



Using EHR Data to Conduct PBRN Research

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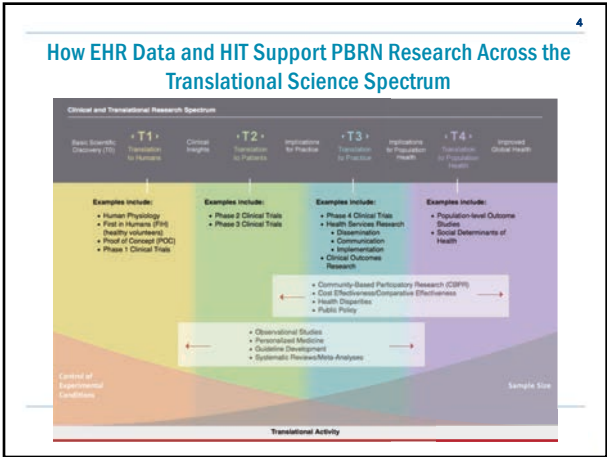
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Goals

- Understand how to get started with using EHR data and HIT across the PBRN research lifecycle.
- Be aware of the possible uses for EHR data and HIT in conducting PBRN research.
- Identify the facilitators and barriers to incorporating EHR data and HIT in your research projects.
- Develop strategies to ensure that PBRN partners benefit from EHR and HIT-based projects.



Introduction



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How EHR Data and HIT Support “The Research Lifecycle”

Research Lifecycle Stage	Examples of Support Provided by EHR Data and HIT
Building Collaborations	<ul style="list-style-type: none">Tailor HIT and EHR data queries to answer questions important to practices
Identifying/Choosing the Problem	<ul style="list-style-type: none">EHR data-based discovery
Stating the Research Question	
Developing a research approach	<ul style="list-style-type: none">HIT-based interventionEHR data may provide the research data – define outcomes, delineate mediator and moderator variables.
Select a sample	<ul style="list-style-type: none">EHR can facilitate cohort discovery
Collect high quality data	<ul style="list-style-type: none">EHR can provide discrete data fields, standardized coding (e.g., ICD, CPT, SNOMED)
Analyze and interpret data	
Disseminate findings	<ul style="list-style-type: none">EHR-based patient portals can communicate with patients

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Research New Functions and New Technology

Creating new technology or modifying existing systems is hard...

Electronic health record functionality needed to better support primary care

John H. Kim,¹ John W. Bunting,² Isaac C. Connors,³ David C. Kiple,⁴ Michael S. Kivimäki,⁵ Christopher J. Lohman,⁶ Charles H. Fox,⁷ Jason M. Mitchell,⁸ James M. Mink,⁹ William D. Papp,¹⁰ Karen M. Peterson,¹¹ Robert J. Phillips,¹² Robert Post,¹³ Jon Purn,¹⁴ Michael Rabinovitch,¹⁵ Ray Sankar,¹⁶ Steven E. Shalender¹⁷

ABSTRACT

Electronic health records (EHRs) have become a critical tool for primary care physicians and patients, yet many EHRs are still struggling to meet the needs of primary care. This paper discusses the challenges of EHRs in primary care and the need for new functions and technology to better support primary care. The authors discuss the challenges of EHRs in primary care and the need for new functions and technology to better support primary care. The authors discuss the challenges of EHRs in primary care and the need for new functions and technology to better support primary care.

SPECIAL ARTICLE

A Family Medicine Health Technology Strategy for Achieving the Triple Aim for US Health Care

Thomas J. Witek, MD, Scott M. Ford, MD, MPH, Michael T. Davis, MD, MPH, Jennifer C. Dineen, MD, MPH, Thomas J. Witek, MD, Scott M. Ford, MD, MPH, Michael T. Davis, MD, MPH, Jennifer C. Dineen, MD, MPH

ABSTRACT

Electronic health records (EHRs) have become a critical tool for primary care physicians and patients, yet many EHRs are still struggling to meet the needs of primary care. This paper discusses the challenges of EHRs in primary care and the need for new functions and technology to better support primary care. The authors discuss the challenges of EHRs in primary care and the need for new functions and technology to better support primary care.

Think about partners for collaboration; create a multidisciplinary team; align with your EHR vendor; find developers who have done something similar.

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Don't Forget Dissemination & Implementation Research!

Improving how we use EHRs and technology may be more important than what we use.

Research Paper
The Relationship between Electronic Health Record Use and Quality of Care over Time
 1. Eric D. Miller, PhD, University of Texas, Austin; 2. Kevin M. Lavin, MD, University of Texas, Austin; 3. John D. Hays, PhD, University of Texas, Austin; 4. John A. Borenstein, PhD, University of Texas, Austin

ABSTRACT Electronic health records (EHRs) have the potential to address the quality of care that patients receive. However, the extent to which EHRs improve the quality of care remains unclear. This study examined the relationship between EHR use and quality of care over time. The study found that EHR use was associated with improved quality of care over time. The study also found that EHR use was associated with improved patient satisfaction. The study concluded that EHR use is associated with improved quality of care and patient satisfaction.



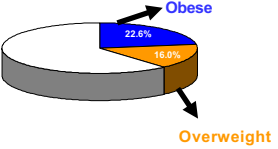
Frameworks exist for evaluating Dissemination & Implementation outcomes (e.g. www.RE-AIM.org).

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Roles of the EHR in Research

Pilot Data – Obesity Study

- Demographics:
 - Eligible – 3,734
 - Female – 49.5%
 - Age – 9.7 years (6.6 – 12.8)
 - Time between visits – 395 days (322 to 552)

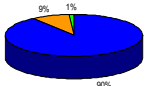


Obese: 22.6%
Overweight: 16.0%

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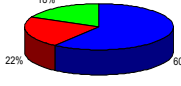
Longitudinal EHR Data Facilitates Further Analysis:

If "obese" at baseline, then at second visit....



Remained same: 90%
Returned to healthy weight: 9%
Overweight: 1%
Obese: 0%

If "overweight" at baseline, then at second visit....




Remained same: 60%
Returned to healthy weight: 22%
Overweight: 18%
Obese: 0%

- Lists of appointments for potential subjects that favor **sensitivity** over *specificity*
- Sent each Friday to research team
- Study team can target specific dates/times to be on-site to maximize their recruitment potential


Subject Recruitment: Extracting Data from Templates

Grundmeier RW et al., "Research Subject Recruitment Using the Electronic Health Record, AMIA Annu Symp Proc, 2007.

PeRC  **IFED Study**

Please select one of the options below for IFED Study study - or - [Click here for project details](#)







Eligibility	Healthy African American BREASTED infants are eligible to participate
Purpose	To evaluate play, language and bone health of toddlers who were exclusively fed breast milk, cow-milk formula or soy protein formula at two study visits: 12 months and 24 months of age
Benefits	Free hearing test, access to no cost treatment and DEVA scan
Compensation	Educational materials, a toy and cash reimbursement for inconvenience and travel
	<input checked="" type="radio"/> OK to contact <input type="radio"/> Study declined <input type="radio"/> Not eligible <input type="radio"/> Defer decision
[Optional]	Preferred phone number & time: <input type="text" value="215-555-1234-evening"/>

PeRC  **P₃ Study**

Please select one of the options below for P₃ Study study - or - [Click here for project details](#)

Eligibility	Children born at 35 weeks gestational age or less are eligible to participate
Purpose	To evaluate parent's attitudes towards the healthcare system. Parents will be surveyed 3 times over the next two years.
Compensation	Compensation is provided for phone surveys
	<input checked="" type="radio"/> OK to contact <input type="radio"/> Study declined <input type="radio"/> Not eligible <input type="radio"/> Defer decision
[Optional]	Preferred phone number & time: <input type="text" value="215-555-1234"/>

Using the EHR as the Intervention: Decision Support

	Vaccines Due Now	Order Today	Next Doses	
		 HPV	<input checked="" type="checkbox"/>	5/1/2010
 Tdap		<input checked="" type="checkbox"/>		
 Meningococcal		<input checked="" type="checkbox"/>		
 Varicella		<input checked="" type="checkbox"/>	6/1/2010	
Upcoming Vaccines				
 Influenza			10/1/2010	
Resources ACIP schedule VIS-multiple languages				

Fiks AG, Grundmeier RW, Mayne S, Song L, Feemster K, Karavite D, Hughes CC, Massey J, Keren R, Bell LM, Wasserman R, Localio AR: "Effectiveness of Decision Support for Families, Clinicians, or Both on HPV Vaccine Receipt" *Pediatrics* 131: 1114-24, 2013.

Feedback Report

- Performance feedback—clinicians made aware of their own vaccination rates and how they compare to their practice and care network.
- Generated from EHR data

Visit Type	Human Papilloma Virus (HPV) Vaccine Given to Eligible Adolescent					
	You	Your Practice		Network		
	Number of Visits at which HPV Vaccine Given	Number of Visits at which HPV Vaccine Given	Number of Visits at which HPV Vaccine Given	Number of Visits at which HPV Vaccine Given	Number of Visits at which HPV Vaccine Given	
Well Visit	36	8 (22%)	216	68 (31%)	3913	1131 (29%)
Sick Visit	38	0 (0%)	253	13 (5%)	3860	85 (2%)

*Note: this is actual data from a randomly selected study clinician



Example #1 – National EHR datasets, getting to “Big Data”

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What is Big Data Anyway?

"...a broad term for data sets so large or complex that traditional data processing applications are inadequate."

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Data Provenance

The first law of informatics:

"Data shall only be used for the purpose for which they were collected."

van der Lei J. Use and abuse of computer-stored medical records. *Methods of Information in Medicine* 1991;30:79–80.

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The law of medical information: Berg and Goorman

- "The further information has to be able to circulate (i.e. the more diverse contexts it has to be usable in), the more work is required to disentangle the information from the context of its production. The question that then becomes pertinent is; who has to do this work, and who reaps the benefits?"

Int J Med Informatics 1999; 56:51–60

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**Comparative Effectiveness Research through
Collaborative Electronic Reporting
[CER²]:
Opportunities and Cautions as Data Gets Big**



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What is CER² & what is its origin?

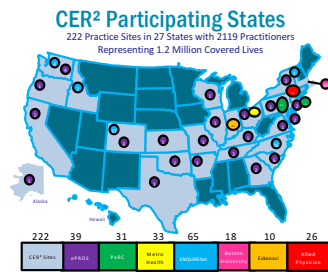
- CER² is a collaboration of primary care informatics researchers studying pediatric care through EHR and related electronic data
- CER² grew out of a need for large scale 21st century practice-based research
- CER² joins existing EHR-based research networks into an electronic über-network

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CER² Unique Appeal

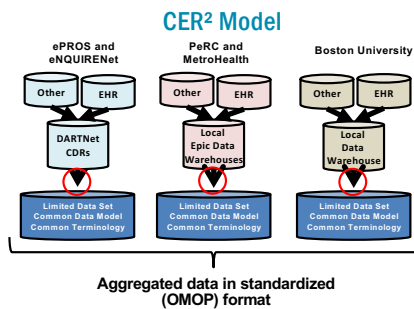
- Longitudinal electronic health record (EHR) database
 - Extensive follow-up time 2000-2014
 - Clinical data supplemented by administrative data
- Contains >1.2 million children, diverse practitioners, seen by practitioners in diverse settings from across the United States
- Supported by a unique team combining, health services, informatics and pharmacoepidemiology expertise
- EHR data from CER² can be combined with data collected from pediatricians, parents, and children to conduct prospective interventional studies and provide a powerful 21st century research platform

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Fiks AG, Grundmeier R, Steffes J, Adams W, Kaelber D, Pace W, Wasserman R. "Comparative Effectiveness Research Through a Collaborative Electronic Reporting Consortium". *Pediatrics* 136(5): e215-24, July 2015

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CER² Governance

- American Academy of Pediatrics "owns" the data and has data use agreement with all data contributors
- Aggregated HIPAA-limited dataset is stored on secure server at The Children's Hospital of Philadelphia
- CER² partner members contribute and analyze data
- CER² affiliate members can help analyze data
- Non-member investigators can help analyze data
- The CER² team has begun to recruit additional partners, affiliates, and non-member investigators to write grants, contribute data and answer new questions.

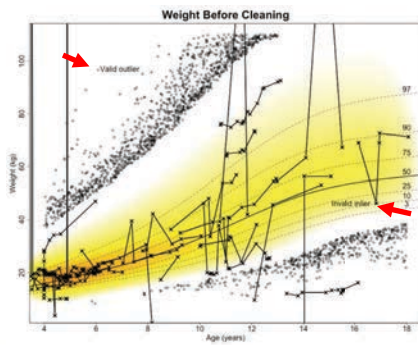
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Implausible Growth Data: Data Cleaning Method

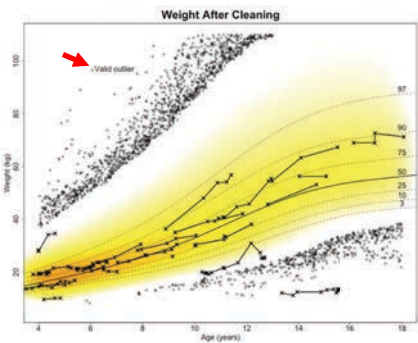
- Challenge: CER² has growth data on ~1.2 million children
- Errors include:
 - Substitution of metric and English system values
 - Misplaced decimal points
 - Plain old mistakes
- How to sort these out?
- The "Daymont Method"



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Missing Data on Race/Ethnicity



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Missing Data on Race/Ethnicity

Missing data on race/ethnicity is common

- Could an adaptation of a method used previously in adults be helpful in pediatrics?
- We tested "Bayesian Improved Surname Geocoding" which accounts for US census geospatial and surname data in addressing missingness
- *Bottom line: The new method more correctly race/ethnicity than traditional imputation, and reduced bias*

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Validity of Imputed Race/Ethnicity for Health Disparities Research

Table: Bias of different methods of estimate race/ethnic difference: true values and estimates by method

Race/Ethnicity	True value	All data*	Complete Case analysis	Indicator variable method	Multiple imputation	BISG-enhanced imputation
Continuous Outcome†						
Black	-10	-10.0 [-10.3,-9.71]	-2.59 [-2.89,-2.29]	-0.96 [-1.26,-0.70]	-2.96 [-3.41,-2.49]	-8.05 [-8.31,-7.74]
Hispanic	+10	9.97 [9.52,10.6]	6.88 [6.09,7.47]	8.21 [7.38,8.79]	7.62 [6.86,8.29]	8.30 [7.61,8.88]
Binary Outcome‡						
Black§	0.5	0.50 [0.48,0.52]	1.55 [1.29,1.41]	1.54 [1.48,1.60]	1.30 [1.22,1.39]	0.65 [0.62,0.68]
Hispanic	2.0	1.99 [1.89,2.11]	1.33 [1.26,1.42]	1.48 [1.40,1.58]	1.34 [1.27,1.45]	1.55 [1.45,1.64]

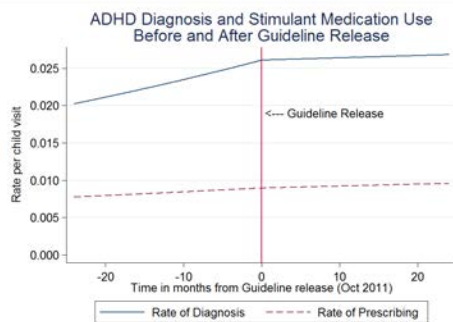
Grundmeier RW, et al., "Imputing missing race/ethnicity in pediatric electronic health records," Health Services Research, 2015 Mar 11. doi: 10.1111/1475-6773.12295. [Epub ahead of print]

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Evaluating the Impact of New Psychotropic Medication Guidelines

- In 2011, AAP ADHD practice guidelines provided, for the first time, guidance for the diagnosis and treatment of ADHD in preschoolers
- To evaluate the impact on clinical practice, we examined changes in the diagnosis of ADHD and prescription of stimulants to children aged **4 through 5 years old** following guideline publication

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- Patterns were similar in sensitivity analyses that included all practices.

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Recap: Big Data

- Data is being repurposed—this has inherent challenges
- Data cleaning is critical
- Once cleaned, pooled data may facilitate the elucidation of national practice patterns and the assessment of rare outcomes
- The CER² team welcomes interested investigators to participate



Example #2 – From regional data sharing infrastructure to small scale EHR data projects

WWAMI region Practice and Research Network



- 58 clinics across 26 organizations in 5 states
- 18 clinics are members of the Data QUEST data sharing infrastructure to share EHR data for research

Data QUEST

WHO: A collaboration between the WPRN and CTSA biomedical informatics program

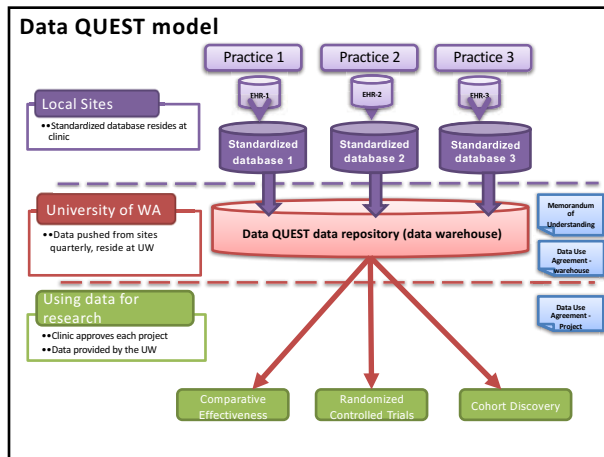
WHAT: Technology – aligns data repositories across practices

- identified clinical data repositories → at the practices
- de-identified data → in a central warehouse hosted at UW

WHY: Supporting research and quality improvement

BEYOND OUR REGION: Aligning with national efforts

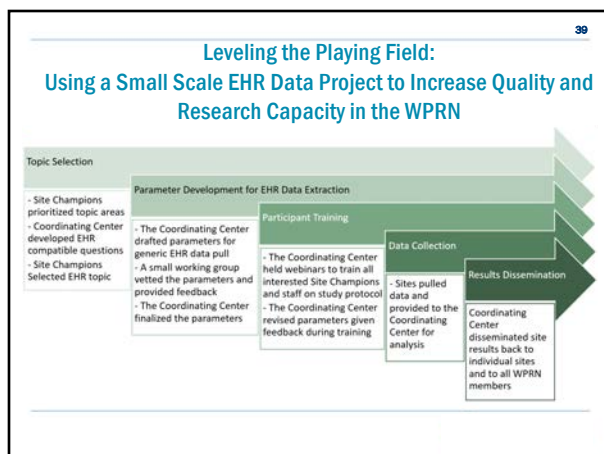
- Practice-Based Research Networks – DARTNet Institute
- Patient Centered Outcomes Research Institute (PCORI) PCORNet
- NIH Collaboratory Distributed Research Network



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Data QUEST

- Strengths**
 - Remarkable tool that has stimulated PBRN collaborations on:
 - 13 grants from small pilot studies to large scale pragmatic clinical trials
 - 17 manuscripts on the science of data sharing
- Challenges**
 - Costs are significant for
 - Coordinating center personnel to manage and conduct operations, monitor and maintain data quality
 - Installation costs ~\$7,000-\$10,000 per site, maintenance is \$2,500 annually. Data extraction costs ~\$3800 for the first site, \$750 each additional.
 - Navigating governance structures in clinical organizations can be formidable.
 - Clinical organizations may change EHRs or make upgrades that could derail the infrastructure.
 - Variation in EHR structure and how EHRs are used is substantial.
 - Not all WPRN sites can participate in Data QUEST.



WPRN EHR project query data table

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See definitions for bolded terms

Measure	Result
1) Demographic , Total number of adult patients with a visit to the clinic during the study period	
For Group A Sleep Medications	
2) Total patients , Number of adult patients with a visit to the clinic during the study period who had a prescription (during the study period) for at least 1 Group A sleep medication	
3) Male patients , Number of adult male patients with a visit to the clinic during the study period who had a prescription (during the study period) for at least 1 Group A sleep medication	
4) Female patients , Number of adult female patients with a visit to the clinic during the study period who had a prescription (during the study period) for at least 1 Group A sleep medication	
For Group B Sleep Medications	
5) Total patients , Number of adult patients with a visit to the clinic during the study period who had a prescription (during the study period) for at least 1 Group B sleep medication	
6) Male patients , Number of adult male patients with a visit to the clinic during the study period who had a prescription (during the study period) for at least 1 Group B sleep medication	
7) Female patients , Number of adult female patients with a visit to the clinic during the study period who had a prescription (during the study period) for at least 1 Group B sleep medication	
For Group C Sleep Medications	
8) Total patients , Number of adult patients with a visit to the clinic during the study period who had a prescription (during the study period) for at least 1 Group C sleep medication	
9) Male patients , Number of adult male patients with a visit to the clinic during the study period who had a prescription (during the study period) for at least 1 Group C sleep medication	
10) Female patients , Number of adult female patients with a visit to the clinic during the study period who had a prescription (during the study period) for at least 1 Group C sleep medication	
For Group D Sleep Medications	
11) Total patients , Number of adult patients with a visit to the clinic during the study period who had a prescription (during the study period) for at least 1 Group D sleep medication	

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Returning Results to Sites is Critical

- One page study summary sheet
- Presented anonymously to the WPRN site champions at our annual meeting.
- Sites knew who they were – could compare their rates to similar practices

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Small Scale EHR Data Project

- Strengths**
 - More WPRN sites could participate
 - Sites were highly engaged in the science, data collection, and results interpretation
 - No IRB approvals required!
- Challenges**
 - No process for assessing data quality or validation
 - Results can be used for preliminary studies, but no individual data for research
 - Limited resources to support follow-on quality improvement efforts

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Lessons Learned

- EHR-based projects are a powerful tool for engaging PBRN sites in research
 - Small scale EHR projects
 - Highly collaborative, responsive to PBRN site interests
 - Demonstrated site capabilities for EHR queries to sites themselves and to the PBRN Coordinating Center
 - Large scale data sharing
 - Requires a greater commitment from sites – must provide information on data origins (provenance)
 - Engages them as collaborators with academic investigators on pragmatic clinical trials, implementation and dissemination research

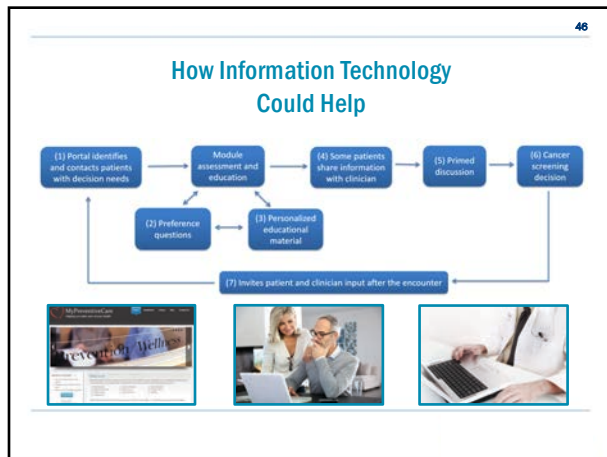


Example #3 – Integrating patient reported data into the EHR

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Informed Decision-Making Module

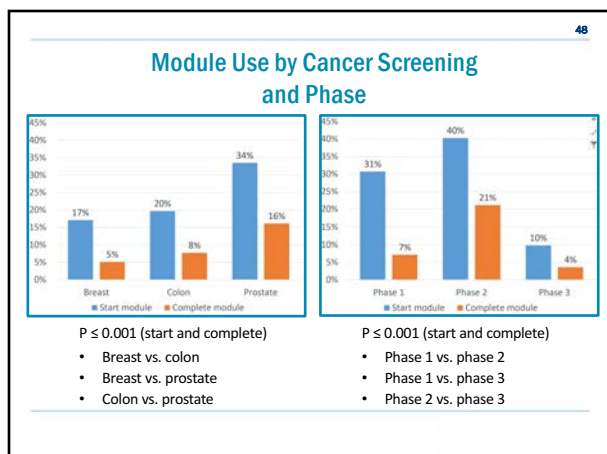
- Focus on three cancer screening decisions
- Specific aims:
 - **Aim 1** – to reach patients outside the clinical setting – before clinical encounters – to explore their preferred approach to decisions about cancer screening
 - **Aim 2** – to follow patients into the clinical encounter to study the assistance offered by clinicians, its congruence with the patient's stated preferences, and the effect of website exposure on the conversation and decision outcomes

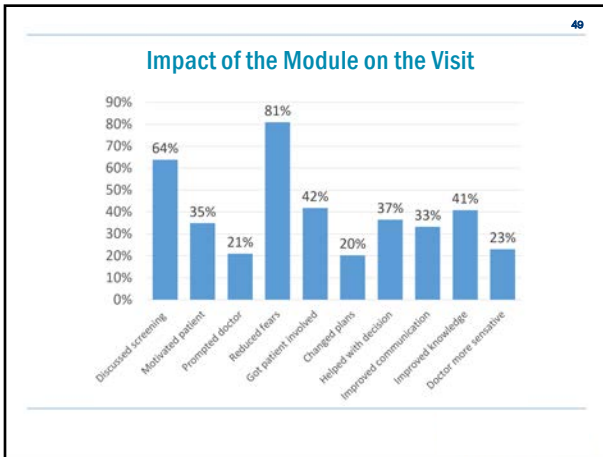


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Patients Facing Cancer Screening Decisions (n=72,000 portal users)

	Any	Breast	Colon	Prostate
Overall	11,094 (13.5%)	3,615 (4.4%)	6,115 (7.5%)	1,364 (1.7%)
Phase 1 (6 weeks) - Prompt when using	1,010	297	542	171
Phase 2 (14 weeks) - Invite before visit	610	171	354	85
Phase 3 (12 weeks) - Invite outside of visit	9,436	3,220	5,136	1,080





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Getting HIT to Work for this Research Study

<p><u>Facilitators</u></p> <ul style="list-style-type: none"> • We controlled the design and programming of the patient portal • Patient and clinician engagement supported the research • HIT automated a repetitious process that occurred frequently in practice 	<p><u>Barriers</u></p> <ul style="list-style-type: none"> • We had limited control over how the module interacted with the EHR • More time is needed to cause the culture change needed to redesign care • Sometimes it is difficult to balance research versus clinical data collection
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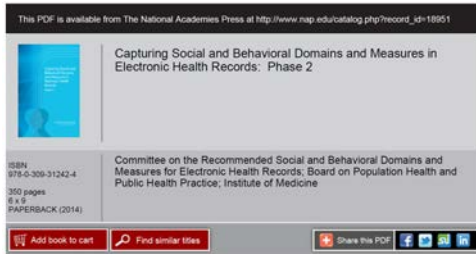
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The Benefits of Patient Reported Data

- Can be used to better engage patients in their care and wellbeing
- Can extend care outside of traditional office visits
- Can serve as a new data source – the answers to which only patients know

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The IOM Has Prioritized Capturing Patient Reported Data in Electronic Health Records



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Thank you for your interest

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Key References

- Electronic health record functionality needed to better support primary care. *J Am Med Inform Assoc.* 2014; 0:1-8. [PMID 24421225].
- A family medicine health information strategy for achieving the triple aim for U.S. healthcare. *Ann Fam Med.* 2015; 47(8):628-35. [PMID 26382121].
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- <https://dataquest.iths.org>