

Considering useful
approaches when navigating
uncharted territories



Outline

- 1- Framing- Navigation of uncharted areas
- 2- Emerging lessons from wearables enabling return of agency
- 3- Emerging lessons from -omics driving therapies
- 4- How will navigation of uncharted areas in the future relate to now
- 5- Opportunities for SciLifeLab



Outline

1- Framing- Navigation of uncharted areas





Ask -Perplexity

Are there different approaches to navigating different paths in science?

Answer

There are indeed different approaches to navigating different paths in science. Two prominent approaches are the convergence research approach and the translational science approach.

Sources

A Scoping Review
of Citizen Scienc...

 frontiersin • 1

Learn About
Convergence...

 new.nsf • 2

Translational
Science Principles

 ncats.nih • 3



View 2 more

Ask –Perplexity

When you want to explore a new question in clinical sciences
how can you proceed when no one has worked on the question?

Conduct a thorough literature review

Develop a theoretical framework

Use pilot or exploratory studies





Employ qualitative methods

Leverage existing data sources

Consider innovative study designs

Engage stakeholders and communities



	Known	Unknown
Known	 <p>Known-Knowns</p> <p>Information we are <u>aware</u> of and have evidence for</p>	 <p>Known-Unknowns</p> <p>Information gaps or risks we are <u>aware</u> of</p>
Unknown	 <p>Unknown-Knowns</p> <p>Information we are <u>unaware</u> of or are <u>biased</u> towards</p>	 <p>Unknown-Unknowns</p> <p>Information or gaps we <u>unaware</u> of</p>



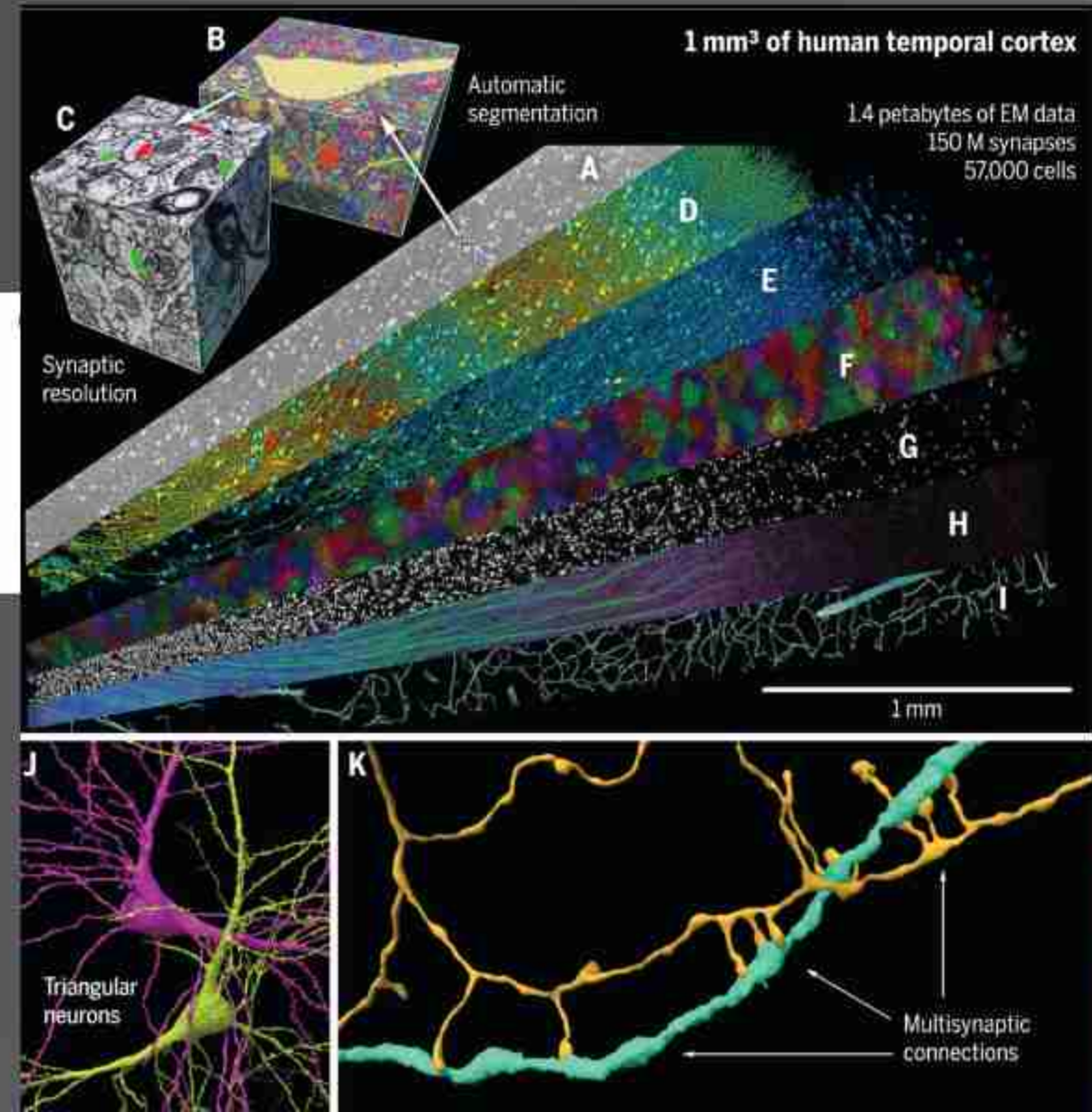
First consider- why is this question of uncharted navigation relevant today- is that not what science has always been about?

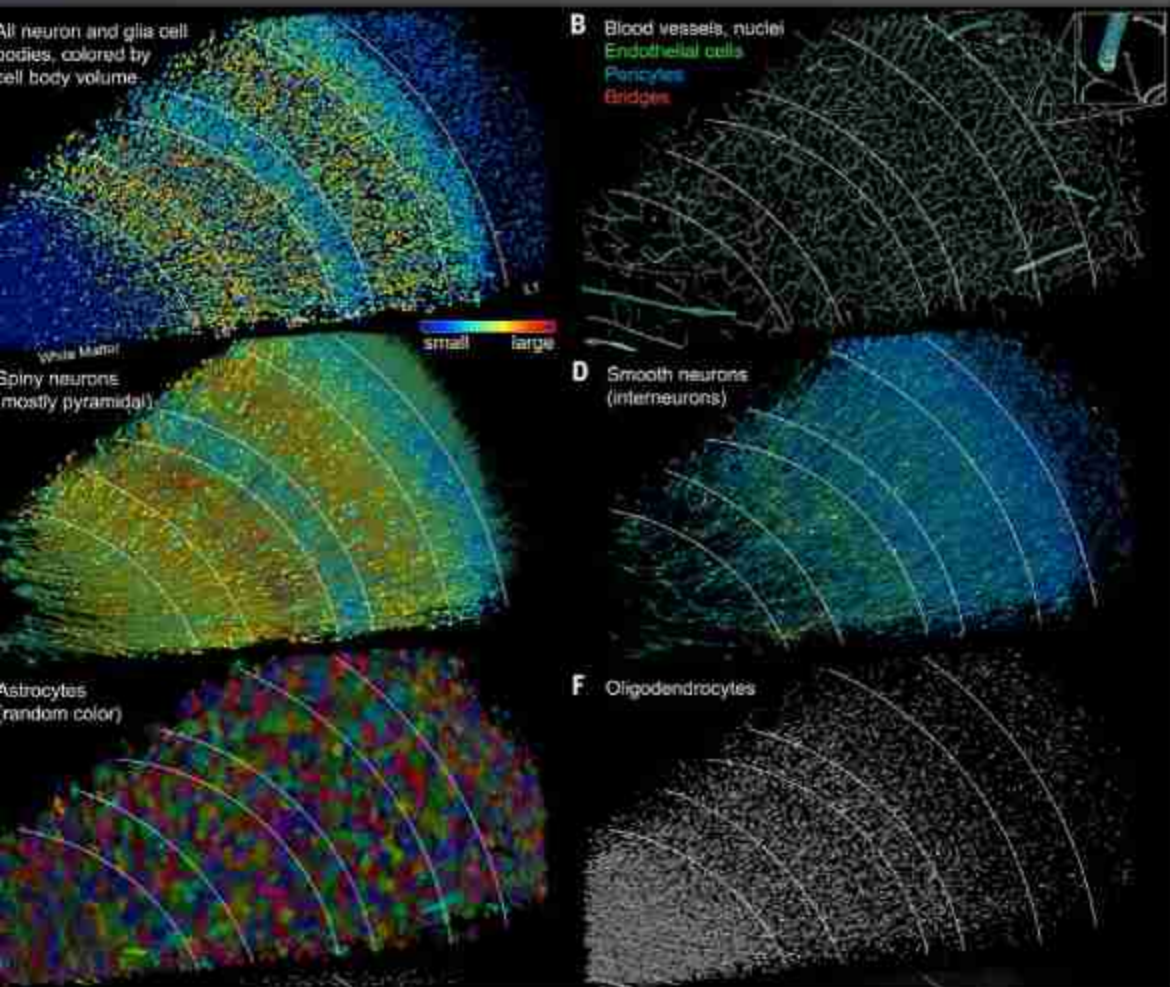
RESEARCH ARTICLE NEUROSCIENCE

A petavoxel fragment of human cerebral cortex reconstructed at nanoscale resolution

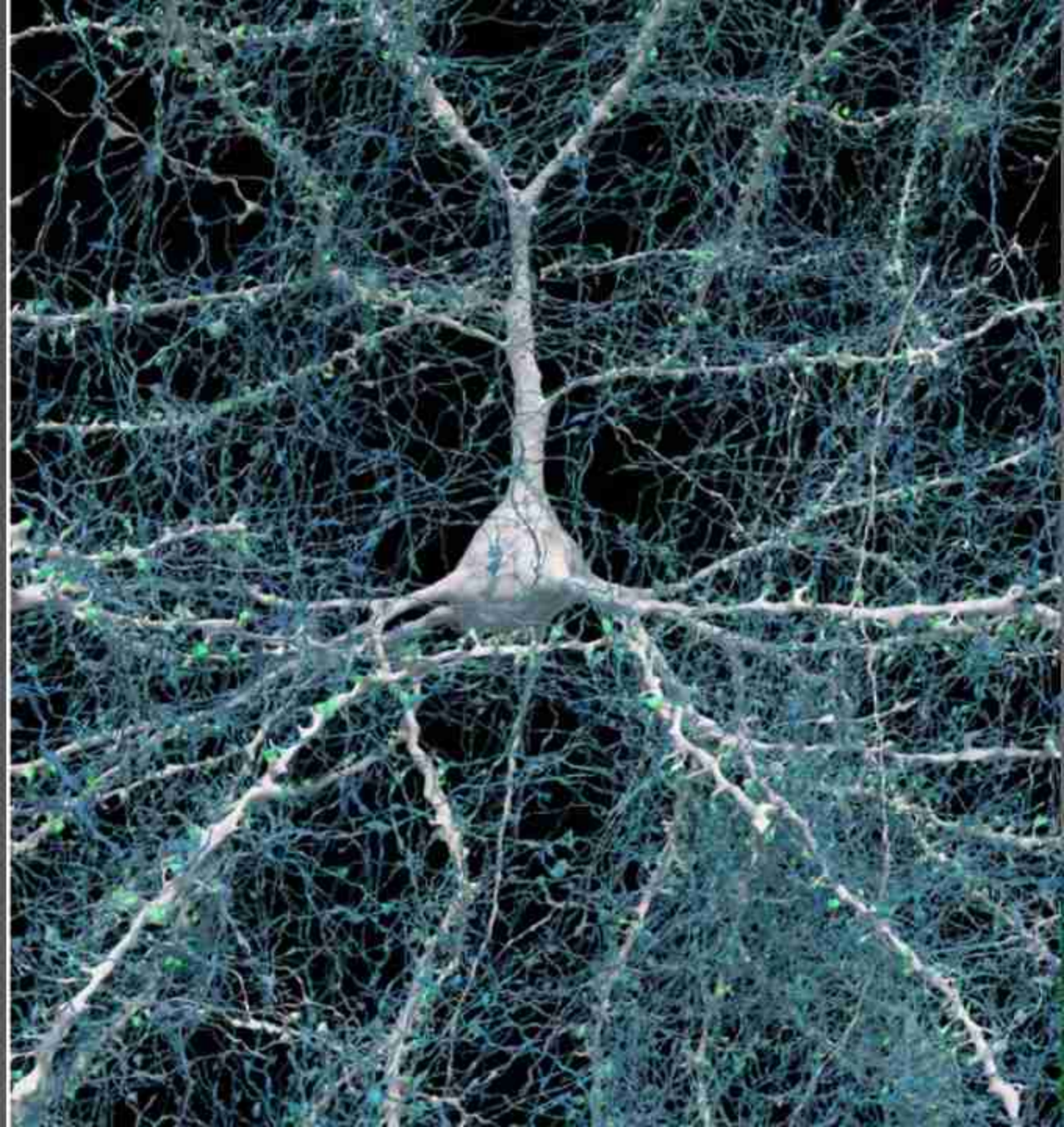
ALEXANDRE SHAPSON-COHEN, MICHAEL JANUSZEWski, DANIEL R. BERGER, ART FROST, [...] AND JEFF W. LUSHTMAN, +26 authors [Authors Info & Affiliations](#)

SCIENCE • 10 May 2019 • Vol 364, Issue 6436 • DOI:10.1126/science.1264358





CREST – CAVE – VAST



Unmasking AlphaFold: integration of experiments and predictions in multimeric complexes

Evolutionary transitions in cellular complexity

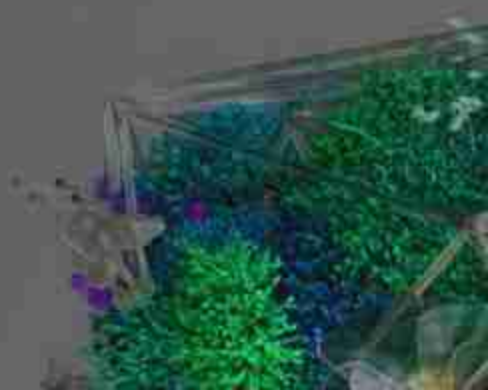
Functional Pathology – learning vs discovery

Single molecule tracking methods by means of fluorescence microscopy

Spatially resolved transcriptomics by in situ sequencing

Functional variation in the human genome: Lessons from natural and induced genetic perturbations

To seamlessly integrate AI with cell and molecular biology



Outline

- 1- Framing- Navigation of uncharted areas
- 2- Emerging lessons from wearables enabling return of agency



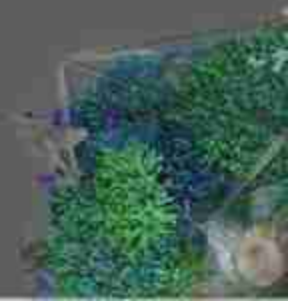
transition to working on **wearables**

when **genotyping** was becoming more informative than **phenotyping**



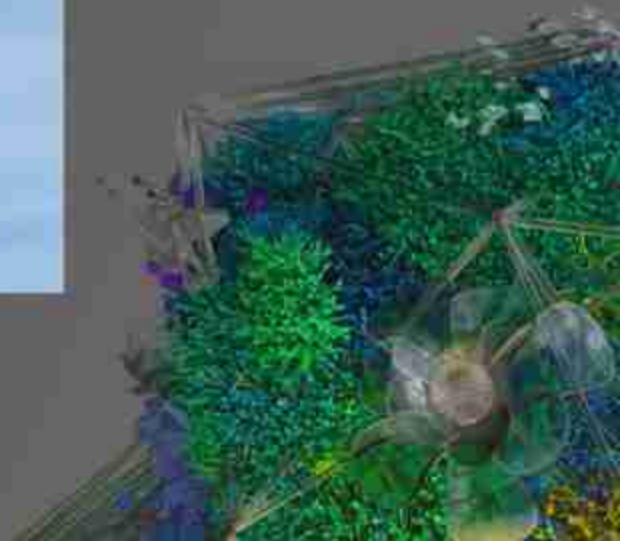
4YOU+ME

Non-profit





static and somewhat constrained by definitions of symptoms with subjectivity of examining clinicians





touch



hearing



sight



taste

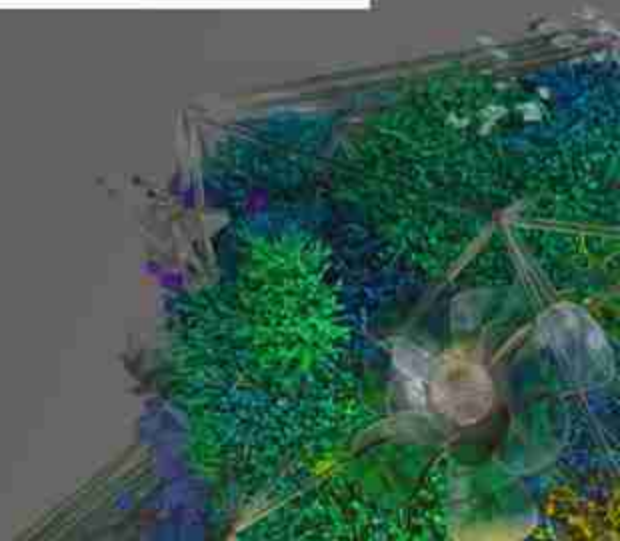


smell

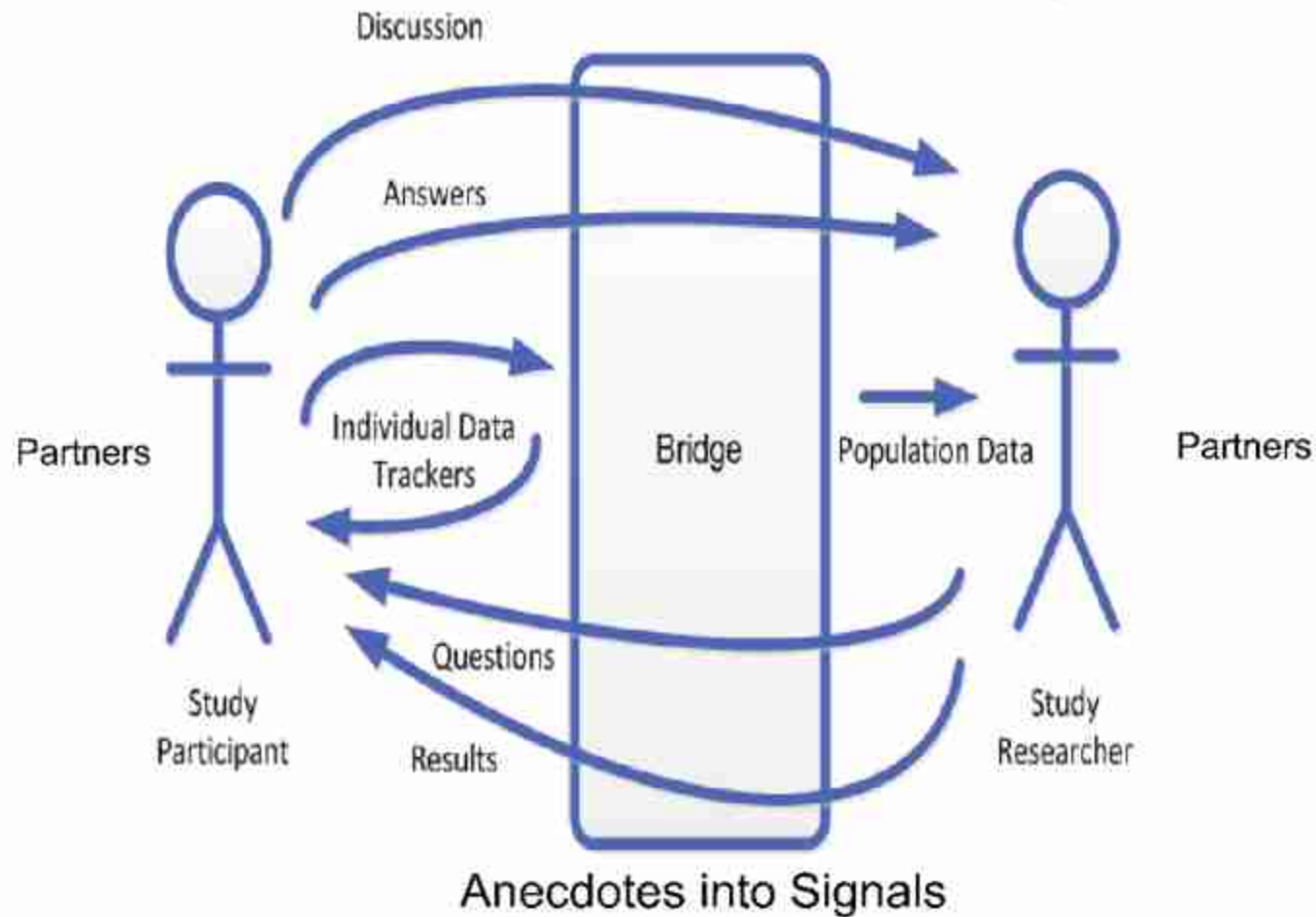


4YOU+ME

Non-profit

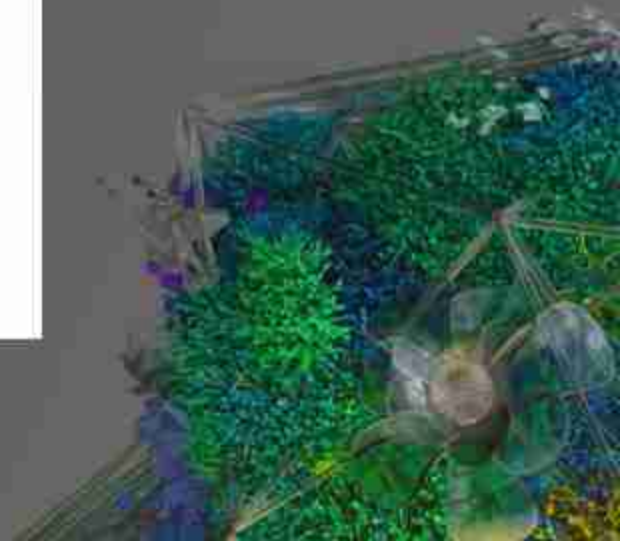


Participant –Centered Research Studies with Feedback Loops



Support
provided by

Robert Wood Johnson
Foundation





TIM MOYNIHAN GEAR 03.09.15 02:05 PM

SHARE



1331



APPLE'S RESEARCHKIT IS A NEW WAY TO DO MEDICAL RESEARCH



Jeff Williams, senior vice president of operations at Apple, introduces ResearchKit at an event in San Francisco.

Personal Health Assistant

self-navigate before and after symptoms arise

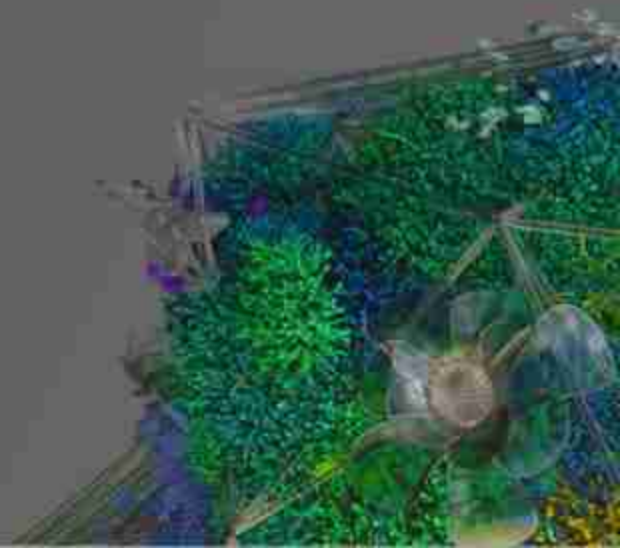
nurtures actions in times of strength

contributed by each for each other



4YOU+ME

Non-profit



unknown complexities of forecasting individual health trajectories

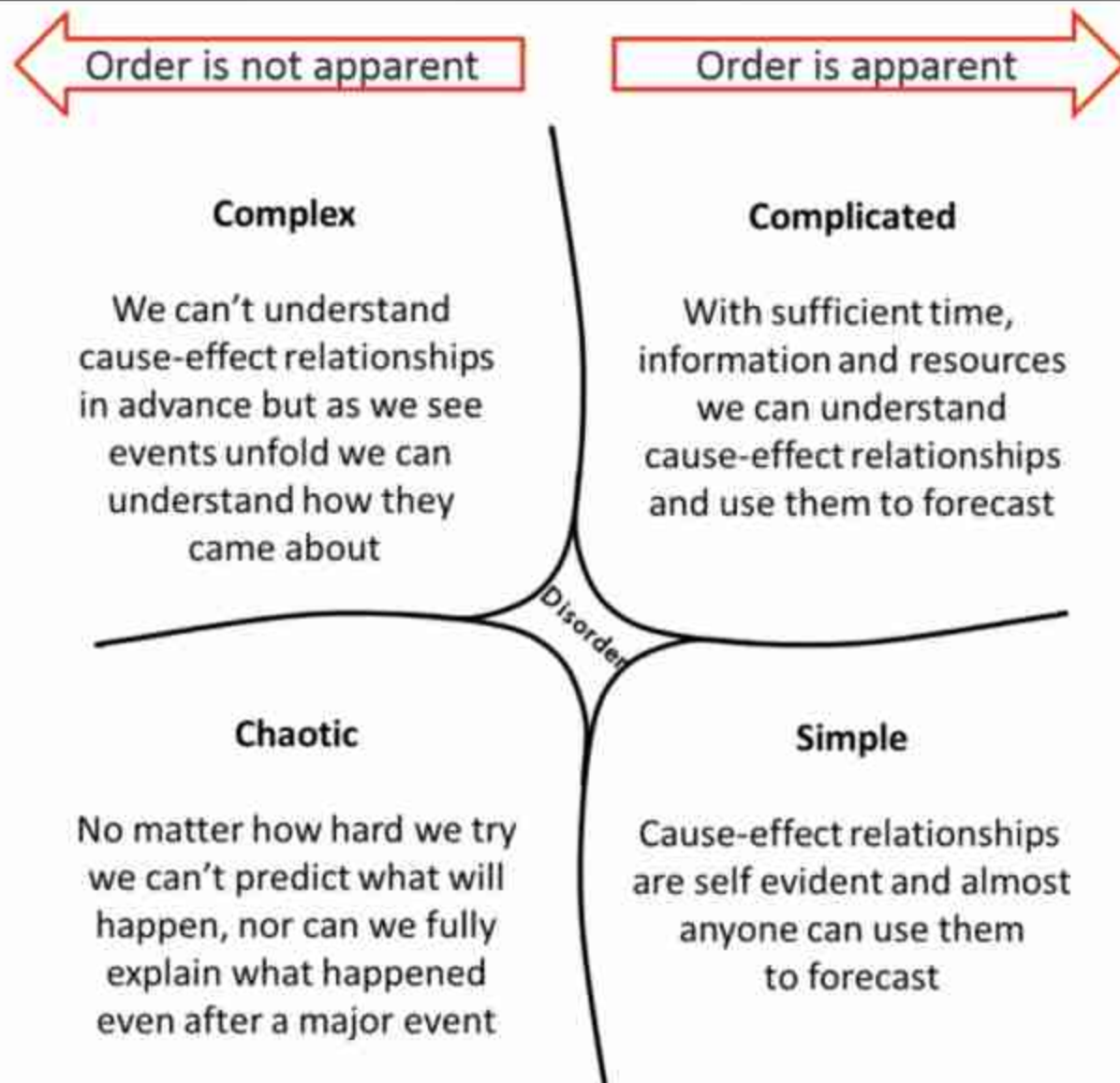
progress over four years – lessons about future

How close are we to forecasting symptom transitions for chronic conditions like diabetes and Alzheimer's using digital devices-smartphones and beyond?

SciLifeLab
Stockholm
Feb 3, 2020

Stephen Friend MD PhD
University of Oxford
4YouandMe
Sage Bionetworks

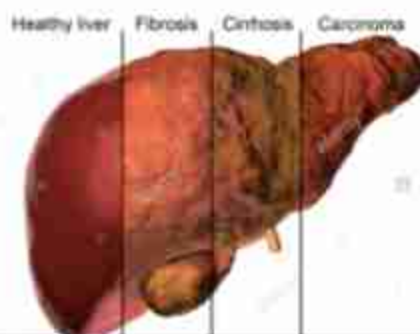




Presented Feb 2020



Opportunities: Rebuilding taxonomies of diseases



Presented Feb 2020

Opportunities: Unfolding Disease transitions

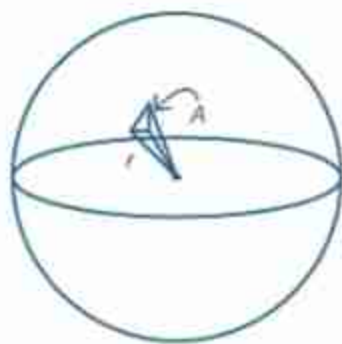
Prodrome Early Moderate Advanced

Singular to branching



Presented Feb 2020

Opportunities: Untangling causes and consequences



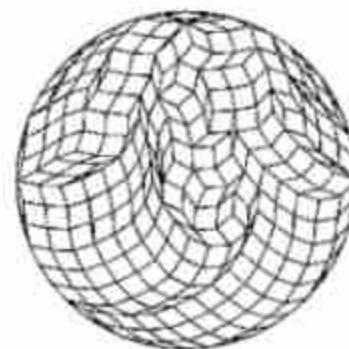
singular to overlapping

mood

STRESS

sleep

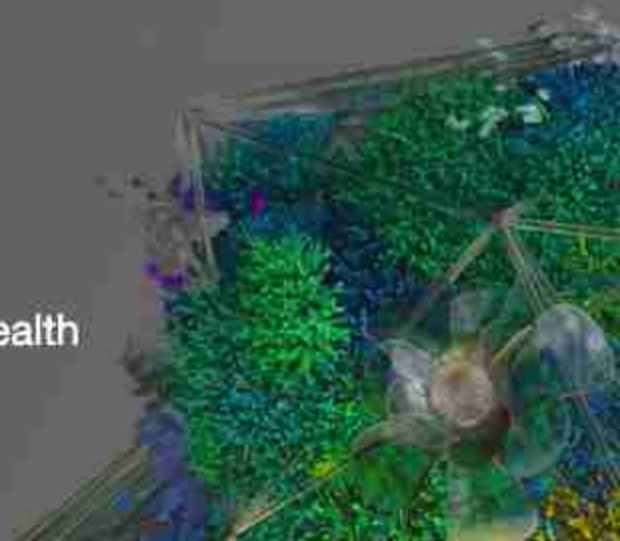
cognition



Presented Feb 2020

Current and Completed Feasibility Studies

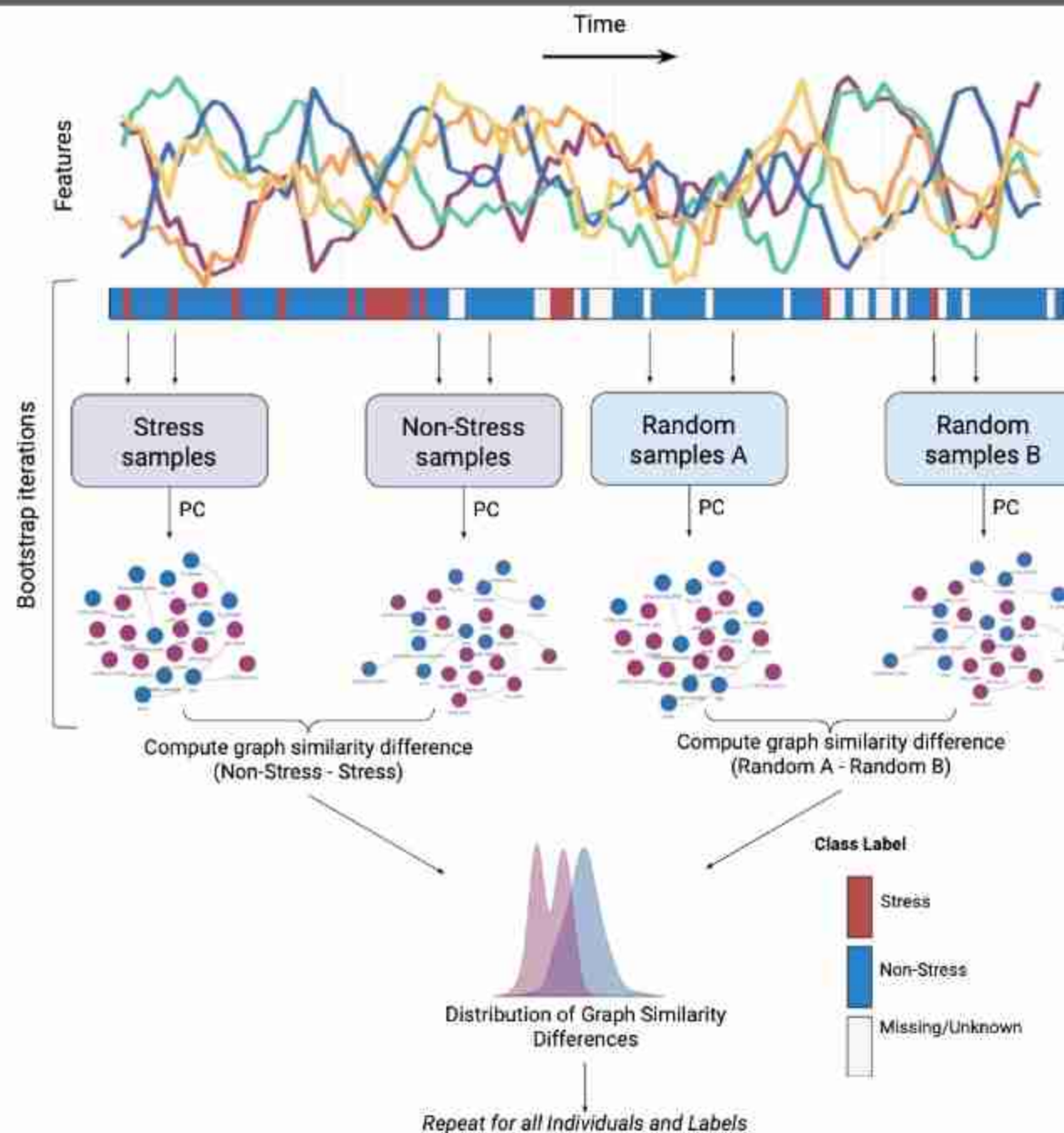
- ★ **Stress and Recovery:** Stress in COVID healthcare workers
- ★ **BUMP:** Forecasting Symptoms of Pregnancy and timing of delivery
 - BUMP-C:** Build portraits from trying to conceive to conception
- ★ **Stress in Crohn's:** Can stress help forecast flares?
- ★ **HERO PANC:** Following the effects of chemo and tumor regrowth
 - HERO CNS:** Designing tool to detect early growth of tumors
- Diabetes & Stress:** How does stress effect continuous glucose measures
- Fabric of Life:** Effects of Stress on Li-Fraumeni Syndrome
 - OxAMI Fabric of Life:** Effects of Stress on healing from heart attacks
- ★ **My Experiences:** Revamping the Psychiatric system of classification
- ★ **Open Band:** Construct and Open Hardware Open Firmware Affordable wearable for health



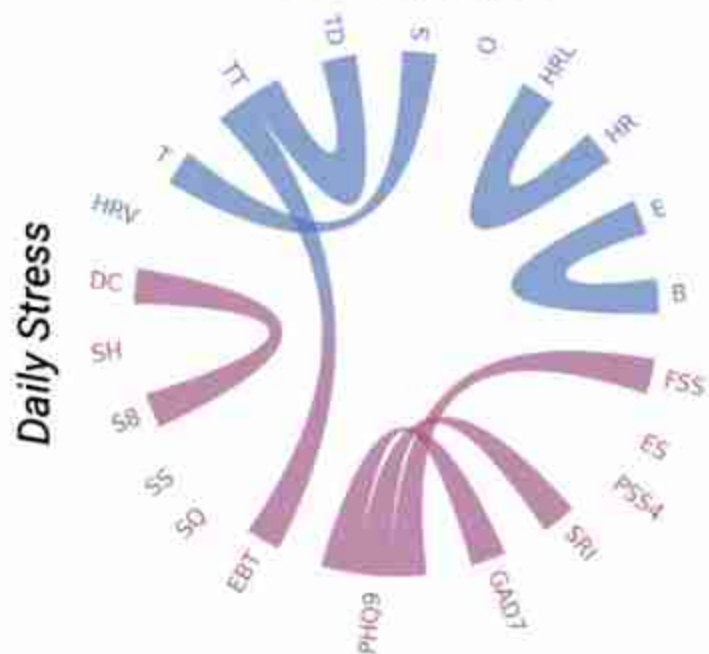
ARTICLE OPEN

Dissecting the heterogeneity of “in the wild” stress from multimodal sensor data

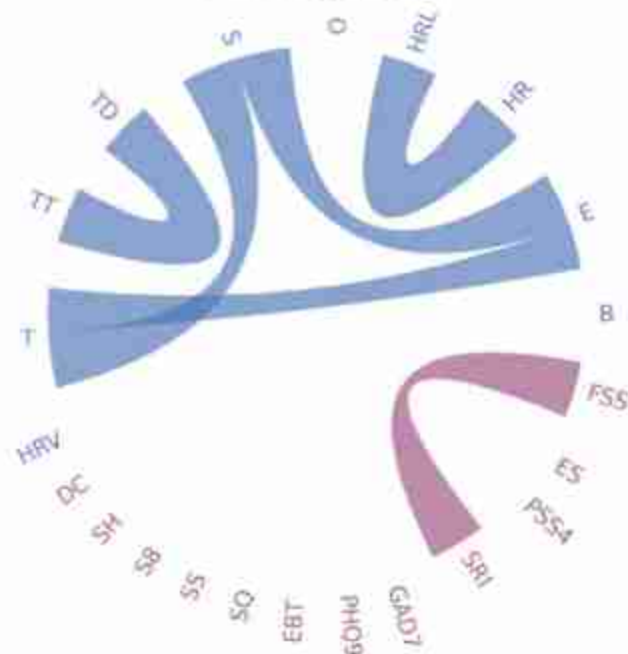
Sujay Nagaraj^{1,2,5,10}, Sarah Goodday^{4,5}, Thomas Hartvigsen⁶, Adrien Boch⁷, Kopal Garg^{1,2,3}, Sindhu Gowda^{1,2}, Luca Foschini⁸, Marzyeh Ghassemi^{2,6,10}, Stephen Friend⁶ and Anna Goldenberg^{1,2,3,11,12}



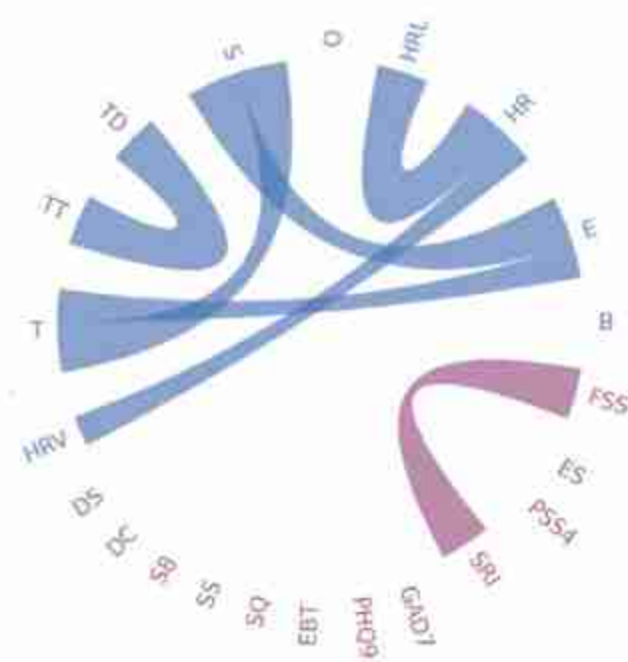
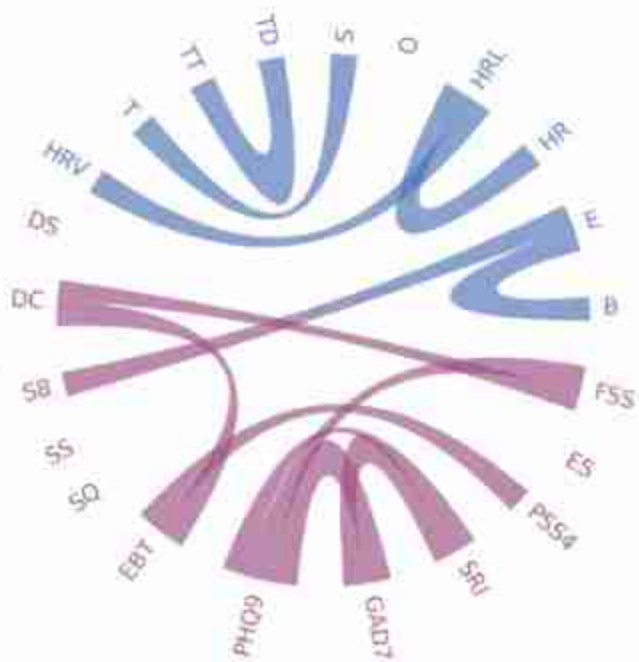
Participant A



Participant B



Daily Shifts



Study Characteristics: BUMP/BUMP-C

Aim: To determine the feasibility of using multiple digital health tools to follow eight core symptoms of pregnancy

N=524 (BUMP), 263 (BUMP-Conception (C))

Population: Individuals attempting to get pregnant/individuals up to 15 weeks pregnant, 18-40 years

Follow-up time: Over pregnancy to 3-months postpartum (BUMP-C cohort up to 6 months attempting to get pregnant)

Recruitment: Patient provider platforms (Sema4), Community Health Centers, targeted social media campaigns in the US

Study Tools: App, Oura ring, Garmin watch, Apple watch (BYOD), Bodyport scale

Engagement: Bi-weekly phone support calls, Investigator – Participant Zoom calls



4YOU+ME
Non-profit

npj | digital medicine www.nature.com/npjdigitalmed

PROTOCOL **OPEN** Check for updates

Better Understanding of the Metamorphosis of Pregnancy (BUMP): protocol for a digital feasibility study in women from preconception to postpartum

S. M. Goodday^{1,2,3,4}, E. Karlin¹, A. Brooks¹, C. Chapman¹, D. R. Karlin^{1,3,4}, L. Foschini⁵, E. Kipping⁵, M. Wildman⁵, M. Francis⁶, H. Greenman⁶, U. Li⁶, E. Schadt⁶, M. Ghassemi^{7,8,9}, A. Goldenberg^{9,10}, F. Cormack^{11,12}, N. Taptiklis¹¹, C. Centen¹², S. Smith¹² and S. Friend^{1,4}

Equipment Needed

Three wearable devices will be provided to study participants

Fitbit Versa

- 3-axis accelerometer
- 3-axis gyroscope
- Optical heart rate monitor
- Altimeter
- Vibration motor
- WiFi Antennas (802.11 b/g/n)
- 4+ days battery Life



Oura Ring 2

- Heart Rate, Resting Heart Rate (RHR)
- Heart rate variability (HRV)
- Respiration rate, breathing variance
- Sleep stages and quality metrics
- Body temperature variation
- Duration, intensity, and timing of activities
- Inactivity, sedentary time



BodyPort Smart Scale

- Weight
- Pre-ejection Period
- BMI
- Ejection Time
- Impedance
- PEP/LVET
- Peripheral Fluid Content
- Pulse Wave Velocity
- Balance
- Pulse Transit Time
- Pulse Rate
- Pulse Arrival Time
- Heart Rate Variability
- Ejection Force



SIGNALS

SYMPTOMS

Fatigue - Tiredness
Cognition - Forgetfulness
Emesis - Vomiting
Dyspnea - Shortness of breath
Mood - Depressive symptoms
Sleep - Sleep disruptions
Gait - Changes in walking style
Edema - Swelling

Raw IMU (accel + gyro + magnetometer)
Minute-level steps
Resting Heart Rate
Minute-level HR
Opportunistic second-level HR
RR-intervals
Raw PPG
Opportunistic/Continuous HRV
Opportunistic/Continuous BP
Active Tests
Sleep macros (TTA, WASO, SOL, SE)
Sleep stage classification (30-second epochs)
SPO2
Respiration Rate
Body Weight/Fat %
Peripheral fluid content
Body impedance magnitude/phase
Body Temperature
GPS at location changes
User-mediated event mark
Phone usage (pick up, time on phone)
Social networks usage
Eye movements

Fatigue

Active

- Study visits
 - Maternal Social Support Index
 - Adverse Childhood Events
 - PHQ-4
 - Perinatal PTSD survey
 - Medical history
 - Birthing data
 - Heart rate
 - Diabetes screens
 - CBC
 - Edinburgh Postnatal Depression Scale
- Camcog
 - N-back task
 - Emotion bias task
 - Psychomotor vigilance test

● In-app

- Gait task
- 2-minute walk test
- Video diary
- Absolute location (opt-in)
- SAM EMA
- Pregnancy symptom survey
- Medical/pregnancy history survey
- Quality of life survey
- Healthcare utilization survey
- Fatigue survey
- Emotional support survey
- Pain interference survey
- Sleep disturbance survey
- Sleep related impairment survey
- Flu / infection question

● Bodyport

- Left ventricular ejection time

Passive

● Activity

- Activity score
- Daily movement
- Daily steps
- Metabolic equivalents (1 min)
- Activity class (5 min)
- Steps (15 min)
- Heart rate (1 min)

● Sleep

- Bedtime start/end delta
- Heart rate (5 min)
- Nightly temperature delta
- Number of sleeps per day
- Sleep score
- Circadian alignment
- Disturbances
- Sleep levels (5 min)
- HRV (5 min)
- Sleep levels

● Readiness score

● Stress level

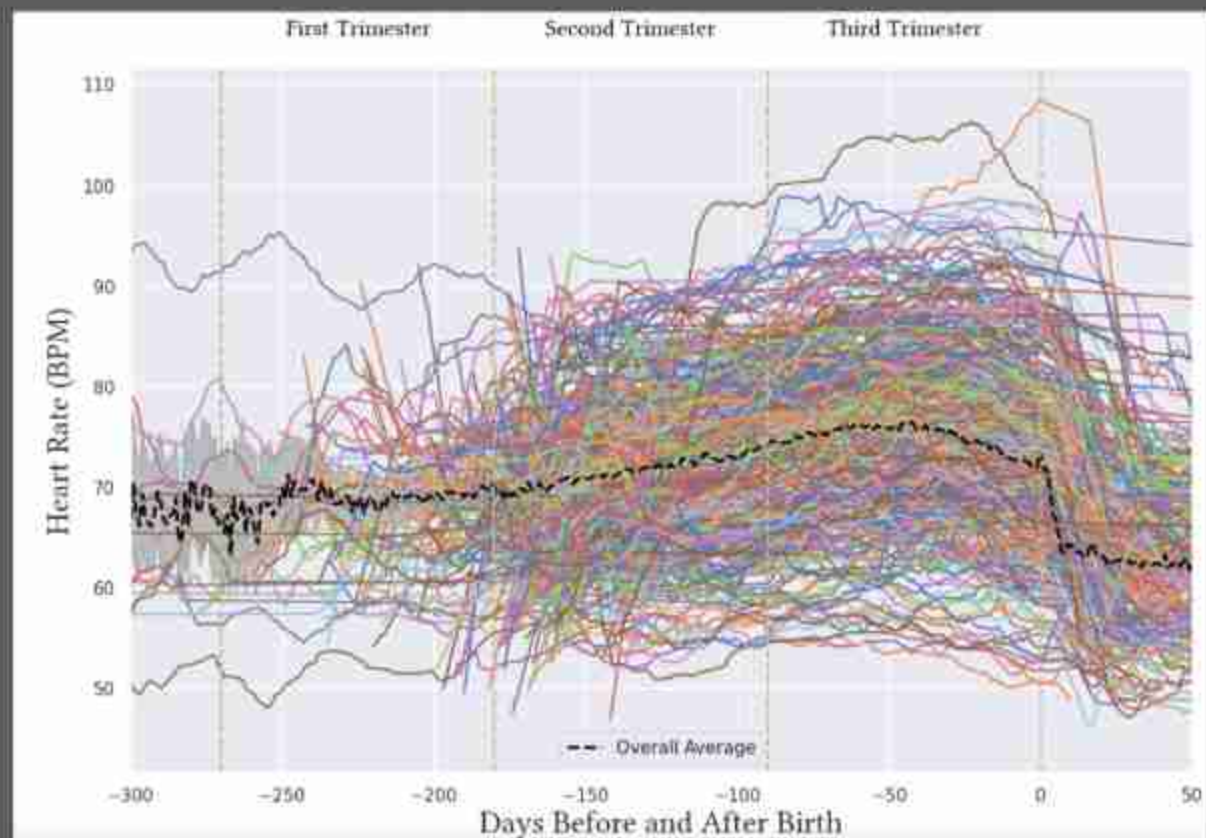
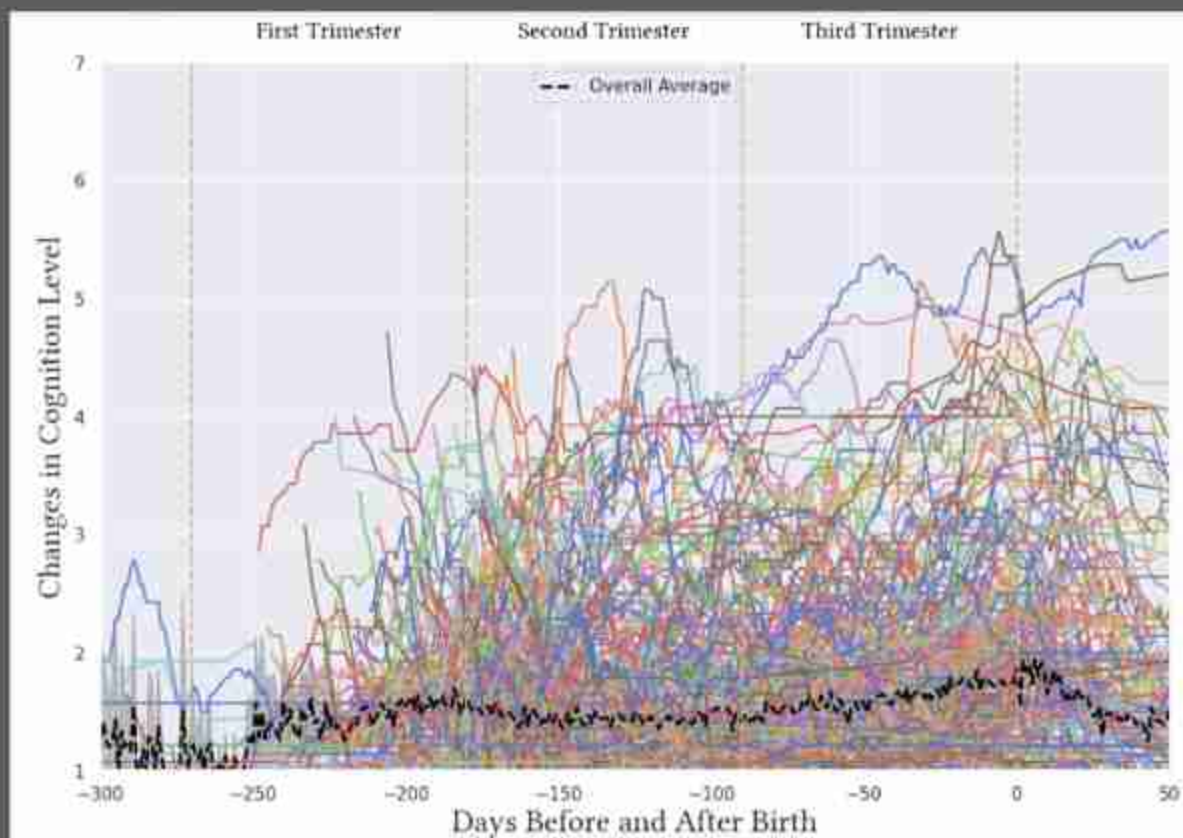
● Body battery

● Breathing rate (1 min)

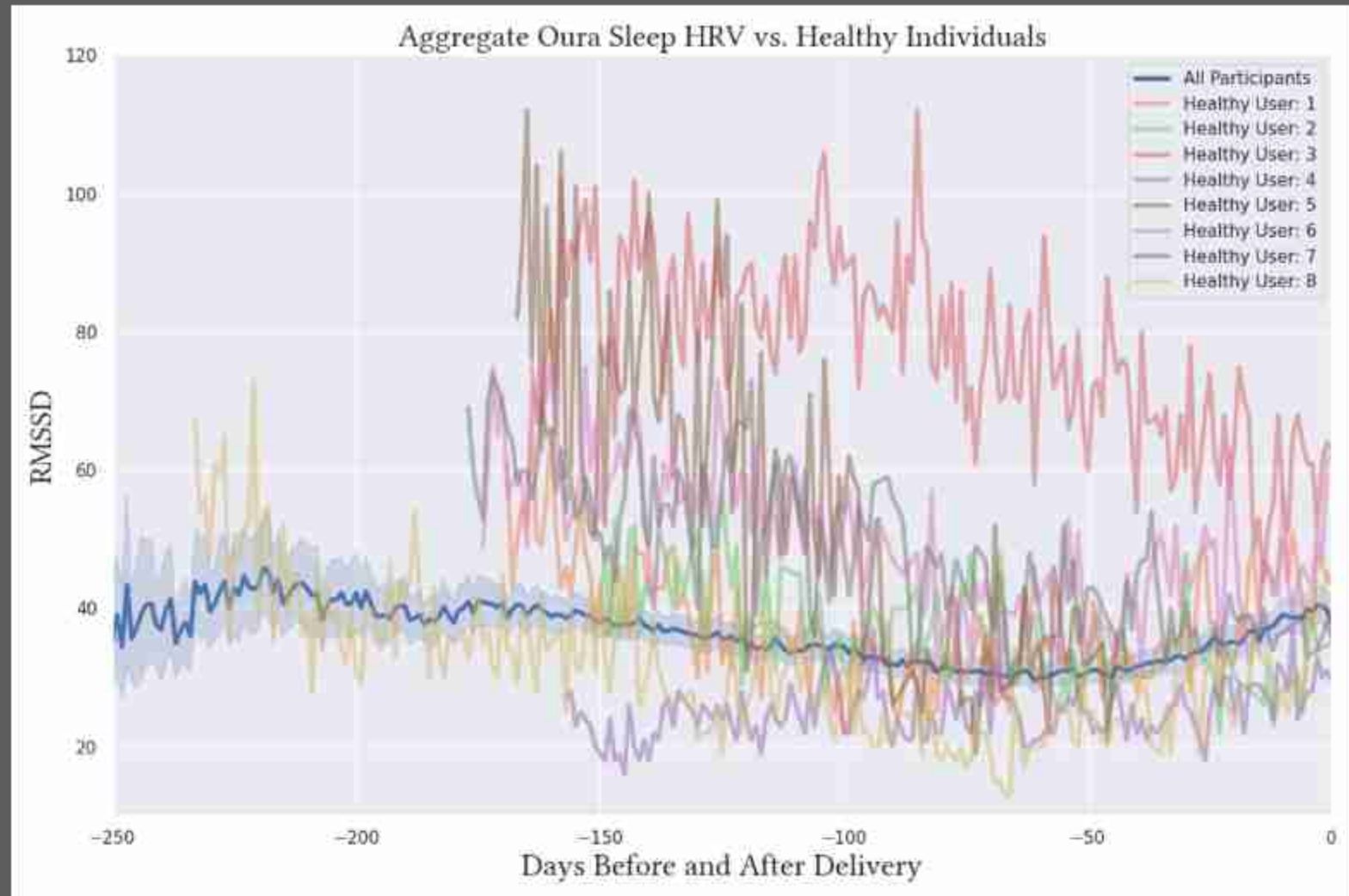
● Instagram posts

● Twitter posts & feed

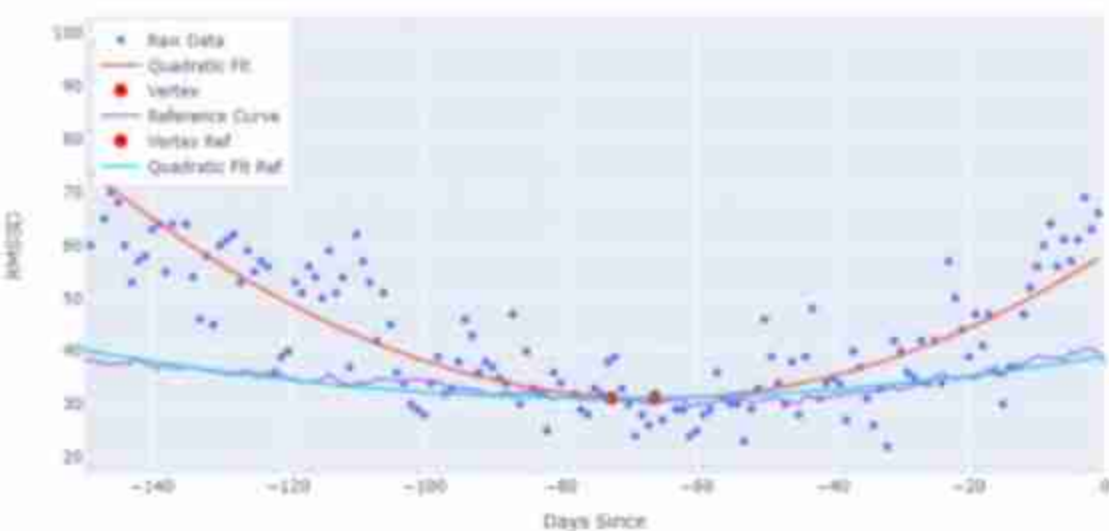
● Phone usage



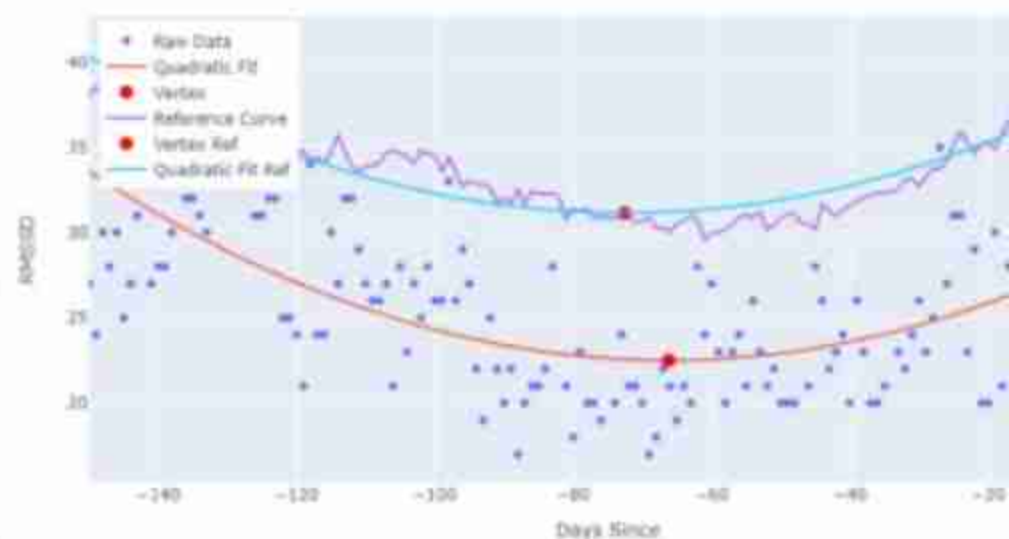
BUMP: Aggregate and healthy individual level HRV over pregnancy



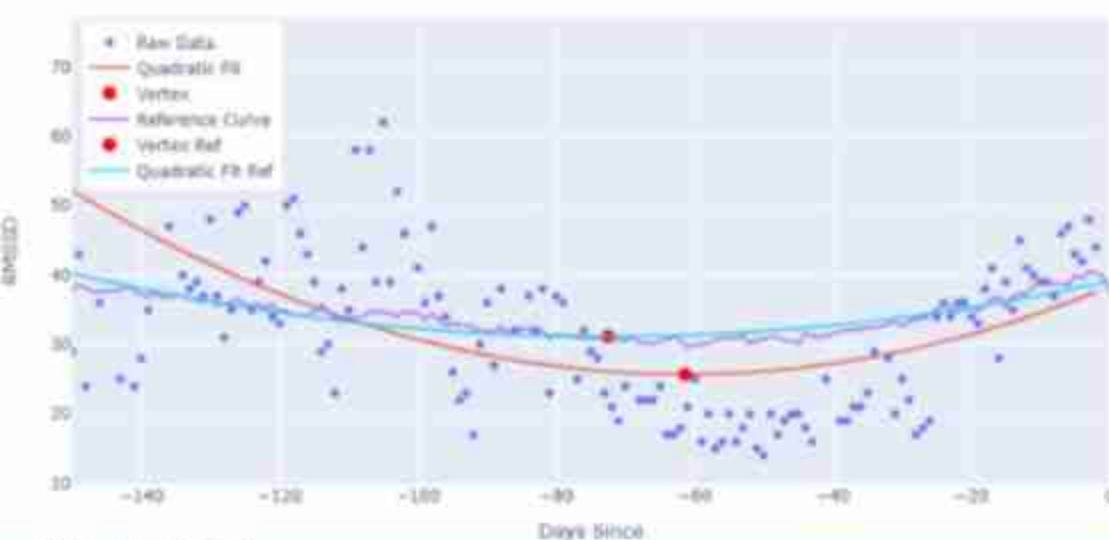
Quadratic fit with Vertex on Raw Data - sema4_164



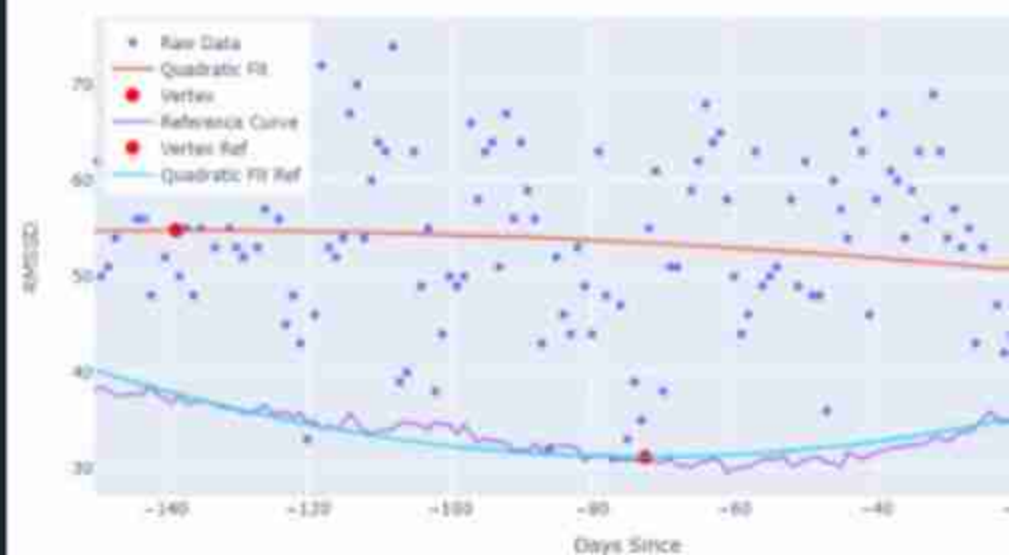
Quadratic fit with Vertex on Raw Data - sema4_133



Quadratic fit with Vertex on Raw Data - sema4_131




Quadratic fit with Vertex on Raw Data - sema4_364



Current Lessons and Puzzles at n of one level

-Navigating uncharted territories

- 1- Chaos at n of one level for symptoms is much larger than anticipated
 - 2-Remarkable creativity of human body to react to outside circumstances in unique and evolving dynamic ways- how to gain power from others?
 - 2- features not just entangled- but driven by known and unknown confounders
 - 3- Poised to test whether routines, intervals, and labels from individuals allow **context** and larger populations allow ID of doppelgangers- use of generative approaches
 - 4- Poised to better link blood-based analytes and EHRs with wearable data
 - 5- Imagine a world where all data is fused using AI generative approaches and knowledge graphs
- 

Outline

- 1- Framing- Navigation of uncharted areas
- 2- Emerging lessons from wearables enabling return of agency
- 3- Emerging lessons from -omics driving therapies
- 4- How will navigation of uncharted areas in the future relate to now



The Resilience Project 2013-2016

a proof of concept effort to explore the potential power of second site suppressors as drug targets by scanning the healthy for unexpected resilient individuals



Original: “The Resilience Project”

Proof of Concept Study showing
it is possible to

nature
biotechnology

ARTICLES

Analysis of 589,306 genomes identifies individuals resilient to severe Mendelian childhood diseases

Rong Chen^{1,2,12}, Lisong Shi^{1,2,12}, Jörg Hakenberg^{1,2}, Brian Naughton^{3,11}, Pamela Sklar^{1,2,4}, Jianguo Zhang⁵, Hanlin Zhou⁵, Lifeng Tian⁶, Om Prakash⁷, Mathieu Lemire⁸, Patrick Sleiman⁶, Wei-yi Cheng^{1,2}, Wanting Chen⁵, Hardik Shah^{1,2}, Yulan Shen⁵, Menachem Fromer^{1,2,4}, Larsson Omberg⁹, Matthew A Deardorff⁶, Elaine Zackai⁶, Jason R Bobe^{1,2}, Elissa Levin^{1,2}, Thomas J Hudson⁸, Leif Groop⁷, Jun Wang¹⁰, Hakon Hakonarson⁶, Anne Wojcicki³, George A Diaz^{1,2}, Lisa Edelmann^{1,2}, Eric E Schadt^{1,2} & Stephen H Friend^{1,2,9}

Genetic studies of human disease have traditionally focused on the detection of disease-causing mutations in afflicted individuals. Here we describe a complementary approach that seeks to identify healthy individuals resilient to highly penetrant forms of genetic childhood disorders. A comprehensive screen of 874 genes in 589,306 genomes led to the identification of 13 adults harboring mutations for 8 severe Mendelian conditions, with no reported clinical manifestation of the indicated disease. Our findings demonstrate the promise of broadening genetic studies to systematically search for well individuals who are buffering the effects of rare, highly penetrant, deleterious mutations. They also indicate that incomplete penetrance for Mendelian diseases is likely more common than previously believed. The identification of resilient individuals may provide a first step toward uncovering protective genetic variants that could help elucidate the mechanisms of Mendelian diseases and new therapeutic strategies.

- curate highly penetrant “lethal” alleles.
- Mine pre-existing large datasets of others.
- scan exomes and genotyping arrays for functional second-site suppressors.
- Identify likely candidates
- Allowed recognition of how essential to recontact individuals and records.
- Importance of adding in advocate groups, new tools to screen for second-site suppressors, use of emerging knowledge graphs, alpha fold approaches.

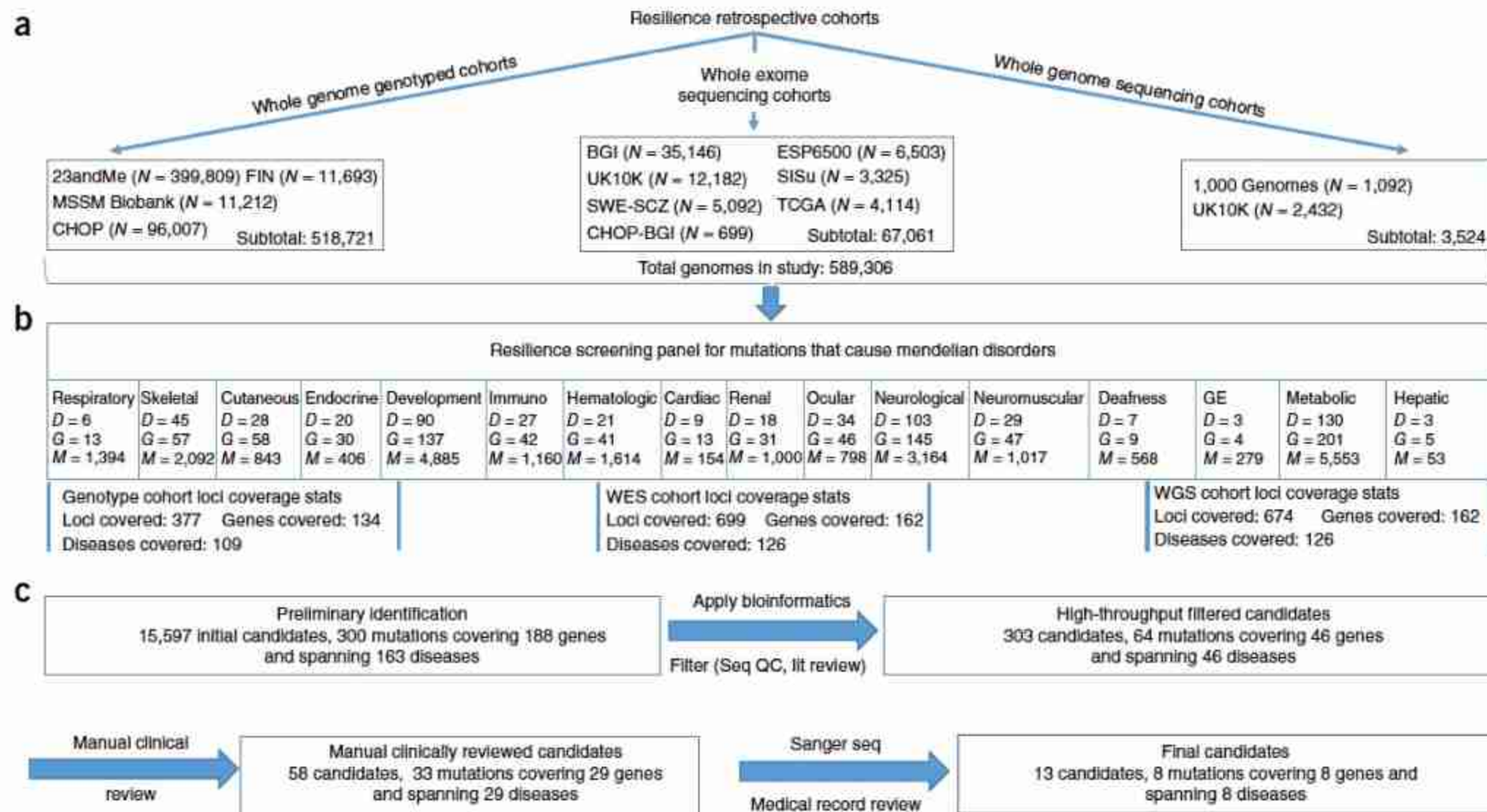


Figure 1 Study design and results for the retrospective search for resilient individuals. (a) A summary of the different cohorts and the genomic data available on those cohorts (see **Table 2** for more details). (b) The disease-causing genes and mutations that were assembled to construct our screening panel (more details in **Table 1** and **Supplementary Tables 1 and 2**). The D, G and M variables denote the number of diseases, genes and mutations, respectively, represented on our screening panel in the respective disease categories. The coverage statistics indicate the coverage achieved for the core allele panel in the genotype, WES and WGS cohorts. (c) Summaries for the different stages of the filtering process to identify candidate resilient individuals (see **Supplementary Fig. 1** and **Tables 3 and 4** for more details).

Table 4 13 Candidates identified in the Resilience Project

Phenotype	Gene	Mutation (cDNA; protein reference)	Genomic coordinate (hg19)	Mutation severity	Candidate confidence	Panel source	No. of candidates	Zygosity	Data source	Level of support for candidacy ^a	Sample status	Population carrier frequency ^b	
												1 KG	ESP
Cystic fibrosis	<i>CFTR</i>	c.1558G>T; p.V520F (NM_000492.3)	Chr7: 117199683	Severe pulmonary disease, childhood-onset	Strong	Core allele panel	3	hom	23andMe	C1,C2,C3, G1,G2,G3	2 adults, one declared no manifestation	0.00	0.00
Smith-Lemli-Opitz syndrome	<i>DHCR7</i>	c.964-1G>C (NM_001360.2)	Chr11: 71146886	Severe developmental disorder, probably embryonic lethal	Strong	Core allele panel	2	hom	UK10K	C1,C2, G1,G2	Not obtained	0.0052	0.011
Familial dysautonomia	<i>IKBKAP</i>	c.2204+6T>C (NM_003640.3)	Chr9: 111662096	Severe neurological disease, high mortality in early childhood	Strong	Core allele panel	1	hom	23andMe	C1,C2, G1,G2,G3	No disease reported by individual	0.00	0.0012 (only in EA)
Epidermolysis Bullosa simplex	<i>KRT14</i>	c.373C>T; p.R125C (NM_000526.4)	Chr17: 39742714	Severe dermatologic condition, infantile onset	Strong	Core allele panel	1	het	BGI	C1,C2,C3, G1,G2	No disease reported by individual	0.00	0.00
Pfeiffer syndrome	<i>FGFR1</i>	c.755C>G; p.P252R (NM_023110.2)	Chr8: 38282208	Severe congenital skeletal dysplasia with variable expressivity	Strong ^c	Core allele panel	1	het	SWE-SCZ	C1,C2,C3, G1,G2,G3	No abnormal morphology reported in discharged health information	0.00	0.00
APECED	<i>AIRE</i>	c.769C>T; p.R257* (NM_000383.2)	Chr21: 45709656	Severe childhood-onset autoimmune disease	Strong	Core allele panel	1	hom	23andMe	C1,C2,C3, G1,G2	No disease reported by individual	0.00	0.00015
Acampomelic campomelic dysplasia	<i>SOX9</i>	c.1320C>G; p.Y440* (NM_000346.3)	Chr17: 70120318	Severe skeletal dysplasia with early childhood death	Strong	Expanded panel	1	het	FINN	C1,C2, G1,G2	Not obtained	0.00	0.00
Atelosteogenesis	<i>SLC26A2</i>	c.835C>T; p.R279W (NM_000112.3)	Chr5: 149359991	Severe early-onset skeletal dyspla- sia with variable expressivity	Moderate ^d	Expanded panel	3	hom	23andMe	C1,C2, G1,G2	Not obtained	0.0028	0.0023

^aSee **Table 5** for code definitions. ^bCarrier frequencies from combined ethnicities. ^cIndividual was categorized as strong candidate due to lack of dysmorphic features. ^dIndividual with variable phenotypes have been reported with the mutation²⁷.
EA, European American.

Resilience Project 2.0 RoadMap

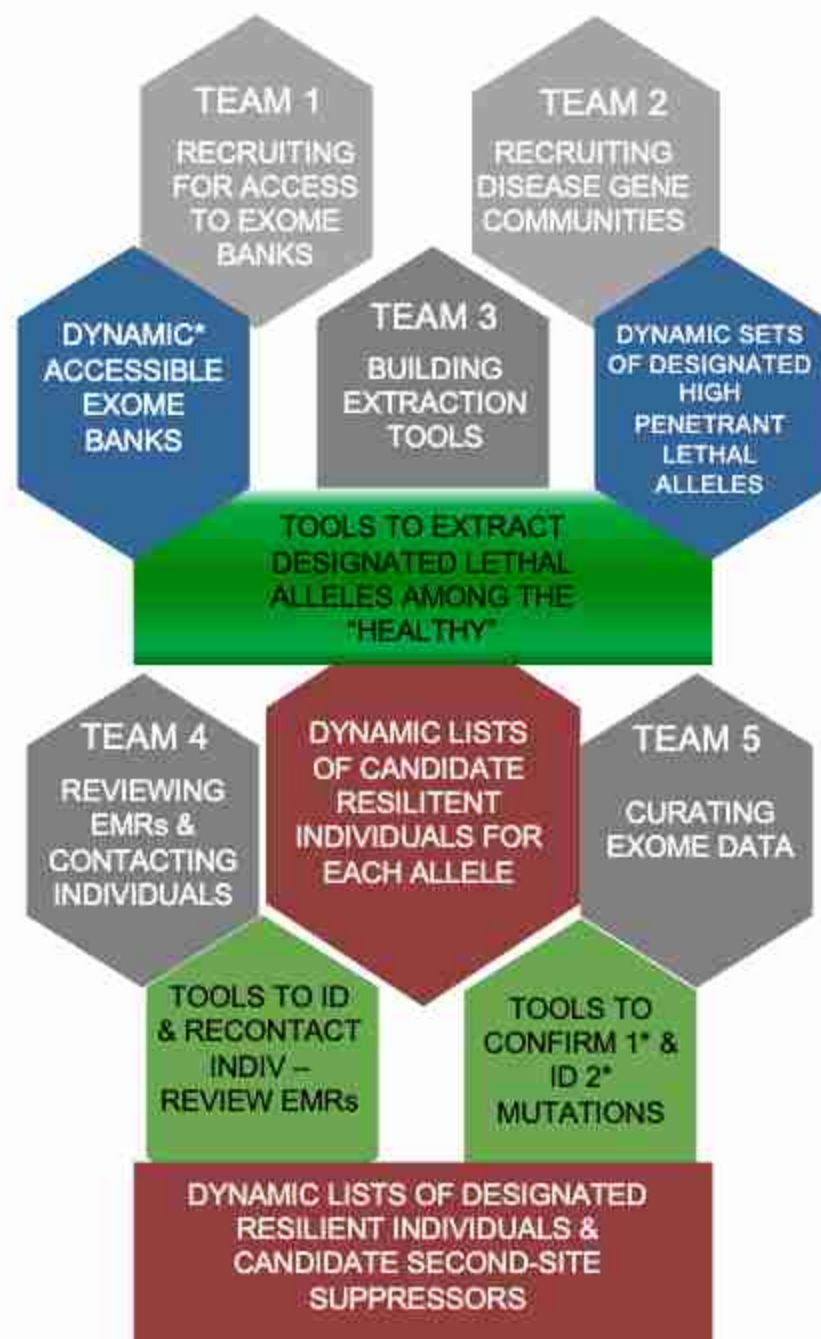
"Build a scalable stage-gate driven open platform to deliver lead compounds for diverse genetic diseases based on leveraging existing exome banks, EMRs, and known lethal penetrant mutations/alleles. This effort starts by identifying second-site suppressors so as to find drug targets with existing human genetic validation, followed by use of emerging tools to prioritize candidate second site suppressors, and then use coordinated teams to deliver active compounds for prioritized drug targets."

April 29th, 2024 Draft

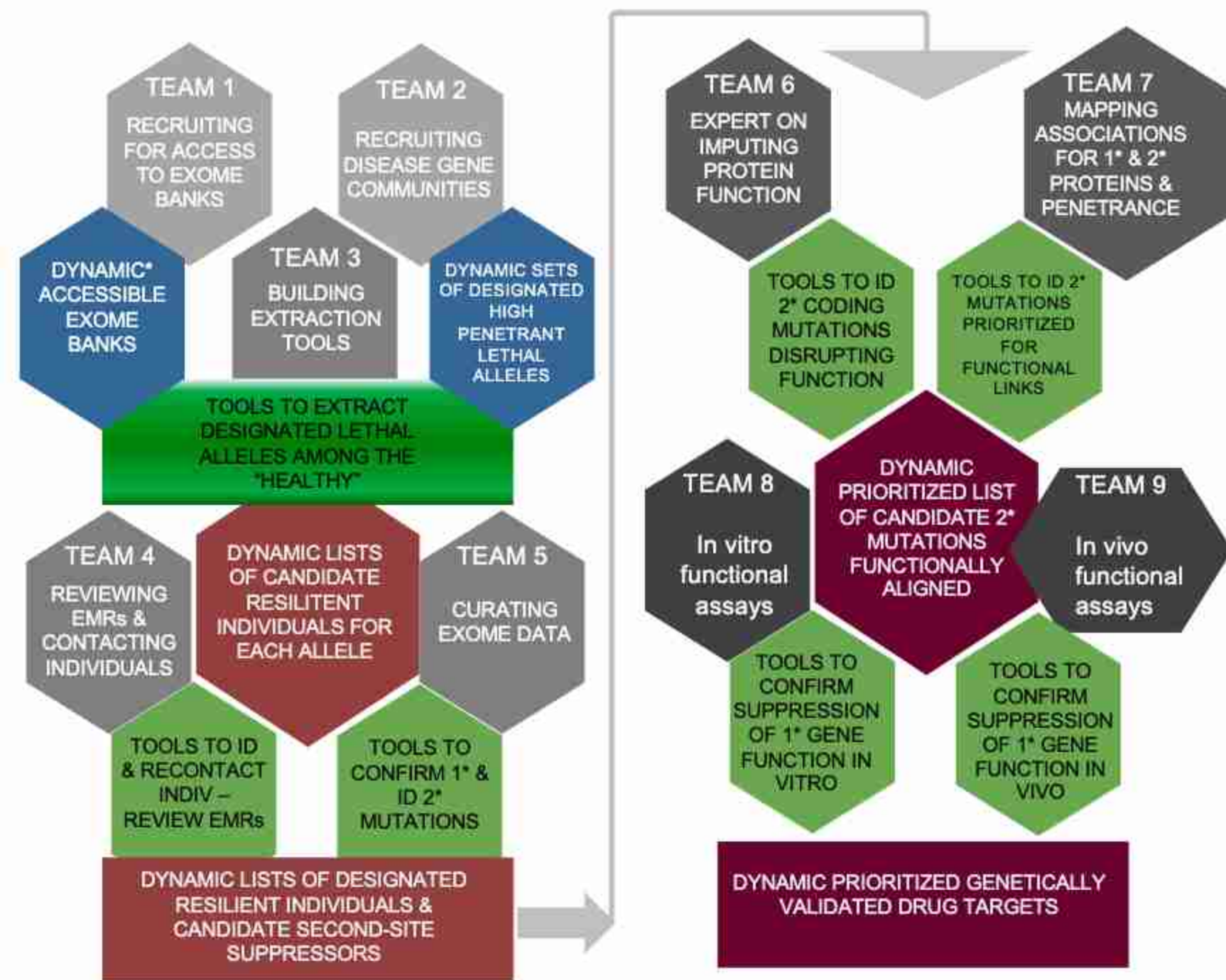
Why is this needed?

- Treatment options for vast majority of the 5000+ genetic diseases with known mutations are too often non-existent or very limited
- Identification of targets for altering expression of disease in healthy resilient individuals has the power to open up treatment in the indicated disease space for small molecules
- Increasing scales of exome/genome data with linked EHR and patient contact available
- No groups systematically searching for resilient individuals outside of affected families where power to identify and decode individuals is a function of big sample sizes (so data need to be brought together)
- Tools to sort through the massive number of mutations to ID mutations that might disrupt function and be relevant using emerging ML methods is becoming more effective
- Coordinated teams are needed to translate interesting findings of resilience to validated second site suppressors poised to be targets for small molecule drug discovery/development

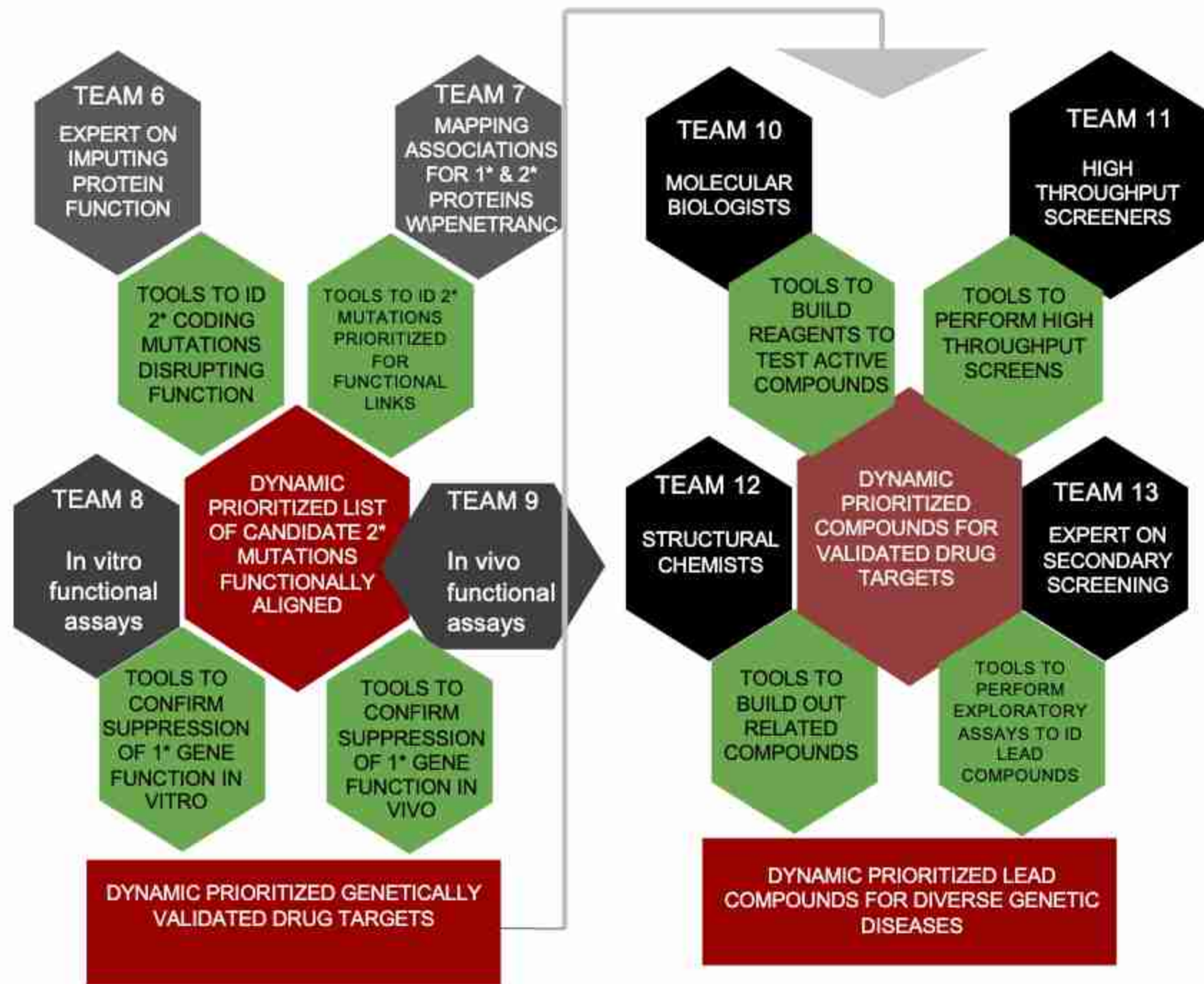
Identifying and Decoding Resilient Individuals



Lists of mutations identified
in "Resilient" Individuals



“Validated” Potential
Drug Targets

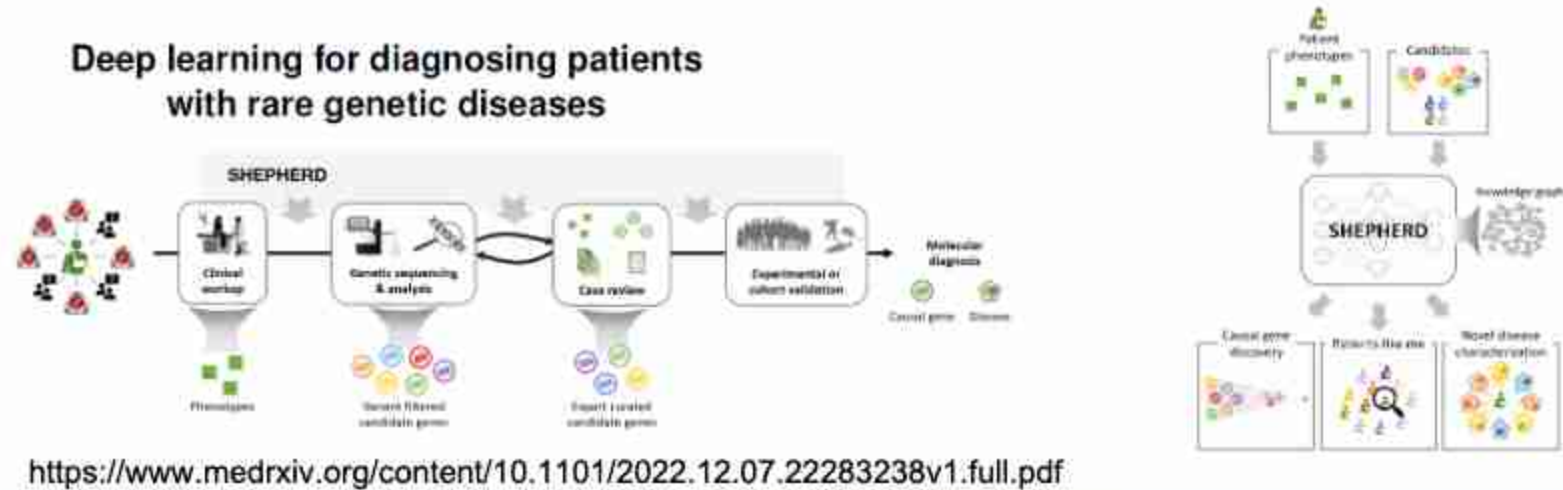


Potential
“Lead” Compounds

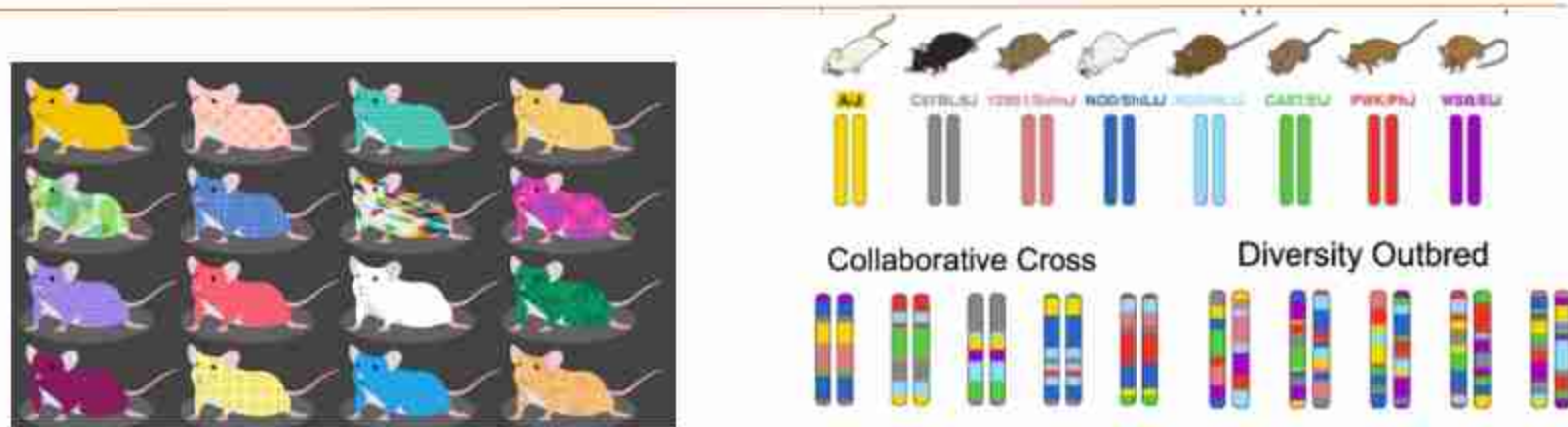
Draft RP2.0 “teams of experts” to help identify ideal RP2.0 partners and teams

- Team 1 - Recruiting access to re-contactable Exome databases
 - Potential members: Geoff Ginsburg- NIH All of Us, Tom Maniatis- NY Genome Center, ?John Bell- Oxford University, UK BioBank, ?Aarno Palotie- FinnGen, John Spiro- Simons Foundation,
- Team 2 - Primary gene/allele selection: Coordinate initial designated gene/alleles across genome driven by genetic communities committed to be advocates and identify apparent existing resilient individuals
 - Potential members: ?Francis Collins- Bruce Gelb- MSSM, Daniel MacArthur- Garvan Institute, NIH Mol Genetics Section, ?Gary Cutting- JHMU, ?Caroline Wright
- Team 3 - Building Extraction tools
 - Potential members: TBD
- Team 4 - Contacting candidate resilient individuals and linking with EMR records
 - Potential members: Diego Chowell- MSSM,
- Team 5 - Curating Exome data
 - Potential members: Daniel Jordan- MSSM
- Team 6- Experts on imputing loss of protein function
 - Potential members: ?Demis Hassabis- Deep Mind-AlphaFold, Peter Kim- Stanford
- Team 7- Experts for Mapping Associations for primary and secondary proteins and considering “penetrance”
 - Potential members: Cori Bargman- Rockefeller, David Fajgenbaum- U Penn, EverCure. Huda Zhohbi, Baylor,

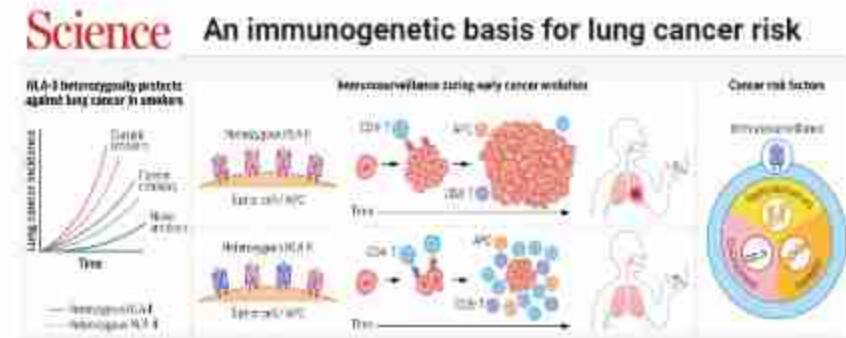
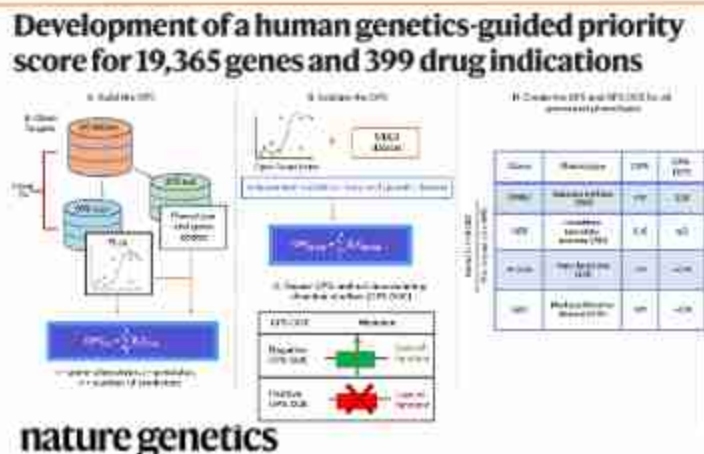
Baylor employing state of the art **AI tools and advanced experimental systems to uncover causal rare disorder disease genes** and a want to apply to discovery of resilience factors



Nadia Rosenthal at JAX employing advanced cohorts of **diversity strains of mice to uncover resilience factors** for disease



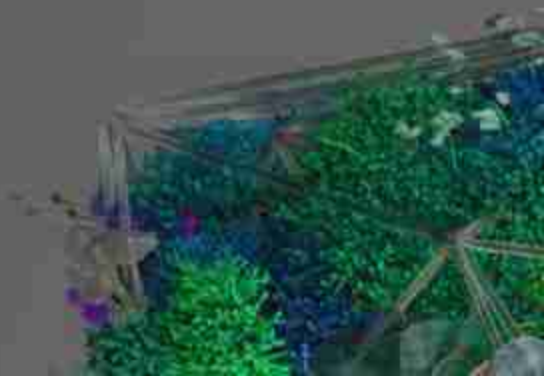
Diego Chowell and Daniel Jordan at Mount Sinai employing **machine learning approaches to integrating variant information with EMR data** to discovery new drivers of disease and resilience



Current Lessons and Puzzles in Resilience Project 2.0

-Navigating uncharted territories

- 1- How and where to host the distributed project
- 2- Virtually all teams have serious sets of unknown unknowns
- 3- Facing social moral issues- how to best unlock cloistered genome data
- 4- Sorting functional links for second-site suppressor candidates
- 5- Chance to highlight again- context: penetrance

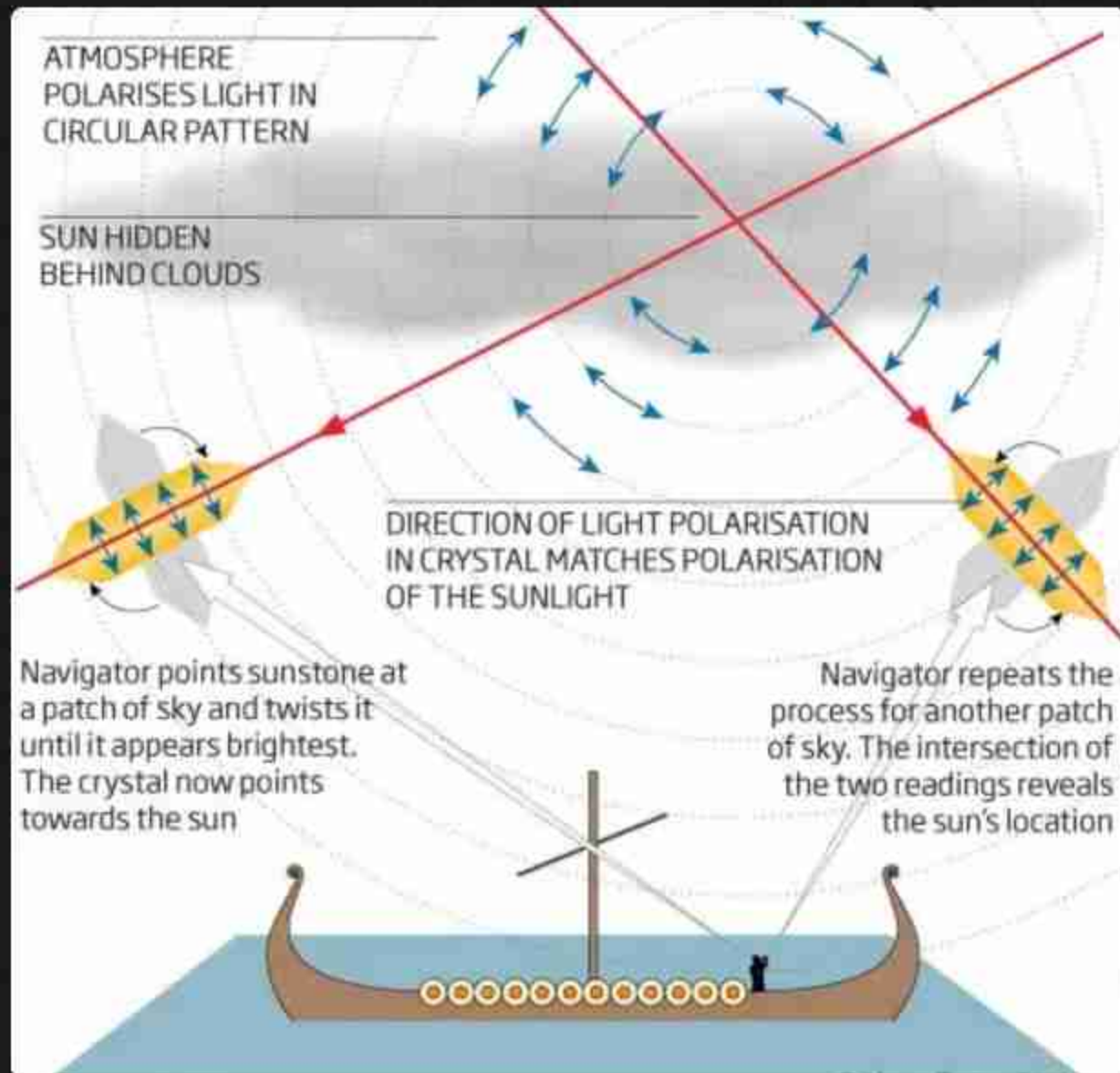


Outline

- 1- Framing- Navigation of uncharted areas
- 2- Emerging lessons from wearables enabling return of agency
- 3- Emerging lessons from -omics driving therapies
- 4- How will navigation of uncharted areas in the future relate to now



✠ how do viking sunstones work



understand
existing
knowledge



build and
employ
new tools

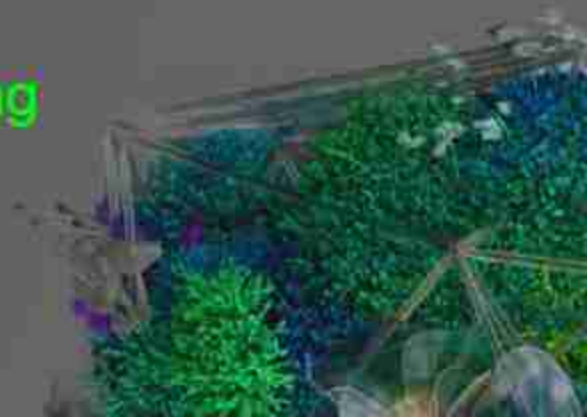
ask
novel
questions

entertain
new methods
of questioning

scale of data forcing navigation via knowledge graphs requiring framing

speed of hypothesis generation

contextual micro-validations

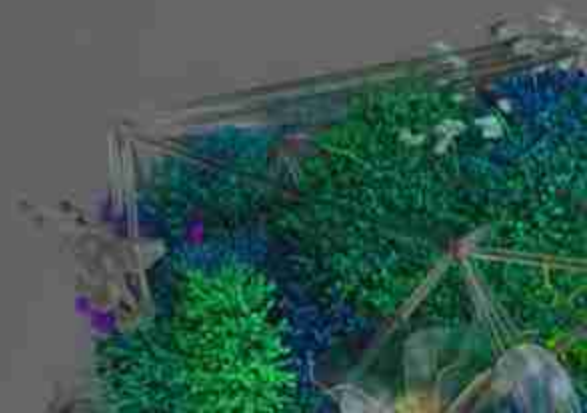


USERS BEWARE

Oppenheimer's Syndrome

beware of what you build for the good of humankind

The power to forecast an individual's health trajectories will place an awkward tension between giving individuals free-will/ freedom to act and the known good for the social group



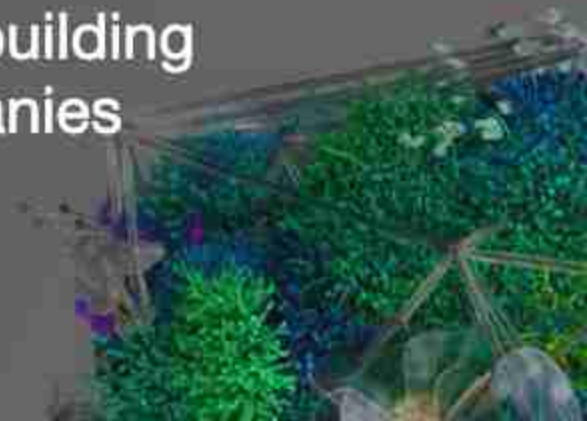
Outline

- 1- Framing- Navigation of uncharted areas
- 2- Emerging lessons from wearables enabling return of agency
- 3- Emerging lessons from -omics driving therapies
- 4- How will navigation of uncharted areas in the future relate to now
- 5- Opportunities for SciLifeLab



Opportunities for SciLife Lab

- 1- Become even more of a virtual distributed convener- beyond ownership
- 2- Designate self as owner of “Hilbert’s Questions” for LifeSciences
- 3- Invert current power structure- Researcher-Clinician-Patients where re-optimized so that individuals can co-navigate their interventions
- 4- Fuse the powerful reductive disciplines (omics EHRs etc.. with integrative longitudinal data from wearables
- 5-Offer a contrarian “by each other for each other” model for building generative data (sidestepping being serfs for large tech companies in this the emerging age of techno-feudalism)





Discussion

Hilma af Klint