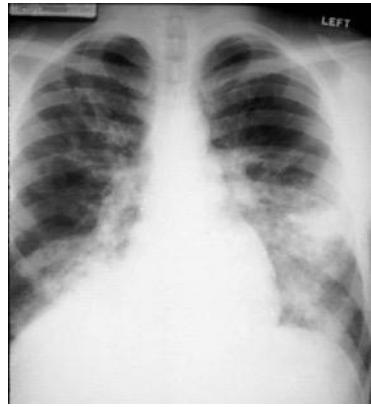
Chan-Zuckerberg Biohub Investigator

University of California, San Francisco

# Disclosures

- SURPI+ software, “Pathogen Detection using Next Generation Sequencing” (PCT/US/16/52912), filed by University of California, San Francisco
- Scientific Advisory Board for Mammoth Biosciences, BiomeSense, Poppy Health, and Delve Bio and Co-Founder of Delve Bio

# Major Diagnostic Challenges in Acute Infectious Diseases



## Pneumonia

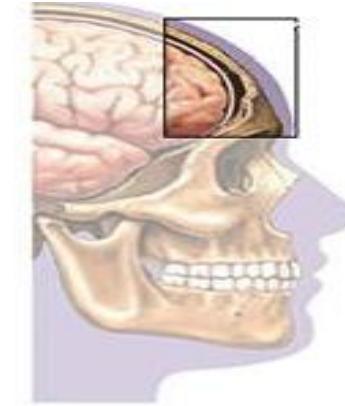
**15 – 62% unknown cause**

- Van Gageldonk-Lafeber, (2005) CID 41:490-497
- Louie, et al., (2005) CID 41:822-828
- Ewig, et al. (2002) Eur Respir J 20:1254-1262
- Jain, et al., (2015) NEJM 373(5)

## Meningitis / Encephalitis

**40 – 60% unknown cause**

- Glaser, et al., (2006) CID 43:1565-1577
- Vora, et al., (2010) Neurology 82:443-451



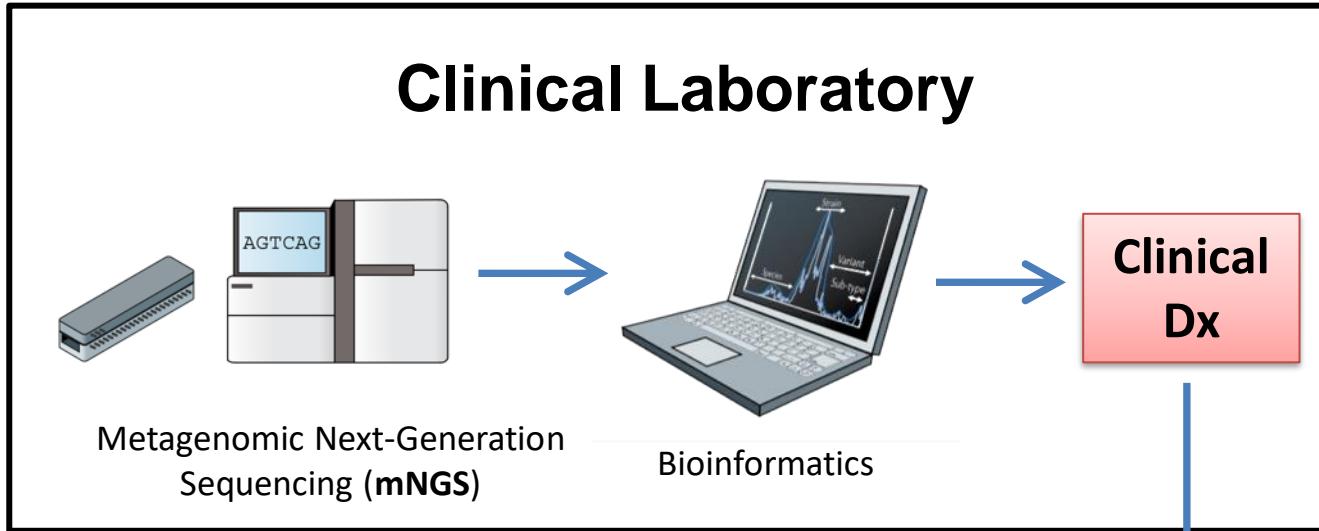
## Fever / Sepsis

**~20% unknown cause**

- Eber, et al. (2010) Arch Intern Med 170:347-353
- Vincent, et al. (2015) Critical Care Med 43(11).

***Failure to obtain a timely diagnosis leads to delayed / inappropriate therapy, increased mortality, and excess healthcare costs***

# Clinical Metagenomic Sequencing for Diagnosis of Acute Illness



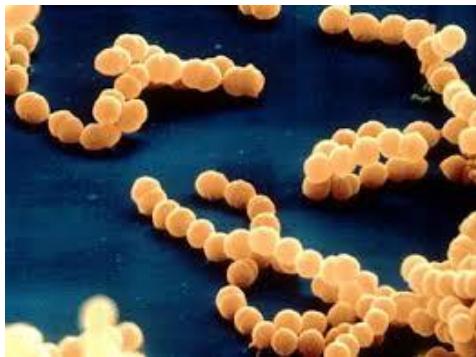
↓  
Lower healthcare costs  
↑ Improved patient outcomes

←  
Cost-effective and actionable information for early treatment

**Turnaround time: hours – days (versus days – weeks)**

# Nearly all Pathogens can be Identified by mNGS

**Bacteria**



**Viruses**



**Fungi**



**Parasites**



ORIGINAL ARTICLE

# Clinical Metagenomic Sequencing for Diagnosis of Meningitis and Encephalitis

M.R. Wilson, H.A. Sample, K.C. Zorn, S. Arevalo, G. Yu, J. Neuhaus, S. Federman, D. Stryke, B. Briggs, C. Langelier, A. Berger, V. Douglas, S.A. Josephson, F.C. Chow, B.D. Fulton, J.L. DeRisi, J.M. Gelfand, S.N. Naccache, J. Bender, J. Dien Bard, J. Murkey, M. Carlson, P.M. Vespa, T. Vijayan, P.R. Allyn, S. Campeau, R.M. Humphries, J.D. Klausner, C.D. Ganzon, F. Memar, N.A. Ocampo, L.L. Zimmermann, S.H. Cohen, C.R. Polage, R.L. DeBiasi, B. Haller, R. Dallas, G. Maron, R. Hayden, K. Messacar, S.R. Dominguez, S. Miller, and C.Y. Chiu

Article | Published: 09 November 2020

## Rapid pathogen detection by metagenomic next-generation 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 Ishpuniiani, 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

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Institution: UNIV OF CALIF-SF [Sign In](#) via User Name/Password



## Laboratory validation of a clinical metagenomic sequencing assay for pathogen detection in cerebrospinal fluid

Steve Miller<sup>1,2,10</sup>, Samia N. Naccache<sup>1,2,3,10</sup>, Erik Samayo<sup>1</sup>, Kevin Messacar<sup>4</sup>, Shaun Arevalo<sup>1,2</sup>, Scot Federman<sup>1,2</sup>, Doug Stryke<sup>1,2</sup>, Elizabeth Pham<sup>1</sup>, Becky Fung<sup>1</sup>, William J. Bolosky<sup>5</sup>, Danielle Ingebrigtsen<sup>1</sup>, Walter Lorizio<sup>1</sup>, Sandra M. Paff<sup>1</sup>, John A. Leake<sup>6</sup>, Rick Pesano<sup>6</sup>, Roberta DeBiasi<sup>7,8</sup>, Samuel Dominguez<sup>4</sup> and Charles Y. Chiu<sup>1,2,9</sup>

 Author Affiliations

<sup>1–10</sup> These authors contributed equally to this work.

• Corresponding author: [charles.chiu@ucsf.edu](mailto:charles.chiu@ucsf.edu)

# CLIA-Validated Clinical mNGS Assays at UCSF



Center for Next-Gen  
Precision Diagnostics

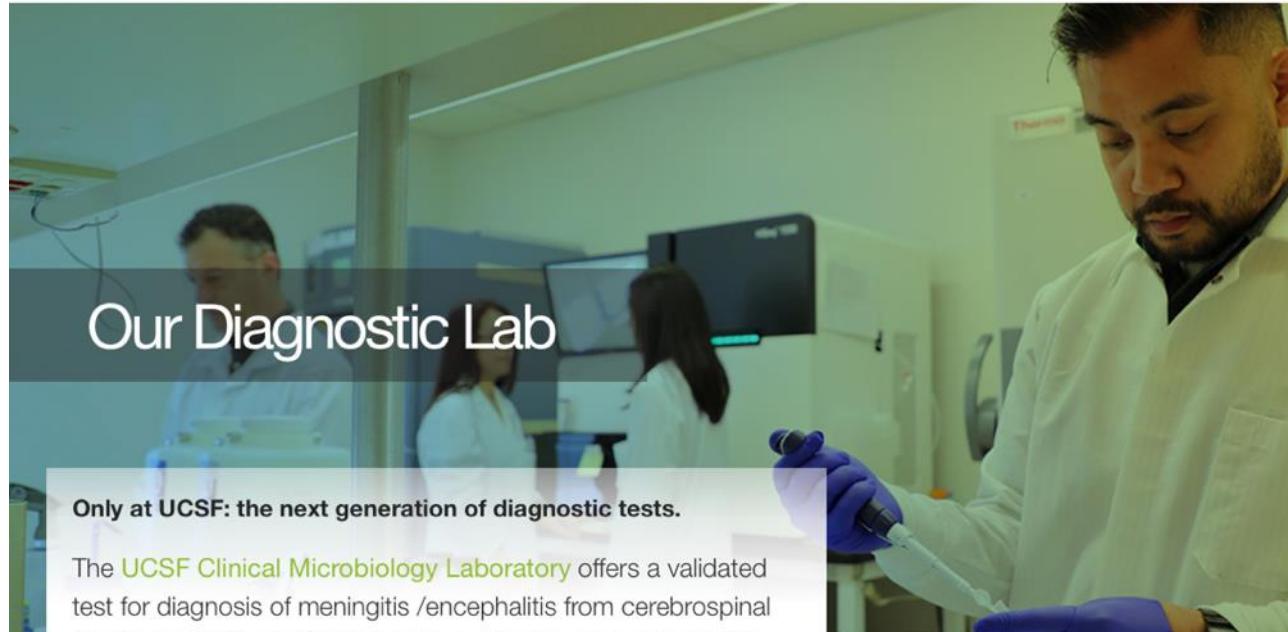
For Providers

For Patients

Technology

Our Vision

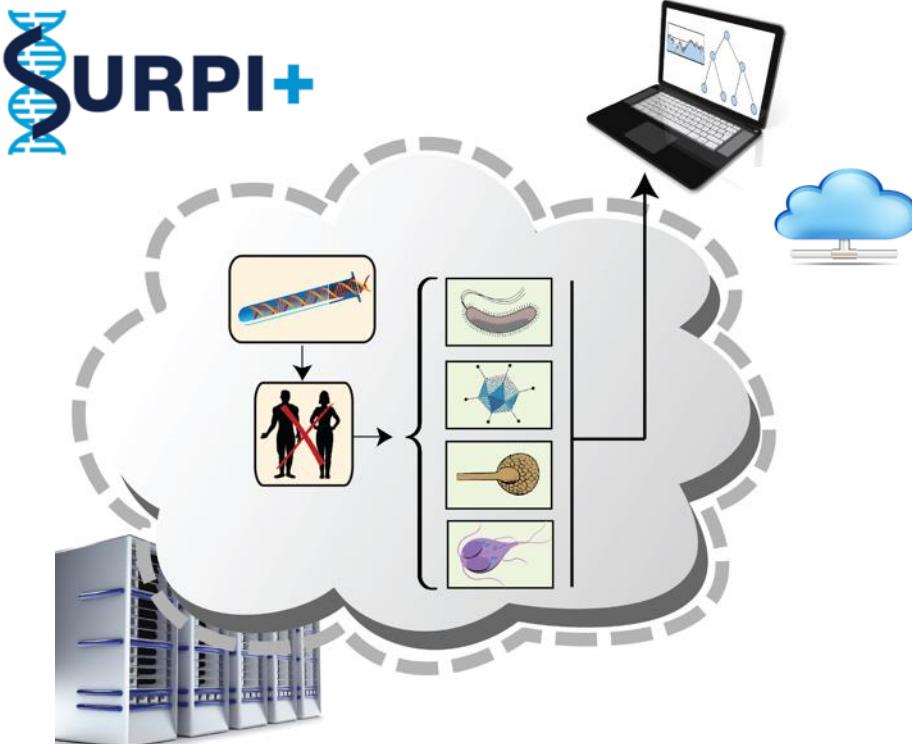
- CSF
- Plasma
- Body Fluids



<http://nextgendiagnostics.ucsf.edu>

# The SURPI Bioinformatics Pipeline

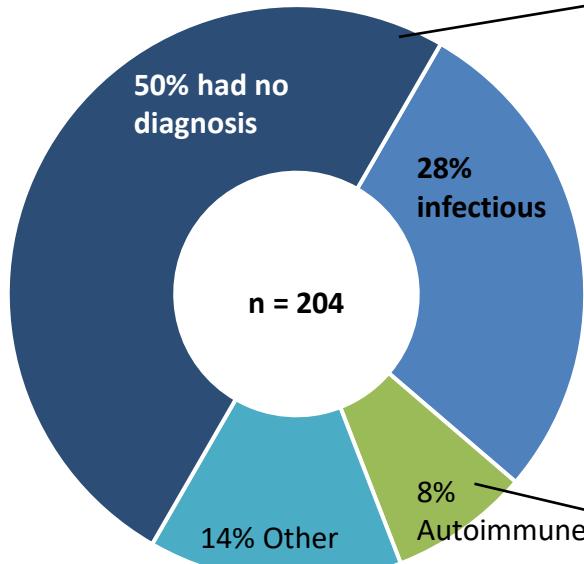
“Sequence-based ultra-rapid pathogen identification” (minutes – hours)



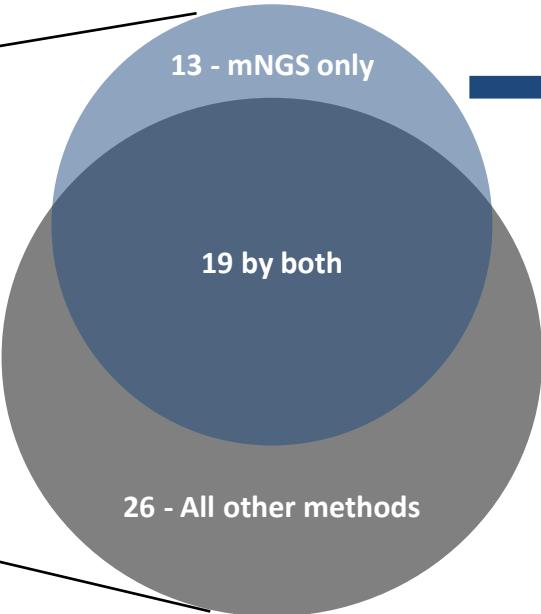
- ***Directly addresses computational analysis bottleneck***
- ***SURPI+ (clinical version) – automated analysis***

# Clinically Actionable Diagnosis of Neurological Infections by Metagenomic Next-Generation Sequencing (mNGS)

## Clinical Trial Summary



## Diagnoses (n=58)



## Clinical Utility

9 cases had direct clinical impact

- *Neisseria* sp. – changed antibiotics
- *Nocardia farcinica* – changed antibiotics
- *Candida tropicalis* – changed antibiotics, discontinued antifungals
- **Hepatitis E virus** – antiviral, stopped liver transplant
- *Enterobacter aerogenes* – changed antibiotics
- *Enterococcus faecalis* – changed antibiotics
- *Streptococcus mitis* – changed antibiotics
- *Streptococcus agalactiae* – changed antibiotics
- *Streptococcus agalactiae* – changed antibiotics

*Note: Conventional diagnostics include culture, PCR, serology (antibody), and antigen testing*

**Roughly 1/4 of all diagnoses were made using mNGS alone**

Wilson, et al., 2019, NEJM, 380:2327-2324

# Representative Set of mNGS Assay Positives (2016-2023)

|  |  |   |
|--|--|---|
| <i>Streptococcus agalactiae</i> (CSF)      | <i>Angiostrongylus cantonensis</i> (CSF)                 | Powassan virus (CSF)                                      |
| <u><i>Enterobacter aerogenes</i></u> (CSF) | rubella virus <sup>#</sup> (CSF)                         | human bocavirus 1 (plasma)                                |
| Human herpesvirus 1-8 (CSF, plasma)        | yellow fever virus <sup>#</sup> (CSF)                    | <i>Legionella anisa</i> (plasma)                          |
| <i>Cryptococcus neoformans</i> (CSF)       | Potosi virus** (CSF)                                     | <i>Candida</i> sp. (CSF and plasma)                       |
| enterovirus D68 (CSF)                      | astroviruses*** (CSF)                                    | <i>Gardnerella vaginalis</i> (plasma)                     |
| JC polyomavirus (CSF)                      | Colorado tick fever virus (CSF)                          | <i>Scedosporium</i> sp. (CSF and plasma)                  |
| SARS-CoV-2 (respiratory fluid)*            | <i>Balamuthia mandrillaris</i> (CSF)                     | <i>Coxiella burnetti</i> (plasma)                         |
| <i>Candida</i> sp. (CSF)                   | <i>Naegleria fowleri</i> (CSF)                           | <i>Fusarium</i> sp. (CSF and plasma)                      |
| <i>Aspergillus</i> sp. (CSF)               | <i>Acanthamoeba</i> sp. (CSF, plasma)                    | <i>parvovirus B19</i> (plasma)                            |
| <i>Scedosporium</i> sp. (CSF)              | <i>Chlamydia psitacci</i> (CSF)                          | <i>Leptospira santarosai</i> (CSF)                        |
| St. Louis encephalitis virus (CSF)         | <i>Brucella meletensis</i> (CSF)                         | <i>Mycobacterium</i> sp. (CSF, plasma, respiratory fluid) |
| hepatitis E virus (CSF)                    | <i>Mycoplasma pneumoniae</i> (plasma)                    | <i>Kingella kingae</i> (plasma)                           |
| <i>Neisseria meningitidis</i> (CSF)        | respiratory viruses (respiratory fluid) <sup>&amp;</sup> | BK polyomavirus (plasma)                                  |
| MW polyomavirus (CSF)                      | Cache Valley bunyavirus (CSF)                            | <i>Bartonella quintana</i> (plasma)                       |
| <i>Capnocytophaga canimorsus</i> (plasma)  | bufavirus (plasma)                                       | <i>Borrelia burgdorferi</i> (CSF)                         |
| <i>Trypanosoma cruzi</i> (CSF)             | <i>Tropheryma whipplei</i> (CSF)                         |   |

\*reads align to bat coronaviruses (using 2019 SURPI+ database)

\*\*arbovirus that has never been described before in human infection in a fatal immunocompromised patient

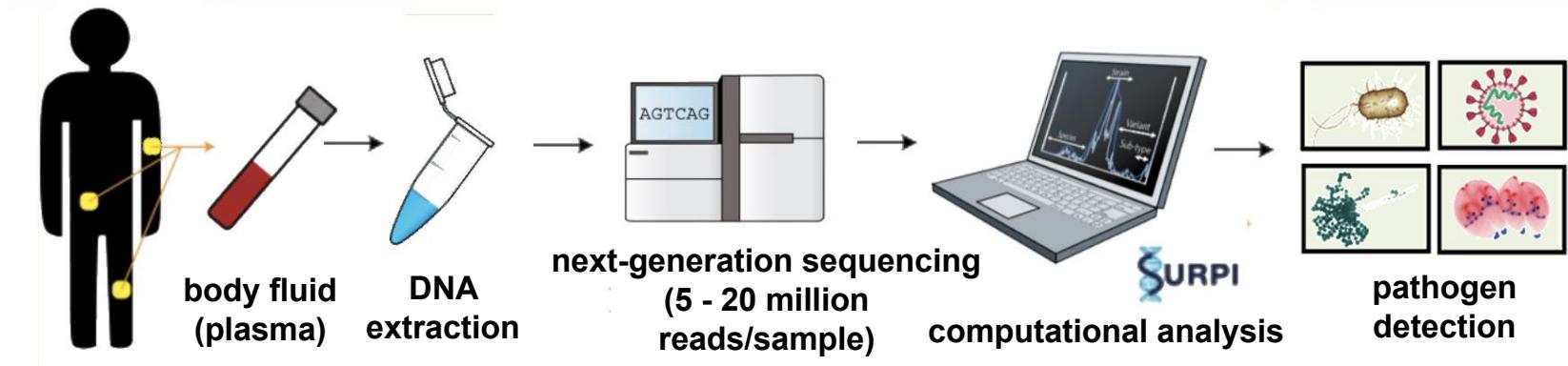
\*\*\*neuroinvasive species such as VA-1/HMO-C

&RSV, influenza A/B, parainfluenza viruses 1-4, seasonal coronaviruses, adenovirus

#vaccine-associated case or outbreak



# Metagenomic Sequencing of Body Fluids from Infected Patients



Article | Published: 09 November 2020

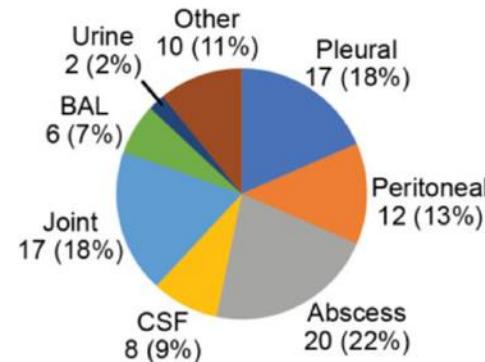
## Rapid pathogen detection by metagenomic next-generation sequencing of infected body fluids

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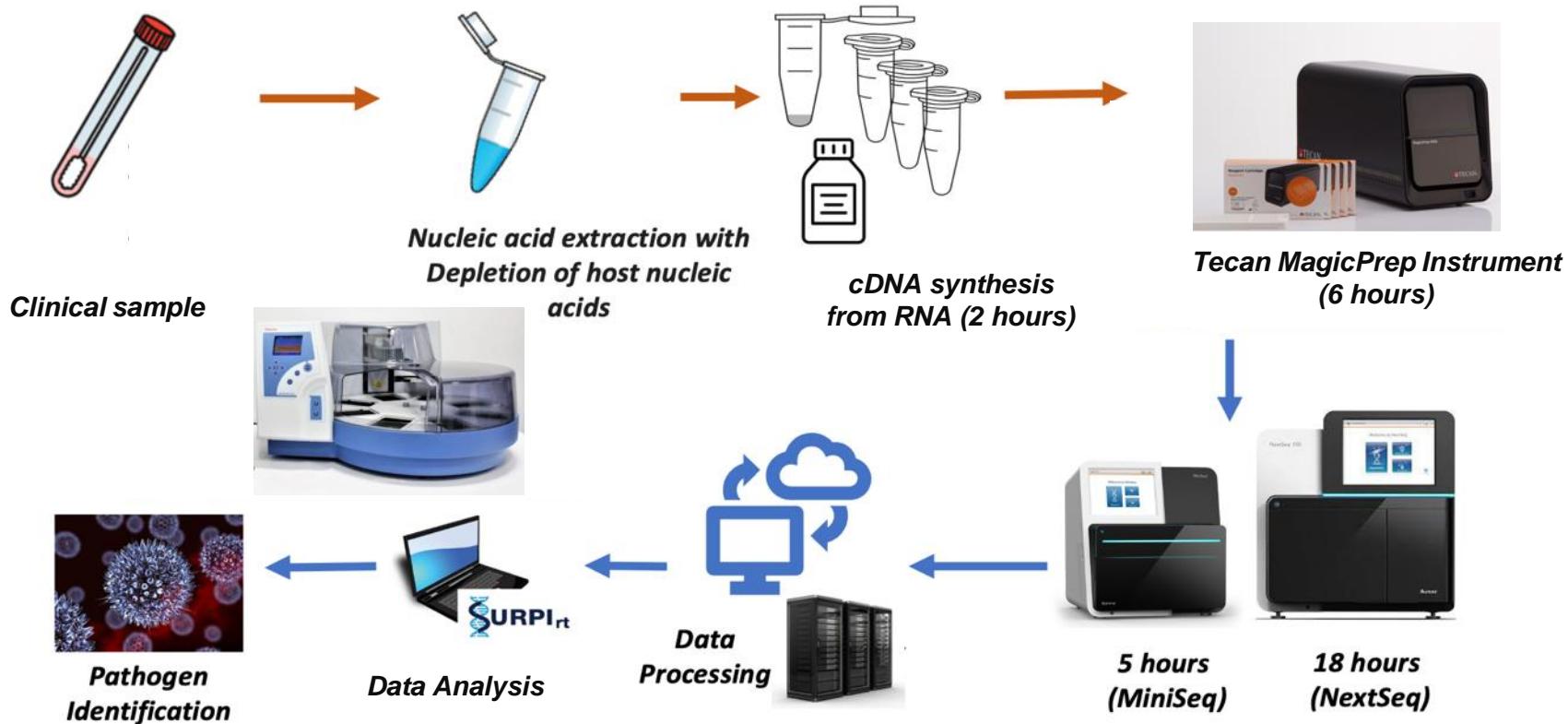
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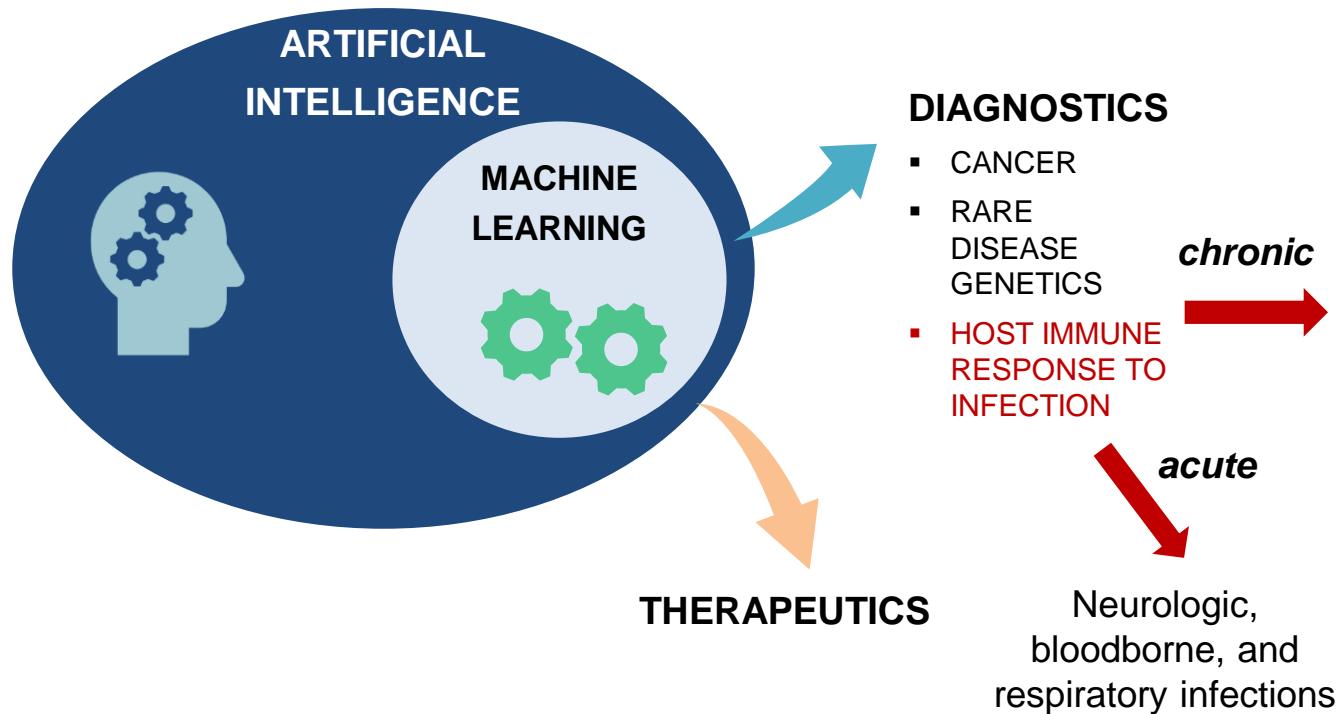


# Clinical Workflow for mNGS Based Pathogen Detection



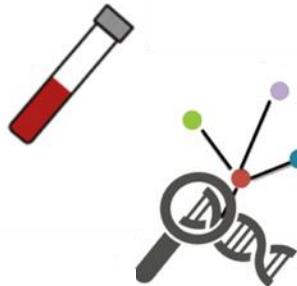
- **12 – 24 hours turnaround time → are same day results feasible?**
- **Goal for mNGS to be performed routinely by clinical and public health labs**

# Host Response Based Diagnostics for Acute and Chronic Illnesses



# Gene Expression (Transcriptome) Profiling by RNA-Seq

## Sample and Clinical Metadata Collection

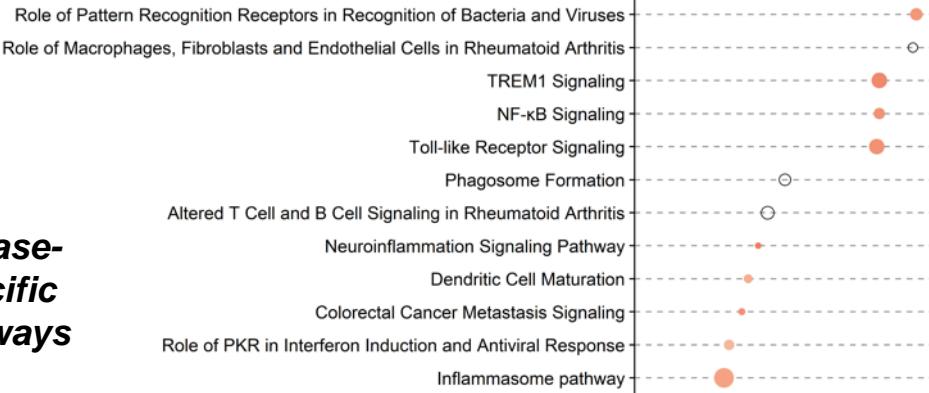
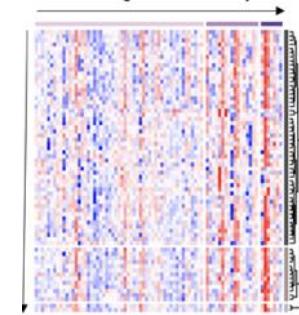


## Nucleic Acid Extraction and NGS Library Preparation

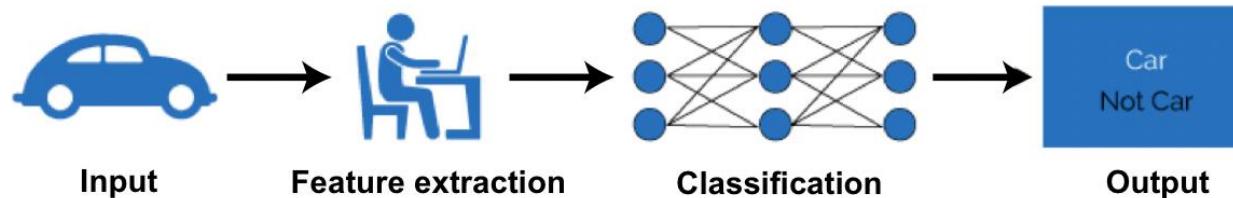


## Disease-Specific Pathways

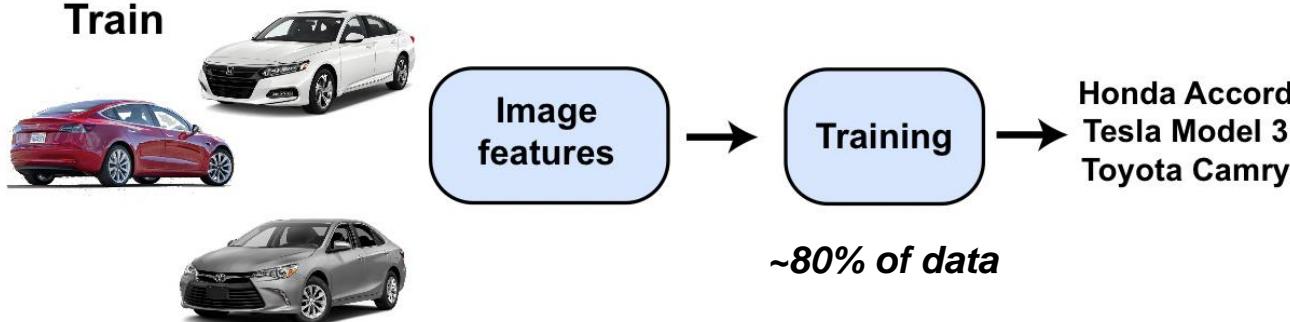
## DEG Analysis and Machine Learning-Based Modeling



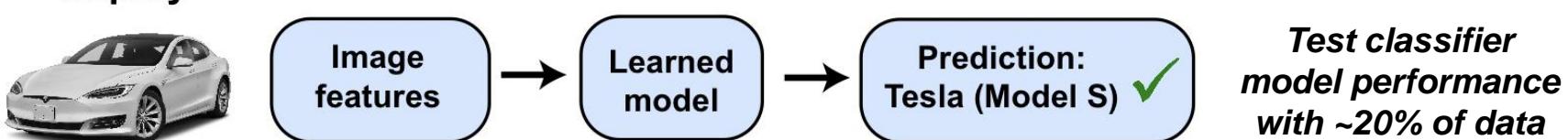
# Machine Learning Based Analysis Workflow



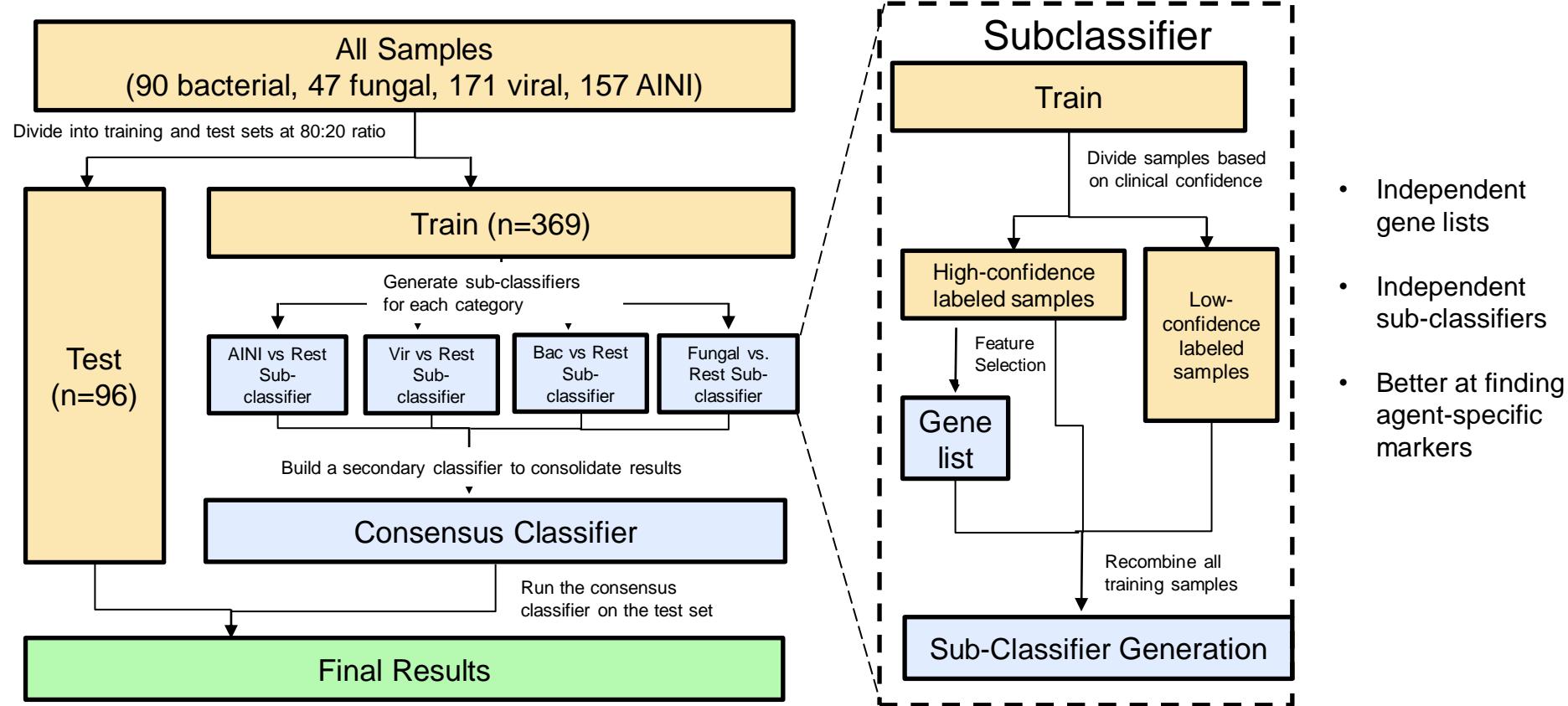
## Train



## Deploy



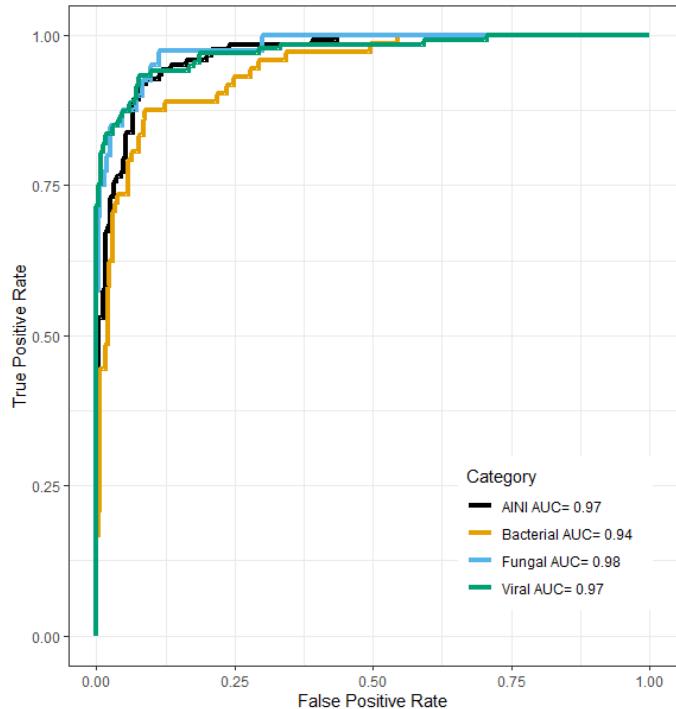
# Design of a CSF Host Response Classifier for Differential Diagnosis of Neurological Illness (Two-Stage Binary Classification Approach)



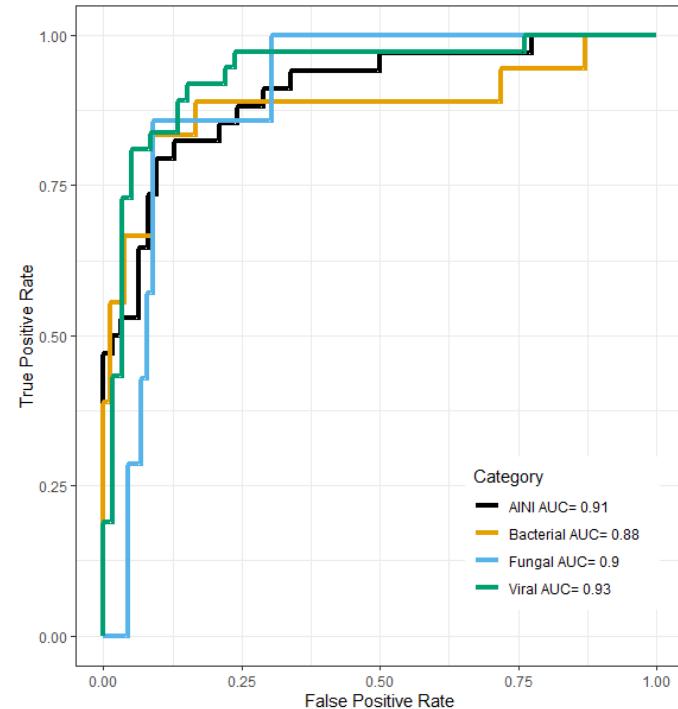
# Host Response Classifier Performance

## (Two-Stage Binary Classification Approach)

*Training Set*



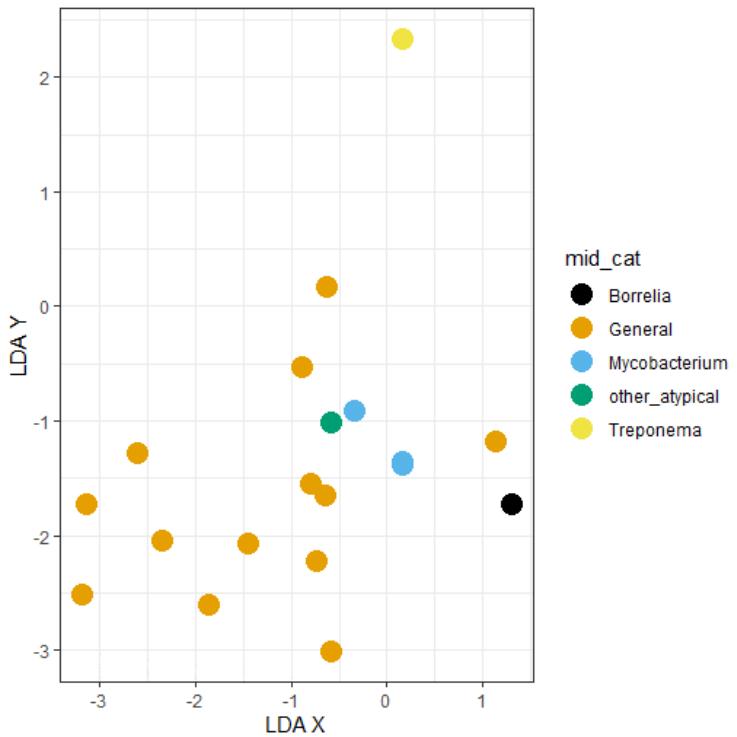
*Test Set*



**>90% accuracy for all 4 comparisons**

# Subcategory Classification

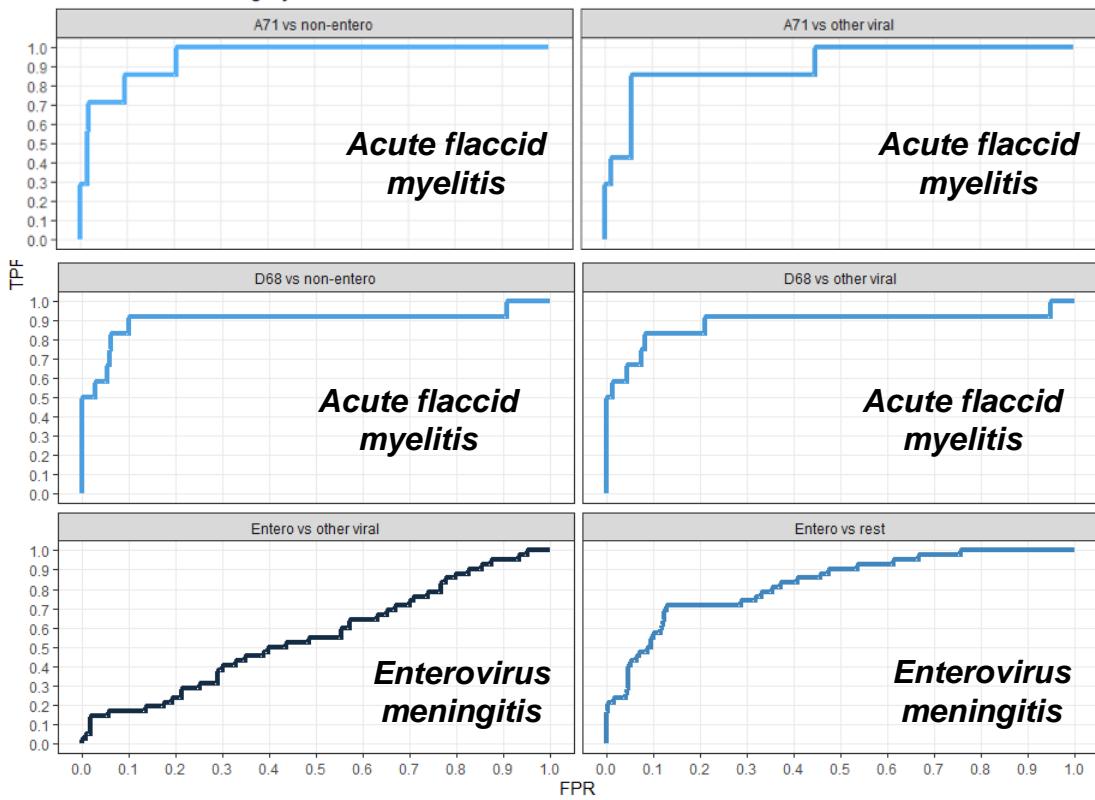
Bacterial Subcategory LDA



mid\_cat

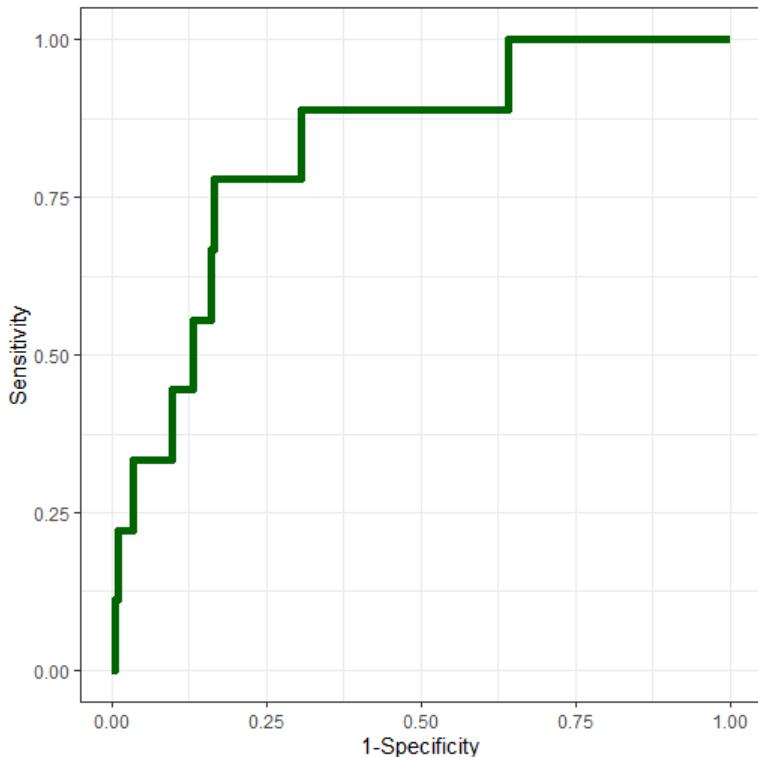
- Borrelia
- General
- Mycobacterium
- other\_atypical
- Treponema

Enterovirus Subcategory ROCs



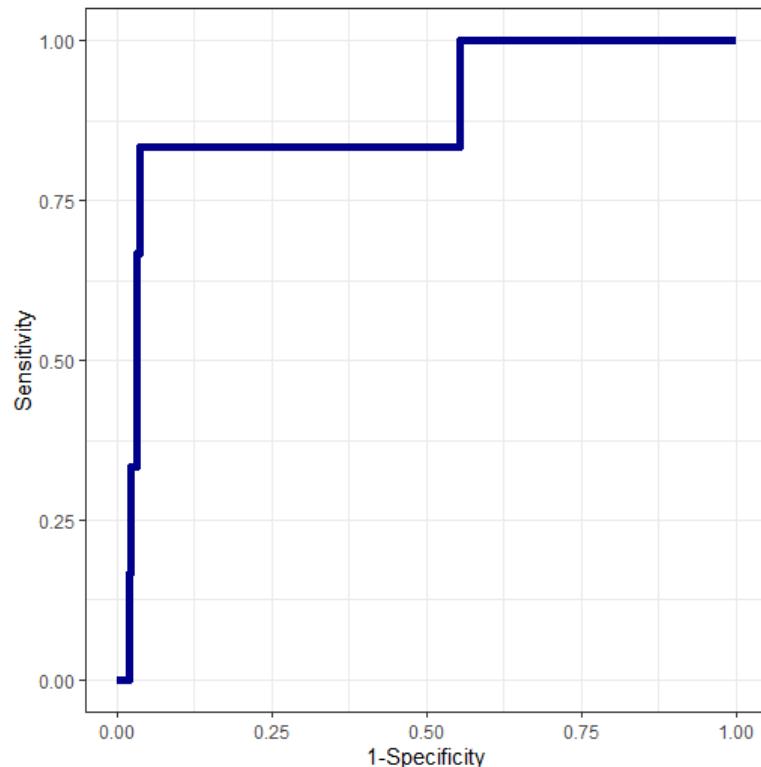
# Subcategory Classification

Parasitic LDA ROC



AUC = .83

Cocci or Histoplasma LDA ROC



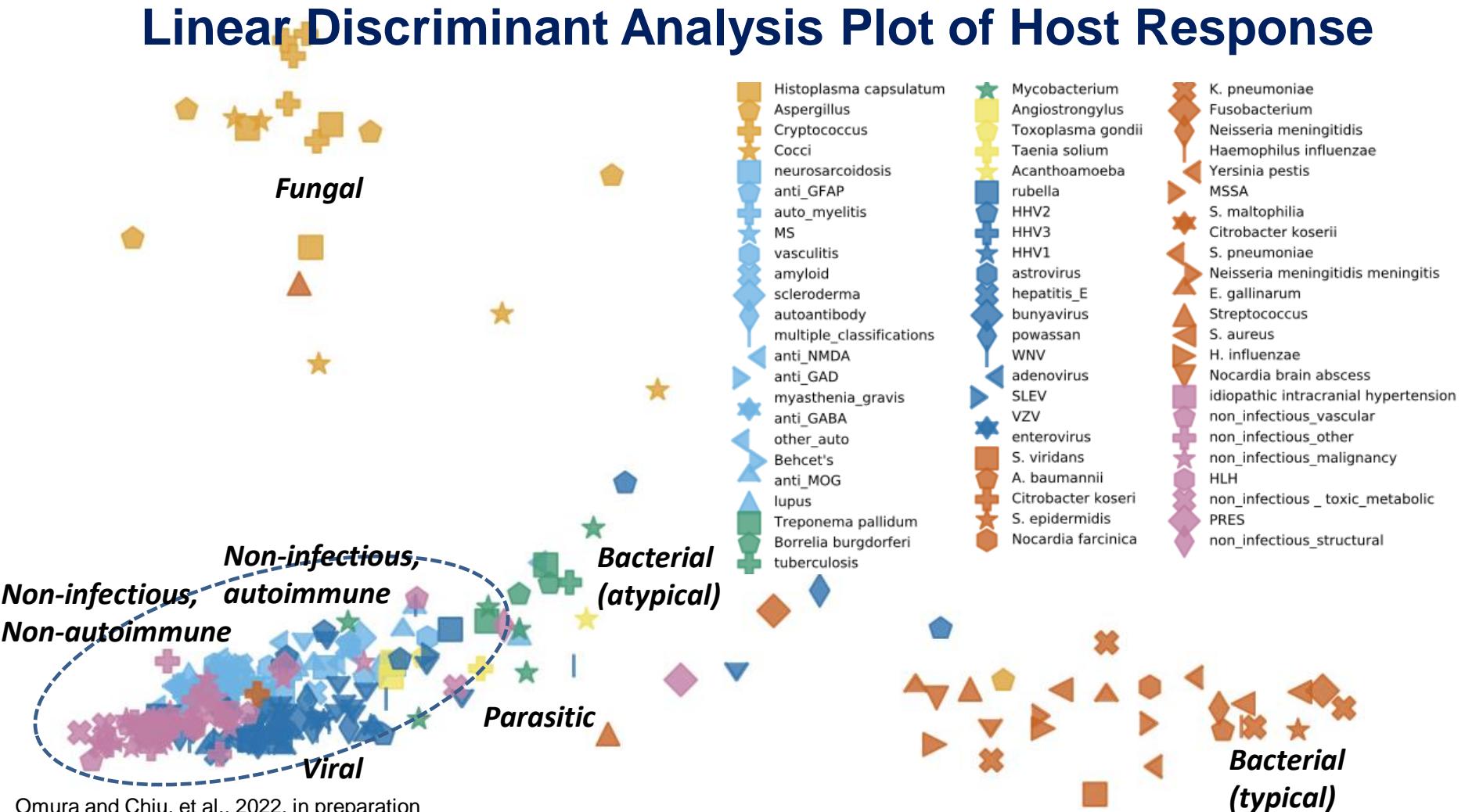
Omura, Wilson, Chiu, et al., 2023, in preparation

AUC = .88

# Examples of Host Response Classifier Calls

| Patient Dx                                     | mNGS result   | AINI   | Bacterial | Fungal | Parasitic | Viral  | Classifier Result |
|--|---|--------|-----------|--------|-----------|--------|-------------------|
| subthreshold <i>Mycobacterium tuberculosis</i> | negative  | 0.61%  | 64.07%    | 21.18% | 1.30%     | 12.84% | Bacterial         |
| GABA receptor-mediated encephalitis            | negative  | 64.21% | 14.26%    | 2.58%  | 3.08%     | 15.88% | AINI              |
| unknown, likely viral / autoimmune             | multiple bacterial taxa, including <i>P. acnes</i> , <i>Micrococcus luteus</i> , and <i>Corynebacterium</i> sp. | 35.20% | 11.80%    | 8.74%  | 6.93%     | 37.33% | Viral             |
| subthreshold <i>Aspergillus</i>                | 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             |

# Linear Discriminant Analysis Plot of Host Response



# CSF Subclassifier Analysis: Acute / Chronic Neurologic Syndromes

| Subcategory        | AUC      | Classification Strategy* |
|--------------------|----------|--------------------------|
| amyloid            | 0.811321 | SVM                      |
| cancer             | 0.717778 | SVM                      |
| lupus              | 0.754717 | SVM                      |
| multiple sclerosis | 0.896226 | LDA                      |
| paraneoplastic     | 0.796296 | SVM                      |
| structural         | 0.777778 | SVM                      |
| vascular           | 0.886792 | LDA                      |
| vasculitis         | 0.839623 | SVM                      |

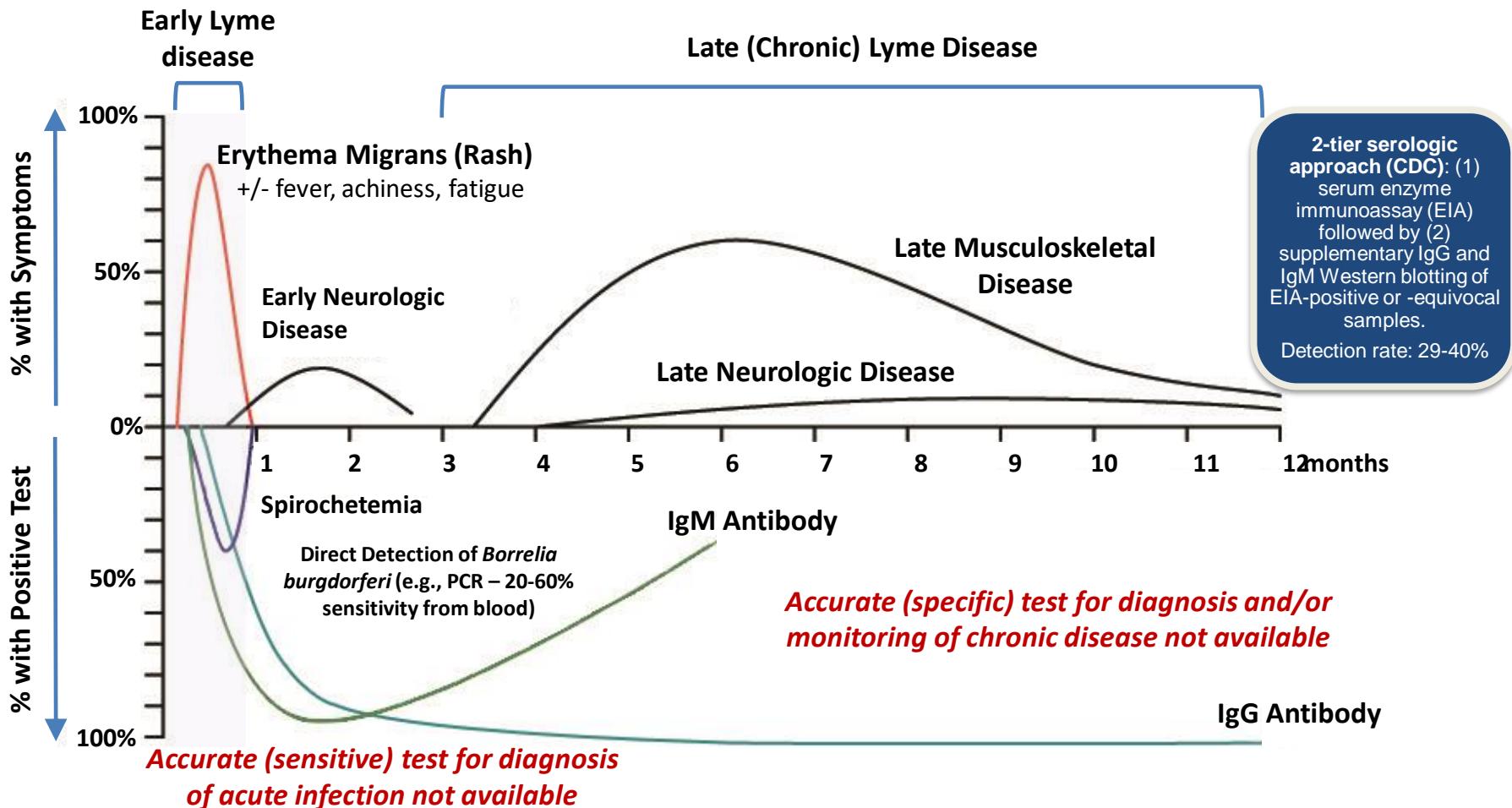
\*SVM, support vector machines; LDA, linear discriminant analysis

Omura, Wilson, Chiu, et al., 2023, in preparation

# CSF mNGS: Clinical Results Report

| Organism Type            | Taxonomic Name / Not Detected / Pending | Interpretive Note  |
|--------------------------|---|--|
| DNA VIRUSES              | Not Detected                            |  |
|                          |   |  |
|                          |   |  |
|                          |   |  |
| RNA VIRUSES              | Not Detected                            |  |
|                          |   |  |
|                          |   |  |
|                          |   |  |
| BACTERIA                 | <i>Borrelia burgdorferi</i>             | This bacterium is the etiologic agent of Lyme neuroborreliosis (Koedel, et al., Nature Reviews Neurology, 2015, 11:446-456).<br>Clinical correlation is recommended. |
|                          |   |  |
|                          |   |  |
|                          |   |  |
| FUNGI                    | Not Detected                            |  |
|                          |   |  |
|                          |   |  |
|                          |   |  |
| PARASITES                | Not Detected                            |  |
|                          |   |  |
|                          |   |  |
|                          |   |  |
| HOST RESPONSE CLASSIFIER | Autoimmune/Non-Infectious: 23%          | Host response: likely bacterial, possible autoimmune / non-infectious  |
|                          | Viral: 13%                              | Subclassifier: Possible neuroborreliosis   |
|                          | Bacterial: 57%                          |  |
|                          | Fungal: 7%                              |  |

# Challenges in Diagnosis of Lyme Disease



# What is the Diagnosis?

40 y/o patient from California, with chronic weakness, diffuse muscle pain, and lower-extremity numbness

- Lyme disease – Two-tiered antibody testing NEGATIVE
- *Borrelia burgdorferi* PCR, *Anaplasma* PCR, *Babesia* PCR NEGATIVE
- *Borrelia burgdorferi* IgG C6 peptide, p83-93 **POSITIVE**
- *Borrelia burgdorferi* IgM C6 peptide **POSITIVE**
- *Borrelia afzelli* IgG OspA **POSITIVE**
- *Borrelia bavariensis* VlsE1 **POSITIVE**
- *Babesia microti* WCS (whole-cell sonicate) IgG **POSITIVE**
- *Bartonella henselae* SucB IgG **POSITIVE**
- *Anaplasma phagocytophilum* Msp5/Msp2 (p44) IgG **POSITIVE**

# Classifier for Early Lyme Diagnosis from PBMCs

## PBMCs (31-gene panel)

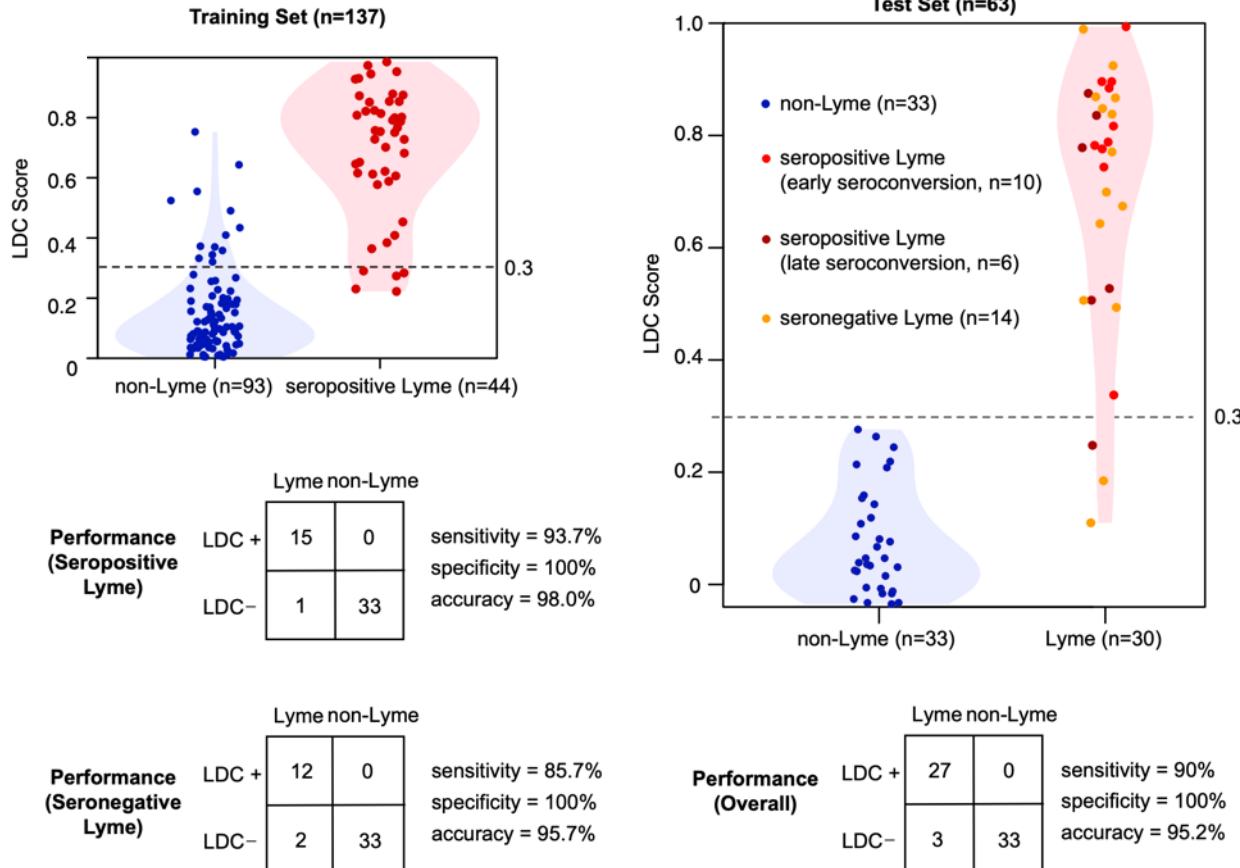
90% sensitivity

100% specificity

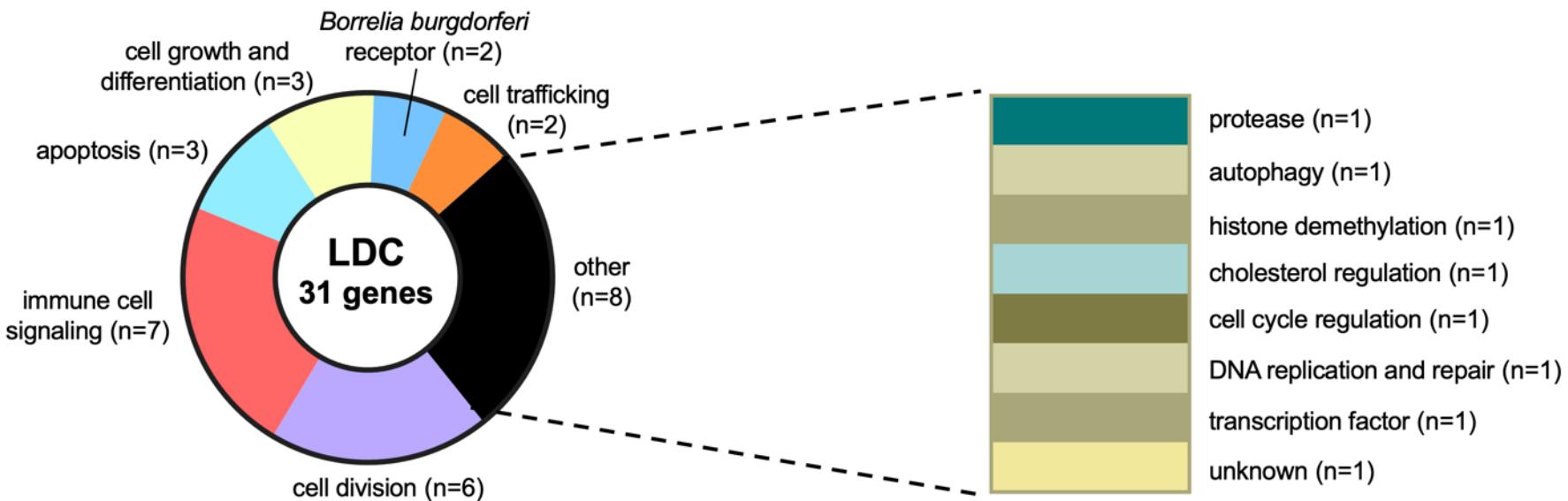
95% accuracy

### Limitations:

- no controls from other tickborne infections
- PBMC isolation is not routinely done in the clinical lab

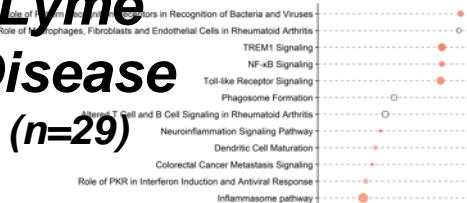


# Classifier for Early Lyme Diagnosis from PBMCs

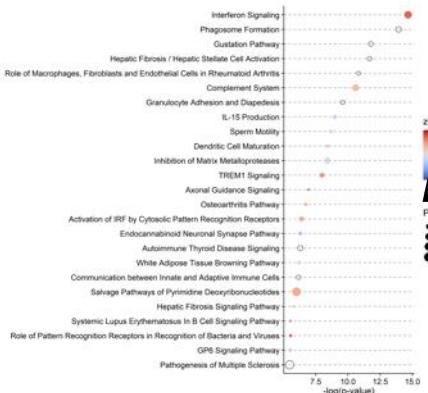


# RNA Profiles of Tickborne Infections from Blood

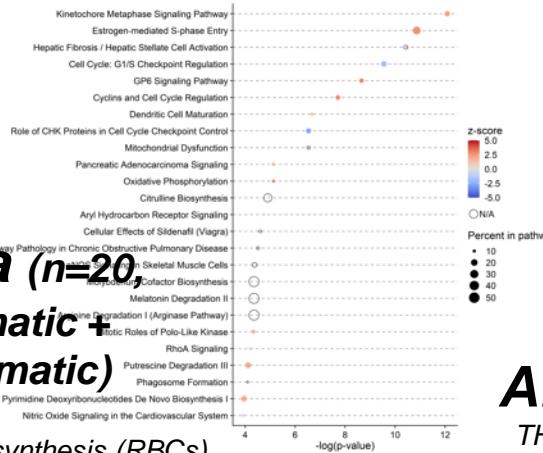
## Lyme Disease (n=29)



Inflammasome pathway  
TREM1 signaling  
TLR signaling  
NF- $\kappa$ B signaling  
Immune Cells in Rheumatoid Arthritis  
IL-6 signaling



## Babesia (n=20, symptomatic + asymptomatic)



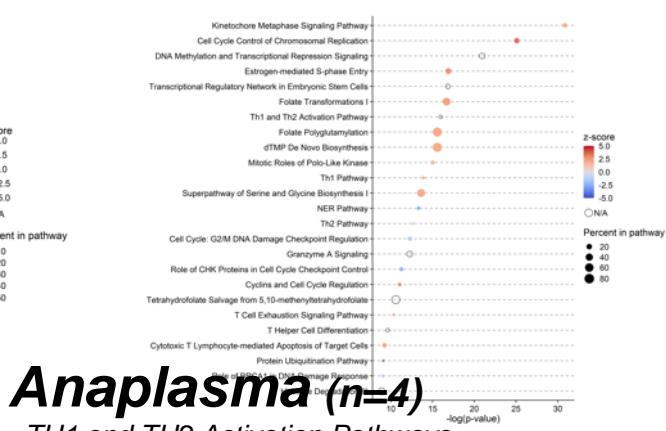
\*involvement in canine babesiosis

## Influenza (n=18)

Interferon Signaling  
Granulocyte Adhesion  
Autoimmune Signaling  
Pattern Recognition Receptors to Bacteria and Viruses

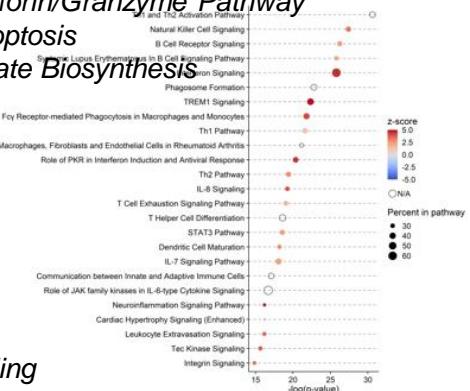
## Bacterial sepsis (n=5)

Phagocytosis  
TREM1 Signaling  
Interferon and NK Cell Signaling  
IL-6 and IL-7 Signaling

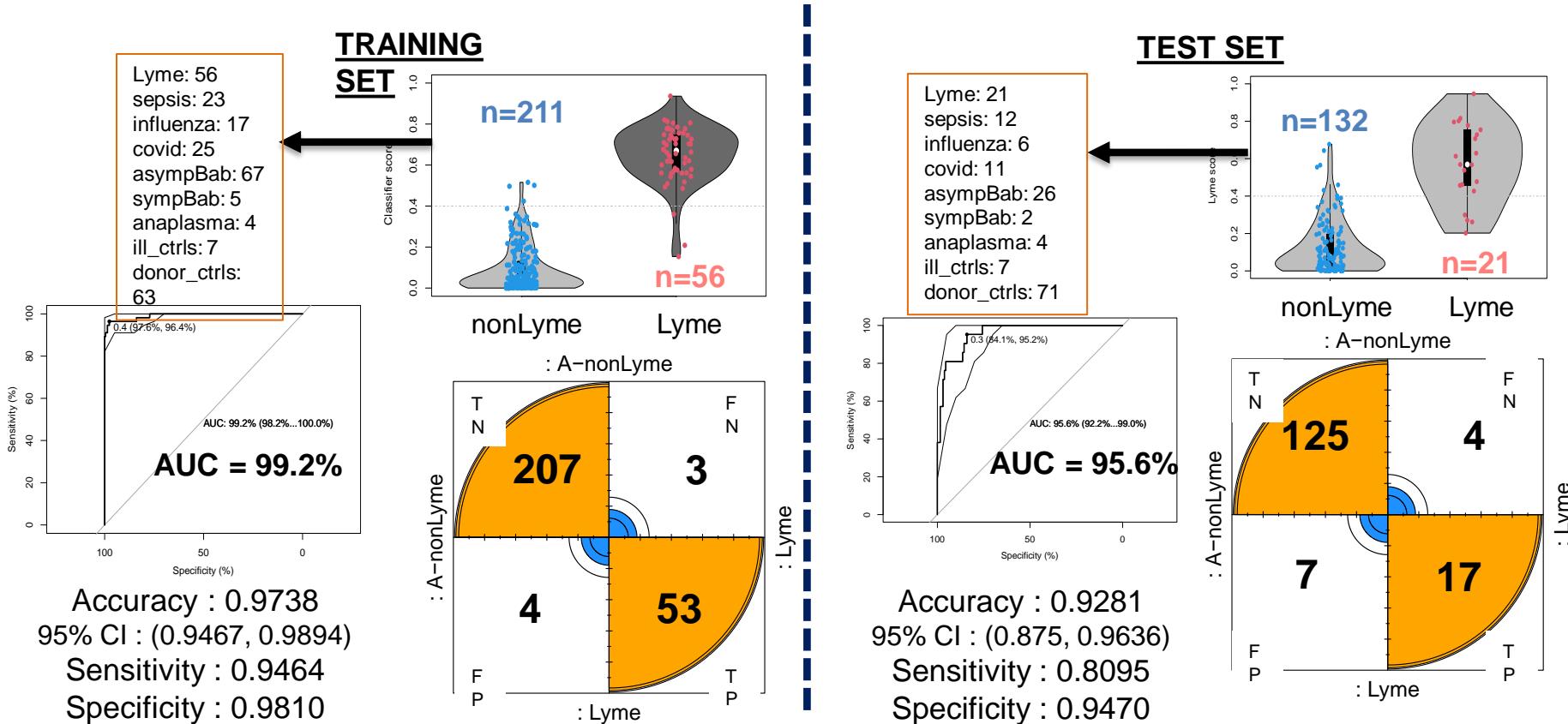


## Anaplasma (n=4)

TH1 and TH2 Activation Pathways  
Perforin/Granzyme Pathway  
Apoptosis  
Folate Biosynthesis



# Gene Expression Classifier for Early Lyme from Whole Blood



# Key Lyme-Associated Genes Identified using the SHAP (Shapley Additive Explanations) Algorithm

## ADGRE4P (Adhesion G Protein-Coupled Receptor E4)

- leukocyte adhesion and migration

## GPR15 (G-protein coupled receptor 15)

- chemokine receptor
- up-regulated in patients with persistent Lyme symptoms in PBMC (Bouquet, et al. 2016)
- differentially expressed in early Lyme patients in PBMC (Servellita, et al. 2022)

## DUSP5 (Dual specificity phosphatase 5)

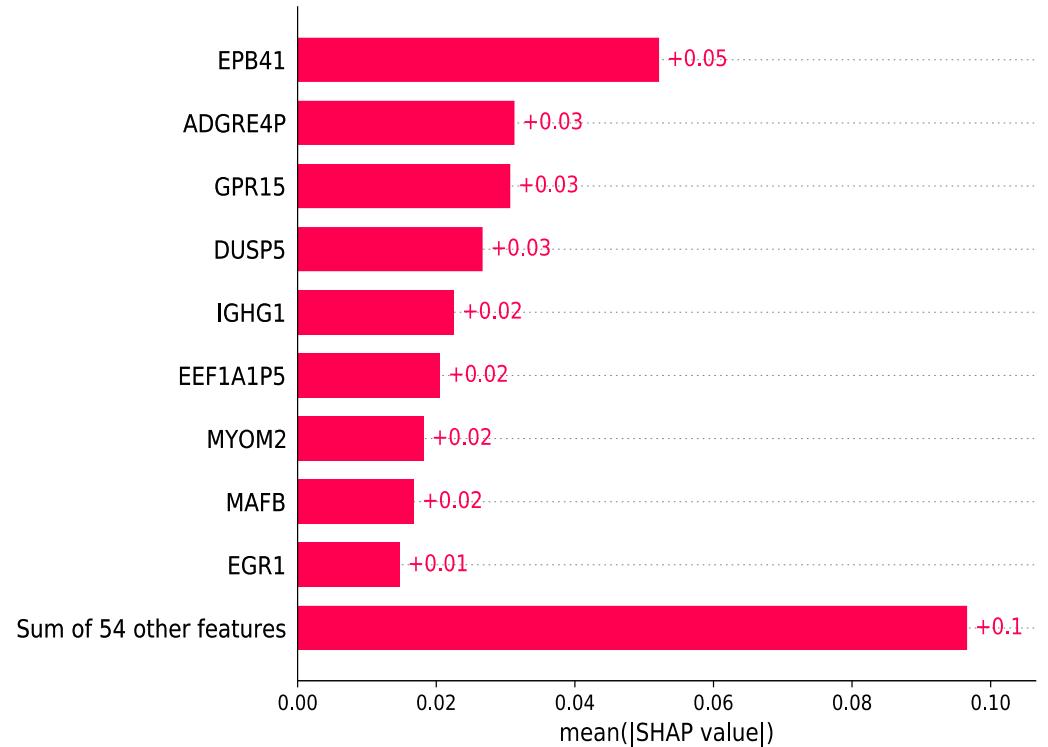
- cellular proliferation and differentiation
- up-regulated in PBMCs stimulated with live *Borrelia burgdorferi* (Salazar, et al. 2009)

## IGHG1 (Immunoglobulin heavy constant gamma 1)

- activation of immune response; defense response to other organism; and phagocytosis
- up-regulated after *B. burgdorferi* stimulation (Scholl, et al. 2016)

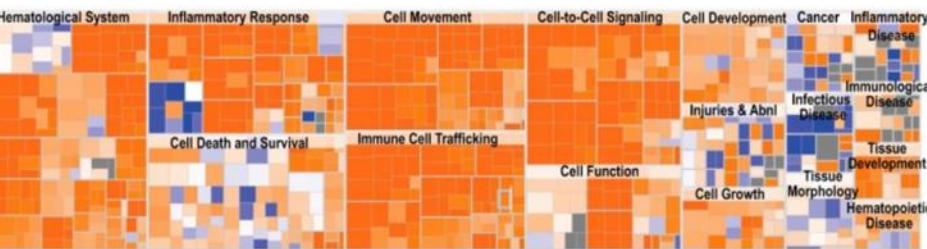
## EGR1 (Early growth response 1)

- one of the top genes with greatest fold changes in LD subjects relative to healthy donors in PBMC (Petzke, et al. 2020)
- down-regulated in PBMC stimulated with *B. burgdorferi* (Krupna-Gaylord, et al. 2014)

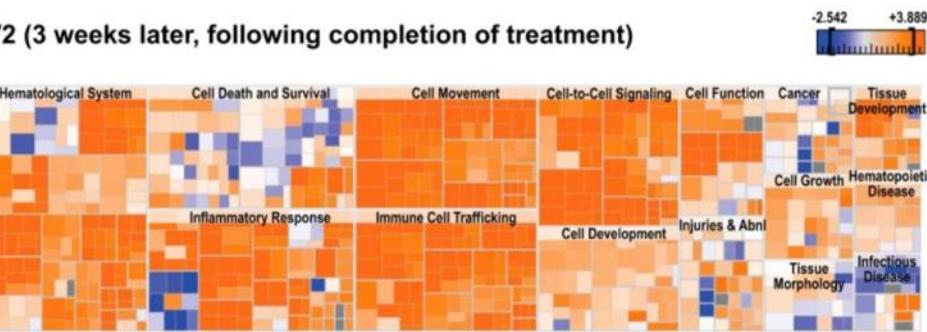


# Persistent Gene Expression Signature in Lyme Disease

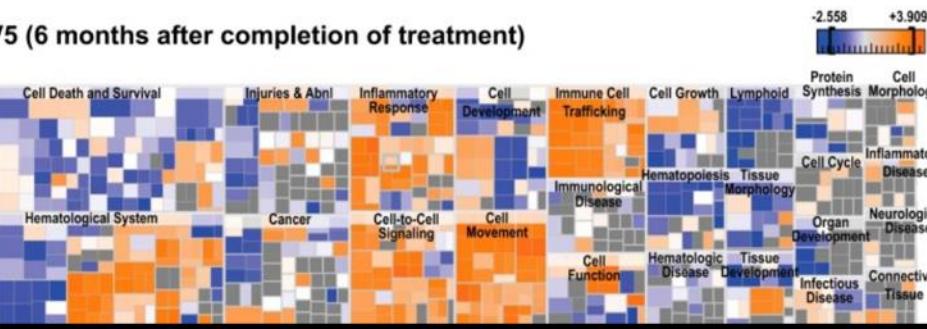
V1 (acute Lyme disease diagnosis, pre-treatment)



V2 (3 weeks later, following completion of treatment)

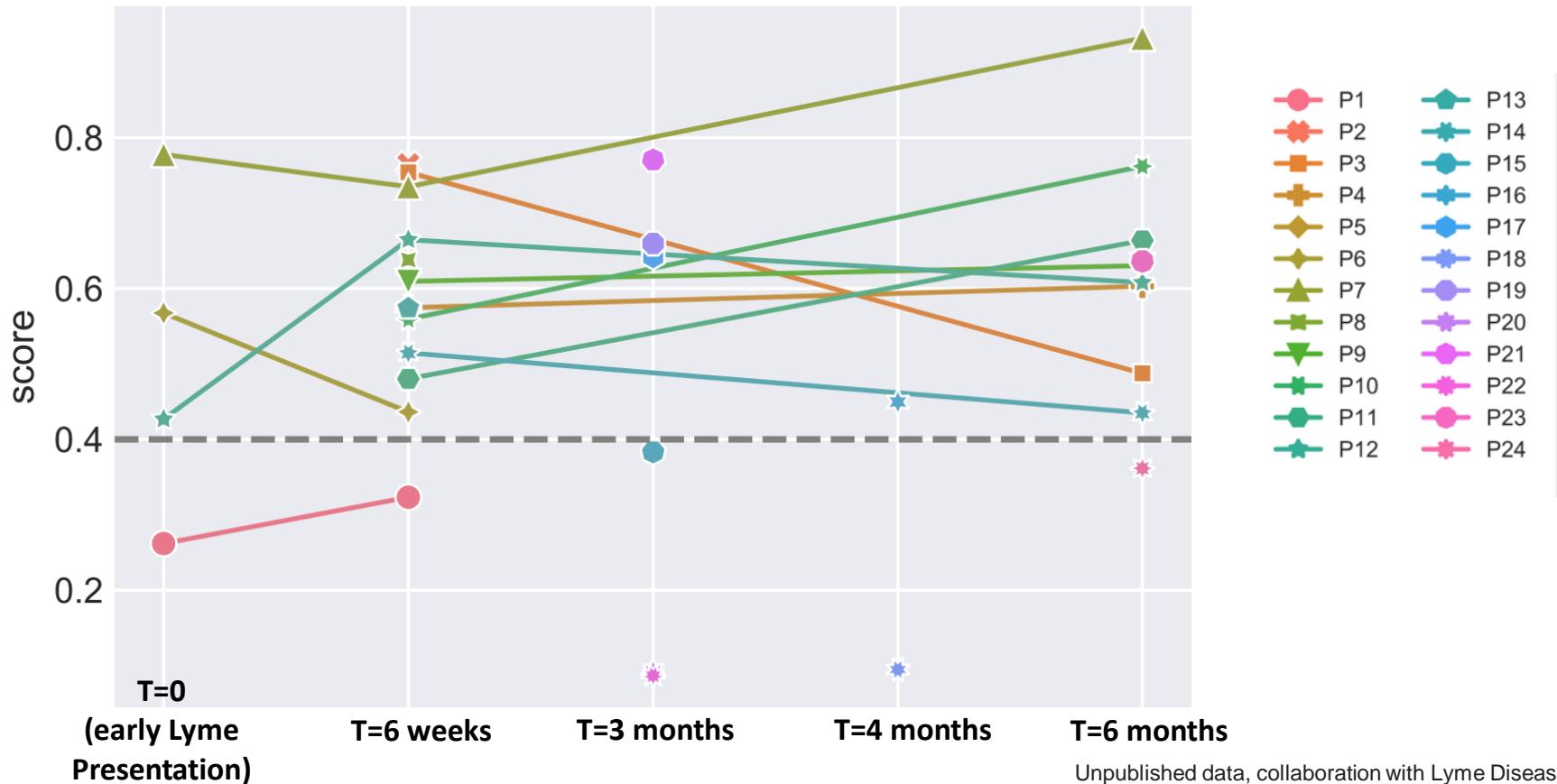


V5 (6 months after completion of treatment)



# Longitudinal Host Response Analyses

(n=24 patients with confirmed Lyme)



# CSF Subclassifier Analysis: Lyme Disease (Neuroborreliosis)

| vs other bacterial inf | MNC_5331  | MNC_6421 | MNC_4148  | MNC_3872  |                                 |   |
|------------------------|-----------|----------|-----------|-----------|---------------------------------|---|
| CLCF1                  | 2.784069  | 4.236764 | 3.20767   | 3.626301  | IL-6 family cytokine            | * |
| ADCK2                  | 1.808971  | 2.54256  | 3.470445  | 2.424954  | unknown function                |   |
| SLC39A13               | 1.717214  | 1.749701 | 3.280119  | 2.311277  | zinc transporter                |   |
| TMEM243                | 2.180132  | 3.727614 | 3.329168  | -0.361985 | transmembrane protein           |   |
| S1PR2                  | 1.661798  | 1.690055 | 2.575797  | 2.665008  | mast cell receptor              | * |
| ST6GALNAC4             | 1.533716  | 1.963451 | 2.217012  | 2.496924  | sialic acid transfer            | * |
| KIF26A                 | 1.462193  | 2.267583 | 2.073608  | 2.00224   | kinesin                         | * |
| LILRA4                 | -0.445988 | 2.774495 | 3.027446  | 2.339625  | plasmacytoid dendritic cell sig | * |
| SLC25A16               | 1.843911  | 1.878132 | 1.459621  | 2.469678  | solute carrier transporter      |   |
| KCNN4                  | 2.206551  | 2.244962 | -0.352212 | 3.417366  | potassium channel               | * |
| RELB                   | 1.226078  | 2.097651 | 2.113863  | 1.731392  | NFkB pathway                    | * |
| IL15RA                 | 1.260931  | 2.133217 | 1.833491  | 1.766658  | interleukin receptor            | * |
| WWOX                   | 1.296417  | 2.271688 | 1.191076  | 2.173951  | spinocerebellar ataxia          |   |
| RELT                   | 1.279794  | 1.886893 | 1.688061  | 1.789566  | NFkB pathway                    | * |

# Chronic Fatigue Syndrome and RNA Gene Profiling

Number of differentially expressed genes in ME/CFS patients compared to controls.

|   | Timepoint | Total | Up-Regulated | Down-Regulated |
|---|-----------|-------|--------------|----------------|
| ME/CFS vs Controls  | Day 1     | 0     | 0            | 0              |
|   | Day 2     | 0     | 0            | 0              |
|   | Day 3     | 0     | 0            | 0              |
|   | Day 7     | 0     | 0            | 1              |
|   | All days  | 6     | 4            | 2              |
|   |           |       |              |                |
|   |           |       |              |                |
| Low $\dot{V}O_2$ ME/CFS subset vs Regular repeat exercise   | Day 1     | 1     | 1            | 0              |
|   | Day 2     | 0     | 0            | 0              |
|   | Day 3     | 2     | 2            | 0              |
|   | Day 7     | 3     | 3            | 0              |
|   | All days  | 0     | 0            | 0              |
|   |           |       |              |                |
|   |           |       |              |                |
| Test-retest effect ME/CFS subset vs Regular repeat exercise | Day 1     | 0     | 0            | 0              |
|   | Day 2     | 2     | 1            | 1              |
|   | Day 3     | 3     | 3            | 0              |
|   | Day 7     | 4     | 4            | 0              |
|   | All days  | 0     | 0            | 0              |
|   |           |       |              |                |
|   |           |       |              |                |
| Day 1 vs Day 2  | Disease   | Total | Up-Regulated | Down-Regulated |
|   | CFS       | 0     | 0            | 0              |
|   | HC        | 0     | 0            | 0              |

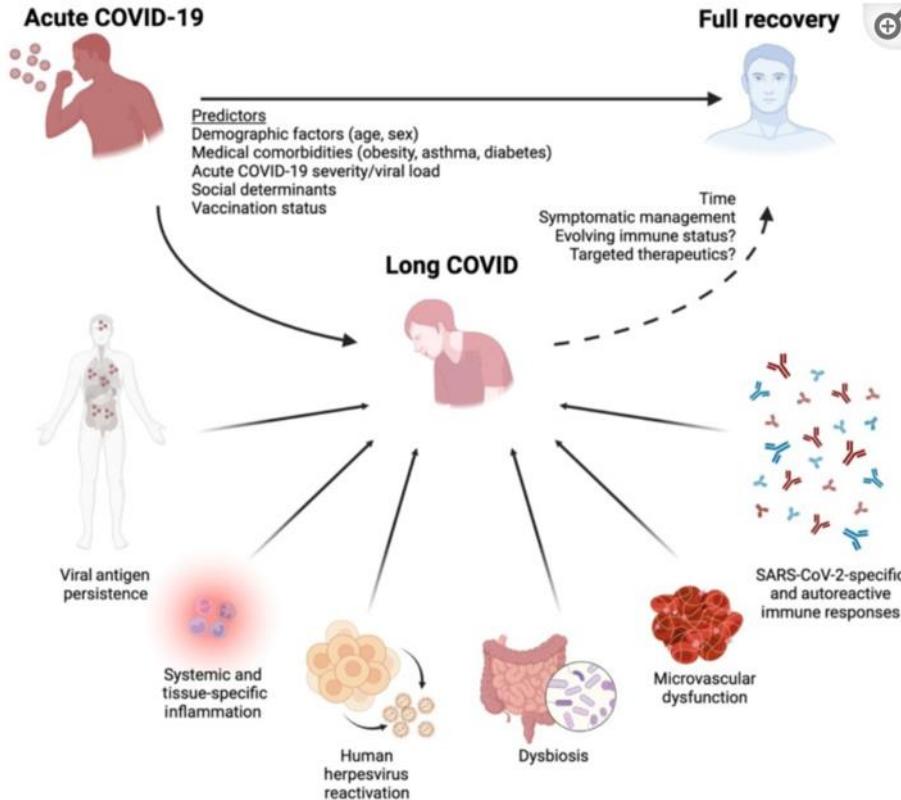
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List of differentially expressed genes in ME/CFS patients compared to controls.

| Comparison  | Gene ID      | Gene name   | Fold change | FDR      | Gene count (avg.) |
|---|--------------|---|-------------|----------|-------------------|
| ME/CFS vs controls; all days                      | HOXA9        | Homeobox A9   | 2.57        | 0.08     | 0.37              |
|   | LOC101928767 | Uncharacterized   | 2.03        | 0.08     | 1.92              |
|   | NRON         | Noncoding Repressor Of NFAT                                   | 1.53        | 0.08     | 0.36              |
|   | RPL23A       | Ribosomal Protein L23a  | -1.77       | 0.06     | 39.63             |
|   | RPS12        | Ribosomal Protein S12   | -1.56       | 0.02     | 646.28            |
|   | SNORA27      | Small Nucleolar RNA, H/ACA Box 27                             | 6.35        | 0.06     | 50.88             |
| ME/CFS vs controls; Day 7                         | LINC01158    | Long Intergenic Non-Protein Coding RNA 1158                   | 1054        | 0.10     | 0.11              |
| Lower $\dot{V}O_2$ vs Normal $\dot{V}O_2$ ; Day 1 | LOC105372441 | Uncharacterized   | 5745        | 3.72E-04 | 0.12              |
| Lower $\dot{V}O_2$ vs Normal $\dot{V}O_2$ ; Day 2 | LOC100133050 | Glucuronidase Beta Pseudogene                                 | 6.42        | 1.19E-03 | 0.01              |
|   | PMS2P2       | PMS1 Homolog 2, Mismatch Repair System Component Pseudogene 2 | 813         | 0.05     | 0.01              |
| Lower $\dot{V}O_2$ vs Normal $\dot{V}O_2$ ; Day 7 | PRR21        | Proline Rich Protein 21                                       | 2072        | 1.98E-03 | 0.04              |
|   | TMEM262      | Transmembrane Protein 262                                     | 11.07       | 1.98E-03 | 0.16              |
|   | USP50        | Ubiquitin Specific Peptidase 50                               | 1979        | 6.86E-02 | 0.04              |

Only 6 DEGs between CFS patients and controls  
*(application pending for samples from the UK National ME Biobank)*

# Long COVID



## RNA Host Response Profiling of Whole Blood from Long COVID Patients

(collaboration with Drs. Michael Peluso and Steven Deeks)

# Take-Home Messages

- Metagenomic next-generation sequencing (mNGS) is promising for broad-based, agnostic diagnosis of infections
- RNA mNGS data can be leveraged to simultaneously interrogate the patient's host response
- Host response profiling using RNA gene expression ("transcriptomics") can enable identification of biomarkers that can lead to tests that will not only diagnose diseases but to monitor the chronic disease course longitudinally
- The signal from cell-free RNA (dead or dying cells) in addition to cell-associated RNA (immune response cells) should be considered when developing diagnostic assays for infection-associated chronic illnesses
- The development of host response assays needs close coordination with regulatory bodies (CLIA, CLSI, FDA, etc.) regarding the development of reference materials and requirements for clinical validation

# Acknowledgements

## UCSF Chiu Lab and VDDC

Scot Federman, BA  
Asmeeta Achari, BS  
Andrea Granados, PhD  
Shaun Arevalo, CLS  
Candace Wang, BS  
Jerome Bouquet, PhD  
Guixia Yu, BS  
Dianna Ng, MD  
Wayne Deng, PhD  
Dustin Glasner, PhD  
Tony Li, BS  
Yale Santos, BS  
Venice Servellita, BS/CLS  
Benjamin Briggs, MD  
Guixia Yu, BS  
Wei Gu, MD/PhD  
Amelia Gliwa, BS  
Jenny Nguyen, BS  
Alicia Sotomayor-Gonzalez, PhD  
Charles Omura, BS/MS



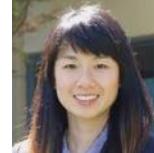
*Venice  
Servellita*



*Charles Omura*



*Alicia Sotomayor-  
Gonzalez*



*Dianna Ng*



*Candace  
Wang*



*Dustin  
Glasner*



## UCSF Clinical Microbiology Lab

Danielle Ingebrigsten, CLS  
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## UCSF

Michael Wilson, MD  
Joseph DeRisi, PhD

## Johns Hopkins University

John Aucott, MD  
Mark Soloski, MD

## American Red Cross

Laura Tonetti, PhD  
Sue Stramer, PhD

## Lyme Disease Biobank

Liz Horn, PhD

## Columbia University

Brian Fallon, MD

## Harvard / BCH

Lise Nigrovic, MD

## Funding

- Steven and Alexandra Cohen Foundation
- Bay Area Lyme Disease Foundation
- Marc Benioff Foundation
- NIH R33 AI120977 and R01 HL105701-01
- US Centers for Disease Control and Prevention
- DoD Tickborne Pathogen Research Award
- Mammoth Biosciences, Inc.
- Abbott Pathogen Discovery Award
- California Initiative to Advance Precision Medicine
- Charles and Helen Schwab Foundation
- George and Judy Marcus Innovation Fund
- Chan-Zuckerberg Biohub
- Delve Bio