



Bringing scientists to data

(to accelerate discoveries and improve human health)

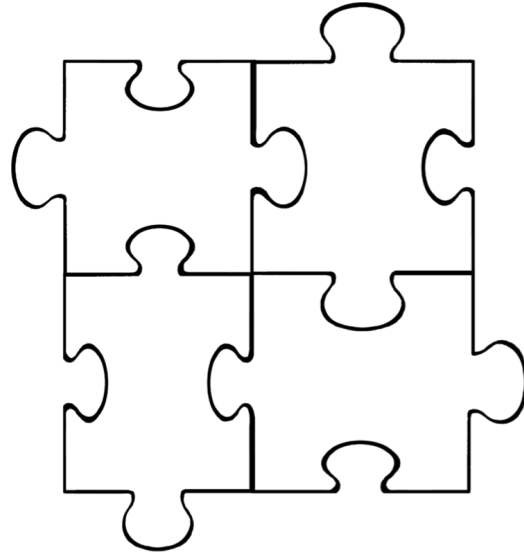
Somalee Datta, PhD
Director Research IT,
SoM Information Resources & Technology

Can we enable exploration on bigger data,
faster analysis and cheaper hypothesis
testing?

System engineering approach to “bigger/faster/cheaper”

Findable, Accessible,
Interoperable, and
Reusable data

Privacy protecting data
sharing across silos



Research ethics,
and compliance

Secure workspaces
to interact with data

Ethics and Compliance

&

Privacy protecting data sharing

Ethics & Compliance



In Sep 1999, teenager Jesse Gelsinger died in a gene therapy trial at UPenn.

“But even one lapse is one too many.” - Donna Shalala, Secretary of the U.S. Department of Health and Human Services, NEJM, 2000



WHO NEEDS HUMAN SAFETY, ANYWAY? —

University could lose millions from “unethical” research backed by Peter Thiel

With nudge from federal regulators, an internal investigation found big problems.

BETH MOLE - 11/14/2017, 4:10 PM



SCIENCE —

Bucking FDA, Peter Thiel funds “patently unethical” herpes vaccine trial

Why is privacy a hard problem?

Probability of re-ID w/ gender known:

	5 digit zip code	County
YYYY	0.2 %	0.0%
MM / YYYY	4.2 %	0.2%
MM / DD / YYYY	63.3 %	14.8%

P. GOLLE: Proceedings of the 5th ACM Workshop on Privacy in the Electronic Society. **2006**: 77-80.



Security & Privacy
Workshop 2017

Track 1: Develop **privacy preserving patient linkage** technique

Track 2: Develop scalable solutions using **SGX secure hardware** to enable genome variants search

Track 3: Develop **Homomorphic Encryption based ML techniques** over encrypted data

More @ <http://med.stanford.edu/gapp.html>

Biomedical data analysis
brings novel benefits to
human health

Predictive Analytics with 10-20 years of EHR data

IEEE BIBM 2017

IEEE International Conference on Bioinformatics and Biomedicine
Kansas City, MO, USA, November 13 - 16, 2017

Improving Palliative Care with Deep Learning

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MIT Tech Review

@techreview

Following

Researchers from Stanford have designed a deep neural network that can look at a patient's health records and estimate the chance of mortality in the next three to 12 months.

More than 60% of deaths in the US happen in an acute care hospital. This predictive model helps the Palliative Care team to be engaged early enough to ensure meaningful services.

Genome based diagnosis coming to you

Built on a platform that allows rapid
turnaround from experimentation to
productization



Genome in a Bottle
Consortium



Global Alliance
for Genomics & Health



Google
Cloud Platform



docker



Stanford
MEDICINE



Stanford
Children's Health



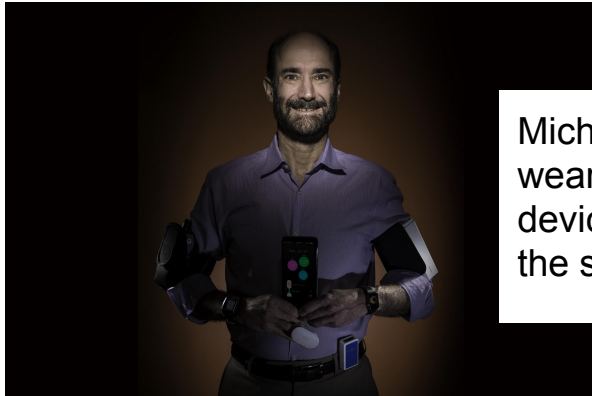
Stanford
HEALTH CARE

- Combines research excellence with operational delivery
- Public-Private partnership
- Pilot launched in Jan 2014
- Production in Jan 2018
- Genome and exome sequencing
- Three major disease areas:
 - Pediatric and adult syndromes
 - Heritable cancer predisposition
 - Heritable cardiovascular disease

Future is now!

Built for the Future. Study Shows Wearable Devices Can Help Detect Illness Early

Posted on January 17, 2017 by [Dr. Francis Collins](#)



Michael Snyder wearing multiple devices used in the study

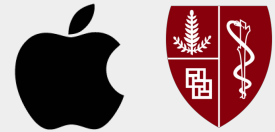
More @ <http://stan.md/2AldJLE>

Apple Watch will alert heart-study participants if they have an irregular beat

[Edward C. Baig](#), USA TODAY Published 3:40 p.m. ET Nov. 30, 2017 | Updated 4:20 p.m. ET Nov. 30, 2017



AFib, the leading cause of stroke, is responsible for approximately 130,000 deaths and 750,000 hospitalizations in the US every year.



American Well[®]
BioTelemetry_{INC}

More @ <http://stan.md/2iw97f0>

Imaging data - Radiology

CheXNet: Radiologist-Level Pneumonia Detection on Chest X-Rays with Deep Learning

Pranav Rajpurkar^{*1} Jeremy Irvin^{*1} Kaylie Zhu¹ Brandon Yang¹ Hershel Mehta¹
Tony Duan¹ Daisy Ding¹ Aarti Bagul¹ Curtis Langlotz² Katie Shpanskaya²
Matthew P. Lungren² Andrew Y. Ng¹

(Algorithm + Radiologist) is better than (Radiologist)

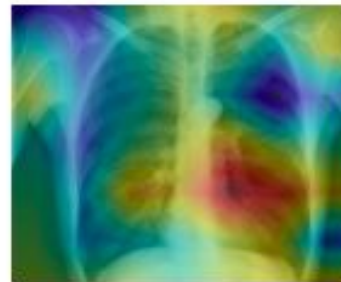
Stanford researchers develop convolutional neural network algorithm that can diagnose up to 14 types of medical conditions based on chest x-ray image.



Input
Chest X-Ray Image

CheXNet
121-layer CNN

Output
Pneumonia Positive (85%)



Potential to make planet scale impact

JAMA | **Original Investigation** | INNOVATIONS IN HEALTH CARE DELIVERY

Development and Validation of a Deep Learning Algo for Detection of Diabetic Retinopathy in Retinal Fundus Photographs

Varun Gulshan, PhD; Lily Peng, MD, PhD; Marc Coram, PhD; Martin C. Stumpe, PhD; Derek Wu, BS; Arunachalam Narayanaswamy, PhD; Subhashini Venugopalan, MS; Kasumi Widner, MS; Tom Madams, MEng; Jorge Cuadros, OD, PhD; Ramasamy Kim, OD, DNB; Rajiv Raman, MS, DNB; Philip C. Nelson, BS; Jessica L. Mega, MD, MPH; Dale R. Webster, PhD

TOM SIMONITE BUSINESS 06.07.17 3:50 PM

GOOGLE'S AI EYE DOCTOR GETS READY TO GO TO WORK IN INDIA

WIRED



400 million diabetic patients in world;
70 million in India; 30% estimated to
develop DR

“Piloting this AI-based diagnosis is Aravind Eye Hospital, the largest eye care provider in India. Aravind Eye Hospital contributed to Google’s research by providing images of DR patients.” - Forbes, Sep 5, 2017

Standing upon shoulders of giants ...

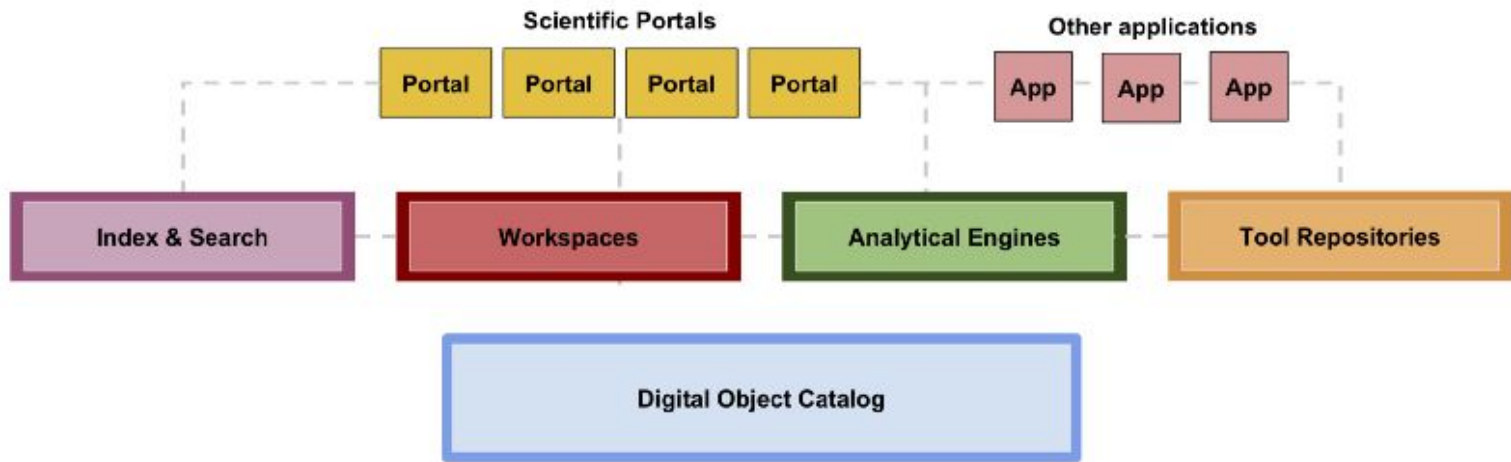
NIH BD2K “Data Commons”

Monday, November 6, 2017

NIH awards to test ways to store, access, share, and compute on biomedical data in the cloud

NIH Data Commons Pilot Phase to seek best practices for developing and managing a data commons.

- 12 awards form nucleus of an NIH Data Commons Pilot Phase Consortium
- \$9 Million in 2017
- Using public clouds



Sage Bionetworks approach to Open Research



The Digital Mammography DREAM Challenge

Build a model to help reduce the recall rate for breast cancer screening

Learn more & register to participate here: www.synapse.org/Digital_Mammography_DREAM_Challenge

Funded by


Enabled by

powered by Sage Bionetworks


powered by Sage Bionetworks


Challenges for improving cancer screening


Research Institute













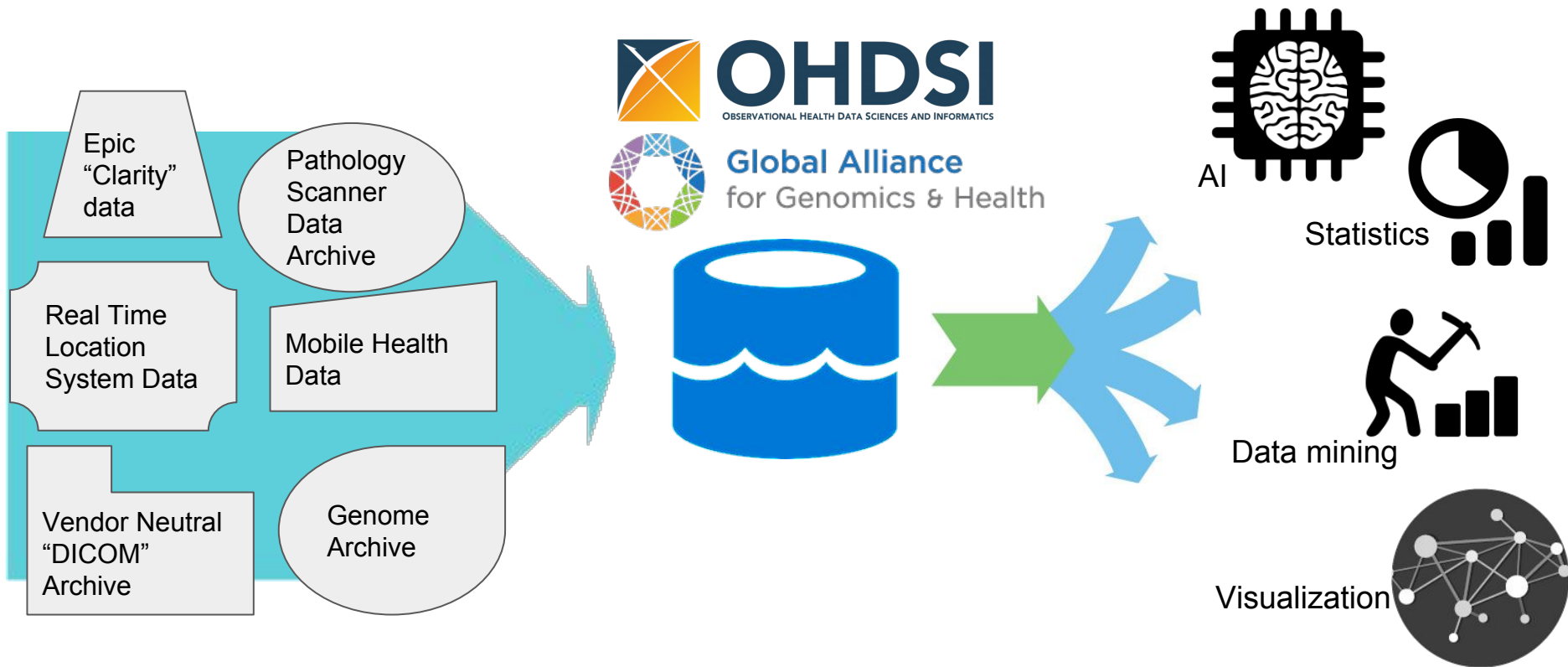
First, design for data sharing

John Wilbanks & Stephen H Friend

To upend current barriers to sharing clinical data and insights, we need a framework that not only accounts for choices made by trial participants but also qualifies researchers wishing to access and analyze the data.

Stanford approach

Findable, Accessible, Interoperable, Reusable



Secure workspaces to interact with data



Stanford Data Center at SLAC



Research Privacy, Ethics and Compliance

For a single dataset:

- Data Use Agreement
- Access “life-cycle” management
- Compliance requirements e.g. IRB approval, HIPAA training
- Track use



For a single user:

- Single pane of view to data access status
- Data flyby - metadata, counts, quality checks, versions
- Access to data experts
- Access to research community



Stanford
MEDICINE

Center for Population Health Sciences

More @ <https://redivis.com/StanfordPHS>

Let's build together!

