# Frontiers of Computing and Predictive Oncology

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### Outline

- Computing and Oncology
- Access to Data
- Some questions

### Personal & Professional Background

- PhD in Chemistry at Caltech, Postdoc in molecular genetics of RAS
- Cancer research for 20+ years cancer informatics, data science, healthcare
- Faculty in the Feinberg School of Medicine at Northwestern for 15+ years
- Director NCI CBIIT 2013-2017; Acting NCI Deputy Director 2016-2017
- Lost three grandparents to cancer

# Changes in Computing

- Converged devices
- Converged IT
- Ubiquity of devices, data, mHealth

# Changes in Oncology

- Cancer is a grand challenge
- Anatomic vs molecular classification
- Health vs Disease

# Cancer is a grand challenge

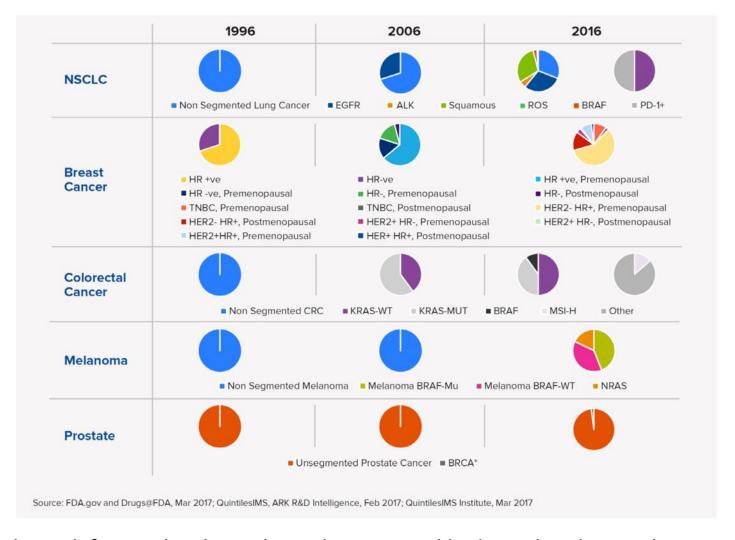


Requires:

- Deep biological understanding
- Advances in scientific methods
- Advances in instrumentation
- Advances in technology
- Data and computation
- Mathematical models

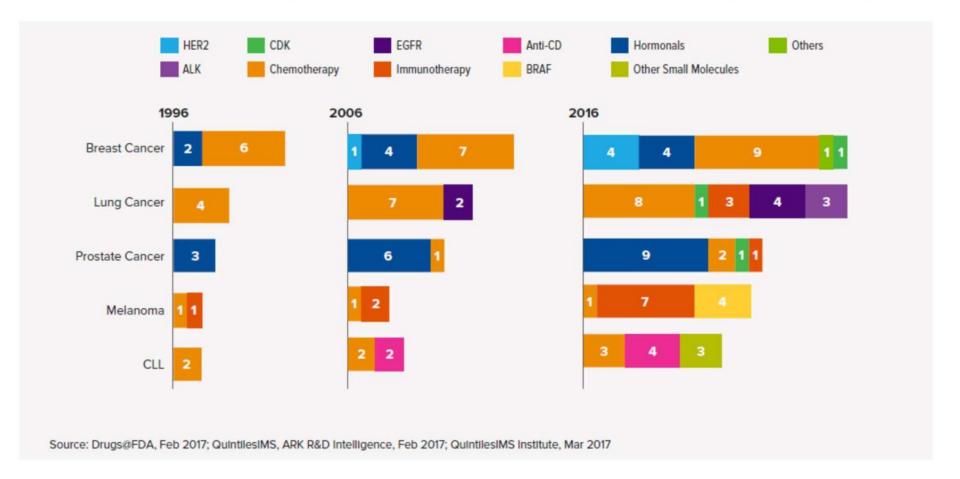
Cancer Research and Care generate detailed **data** that is critical to create a learning health system for cancer

#### Cancer has been progressively redefined over the past 20 years



This redefinition has been driven by improved biological understanding

#### Number of Treatment Options over Time for Selected Tumors (1996–2016)

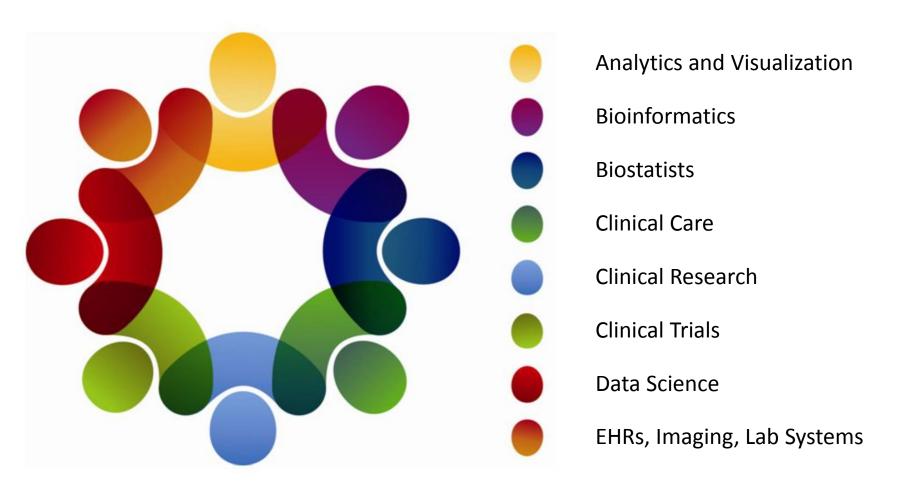


This change has been driven by improved technology - sequencing, imaging, nanotech, drug developing, computing and the availability of data about patient response to therapy

### Health vs Disease

- What is 'normal'?
- Systematic and measurement error
- Biological heterogeneity

### Team Science is critical



Open Data enhances collaboration and team science!

### What we need

- Ability to build, analyze, validate predictive models
- Well annotated and appropriate data sets to use for building, analyzing, and validating predictive models
- Ability to present information in a human relevant, human informative way

Late analysis results do not result in changes in treatment

# Scale is changing!













1 million healthy genomes

2001

2010

2015





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#### A.I. VERSUS M.D.

What happens when diagnosis is automated?

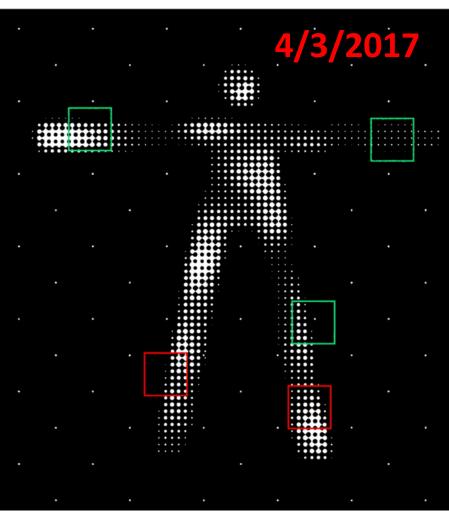
By Siddhartha Mukherjee











### Expert Systems vs Machine Learning

- In 1945, the British philosopher Gilbert Ryle identified two kinds of knowledge factual, propositional knowledge that can be ordered into rules—"knowing that." versus implicit, experiential, skill-based— "knowing how."
- Machine Learning is based on 'learning how'. Expert systems, or rule based machines, are based on 'knowing that'.

### **Human Cognition**

#### Three kinds of learning:

- Learning that rule-based knowledge
- Learning how experiential knowledge
- Learning why integrative, explanatory knowledge

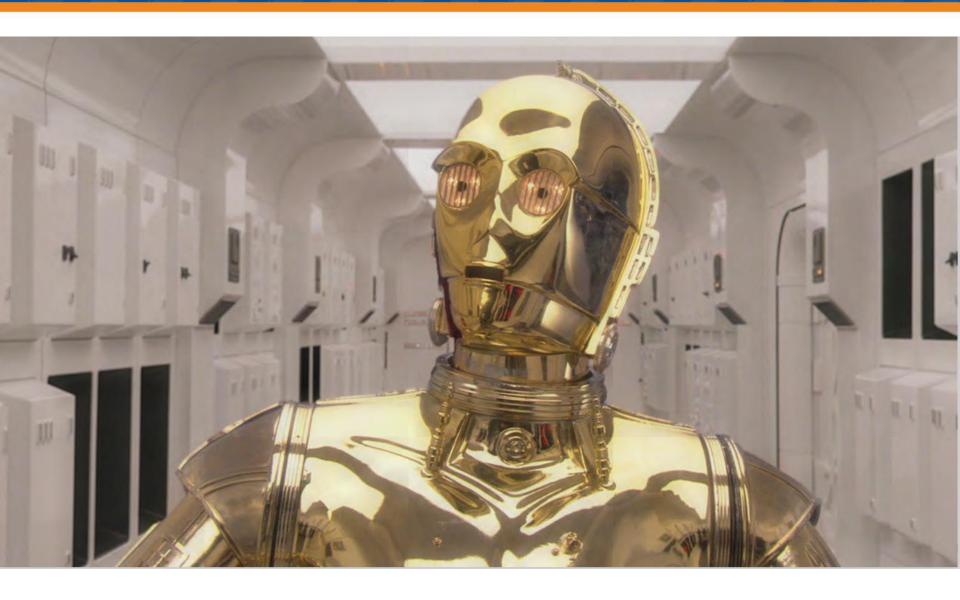
 How do we make data machine readable?

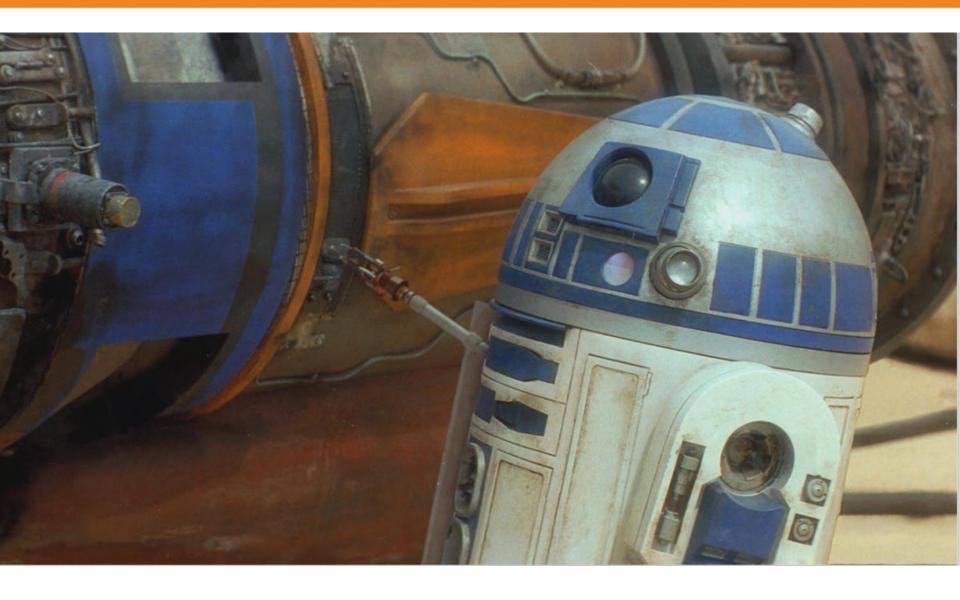
 How do we improve interoperability between instruments, data types, locations, organizations?

 How do we build, improve, validate algorithms, tools, pipelines?

 How do we scale our infrastructure, processing, analytics to provide timely data?

- How do provide data in a cognitively friendly way that helps humans make decisions?
- We need to:
  - Reduce cognitive load
  - Improve data access & 'show your work'
  - Enable timely decision support







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