

## Opening Remarks

Atul Butte, MD, PhD Inaugural Director, UCSF Institute for Computational Health Sciences

### Thanks to an incredible planning team!

- Ariel Deardorff, Data Services Librarian, UCSF Library
- Sharat Israni, Executive Director, UCSF Institute for Computational Health Sciences
- Rick Larsen, Director Academic Research Systems
- Dana Ludwig, Research Database Architect, Enterprise Information and Analytics
- Angela Rizk-Jackson, Director of Operations, UCSF Institute for Computational Health Sciences
- Rhona Snyman, Chief Strategy Officer, UCSF CDHI
- Melissa Telli, Senior Director, Communications and Marketing, CTSI
- Leslie Yuan, Chief Information Officer, UCSF Clinical and Translational Science Institute

#### Sponsored by:

UCSF Institute for Computational Health Sciences

UCSF Information Technology Academic Research Systems

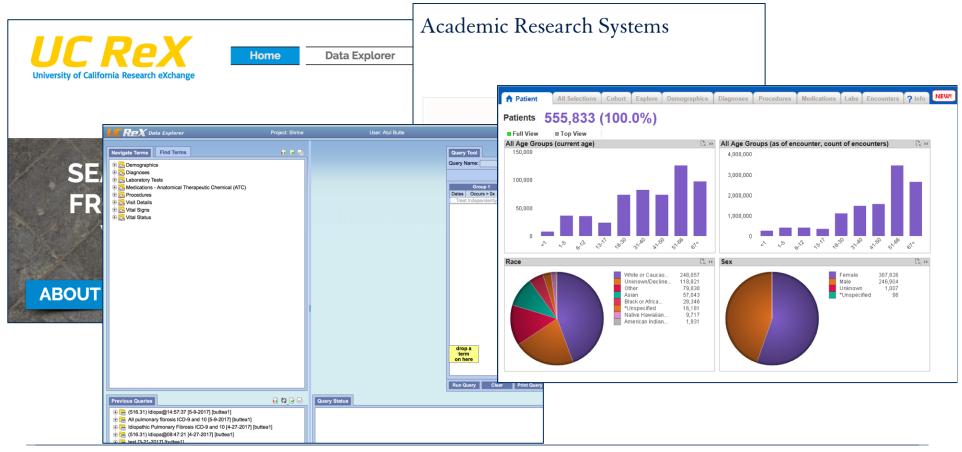
UCSF Clinical & Translational Science Institute (CTSI)

**UCSF Library** 

Center for Digital Health Innovation at UCSF



### We are incredibly lucky to have what we have!





#### The clinician of the future will use EHR data...

#### Evidence-Based Medicine in the EMR Era

Jennifer Frankovich, M.D., Christopher A. Longhurst, M.D., and Scott M. Sutherland, M.D.

culture of U.S. health care, but only if the federal government, 1. Landrigan CP, Parry GJ, Bones CB, Hackas the nation's largest health care payer, demonstrates that it is serious about improving patient safety. 2124-34. [Erratum, N Engl J Med 2010;363: are available with the full text of this article

2. Levinson D. Adverse events in hospitals:

Management, Harvard School of Public Human Services, 2010.

barth AD, Goldmann DA, Sharek PJ. Tempo-ral trends in rates of patient harm resulting from medical care. N Engl I Med 2010:363 2573.1

at NEJM.org. national incidence among Medicare beneficiaries. Washington, DC: Office of the Inspector General, Department of Health and

(Millwood) 2011;30:1217.] 4. Chassin MR, Loeb JM, Schmaltz SP, Wachter RM. Accountability measures — Wachter RM. Accountability measures — using measurement to promote quality im-provement. N Engl J Med 2010;363:683-8. 5. Hospital quality initiatives: outcome measures. Baltimore: Centers for Medicare & Medicaid Services. 2011. (https://www.

.cms.gov/HospitalC 20\_OutcomeMeasu

Copyright © 2011 Mass

Outcome — thrombosis Thrombosis risk factor Heavy proteinuria (>2.5 g per deciliter) "Blood clot"

no./total no (%) 10/98 (10)

Not applicable

#### Evidence-Based Medicine in the EMR Era

Jennifer Frankovich, M.D., Christopher A. Longhurst, M.D., and Scott M. Sutherland, M.D.

Many physicians take great though anticoagulation is not pability.¹ Thro standard practice for children could rapidly r dence-based medicine. Modern with SLE even when they're critimedical education emphasizes the cally ill, these additional factors value of the randomized, con- put our patient at potential risk trolled trial, and we learn early for thrombosis, and we considon not to rely on anecdotal evi- ered anticoagulation. However, we dence. But the application of such were unable to find studies persuperior evidence, however admi- taining to anticoagulation in our rable the ambition, can be con- patient's situation and were therestrained by trials' strict inclusion fore reluctant to pursue that and exclusion criteria - or the course, given the risk of bleeding. complete absence of a relevant A survey of our pediatric rheutrial. For those of us practicing matology colleagues - a review pediatric medicine, this reality is of our collective Level V evidence. all too familiar. In such situa- so to speak - was equally fruittions, we are used to relying on less and failed to produce a conevidence at Levels III through V — sensus. expert opinion — or resorting to anecdotal evidence. What should us and needing to make a deciwe do, though, when there aren't sion swiftly, we turned to a new even meager data available and approach, using the data captured we don't have a single anecdote in our institution's electronic medon which to draw?

such a situation as we admitted platform, called the Stanford to our service a 13-year-old girl Translational Research Integrated and 11.8 (95% with systemic lupus erythemato- Database Environment (STRIDE), sus (SLE). Our patient's presenta- acquires and stores all patient tion was complicated by nephrotic- data contained in the EMR at conducted in less than 4 hours range proteinuria, antiphospholipid our hospital and provides imme- by a single clinician. On the baantibodies, and pancreatitis. Al- diate advanced text searching ca- sis of this real-time, informatics

Without clear evidence to guide ical record (EMR) and an innova-We recently found ourselves in tive research data warehouse. The

SLE cohort that patients with October 2004 a created for use plications asso col approved l review board.

atric lupus coh veloped throm ly ill. The prev among patient and pancreati compared with risk factors th sis was 14.7 (9 tients with ne

among those with pancreatitis This automated cohort review was Results of Electronic Search of Patient Medical Records (for a Cohort of 98 Pediatric Patients with Lupus) Focused on Risk Factors for Thrombosis Relevant to Our 13-Year-Old Patient with Systemic Lupus Erythematosus.\*

Outcome or Risk Factor	Keywords Used to Conduct Expedited Electronic Search	Prevalence of Thrombosis	Relative Risk (95% CI)
		no./total no (%)	
Outcome — thrombosis	"Thrombus," "Thrombosis," "Blood clot"	10/98 (10)	Not applicable
Thrombosis risk factor			
Heavy proteinuria (>2.5 g per deciliter)			
Present at any time	"Nephrosis," "Nephrotic," "Proteinuria"	8/36 (22)	7.8 (1.7–50)
Present >60 days	"Urine protein"	7/23 (30)	14.7 (3.3–96)
Pancreatitis	"Pancreatitis," "Lipase"	5/8 (63)	11.8 (3.8–27)
Antiphospholipid antibodies	"Aspirin"	6/51 (12)	1.0 (0.3–3.7)

used to guide real-time clinical to her anticoagulation; truthfully, decisions. The rapid electronic though, we may never really chart review and analysis were know. We will, however, know not only feasible, but also more that we made the decision on the Annu Symp Proc 2007;October 11:900.

4. Halevy A, Norvig P, Pereira F. The Unrea helpful and accurate than physi-basis of the best data available sonable Effectiveness of Data. IEEE Intelli-

diagnosis of pediatric hypertension - an example of a new era of clinical research er abled by electronic medical records, AMIA Systematic comparison of phenome-wide association study of electronic medical record data and genome-wide association study data

Systematic comparison of phenome-wide association study of electronic medical record data and genome-wide association study data

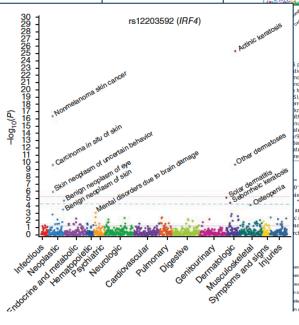
Joshua C Denny<sup>1,2</sup>, Lisa Bastarache<sup>2</sup>, Marylyn D Ritchie<sup>3</sup>, Robert J Carroll<sup>2</sup>, Raquel Zink Julie R Field<sup>4</sup>, Jill M Pullev<sup>4,5</sup>, Andrea H Ramirez<sup>1</sup>, Erica Bowton<sup>4</sup>, Melissa A Basford<sup>4</sup>, D Peggy L Peissig<sup>7</sup>, Abel N Kho<sup>8</sup>, Jennifer A Pacheco<sup>9</sup>, Luke V Rasmussen<sup>10</sup>, David R Cross Jyotishman Pathak<sup>13</sup>, Suzette J Bielinski<sup>14</sup>, Sarah A Pendergrass<sup>3</sup>, Hua Xu<sup>15</sup>, Lucia A Hin Rongling Li<sup>16</sup>, Teri A Manolio<sup>16</sup>, Christopher G Chute<sup>13</sup>, Rex L Chisholm<sup>17</sup>, Eric B Larso Murray H Brilliant18, Catherine A McCarty19, Iftikhar J Kullo20, Jonathan L Haines21, Da Daniel R Masys<sup>22</sup> & Dan M Roden<sup>1,23</sup>

Candidate gene and genome-wide association studies (GWAS) have identified genetic variants that modulate risk for human disease; many of these associations require further study to replicate the results. Here we report the first large-scale application of the phenome-wide association study (PheWAS) paradigm within electronic medical records (EMRs), an unbiased approach to replication and discovery that interrogates relationships between targeted genotypes and multiple phenotypes. We scanned for associations between 3.144 single-nucleotide polymorphisms (previously implicated by GWAS as mediators of human traits) and 1,358 EMR-derived phenotypes in 13,835 individuals of European ancestry. This PheWAS replicated 66% (51/77) of sufficiently powered prior GWAS associations and revealed 63 potentially pleiotropic associations with  $P < 4.6 \times 10^{-6}$ (false discovery rate < 0.1); the strongest of these novel associations were replicated in an independent cohort (n = 7,406). These findings validate PheWAS as a tool to allow unbiased interrogation across multiple phenotypes in EMR-based cohorts and to enhance analysis of the genomic basis of human disease

In recent years, GWAS have provided a powerful systematic method to investigate the impact of common genomic variations on human pathophysiology. Since 2005, more than 1,500 GWAS have identigenetic associations with a wide rai fied genomic variants associated with nearly 250 diseases and traits1;

large number of single variant-pheno serendipitous identification of single diseases, or pleiotropy. Notable examp which were associated initially with ea subsequently with intracranial aneury rysms3; variants in the human leuko IL23R, which were associated initially ease4 and subsequently with a variety of and PTPN22 R602W, which was ass of Crohn's disease and subsequently toid arthritis and other autoimmu of the NHGRI catalog noted pleiotro single-nucleotide polymorphisms (S associations in the catalog8

An alternative and complementar phenotype associations and to detect i PheWAS, associations between a spec range of physiological and/or clinical be explored either by using algorith analyzing data collected in observation small-scale EMR studies have provided the EMR-based PheWAS to replicate it associations and to uncover nov whether EMR data or PheWAS met systematically studied.

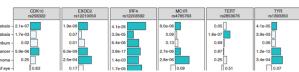


olots for four SNPs. Each panel represents 1,358 phenotypes ion with a particular SNP, using logistic regression assuming an odel adjusted for age, sex, study site and the first three principa otypes are grouped along the x axis by categorization within hierarchy. The upper red lines indicate  $P = 4.6 \times 10^{-6}$  (FDR = 0.1 ); lower blue lines indicate P = 0.05; dashed lines are a roni correction (P = 0.05/1,358). Diamonds encircling phenotype own NHGRI Catalog associations. (a) PheWAS associations for RF4, previously associated with hair and eye color, freckling and nuclear palsy. (b) PheWAS associations for rs2853676 in TERT, ted with glioma. (c) PheWAS associations for rs4977574 near 9p21, previously associated with myocardial infarction, and in osis. (d) PheWAS associations for rs660895 near HLA-DRB1 ed with rheumatoid arthritis. Results and plots for all SNPs sent study are available at http://phewascatalog.org/

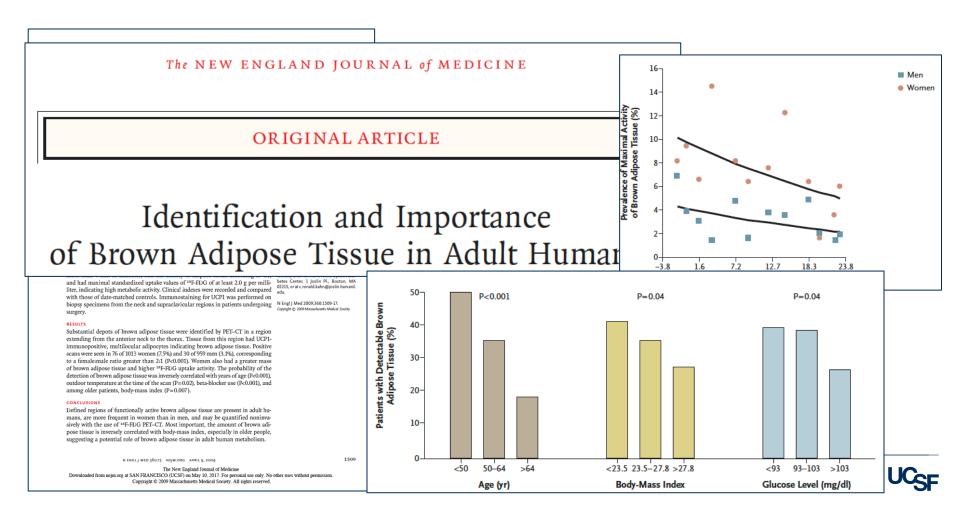
× 10<sup>-12</sup>), acute myocardial infarction (OR = nd hemorrhoids. Associations with hemorrhoids, aneurysms and carotid stenosis all persisted when odel was adjusted for coronary atherosclerosis or

Our study replicated the association between rheumatoid arthritis 8) and abdominal aortic aneurysm (OR = 1.29, and rs660895 near HLA-DRB1 (Fig. 3d; OR = 1.56,  $P = 6.7 \times 10^{-8}$ ). stent with prior publications3, but also with other This SNP was also strongly associated with type 1 diabetes (OR = 'vascular" phenotypes such as unstable angina, 1.44,  $P = 7.1 \times 10^{-8}$ ) and potentially associated with inflammatory arthritides (OR = 1.64,  $P = 3.1 \times 10^{-5}$ ), a parent phenotype of giant cell arteritis (OR = 1.94,  $P = 6.3 \times 10^{-5}$ ). Both of these associations persisted when adjusting for rheumatoid arthritis ( $P = 1.8 \times 10^{-7}$ for type 1 diabetes and  $P = 2.3 \times 10^{-5}$  for inflammatory arthritides).

ANALYSIS



#### The clinical researcher of the future will use EHR data...



## The patient of the future will need their EHR data...

# Kids who don't cry: New genetic disorder discovered

By Jacque Wilson, CNN

① Updated 2:53 PM ET, Thu March 20, 2014



Grace Wilsey was born with NGLY1 deficiency, v

The paper identifies NGLY1 deficiency as an inherited genetic disorder, caused by mutations in the NGLY1 gene. The researchers have confirmed eight patients with these mutations who share several symptoms, including developmental delays, abnormal tear production and liver disease.

And they credit an "Internet blog" with bringing the patients and scientists together.



#### Grace's genome

Grace Wilsey's parents knew something was wrong right away. Their newborn daughter was lethargic. Her eyes seemed hollow and unfocused. She refused to eat. Doctors at the hospital ran multiple tests, but couldn't come up with a diagnosis.

# "With great power comes great responsibility"

# "With great power comes great responsibility"

— Uncle Ben, Spider-Man

