

# Transforming Health Data into Clinical Actions

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# Commercial Conflict(s) Of Interest

None to report.

# Learning Objectives

- Understand the concepts of “Big Data” in the context of health
- Identify the challenges of interoperability, resulting in the “data chasm”
- Describe the core elements of enabling a Learning Healthcare System
- Formulate how health data can be transformed into clinically actionable knowledge

# Outline

- Setting the Stage
- Exploring Clinical and Genomic Data
- Thinking about Big Data
- Bridging the Divide
- Addressing Clinical Needs

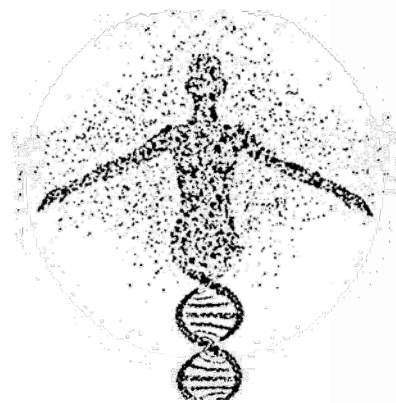
# The Promised Future...



# Biomedical Informatics



“He is programmed with the medical knowledge of 47 of Starfleet's finest physicians and the collected medical information of three thousand cultures.”



Genomic Data



Clinical Data

# Transforming Health Care

CONTEMPO UPDATES  
LINKING EVIDENCE AND EXPERIENCE

## Medical Informatics Improving Health Care Through Information

William R. Hersh, MD

HEALTH CARE IS AN INFORMATION-based science. Much of clinical practice involves gathering, synthesizing, and acting on information. Medical informatics is the

HEALTH CARE IS AN INFORMATION-based science. Much of clinical practice involves gathering, synthesizing, and acting on information. Medical informatics is the field concerned with the management and use of information in health and biomedicine. This article focuses on

related problems in health care; many solutions involve the use of computers and computer-related technologies.

### The Field of Medical Informatics

Medical informatics is a heterogeneous field, composed of individuals with diverse backgrounds and levels of training. Although virtually all health science universities have some entity with the word "informatics" in its title, there are fewer than 25 that carry out research in medical informatics and

offer educational programs.<sup>1</sup> At some institutions, medical informatics is viewed as a service (eg, helping clinicians implement informatics applications), but it is more appropriately considered a science that addresses how best to use information to improve

### Electronic Medical Records

The core application using patient-specific information is the electronic medical record (EMR). The paper-based medical record has its tradition and virtues; however, research has shown it can be illegible, incomplete,

### Applications of Clinical Informatics

There is a variety of classification types for the different applications of clinical informatics; one approach is by the type of information used. There are essentially 2 types of information used in clinical informatics: patient-specific and knowledge-based. Patient-specific information is generated by and used in the care of patients in the clinical setting, whereas knowledge-based information comprises the scientific basis of health care.

focused on entry and retrieval of simple data (eg, prescription writing and drug information) and it is unclear whether other usage (eg, image viewing and literature access) is amenable to these por-

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**Contempo Updates Section Editor:** Janet M. Torrey, MD, Contributing Editor.

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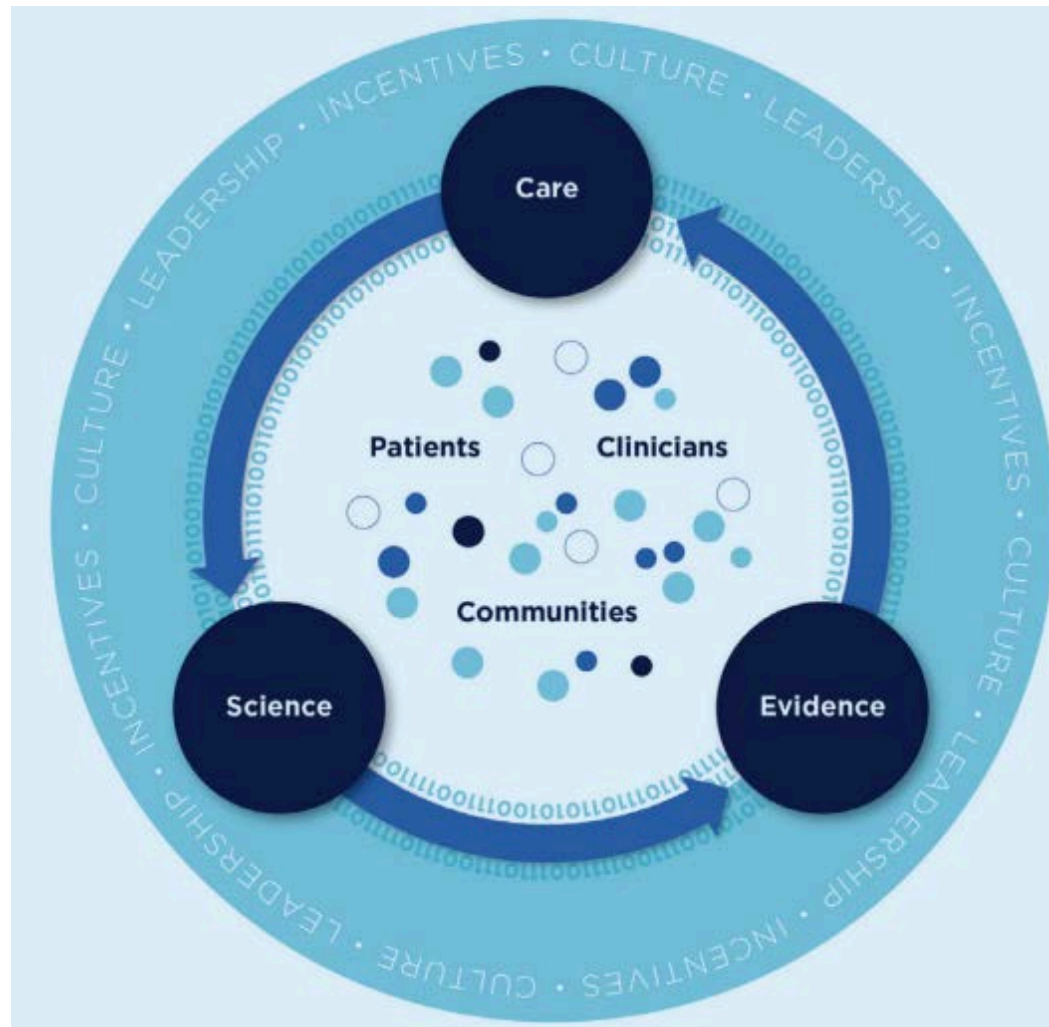
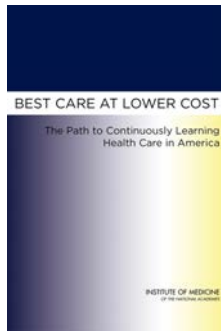
(Reprinted) JAMA, October 23/30, 2002—Vol 288, No. 16 1955

- Cost of Care
- Sharing Knowledge
- Involving Patients
- Personalizing Care
- Coordinating Care
- Improving Outcomes



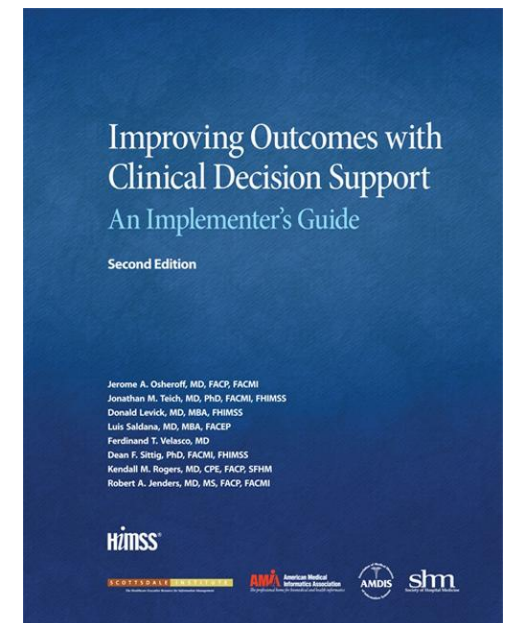
# Managing Expectations





# The Five “Rights” of CDS

- The right **information** (**what**)
- To the right **person** (**who**)
- In the right intervention **format** (**how**)
- Through the right **channel** (**where**)
- At the right time in **workflow** (**when**)



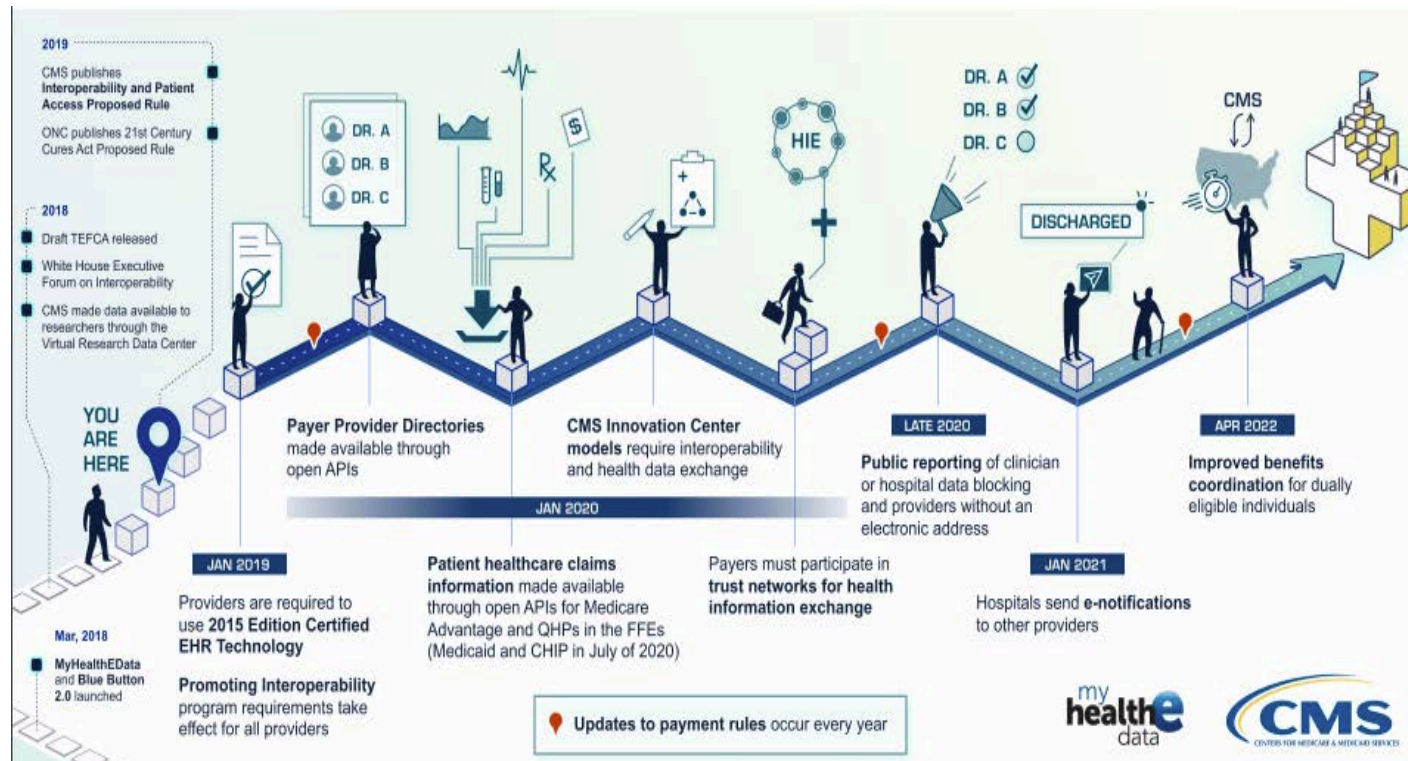
# 21<sup>st</sup> Century Cures

Defines how the healthcare ecosystem:

- (1) Enables the secure exchange and use of electronic health information ***without special effort*** on the part of the user
- (2) Allows for ***complete access, exchange, and use*** of ***all electronically accessible health information*** for authorized use under applicable State or Federal law; and
- (3) Does not constitute ***information blocking***

Defined in Section 4003 of the Cures







## USCDI v1

### Assessment and Plan of Treatment



### Care Team Members



### Clinical Notes \*NEW



- Consultation Note
- Discharge Summary Note
- History & Physical
- Imaging Narrative
- Laboratory Report Narrative
- Pathology Report Narrative
- Procedure Note
- Progress Note

### Goals



- Patient Goals

### Health Concerns



### Immunizations



### Laboratory



- Tests
- Values/Results

### Medications



- Medications
- Medication Allergies

### Patient Demographics



- First Name
- Last Name
- Previous Name
- Middle Name (including middle initial)
- Suffix
- Birth Sex
- Date of Birth
- Race
- Ethnicity
- Preferred Language
- Address \*NEW
- Phone Number \*NEW

### Problems



### Procedures



### Provenance \*NEW

- Author
- Author Time Stamp
- Author Organization



### Smoking Status



### Unique Device Identifier(s) for a Patient's Implantable Device(s)



### Vital Signs

- Diastolic Blood Pressure
- Systolic Blood Pressure
- Body Height
- Body Weight
- Heart Rate
- Respiratory rate
- Body Temperature
- Pulse oximetry
- Inhaled oxygen concentration
- Pediatric Vital Signs \*NEW
  - BMI percentile per age and sex for youth 2-20
  - Weight for age per length and sex
  - Occipital-frontal circumference for children >3 years old



The Office of the National Coordinator for Health Information Technology

## The proposed EHI Export certification requirement requires that:

1



All EHI produced and electronically managed by a developer's health IT must be readily available to export for:

- A. a single patient upon request for their health data, and
- B. all patients when a provider seeks to change health IT systems.

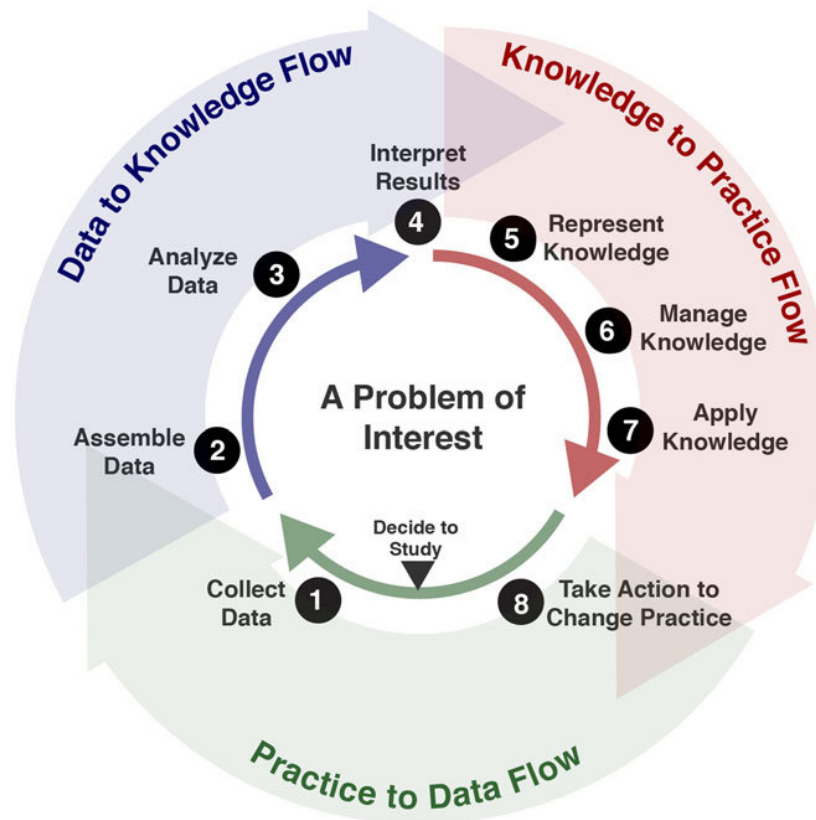
2



The export file must:

- A. be computable, and
- B. include documentation to allow for interpretation and use of EHI. The documentation must be made publicly available via a hyperlink.

**Note:** Health IT developers would have the flexibility to determine their products' export standards.

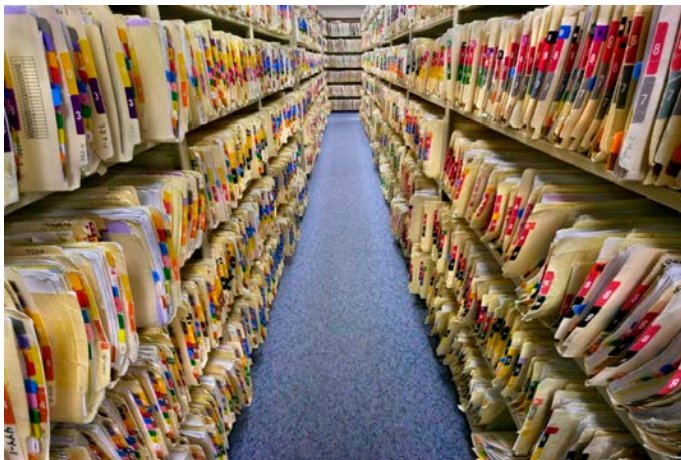


Flynn AJ, Friedman CP, Boisvert P, Landis-Lewis Z, Lagoze C. The Knowledge Object Reference Ontology (KORO): A formalism to support management and sharing of computable biomedical knowledge for learning health systems. *Learning Health Systems*. 2018 Apr;2(2):e10054.

# **In the Clinic**

Electronic Health Data





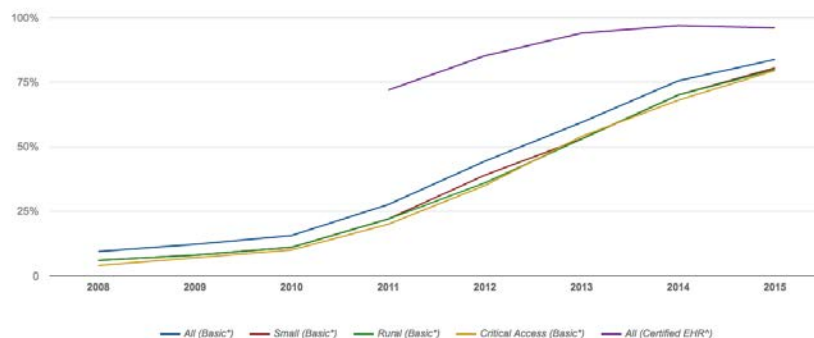


# Uses of an EHR

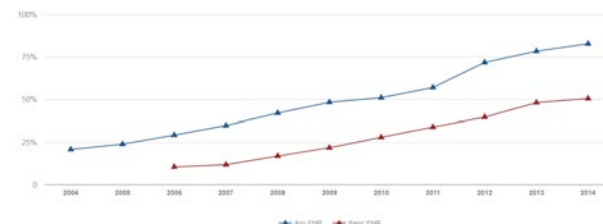
- **Primary Uses**
  - Patient Care
    - Delivery
    - Management
    - Support
  - Billing and Reimbursement
- **Secondary Uses**
  - Decision support (development)
  - Quality
  - Research
  - Education
  - Public Health
  - Regulation
  - ...

Institute of Medicine (U.S.). Committee on Improving the Patient Record., Dick RS, Steen EB, Detmer DE. The computer-based patient record : an essential technology for health care. Rev. ed. Washington, D.C.: National Academy Press; 1997.

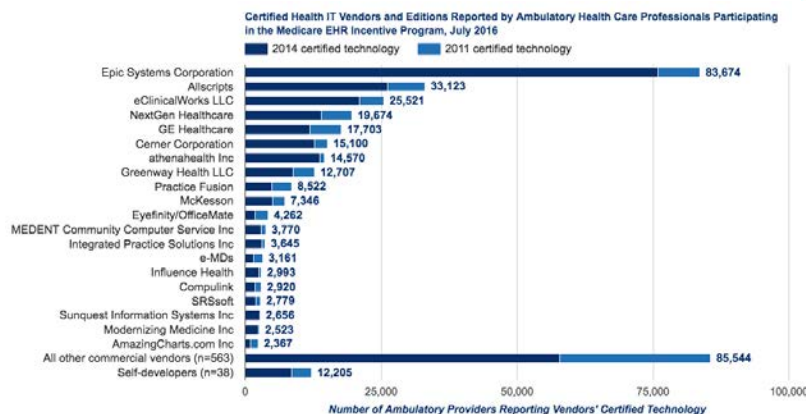
Bloomrosen M, Detmer D. Advancing the framework: use of health data--a report of a working conference of the American Medical Informatics Association. J Am Med Inform Assoc. 2008 Nov-Dec;15(6):715-22.



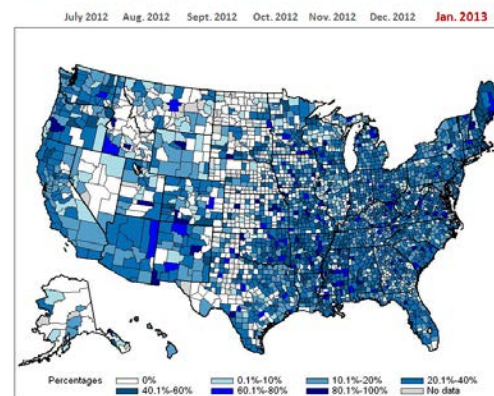
In 2015 over 4 in 5 of all non-federal acute care hospitals had adopted a Basic EHR with clinician notes, whereas, 80 percent of small hospitals with less than 100 beds, rural hospitals, and critical access hospitals had adopted a Basic EHR with clinician notes. Nearly all non-federal acute care hospitals have possession of an EHR certified by HHS.



As of 2014, a majority of office-based physicians have adopted electronic health records (EHRs). By the end of 2014, about 8 in 10 (83%) of office-based physicians had adopted any EHR and about half (51%) adopted a 'Basic EHR'. Since 2008, office-based physician adoption of any EHRs has nearly doubled, from 42% to 83%, while adoption of Basic EHRs has nearly tripled from 17% to 51%. Between 2013 and 2014, adoption of any EHR grew by 6% and Basic EHR adoption grew by 5%.



#### Medicare and Medicaid Electronic Health Record (EHR) Incentive Programs Share of All U.S. Physicians, NPs, and PAs Paid under Medicare or Medicaid



from the nris Office of the National Coordinator for health IT

<http://dashboard.healthit.gov/quickstats/quickstats.php>

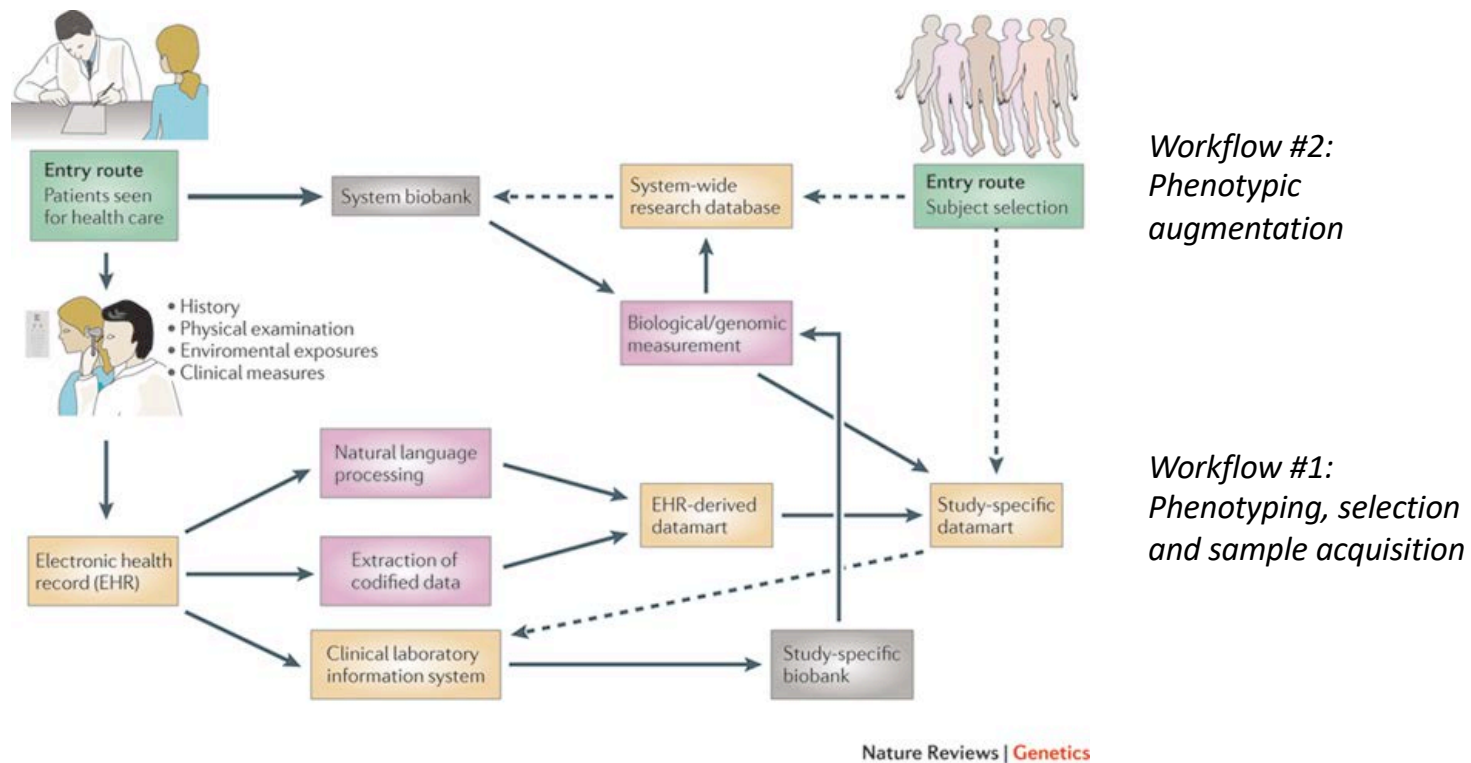
# The Molecular Promise

Genomics, Proteomics &  
Metabolomics





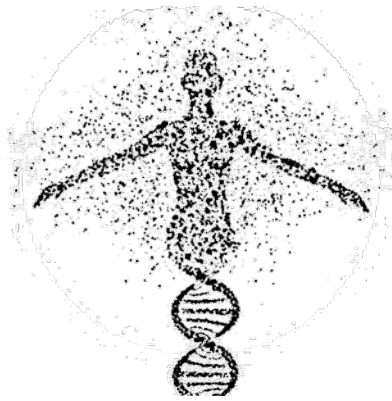
# EHR-driven Genomics Research



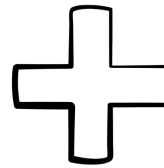
Kohane IS. Using electronic health records to drive discovery in disease genomics. Nat Rev Genet. 2011 Jun;12(6):417-28. doi: 10.1038/nrg2999. Epub 2011 May 18. Review. PubMed PMID: 21587298

# Personalized Medicine

## (Typical Interpretation)



Genomic Data



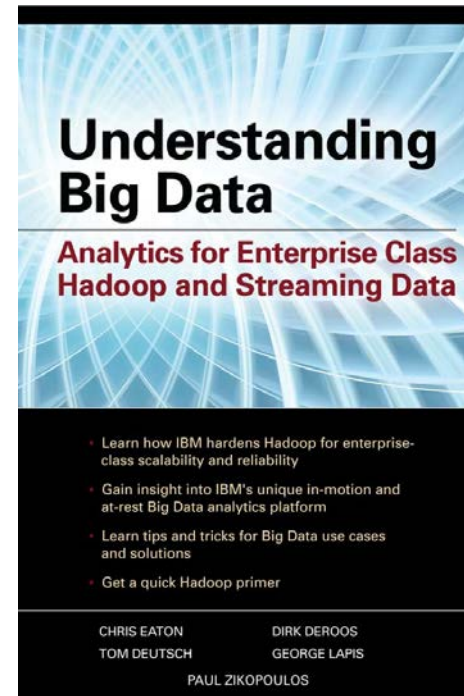
Clinical Data



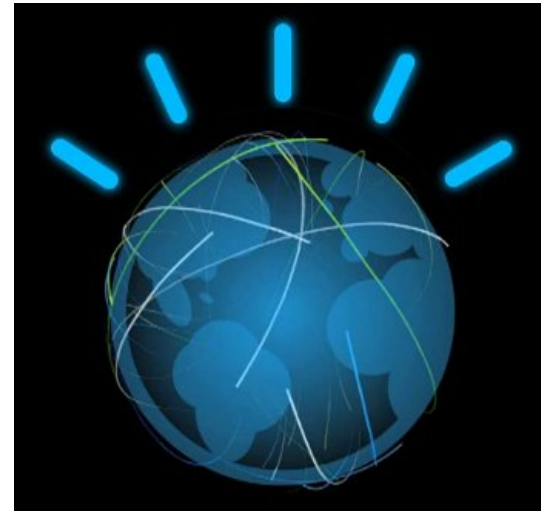
# Big Data, Big Opportunities

# “Big Data”

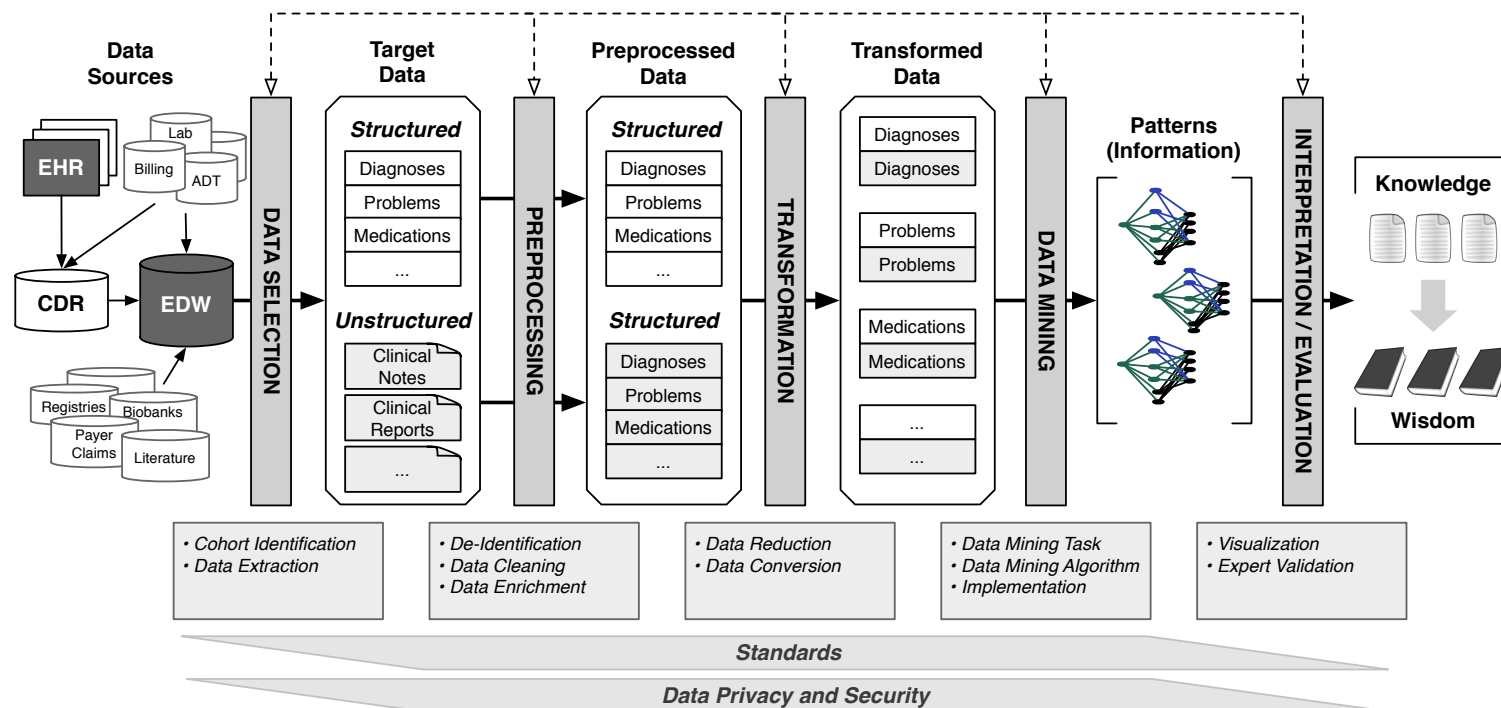
- High Volume
- High Velocity
- High Variety
- High Veracity



# Addressing the Challenge of “Big”



# Disease Knowledge Discovery

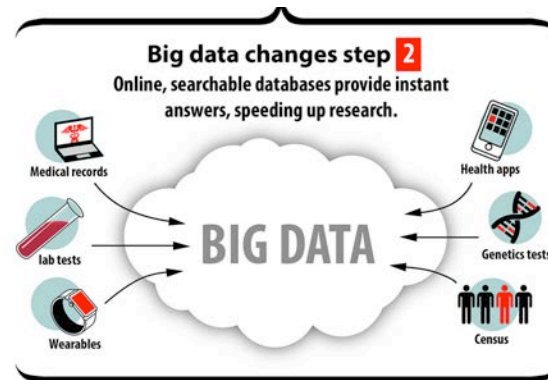
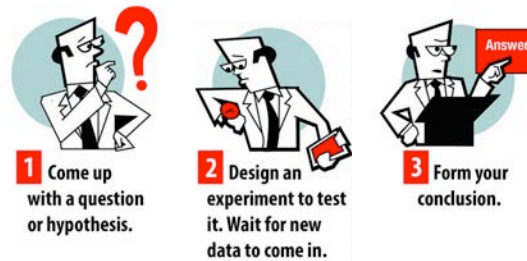


Chen ES, Sarkar IN. Mining the electronic health record for disease knowledge. Methods Mol Biol. 2014;1159:269-86.

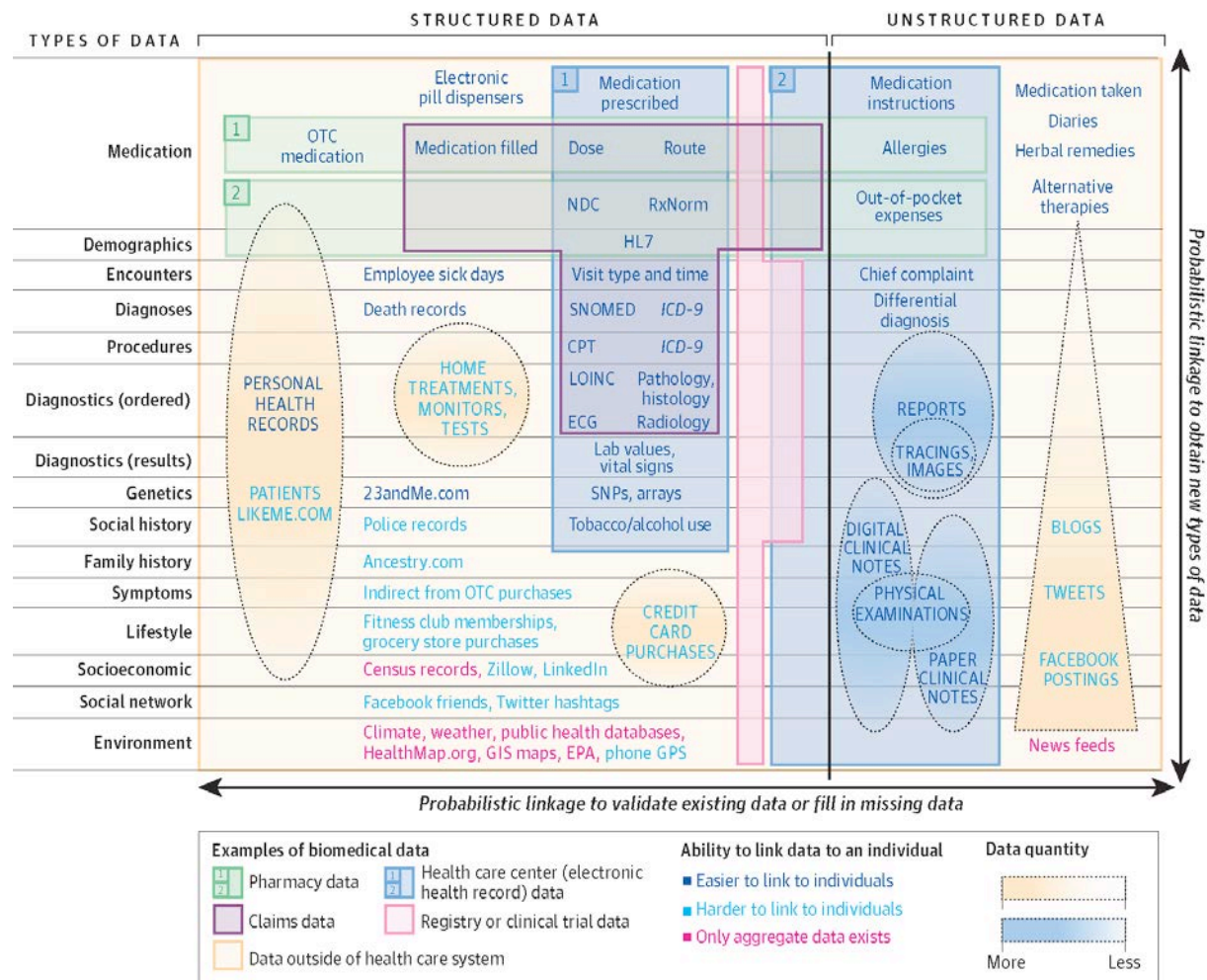
# The Right Data at the Right Time

## How can big data change science?

Here's how medical research traditionally works:



<http://ww2.kqed.org/futureofyou/2014/09/29/how-big-data-is-changing-medicine/>



Weber GM, Mandl KD, Kohane IS. Finding the missing link for big biomedical data. *JAMA*. 2014 Jun 25;311(24):2479-80.



<https://www.mobifilia.com/iot-for-healthcare/>

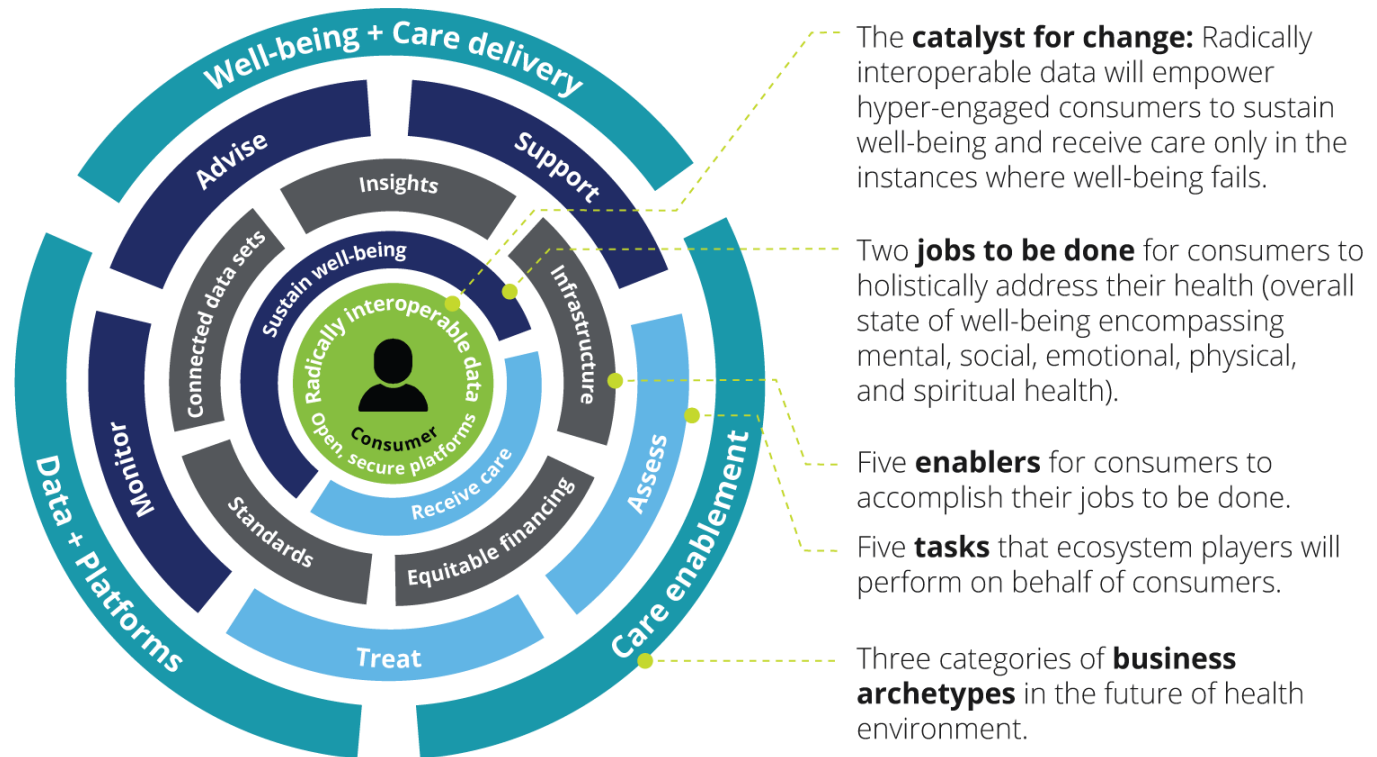
# Interoperability



FIGURE 3

## The future of health will be driven by digital transformation enabled by radically interoperable data and open, secure platforms

Always-on sensors that capture data and platforms that aggregate, store, and derive insights from individual, institutional, population, and environmental data will catalyze the transformation.

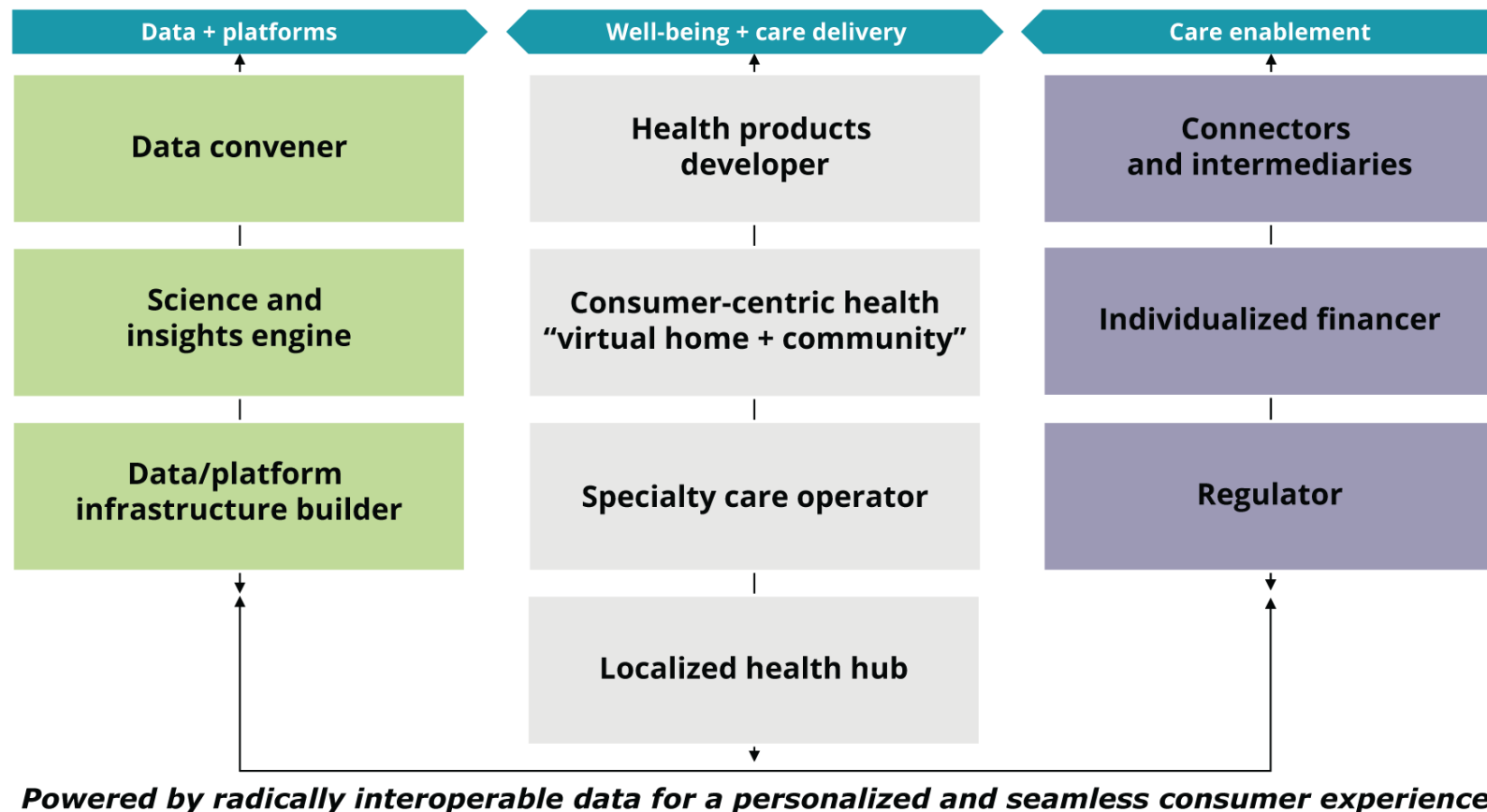


Source: Deloitte analysis.

Deloitte Insights | [deloitte.com/insights](https://deloitte.com/insights)

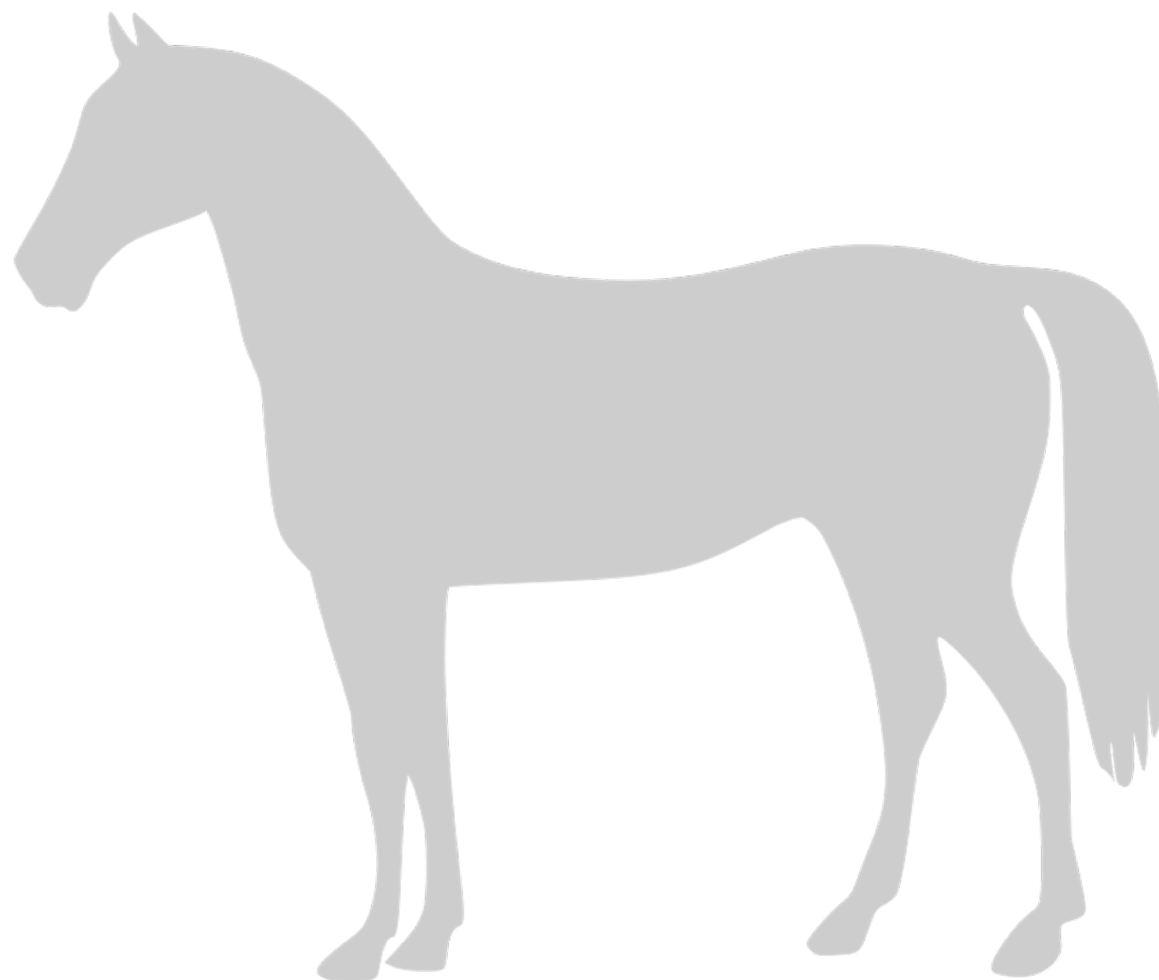
FIGURE 4

## Ten winning business archetypes in the future of health



Source: Deloitte analysis.

Deloitte Insights | [deloitte.com/insights](https://deloitte.com/insights)







# The Health Interoperability Ecosystem






## Where do you fit in?

The health interoperability ecosystem comprises **individuals, systems and processes** that want to share, exchange and access all forms of health information, including discrete, narrative and multimedia. Individuals, patients, providers, hospitals/health systems, researchers, payors, suppliers and systems are potential stakeholders within this ecosystem. Each is involved in the creation, exchange and use of health information and/or data.

An efficient health interoperability ecosystem provides an information infrastructure that uses technical standards, policies and protocols to enable seamless and secure capture, discovery, exchange and utilization of health information.



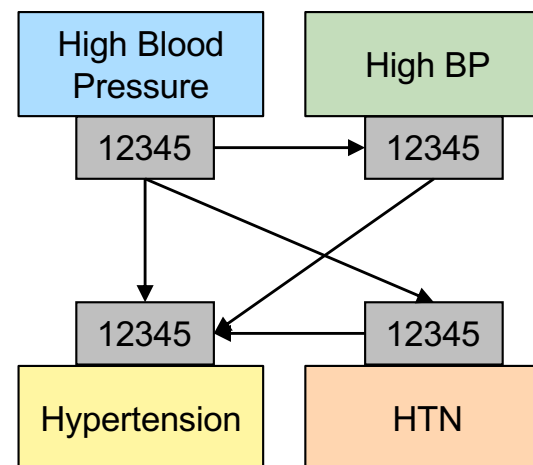
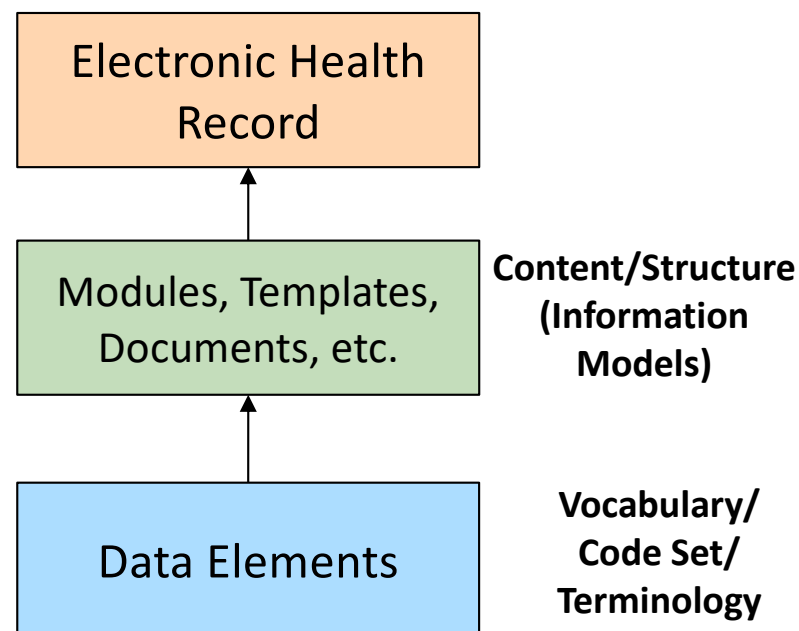
- **“Foundational”** interoperability develops the building blocks of information exchange between disparate systems by establishing the inter-connectivity requirements needed for one system or application to share data with and receive data from another. It does not outline the ability for the receiving information technology system to interpret the data without interventions from the end user or other technologies.
- **“Structural”** interoperability defines the structure or format of data exchange (i.e., the message format standards) where there is uniform movement of healthcare data from one system to another such that the clinical or operational purpose and meaning of the data is preserved and unaltered. Structural interoperability defines the syntax of the data exchange. It ensures that data exchanges between information technology systems can be interpreted at the data field level.
- **“Semantic”** interoperability is the ability of two or more systems to exchange information and to interpret and use that information. Semantic interoperability takes advantage of both the structuring of the data exchange and the codification of the data, including standard, publicly available vocabulary, so that the receiving information management systems can interpret the data. Semantic interoperability supports the electronic exchange of patient data and information among authorized parties via potentially disparate health information and technology systems and products to improve quality, costs, safety, efficiency, experience and efficacy of healthcare delivery.
- **“Organizational”** interoperability encompasses the technical components as well as clear policy, social and organizational components. These components facilitate the secure, seamless and timely communication and use of data within and between organizations and individuals. Inclusion of these non-technical considerations enables interoperability that is integrated into end-user processes and workflows in a manner that supports efficiencies, relationships and overall health and wellness through cooperative use of shared data both across and within organizational boundaries.

CATEGORIES OF STANDARDS		FUNCTIONS OF STANDARDS	EXAMPLES OF REAL WORLD USE OF THE STANDARDS
	VOCABULARY & CODE SETS (SEMANTICS)	The information is universally understood	RxNorm Code for Ibuprofen is 5640
	FORMAT, CONTENT & STRUCTURE (SYNTAX)	Information is in the appropriate format	C-CDA packages up data in the appropriate format
	TRANSPORT	The information moves from point A to point B	SMTP and S/MIME to send the C-CDA from one setting to another
	SECURITY	The information is securely accessed and moved	X.509: to ensure it is securely transmitted to the intended recipient
	SERVICES	Provides additional functionality so that information exchange can occur	DNS+LDAP: to find the recipient's X.509 certificate to encrypt a message

# Standards and Interoperability

*“Too many ways to say the same thing”*

- Common data elements, terminology, structures, and organization
- Seamless exchange and interpretation of data across systems and institutions
- Interoperability
  - Content and structure (*syntactic*)
  - Vocabulary/code set/terminology (*semantic*)



#### ABSTRACT

This study characterizes data quality within a state-based Health Information Exchange (HIE) for supporting subsequent

#### RESULTS



(see Table 1 for preliminary results). Disposition, race, and ethnicity were the most challenging to map to a standard. Preliminary disposition data showed a larger than expected discrepancy between HIE and hospital network datasets for unclear reasons. In addition, more than 60 variations of race were identified in the hospital network data and 40 non-standard values were found in the HIE data for race. For instance, HIE output for “White” race included “1,” “2106-3,” and “WHITE.” Several additional output may represent “White” (e.g., “W” and “WH”), but the loss of mapping scheme in aggregate analysis of HIE data makes it difficult to verify meaning of these variables.

networks, use CurrentCare (comprised of 442 data sources). Fifty percent of statewide ED visits in Rhode Island occur at a single hospital network.

- De-identified data from the hospital network EHR and CurrentCare were analyzed in aggregate for all patients who had visited an ED in the hospital system between August 1, 2015 and March 31, 2016 focusing on: age, gender, race/ethnicity, diagnosis codes, problem list, primary care provider (PCP) status, and disposition.
- The content of the CurrentCare HIE data fields of interest were compared to terminology standards (e.g., those defined for the HL7 Continuity of Care Document [CCD]).
- This study was deemed exempt by the IRB.

#### References

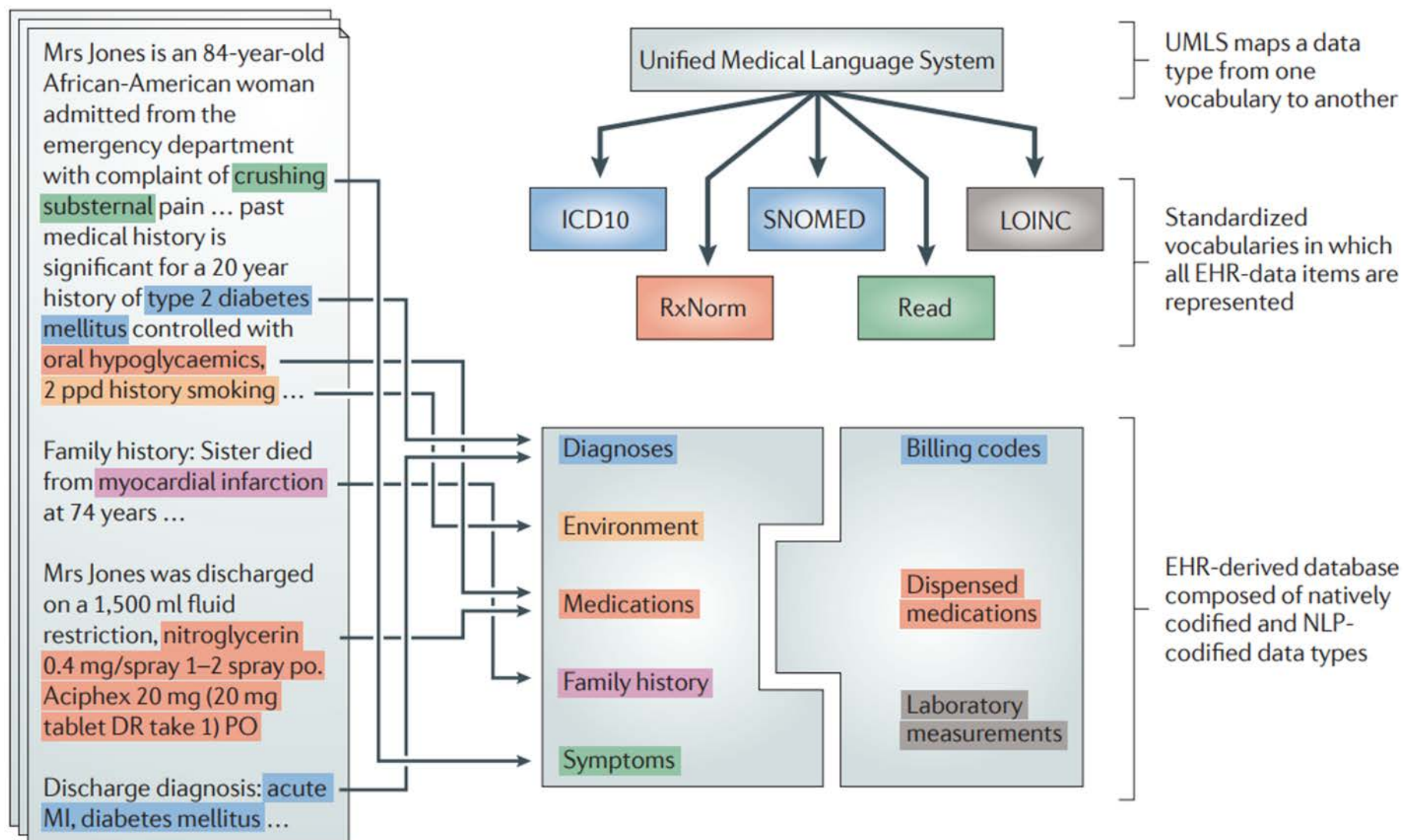
1. Pacific Northwest Evidence-based Practice Center. *Evidence Report/Technology Assessment: Health Information Exchange*. Portland, OR: 2015.
2. Parker C, Weiner M, Reeves M. Health Information Exchanges – Unfulfilled Promise as a Data Source for Clinical Research. *Int J Med Inform*. 2016;87:1-9.
3. Johnson K, Unertl K, Chen Q, Lorenzi N, Nian H, Bailey J, Frisse M. Health information exchange usage in emergency departments and clinics: the who, what, and why. *J Am Med Inform Assoc*. 2011;18(5): 690–697.

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# From Unstructured to Structured Data

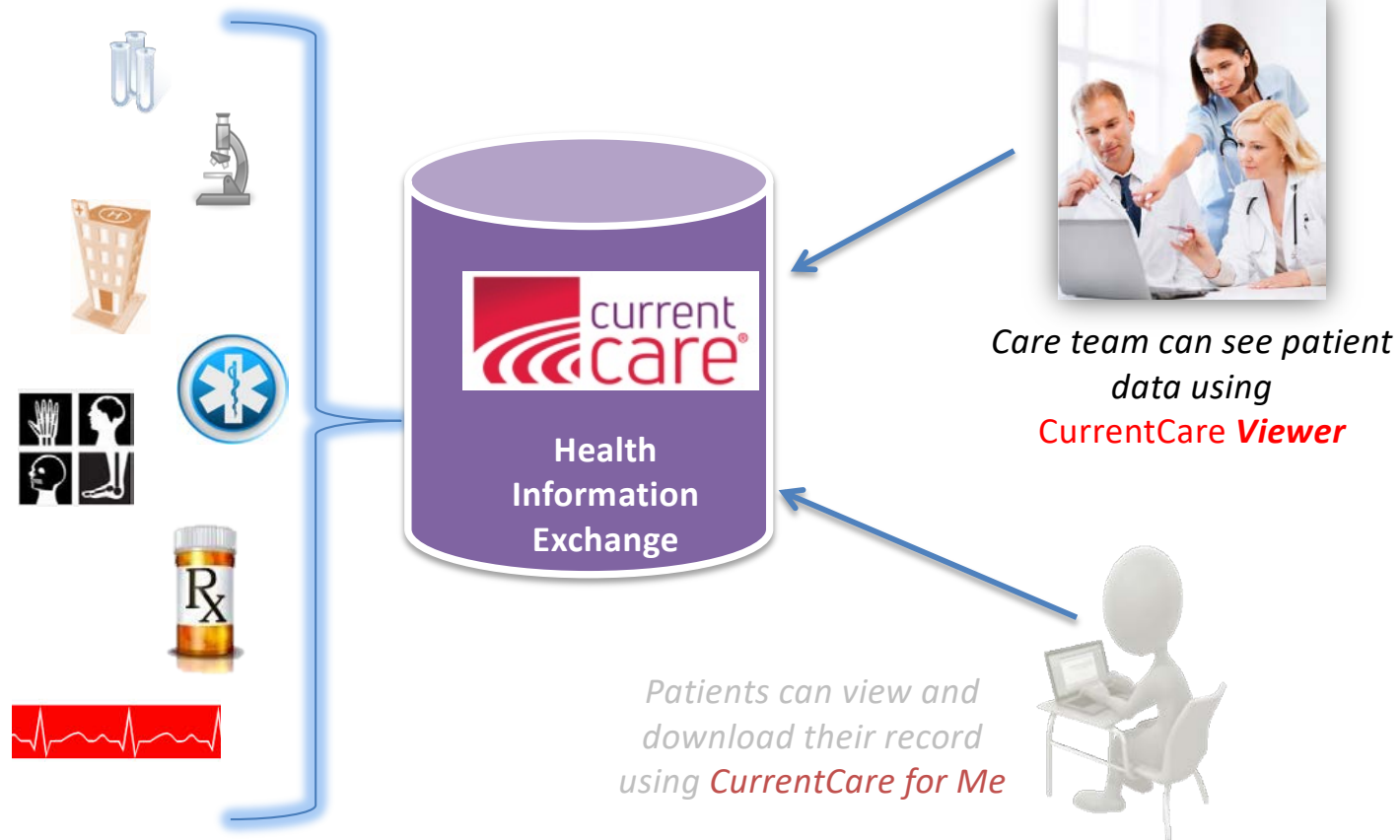


# Supporting Clinical Needs

# HIE - CurrentCare

- Rhode Island's state-wide Health Information Exchange ([HIE](#))
- Operated by the Rhode Island Quality Institute ([RIQI](#))
- A secure repository - protected under HIPAA and the RI Health Information Exchange Act of 2008
- Available to HIPAA-covered organizations; no cost to providers or patients
- Patients must enroll ("Opt-in")

# HIE - CurrentCare



# Patients Decide to Enroll...

- 
- RI is an “Opt-In” state
  - More than 550,000 Rhode Islanders have enrolled

## Be your own healthcare advocate



CurrentCareRI.org

### One, two, three, then add a designee!

1

#### **SIGN UP** for CurrentCare

CurrentCare is a *free* service that keeps all of your health records in one place. Save time, money and discomfort from unnecessary x-rays or lab tests, because this information is already in CurrentCare.



2

#### **ADD** CurrentCare for Me

Take control of your own healthcare record with CurrentCare for Me. Access your record online 24/7, keep track of your meds, lab tests and more.



3

#### **GET** Peace of Mind

- You can track your own health information and healthcare online 24/7 from anywhere
- Avoid prescription errors and repeat tests



+

#### **Designee**

When you sign up for CurrentCare for Me, you can easily designate access to your health record to someone else on your behalf. Just go to: [CurrentCareRI.org/Designee](http://CurrentCareRI.org/Designee) and sign up today!



02/03/14 12:14 - Designee 03/07/14

# Electronic Health Data Sources



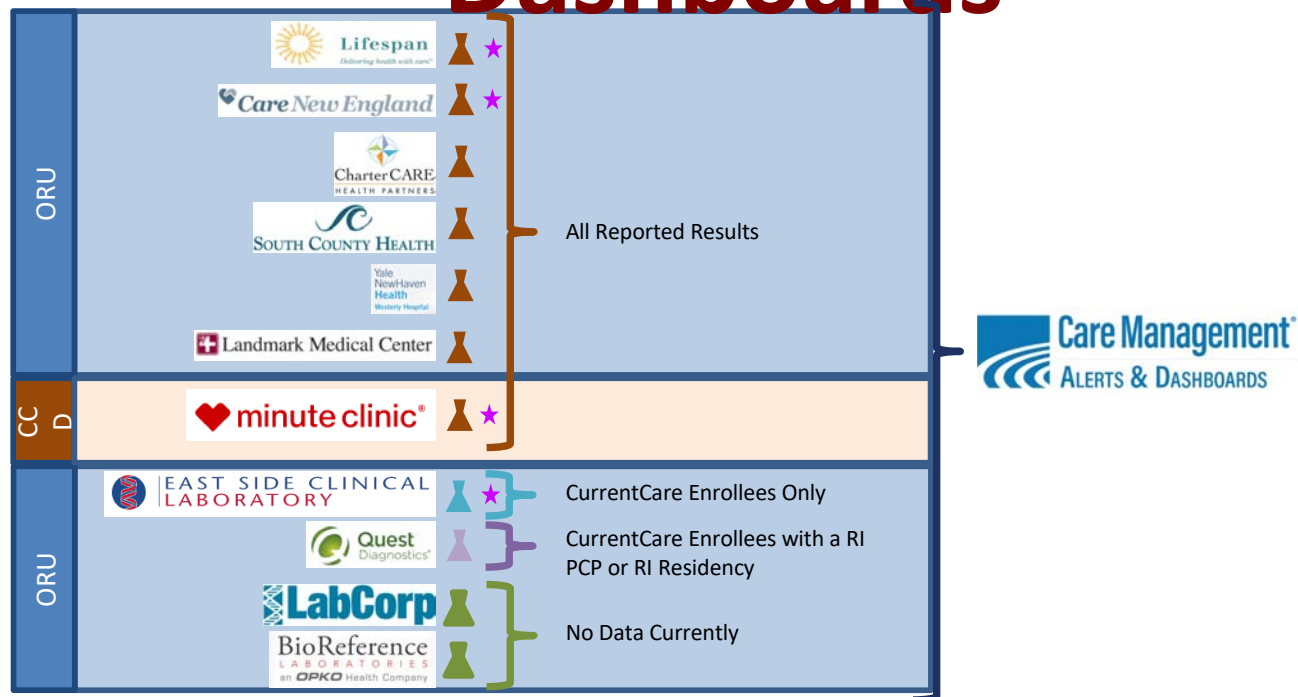
- *Over 520 data sources from:*
  - Hospital Admissions, Discharges, and Transfers (ADTs)
  - Labs
  - Imaging facilities
  - Pharmacies
  - Pharmacy benefit managers
  - Providers' EHRs
  - Urgent Care Facilities
  - Skilled Nursing Facilities
- [www.currentcareri.org/guidebook](http://www.currentcareri.org/guidebook)



# Privacy and Security

- Controlled Access
  - RI Health Information Exchange Act of 2008
  - A Data Use Agreement must be executed and in place
  - Training is required before each person is granted access
  - Access levels assigned based on role at the practice
- Audit Processes
  - Checks for user looking up own record, family member, or co-worker

# COVID-19 Results in Dashboards



# Identifying Possible COVID-19 Encounters

Possible COVID-19 Encounter	Admission Reason
	Painful Urination
	alcohol withdrawal uncomplicated
Yes	Low back pain fever
	RASH
	Chest Pain
	Sprain
Yes	Flu Like symptoms
	Vertigo
Yes	Shortness of breath
	DA/IOL 38.6wks gest diab

# COVID-19 Lab Test Results for Patient Panels

MPIID	First Name	Middle Name	Last Name	COVID-19 Risk Factors	COVID-19 Result	ResultTime	Test Source	Test Code	Test Description	Ordered By
100001	Joe		Patient	1	Positive	2020/04/10 18:36	CVSMC	94534-5	Covid-19 Result	Provider, Test
100002	Mike	A	Test	1	Positive	2020/04/16 08:05	CHARTERCARE	5099-7	Coronavirus Ab Ser-aCnc	Provider, Test
100003	Bill		Patient	3	Negative	2020/04/17 13:45	LIFESPAN	94309-2	SARS-CoV-2	Provider, Test
100004	Harry	R	Patient	0	Positive	2020/04/18 10:35	LMK	1230170102	SARS-COV-2 BY PCR	Provider, Test
100005	Mary		Test	0	Negative	2020/04/13 09:46	CVSMC	94534-5	Covid-19 Result	Provider, Test
100006	Jan	A	Sample	5	Negative	2020/04/20 15:55	CVSMC	94534-5	Covid-19 Result	Provider, Test
100007	Nancy	A	Test	2	Negative	2020/04/20 20:15	LIFESPAN	94309-2	DOH SARS-CoV-2 rRT-PCR	Provider, Test
100008	Dylan		Patient	6	Negative	2020/04/17 16:33	CARENE	Special Pathogen Result	Special Pathogen Result	Provider, Test
100009	Sam	N	Sample	5	Positive	2020/04/20 17:12	CARENE	Special Pathogen Result	Special Pathogen Result	Provider, Test
100010	Alex	A	Person	4	Negative	2020/04/19 01:05	LIFESPAN	94309-2	SARS-CoV-2	Provider, Test

# Testing Volume Visualization for Patient Panels



Screenshots contained in this document do not contain Protected Health Information (PHI).  
All data presented here has been randomly generated from databases of fictitious data.

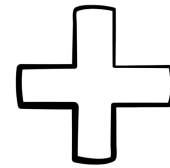
# In Conclusion...



# Personalized Medicine (Modified Interpretation)



Personal Data



Clinical Interpretation

# *Thank You!*

**Neil Sarkar, PhD, MLIS, FACMI**

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