

# False Precision and Estimating the Reliability of Effects with the Traditional Evidence Generating Process

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# Preface

- What follows is partially a spoof to be consistent with the aura of the meeting
- I do believe that the “traditional” system of evidence generation has delivered medical products and delivery that has had a major impact on life expectancy, physical function and ability to enjoy life
- However, I also believe that the traditional evidence generation system has become bloated and burdened with practices that are damaging because they massively increase cost without improving quality and in many cases making quality worse because the SOPs have become more important than the science of clinical investigation.
- One of the damaging parts of the effort is the “asymptotic” effort to record each data item more precisely in the mistaken notion that a more reliable estimate of treatment effect will be derived for outcomes that matter
- **By a combination of refocusing on quality by design and use of automation and analytical methods, we can dramatically accelerate the generation of evidence while also improving the quality of the result**

# We Believe...

- We are in an explosive phase of science that is making many new approaches to prevention, diagnosis and treatment possible
- The proliferation of technologies is fueling an increase in cost that will demand demonstration of value for new therapies
- The overall rising cost of health care requires an assessment of the value of old therapies already in use, particularly when there is a choice of a more expensive new therapy
- Due to increasing transparency people are more aware of evidence gaps
- The sum result is a dramatic need to answer more questions about therapeutics
- The current evidence generation system has unsustainable costs

# The Old Doctrine..

- Was built at a time when automation was not possible because few electronic data existed
- Doctors wrote things on paper and then as time evolved this information was transferred to a computer
- In order to check that the information worked nurses and others had to fly around on airplanes and check that the information matched
- The regulators devised a doctrine (GCP) to enable these (now) arcane practices to be done in a consistent fashion
- Local experts took the doctrine and amplified it in voluminous SOP's

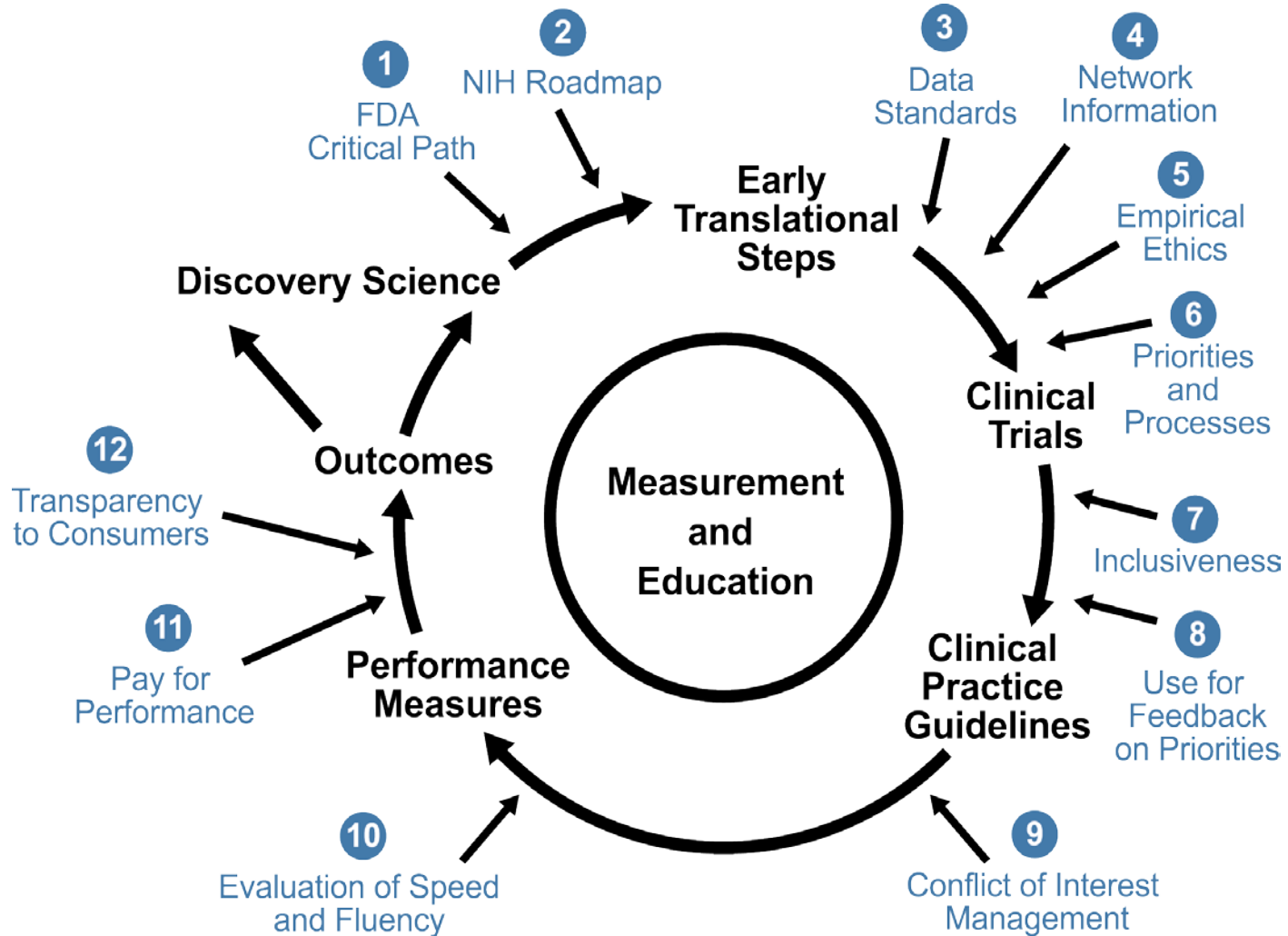
# Thesis

- In a mistaken understanding of the theory and purpose of clinical trials, the regulated clinical trials industry has diverted enormous resources to an effort to increase precision
- The academic/NIH driven clinical research industry has adopted some of this thinking through the proliferation of “GCP”
- Tearing down the structure would be counter-productive—people need structure to conduct these complex human experiments
- To produce reliable clinical trial results that inform patients, carers, doctors (providers), health systems, payors and policy makers, we need to focus on reliable results

# Common Definitions

- Precision
  - the quality, condition, or fact of being exact and accurate.
  - refinement in a measurement, calculation, or specification, especially as represented by the number of digits given.
- Reliable
  - consistently good in quality or performance; able to be trusted.
  - Synonyms: dependable, good, well founded, authentic, valid, genuine, sound, true

# Generating Evidence to Inform Decisions



# Our National Clinical Research System is Well-intentioned But Flawed

- High percentage of decisions not supported by evidence\*
- Health outcomes and disparities are not improving
- Current system is great **except**:
  - Too slow, too expensive, and not reliable
  - Doesn't answer questions that matter most to patients
  - Unattractive to clinicians & administrators

**We are not generating the evidence we need to support the healthcare decisions that patients and their doctors have to make every day.**



# Which Treatment is Best for Whom?

High-Quality Evidence is Scarce

< 15% of Guideline Recommendations Supported by  
High Quality Evidence

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 ORIGINAL CONTRIBUTION

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## Scientific Evidence Underlying the ACC/AHA Clinical Practice Guidelines

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Joseph M. Allen, MA

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Judith M. Kramer, MD, MS

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Robert M. Califf, MD

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Sidney C. Smith Jr, MD

**C**LINICAL PRACTICE GUIDELINES are systematically developed statements to assist practitioners with decisions about appropriate health care for spe-

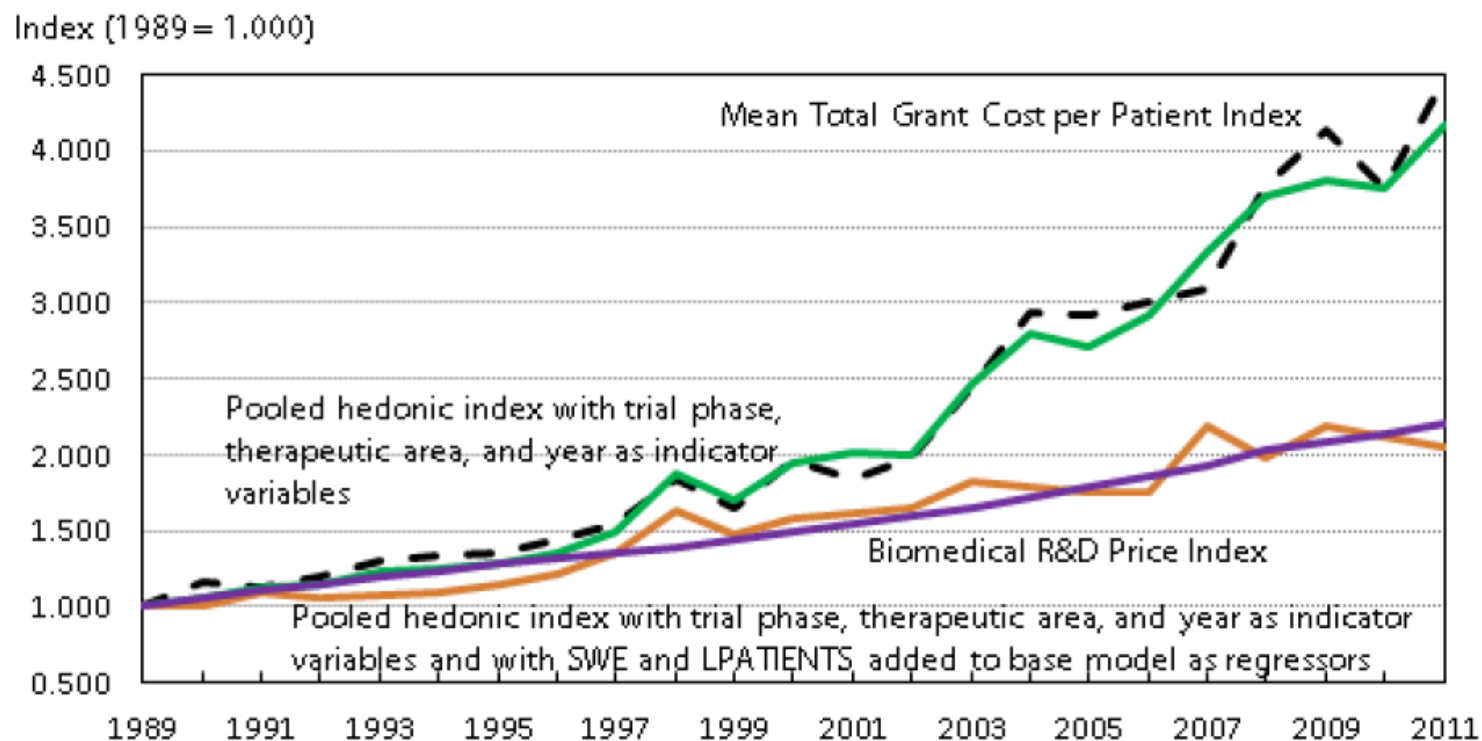
**Context** The joint cardiovascular practice guidelines of the American College of Cardiology (ACC) and the American Heart Association (AHA) have become important documents for guiding cardiology practice and establishing benchmarks for quality of care.

**Objective** To describe the evolution of recommendations in ACC/AHA cardiovascular guidelines and the distribution of recommendations across classes of recommendations and levels of evidence.

**Data Sources and Study Selection** Data from all ACC/AHA practice guidelines issued from 1984 to September 2008 were abstracted by personnel in the ACC Science and Quality Division. Fifty-three guidelines on 22 topics, including a total of 7196 recommendations, were abstracted.

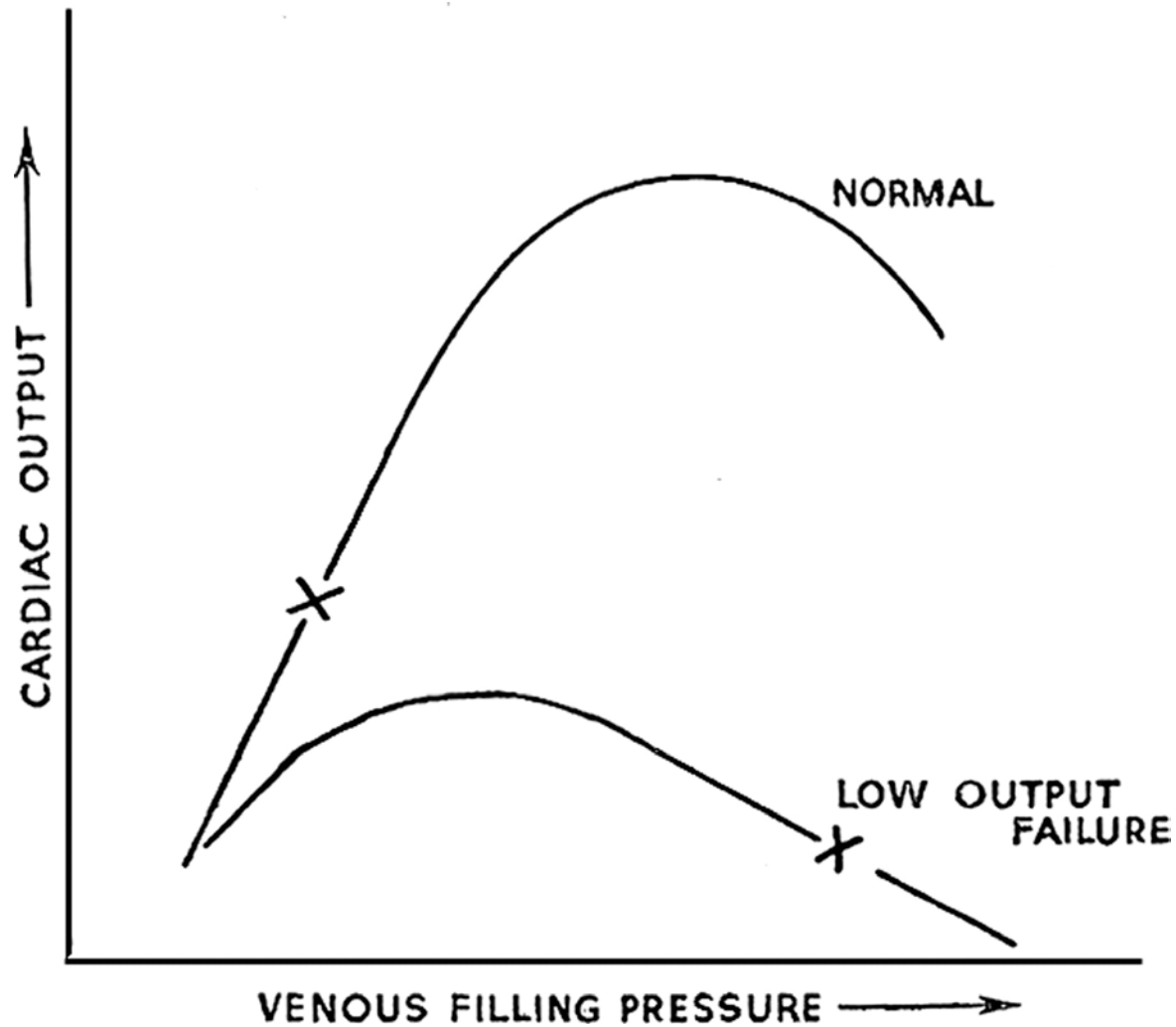
# Trial Hyperinflation

**Figure 3. Mean Total Grant Cost per Patient Index, Biomedical R&D Price Index, and pooled hedonic indexes, 1989–2011**



Source: Authors' calculations based on Medidata Solutions, Inc.'s, PICAS<sup>®</sup> database.

Figure 3. Diagram illustrating the failing heart operating on the descending limb of the Starling curve.



Arnold M. Katz *Circ Heart Fail.* 2008;1:63-71

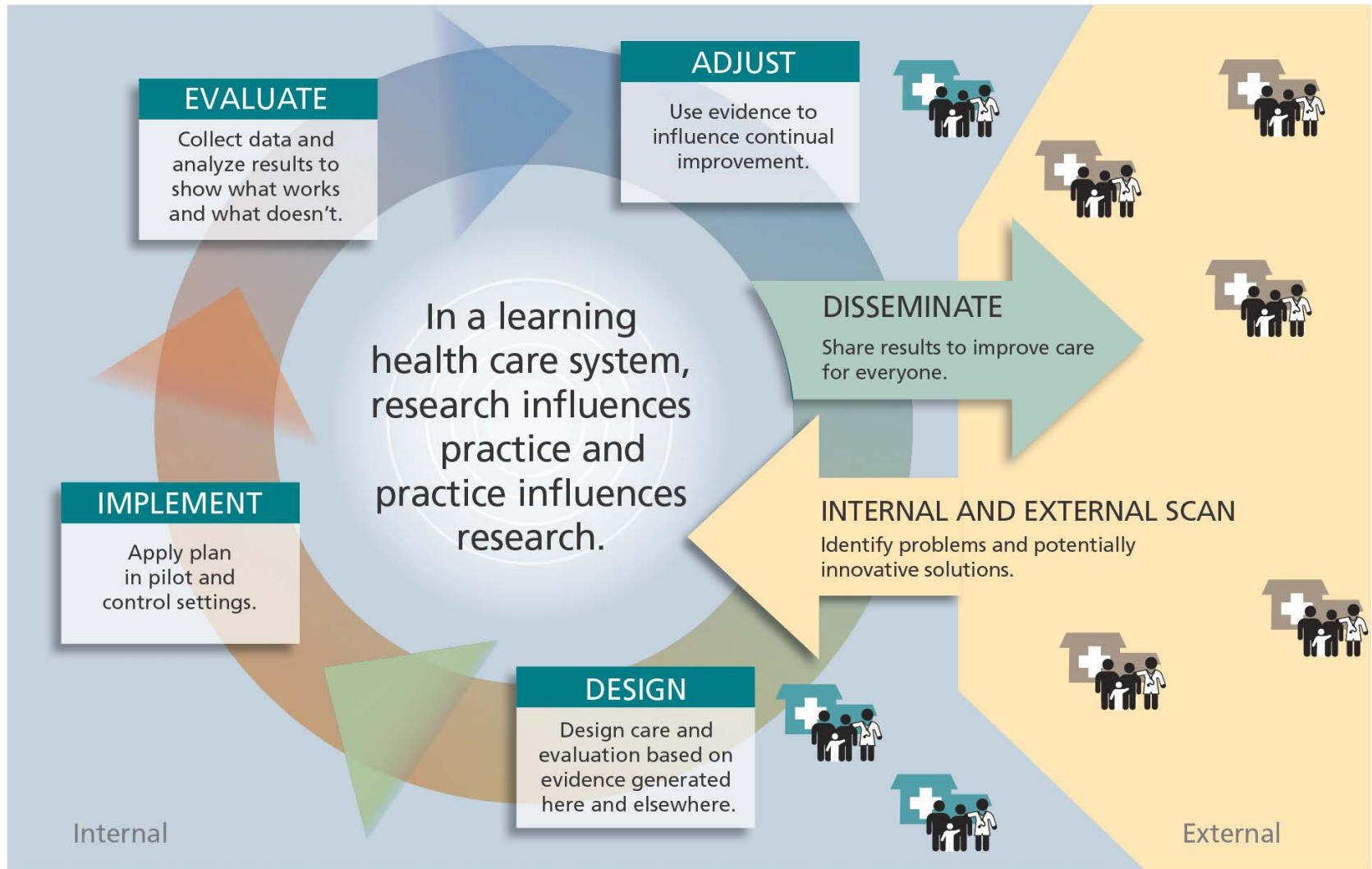
# Definition of “Real World Evidence” — The Law

- **§355g. Utilizing real world evidence**
- **(a) In general**
- The Secretary shall establish a program to evaluate the potential use of real world evidence-
- (1) to help to support the approval of a new indication for a drug approved under section 355(c) of this title; and
- (2) to help to support or satisfy postapproval study requirements.
- **(b) Real world evidence defined**
- In this section, the term "real world evidence" means data regarding the usage, or the potential benefits or risks, of a drug derived from sources other than traditional clinical trials.

# Key Elements to Get a New Start

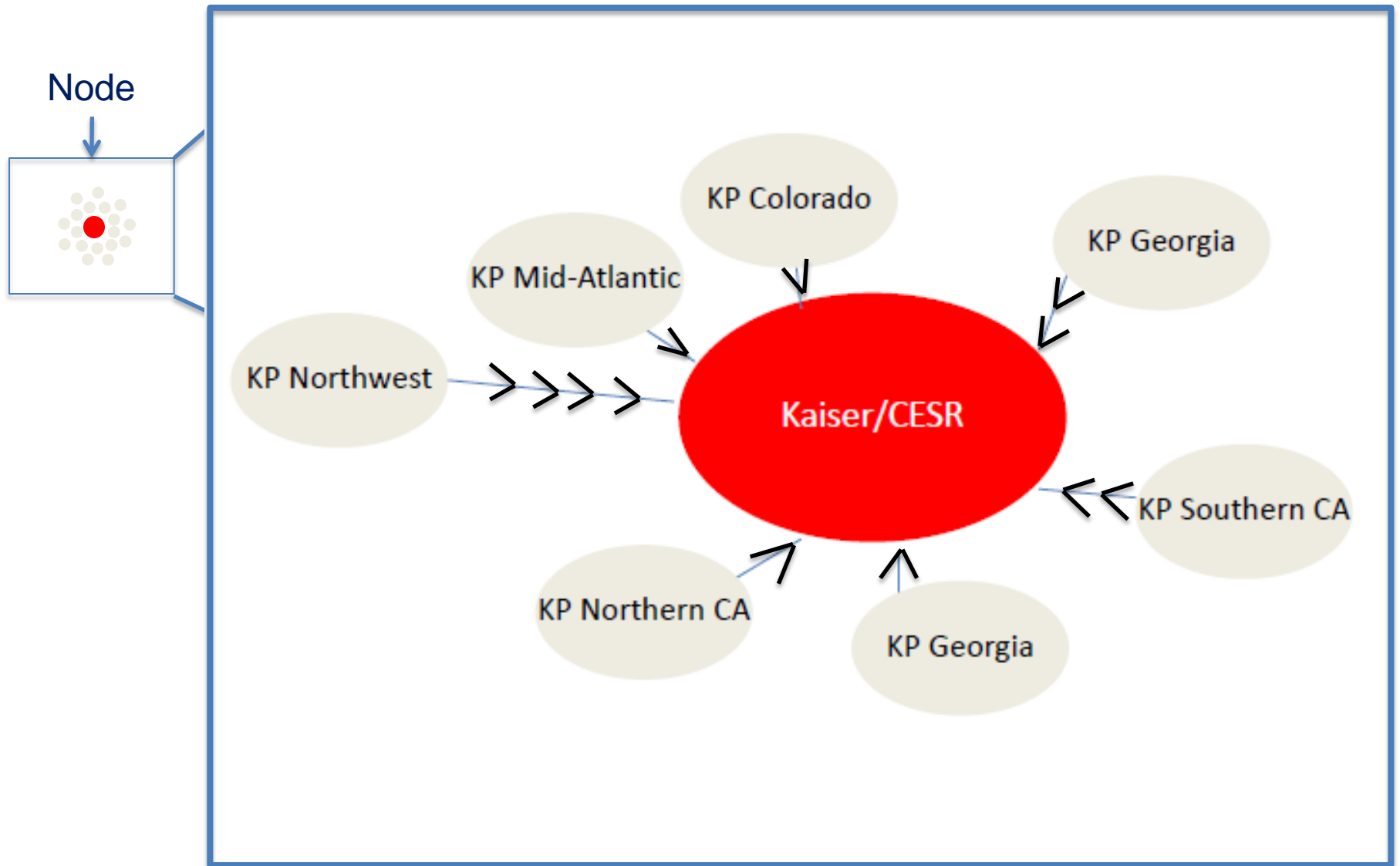
- **Build a reusable system embedded in practice**
- Use quality by design
- Use automation for repetitive tasks
- Operate from basic principles

# Learning health care systems



Public private partnerships are  
developing that could generate  
reliable evidence rapidly

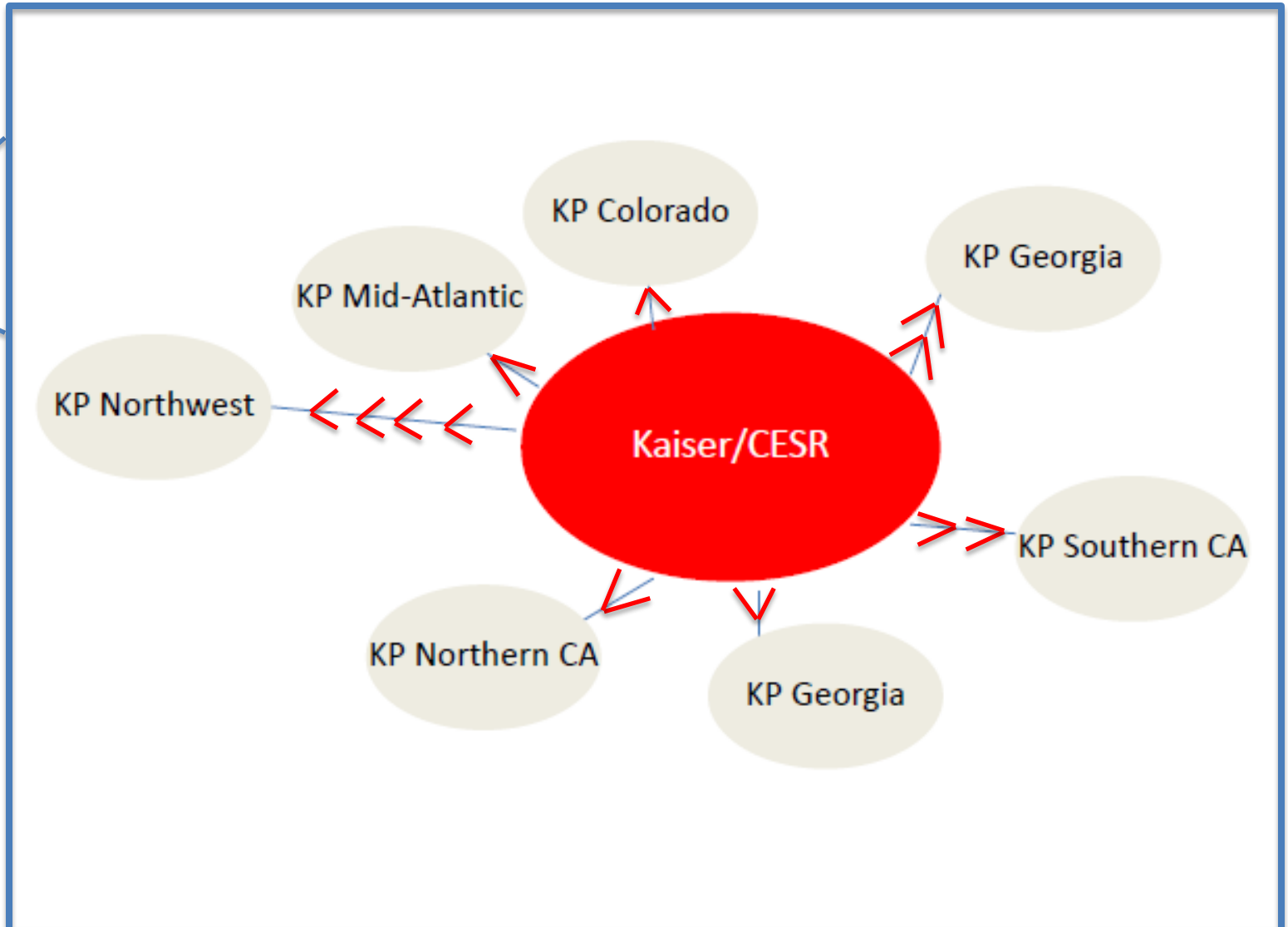
**Previously Independent Sites now part of large integrated health systems**  
**increasingly sophisticated data warehouses**



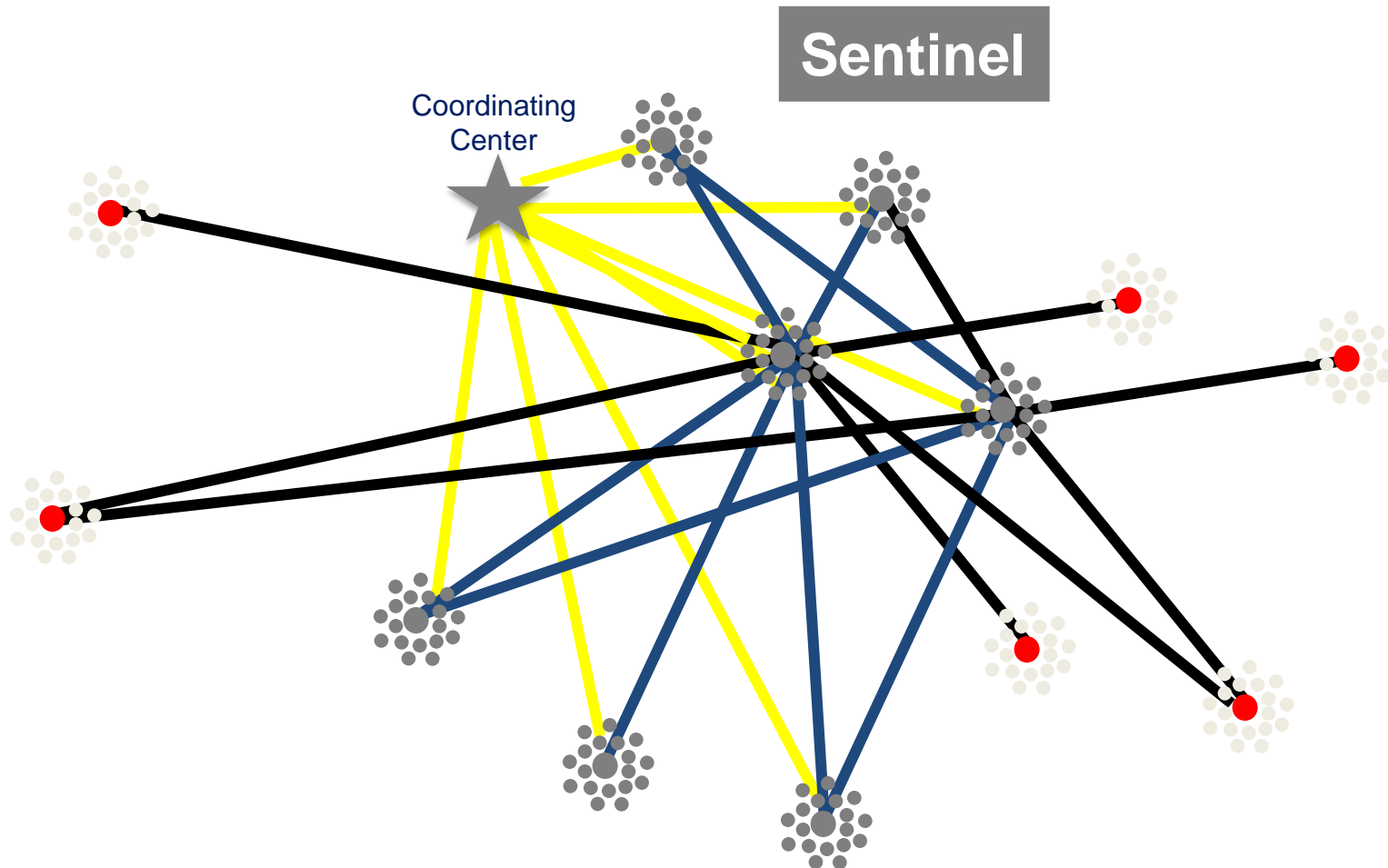


# Nodes are Operational Clusters Using Common Data

Node

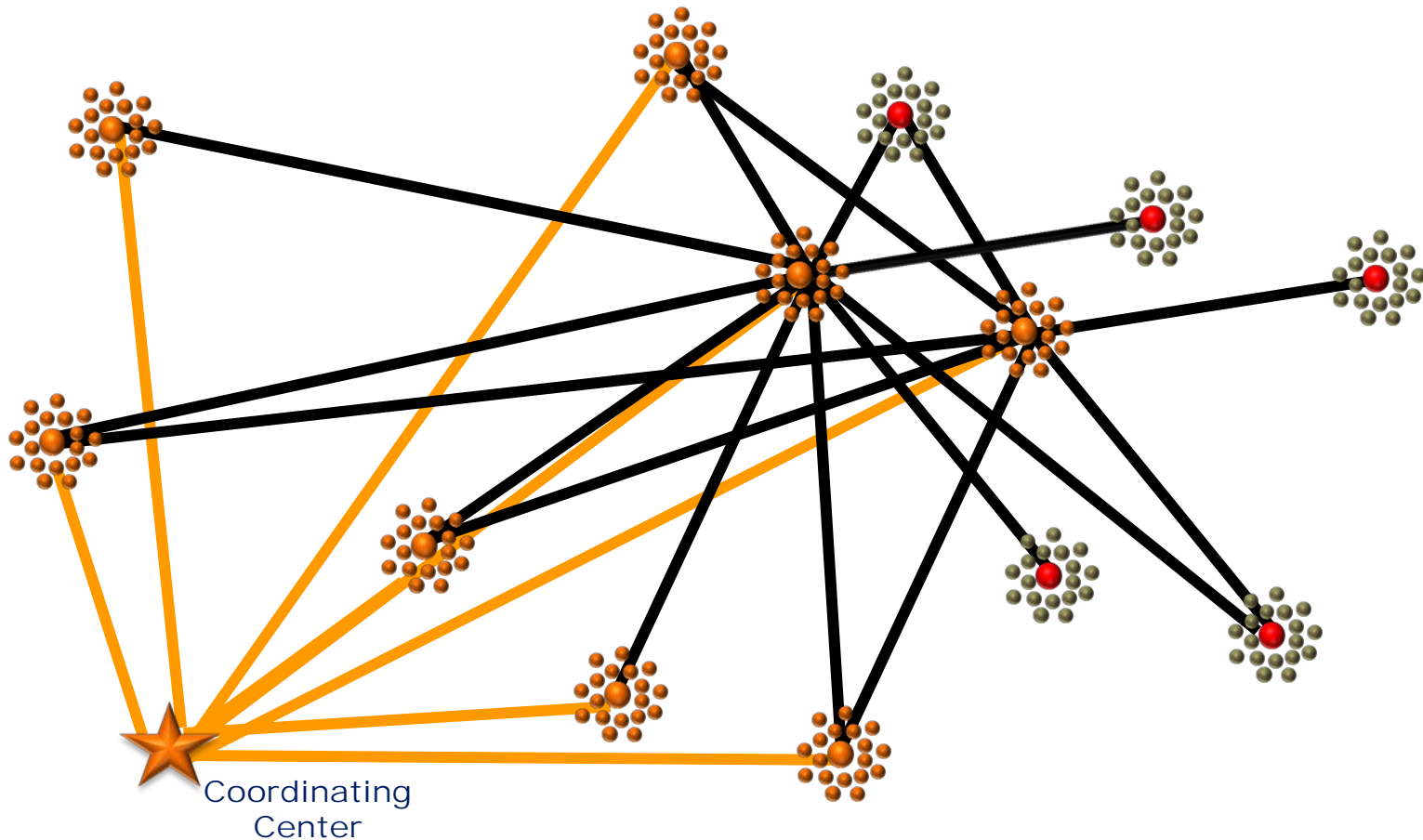


# Drug Surveillance and Trials



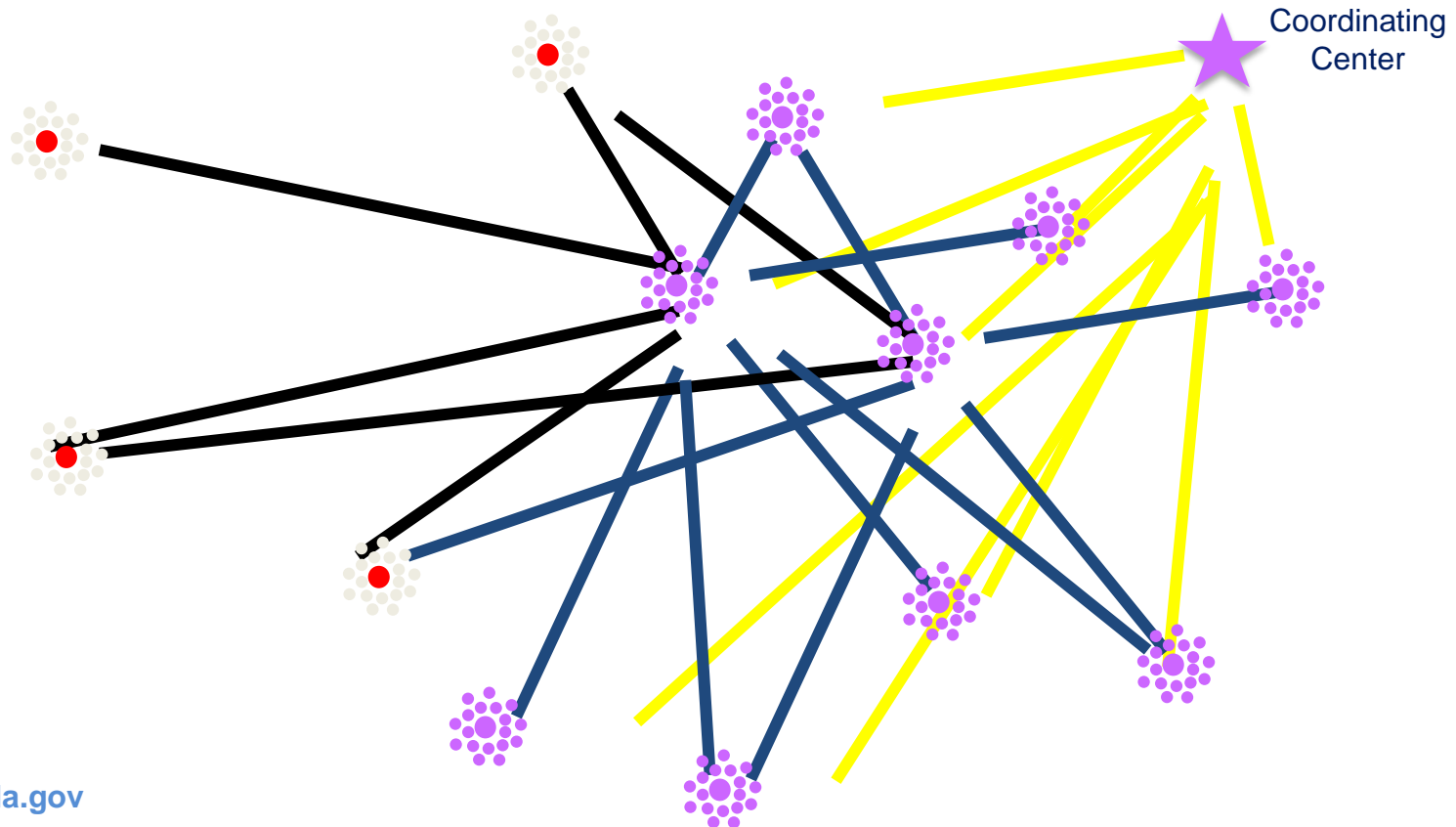
# Device Surveillance and Trials

NEST

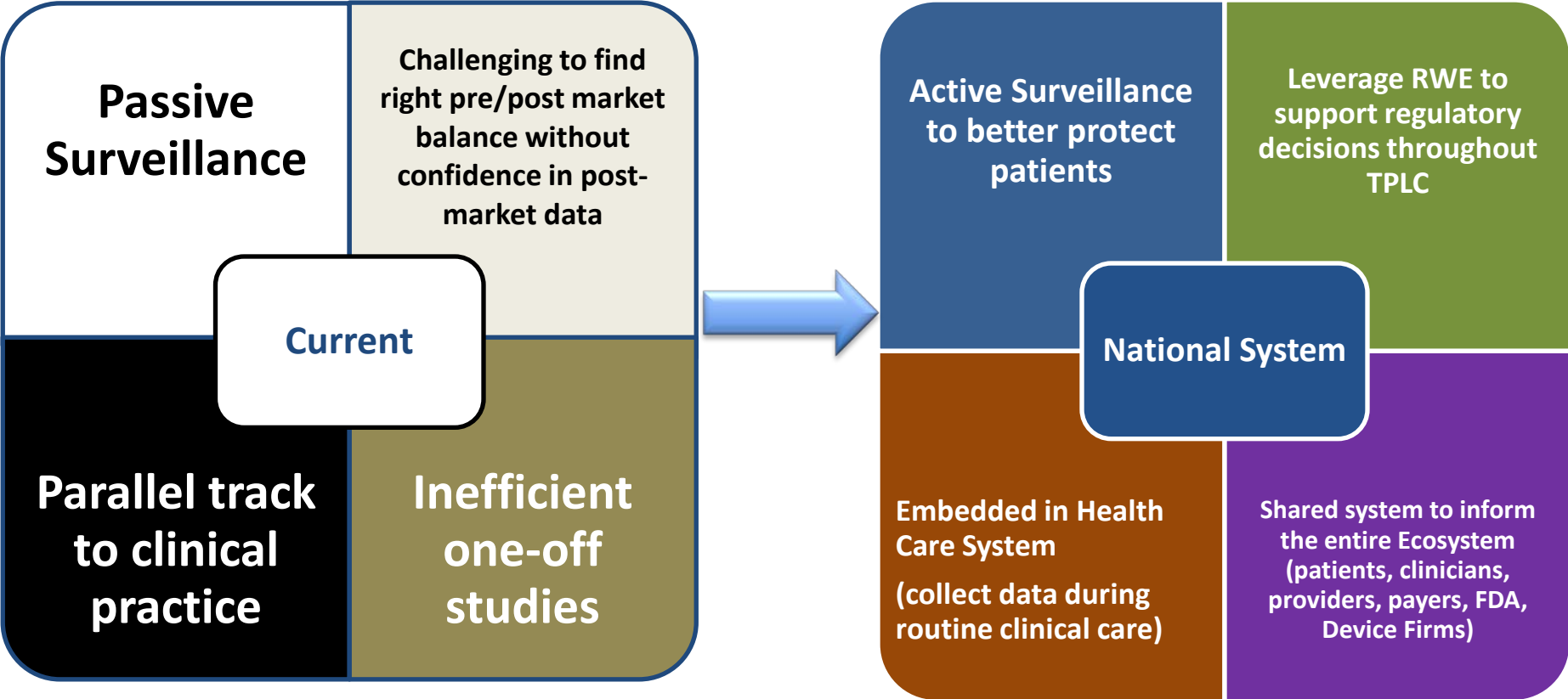


# Post Market Studies, including comparative effectiveness

PCORnet



# National System Paradigm Shift



# Demonstration Project Overview-NIH Healthcare Systems Research Collaboratory

10 Demonstration Projects  
spanning 12 NIH institutes  
and centers

Major clinical outcome trials

1-year planning phase (UH2)

Implementation phase (UH3)

Using EHRs and minimal  
additional data collection

Log order reduction in cost



# Key Elements to Get a New Start

- Build a reusable system embedded in practice
- **Use quality by design**
- Use automation for repetitive tasks
- Operate from basic principles

# What Is Quality by Design?

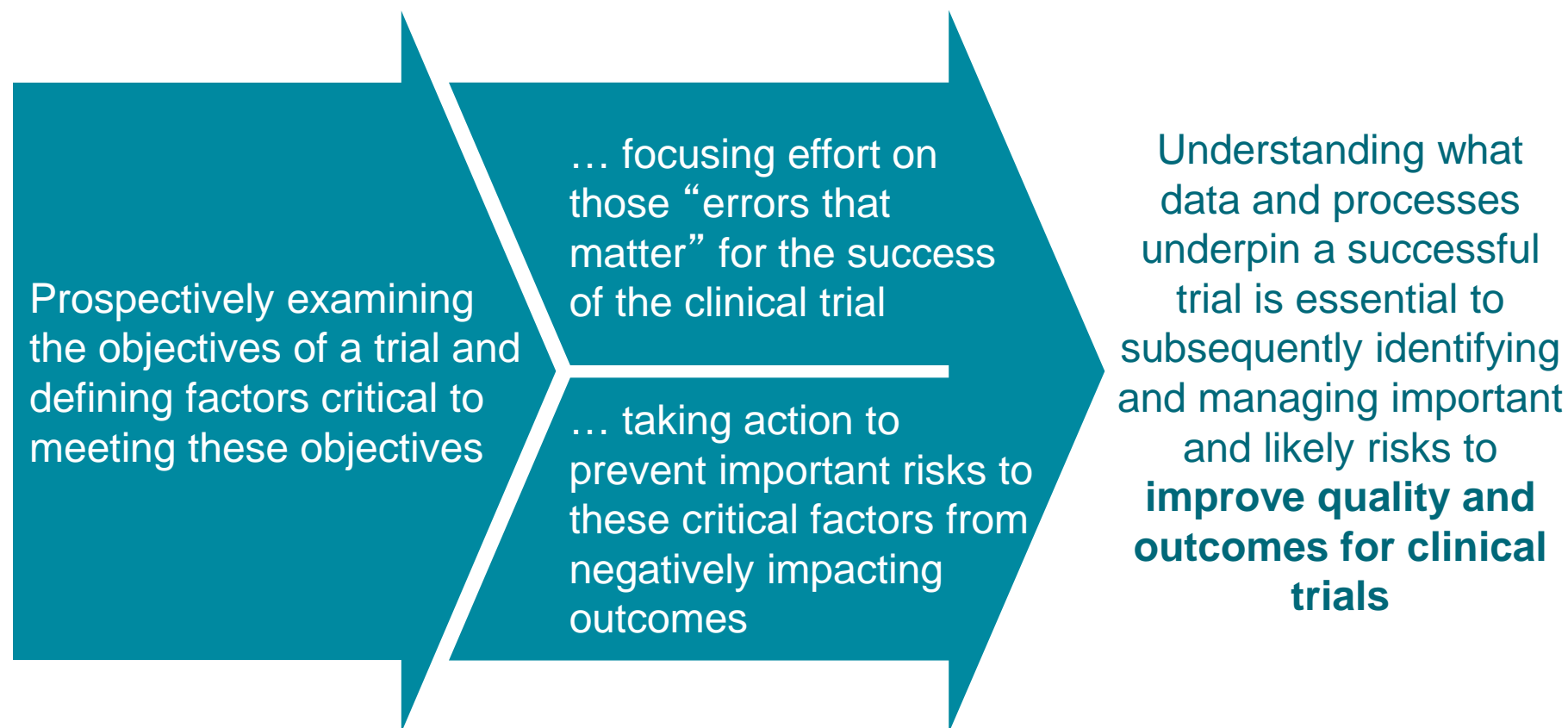


CLINICAL  
TRIALS  
**TRANSFORMATION**  
INITIATIVE

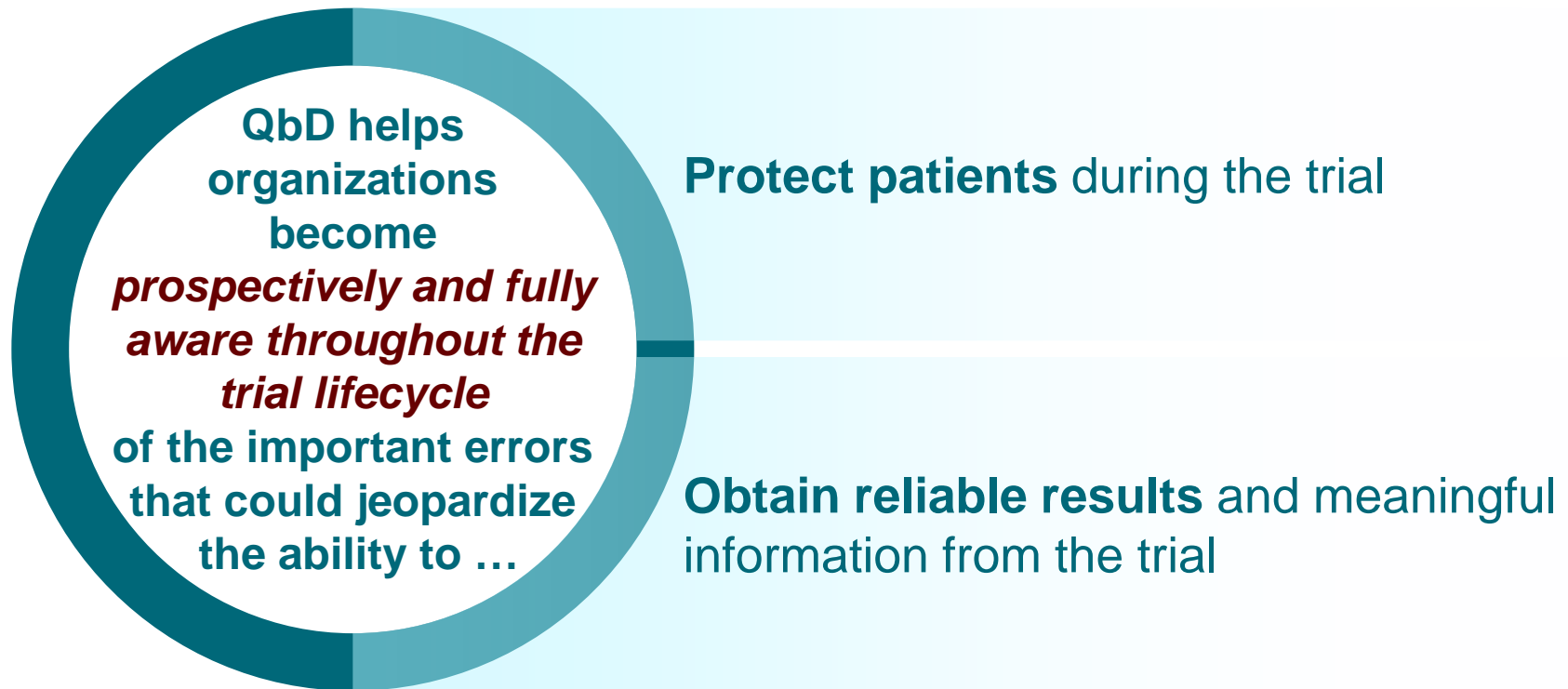


# Quality by Design: QbD Defined

“Quality” in clinical trials is defined as  
the absence of errors that matter



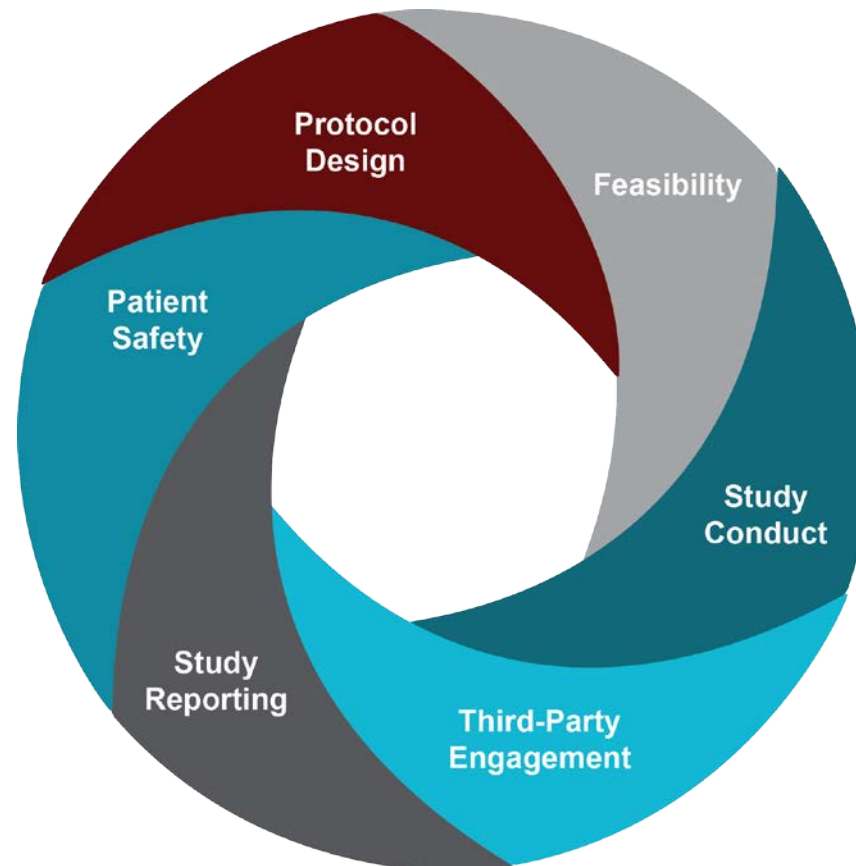
# How QbD Improves Clinical Trials



# QbD Step 1

Identify “critical to quality” factors (CTQs) for your specific trial

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# QbD Step 2

Discuss potential risks related to each CTQ identified that impact study quality (i.e., participant safety or credibility of results)

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## QbD Step 3

Mitigate those risks that will likely lead to errors that matter and determine how to rapidly identify and react when there is an issue



# Use the QbD Toolkit

<http://www.ctti-clinicaltrials.org/toolkit/QbD>



LOGIN

SEARCH

Here to identify and promote practices that will increase the quality and efficiency of clinical trials.

HOME WHO WE ARE WHAT WE DO BRIEFING ROOM TAKE ACTION CONTACT US



Learn About QbD

Teach QbD

Adopt QbD

## QbD TOOLKIT

- > Learn About QbD
- > Teach Others About QbD
- > Adopt QbD

## RESOURCES

- > Principles Document (pdf)
- > CTTI QbD Recommendations (pdf)
- > QbD Video Collection
- > Past CTTI QbD Workshops
- > QbD Project Page



Contact us for questions or comments on the QbD Toolkit

## QbD (Quality By Design) Toolkit

This Quality by Design Toolkit is a compilation of documents, templates, guidelines, and videos that will help you put QbD into practice within in your organization. Whether you are first learning about QbD, (Learn About QbD), want to disseminate these concepts within your organization (Teach Others About QbD), or are ready to implement QbD into your clinical trial (Adopt QbD), this Toolkit has resources for you. Refer back to the Toolkit often and find new resources to support you in translating QbD from principles to practice.



### What is this QbD Toolkit?

Mark Behm from Astra Zeneca describes the QbD Toolkit and how you and your organization can use it to learn about and implement QbD.

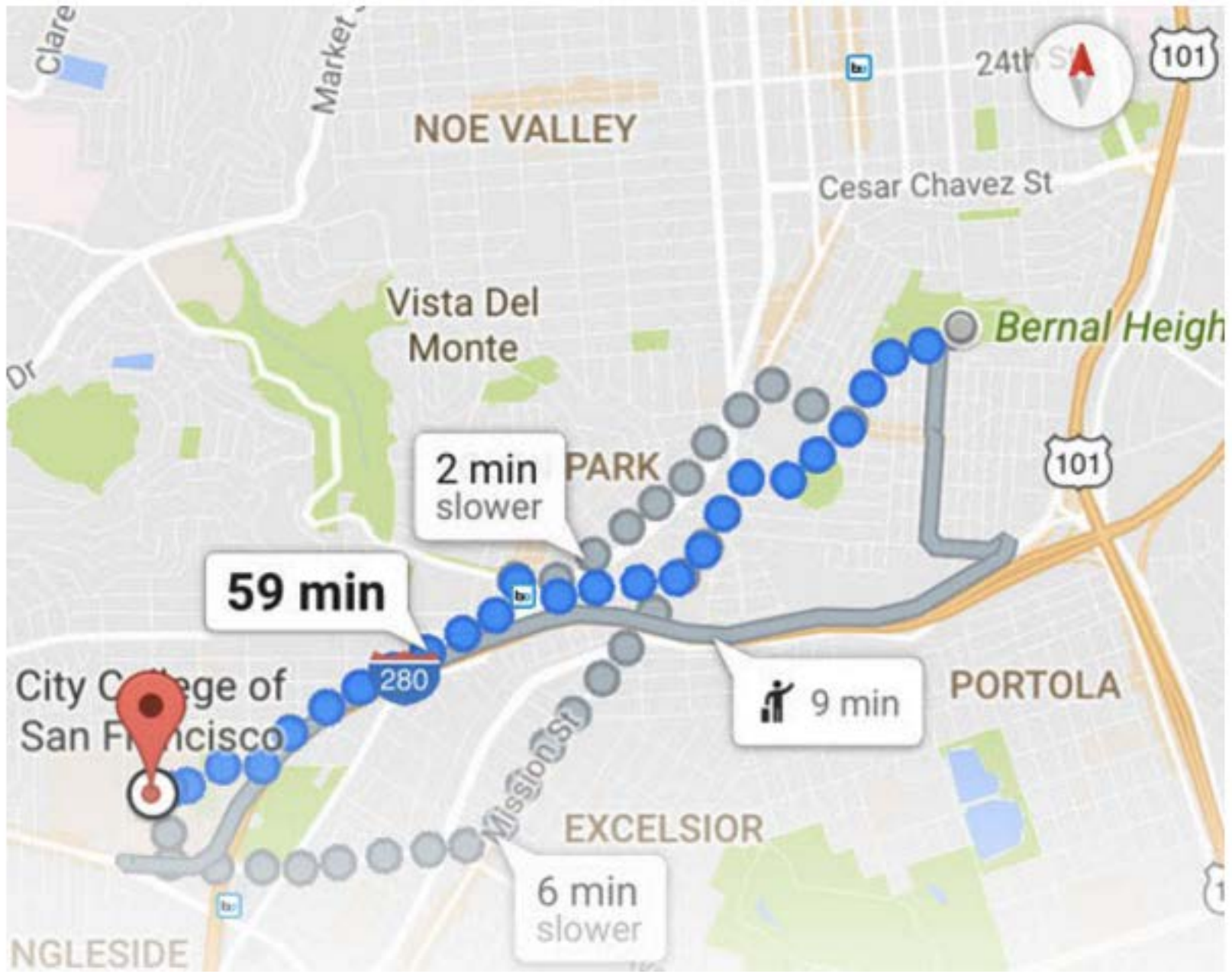


### Why is QbD important for patients?

Nancy Roach from Fight Colorectal Cancer shares the patient perspective on the importance of QbD.

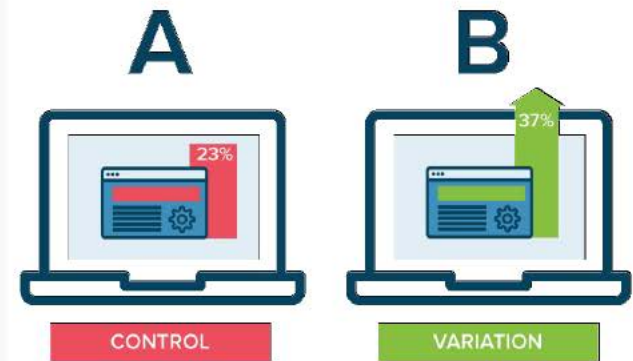
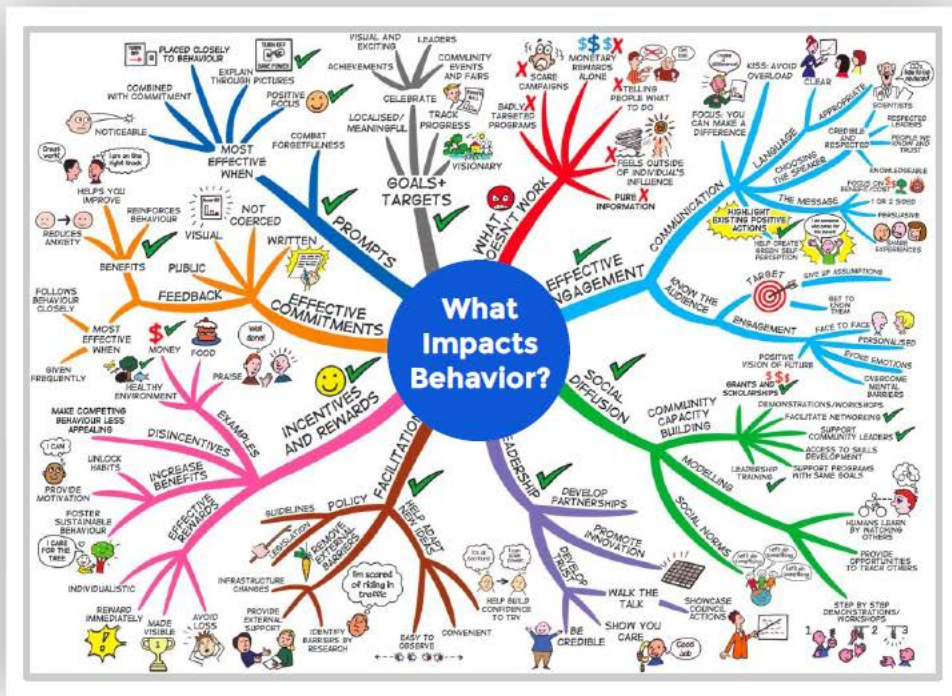
# Key Elements to Get a New Start

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# Data Activation and Testing Outcomes



# Key Elements to Get a New Start

- Build a reusable system embedded in practice
- Use quality by design
- Use automation for repetitive tasks
- **Operate from basic principles**

# Examples of Basic Principles

- Errors that matter
  - Distinguishing random error from systematic error
- Enroll participants likely to inform the question
- Randomization
- Masking
- Measure outcomes in manner that is fit for purpose
- Strengths of different designs for different purposes
- Designing operations that yield an answer to the question in an efficient manner (“the answer is in the question”)

# Levy's case

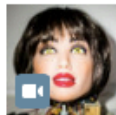
- Trial to determine if Drug X lowers the risk of death and stroke in patients with atrial fibrillation
- Sample size of 18000 and follow-up time of multiple years needed to answer this question
- Thousands of patients had already been studied to determine dosing regimen
- What would it cost to precisely record the time of ingestion of each dose of the twice a day drug?
  - For what purpose?

# McCollister-Slipp Case

- People with diabetes live a long time on medicines
- Comparative effect of medicines on CV outcomes (“macrovascular”), including death, were not known
  - Using traditional GCP doctrine, cost per trial is hundreds of millions
- Comparative effect of medicines on neuropathy, retinopathy, nephropathy (“microvascular”) unknown
  - Using traditional methods of assessment
- Value of new, continuous measures of glucose and other biological parameters not known
- Suggested approach:
  - For CV outcomes streamline trial and use health system data to reduce cost dramatically
  - For microvascular outcomes, automate measurements in populations over time
  - Automate natural history studies to sort out which continuous measures of glucose and metabolism work



Twitter's C.E.O., Dick Costolo, Is Set to Exit, Feeling Heat of Criticism



ROBOTICA EPISODE 5 Sex Dolls That Talk Back



STATE OF THE ART For Twitter, Future Means Here and Now



Sidewalk Labs, a Start-Up Created by Google, Has Bold Aims to Improve City Living



Am Bus Eur Reg

 When will today's fast be tomorrow's slow?   QUALCOMM Why Wait™

TECHNOLOGY

# For Big-Data Scientists, 'Janitor Work' Is Key Hurdle to Insights

By STEVE LOHR AUG. 17, 2014

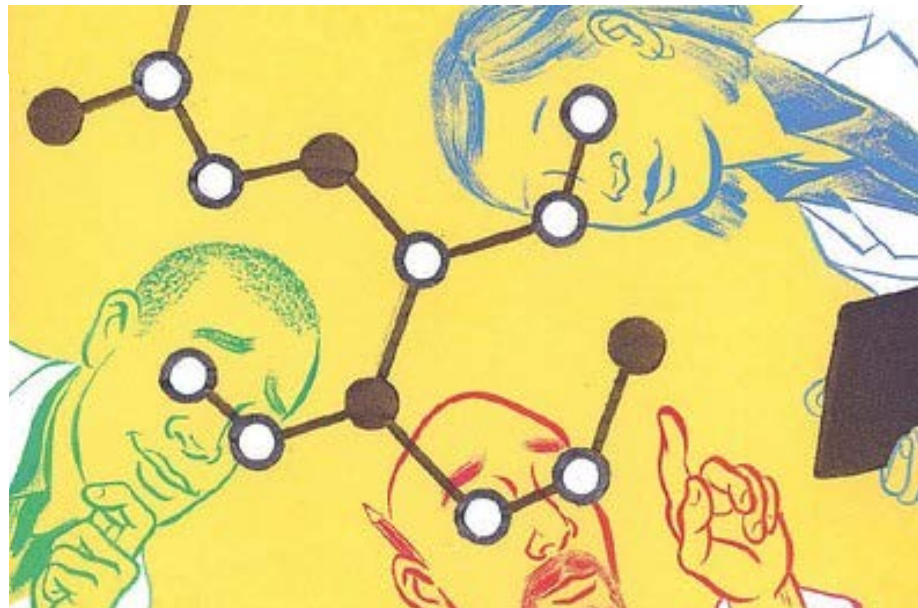
# The New Einsteins Will Be Scientists Who Share

*From cancer to cosmology, researchers could race ahead by working together—online and in the open*

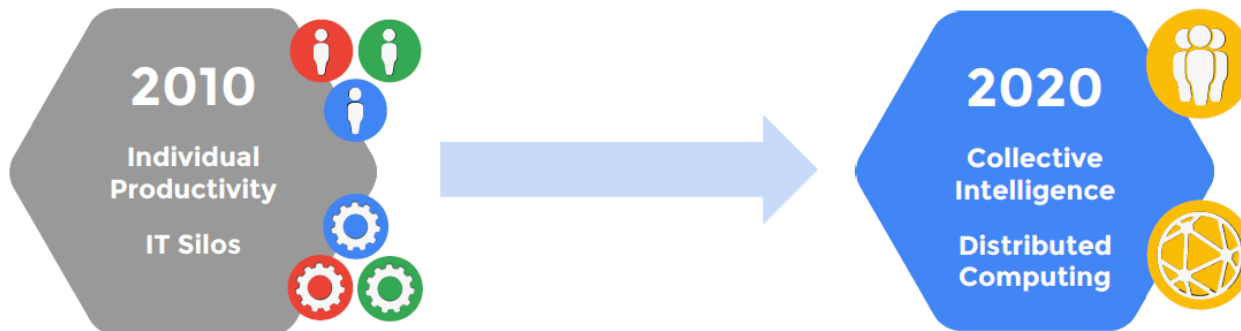
By MICHAEL NIELSEN

In January 2009, a mathematician at Cambridge University named Tim Gowers decided to use his blog to run an unusual social experiment. He picked out a difficult mathematical problem and tried to solve it completely in the open, using his blog to post ideas and partial progress. He issued an open invitation for others to contribute their own ideas, hoping that many minds would be more powerful than one. He dubbed the experiment the Polymath Project.

Several hours after Mr. Gowers opened up his blog for discussion, a Canadian-Hungarian mathematician posted a comment. Fifteen minutes later, an Arizona high-school math teacher chimed in. Three minutes after that, the UCLA mathematician Terence Tao commented. The discussion ignited, and in just six weeks, the mathematical problem had been solved.



## Digital Transformation



- Data on premise, hard to access, analyze and use
- Productivity tools built for individual, local usage
- IT focusing on **where** it computes

- Data stored in cloud, simple to query
- Collaborative, cloud based productivity applications
- Machine learning drives deep, actionable insights
- IT changing **how** it computes



Recognizing the risk of creating another bureaucratic entanglement, we need to work across the ecosystem to codify the key principles and operating methods for evidence generation using real world data to produce real world evidence

The effort should embrace principles that enable quality design to produce reliable results