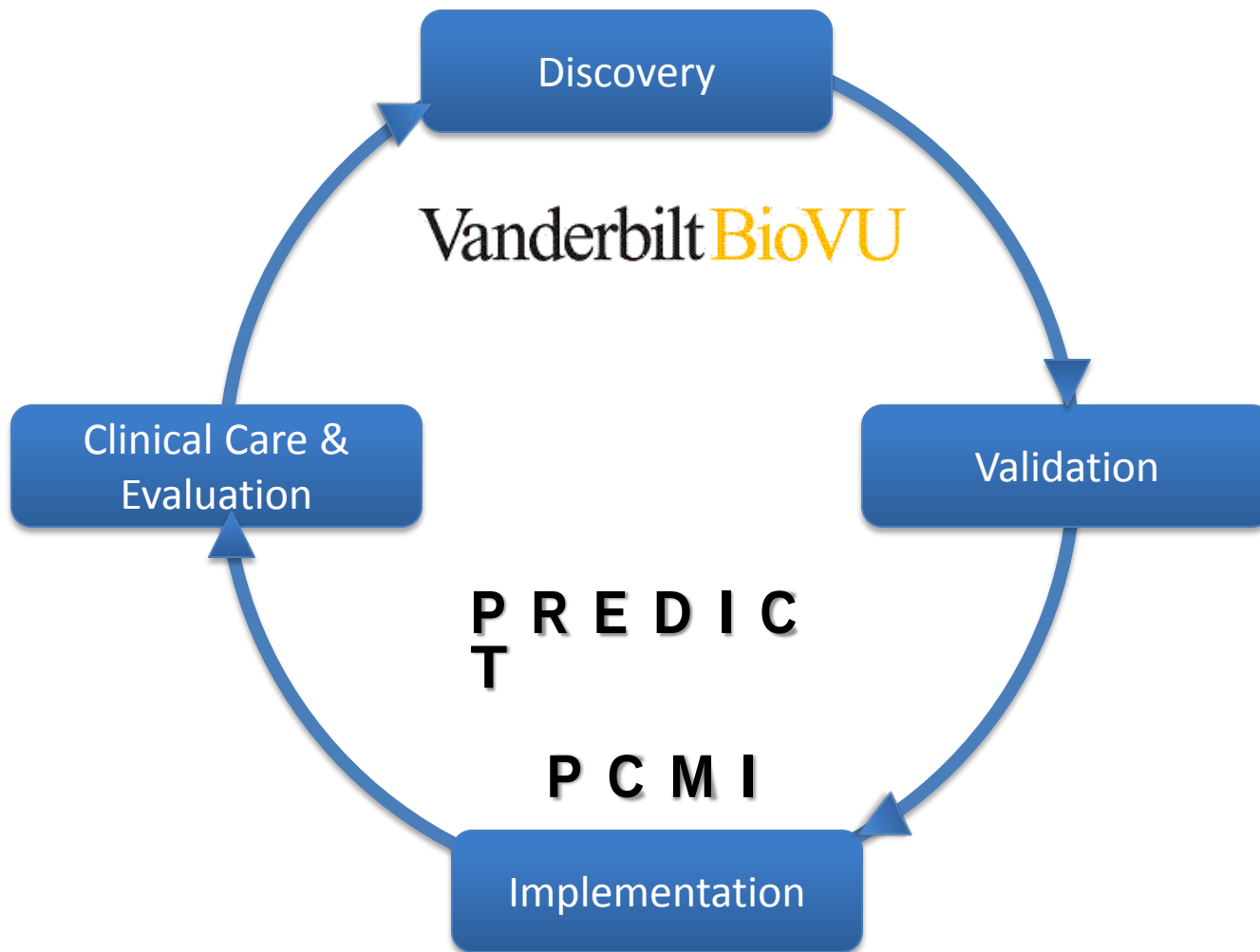
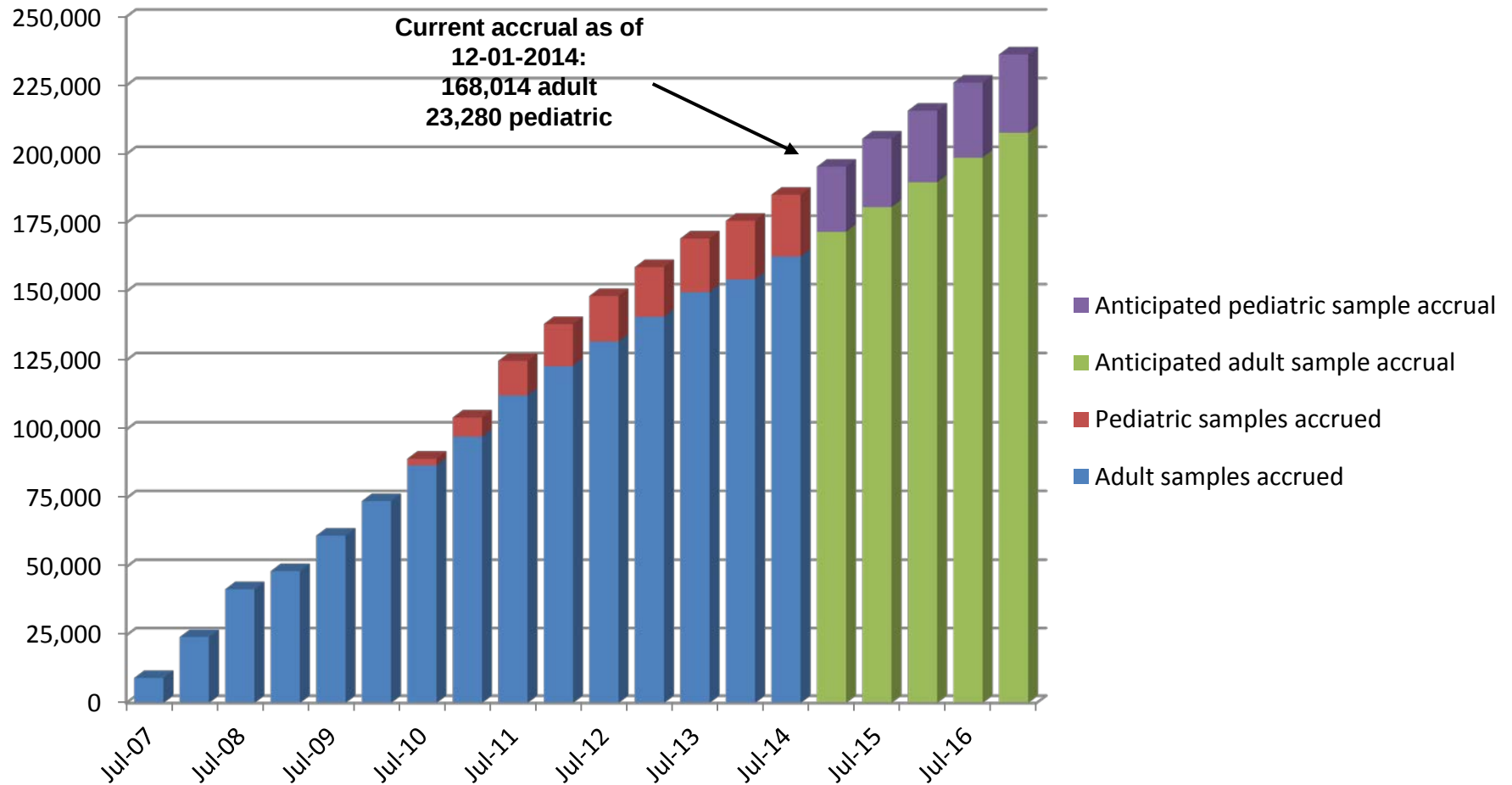


# Pharmacogenomic Learning Health Systems

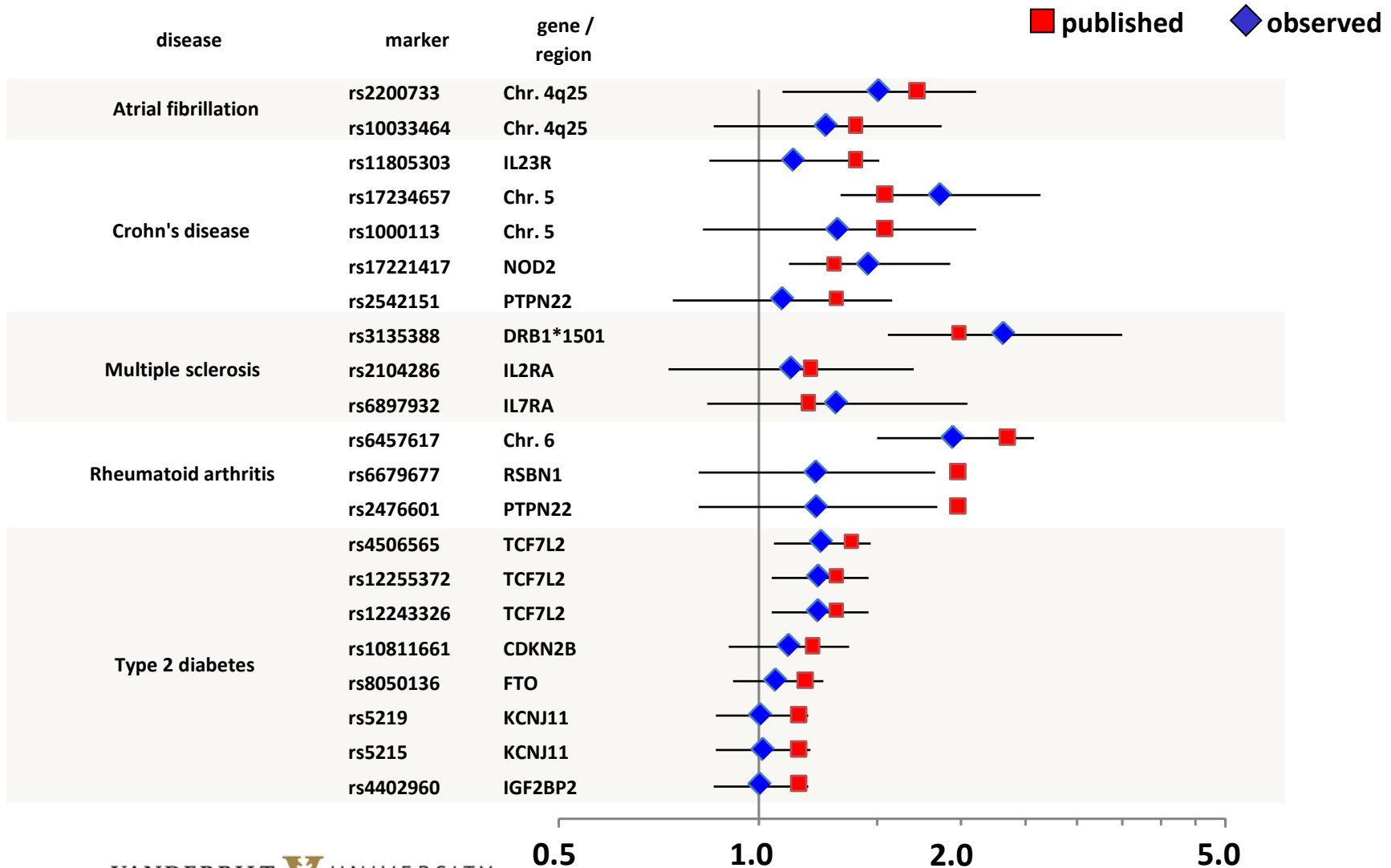
Josh F. Peterson, MD, MPH  
VUMC Department of Biomedical Informatics  
December 8<sup>th</sup>, 2014  
IOM Genomics Roundtable Workshop

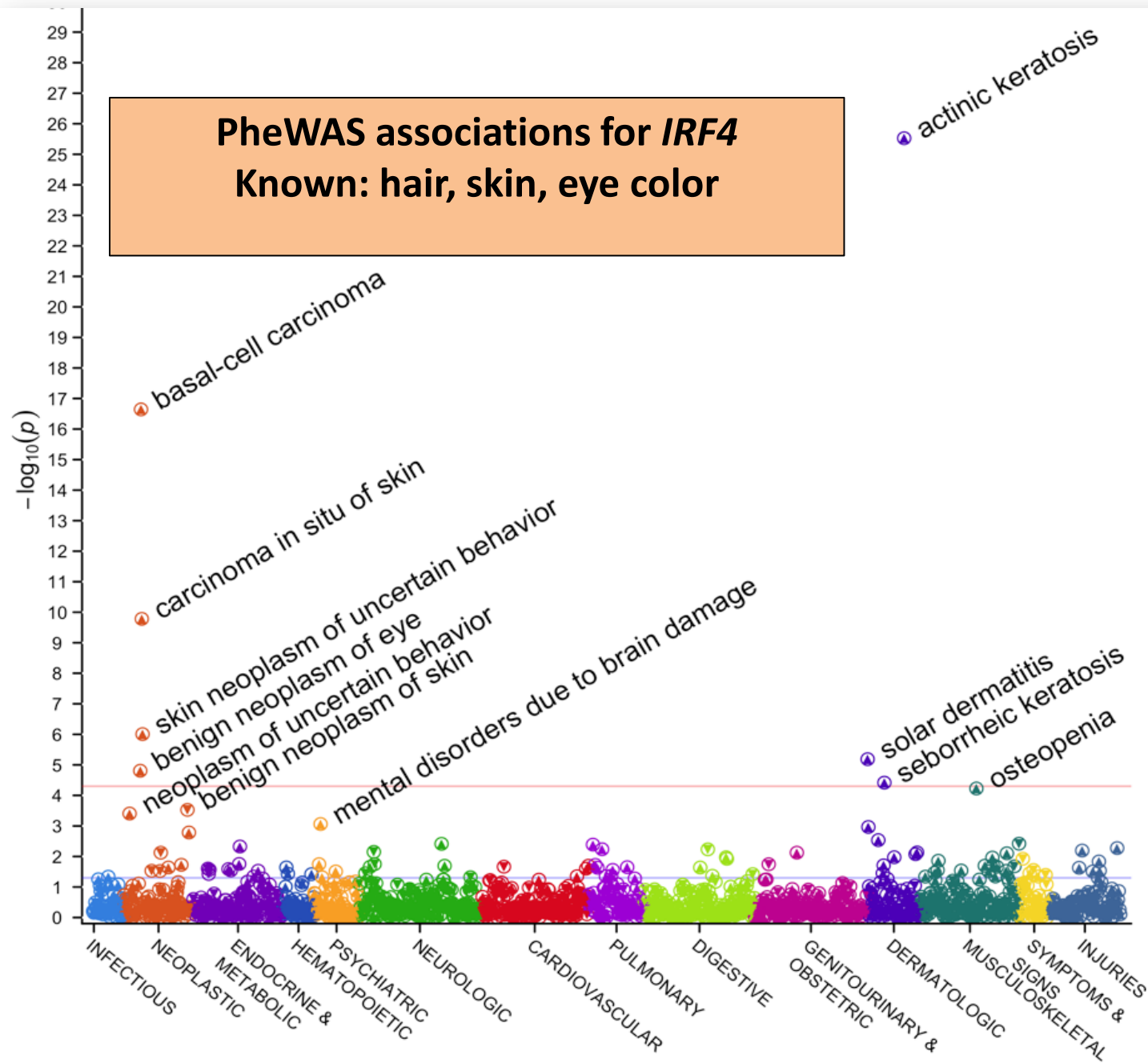


# BioVU Sample Accrual – 191,162



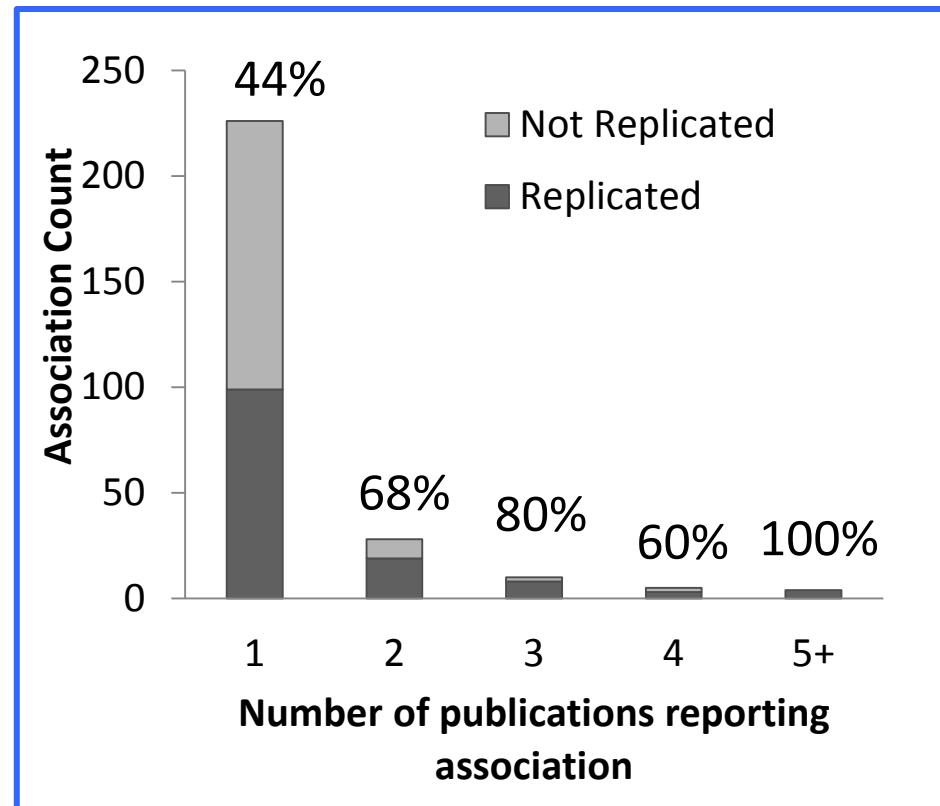
# GWAS Replication of Known Associations





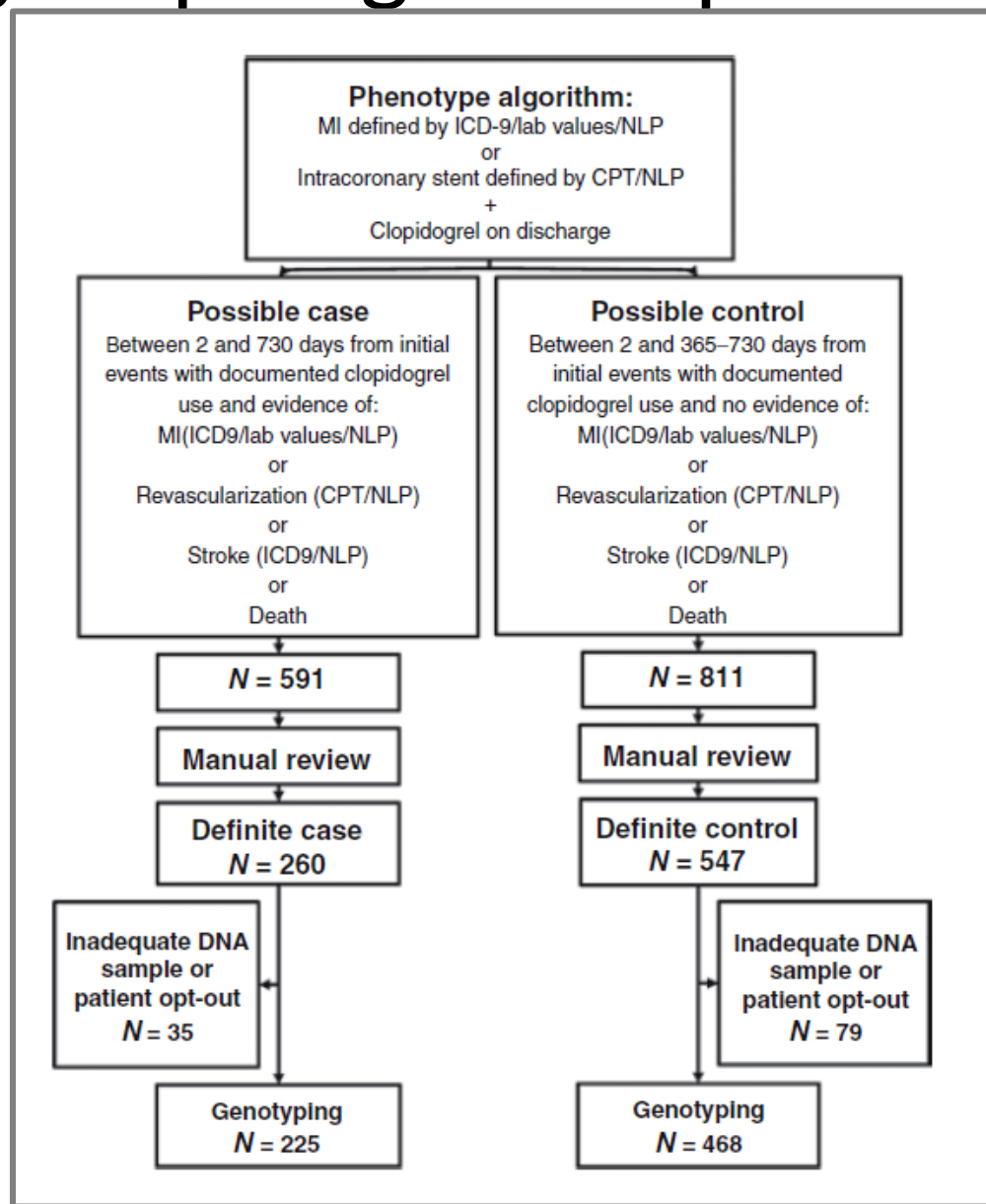
# Factors associated with replication

- Number of prior publications
- Exactness of phenotype match



# Predicting Clopidogrel Response

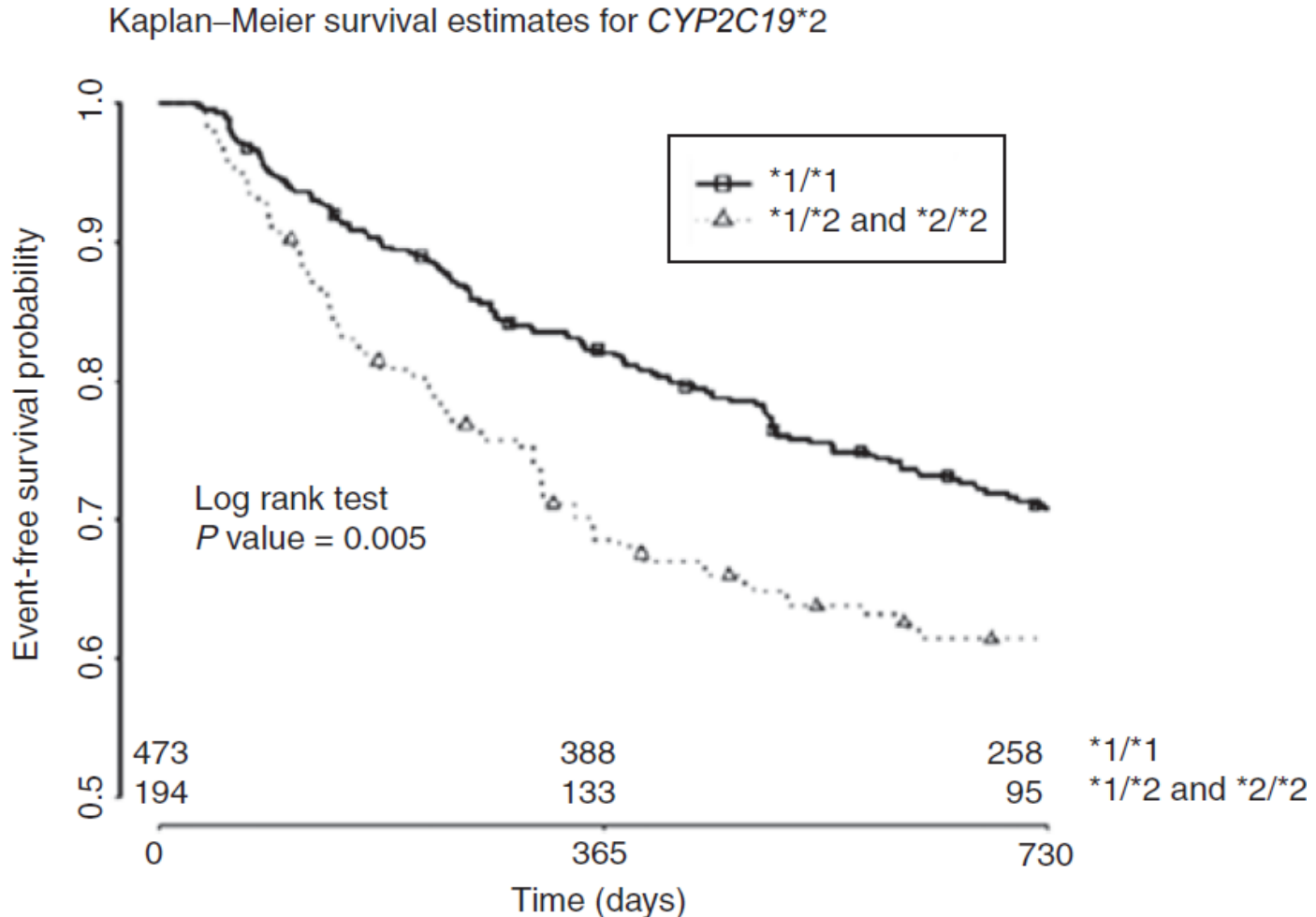
## *BioVU Validation of CYP2C19 LOF Variants and Clopidogrel Efficacy*



# Predicting Clopidogrel Response

## Increased MACE with Impaired Clopidogrel Metabolism

**a**



# Warfarin Dosing Algorithm

## Formula to Calculate WEEKLY DOSE

|                |                                                                               |                                                                                                                                                              |
|----------------|-------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Starting value |                                                                               | 4.999                                                                                                                                                        |
| Age            |                                                                               | -0.281 x age in decades                                                                                                                                      |
| Height         |                                                                               | +0.015 x height in cm                                                                                                                                        |
| Weight         |                                                                               | +0.011 x weight in kg                                                                                                                                        |
| Gene Results   | VKORC1 status<br>(absent = 0, present =1)                                     | -0.816 x VKORC1 A/G status<br>-1.808 x VKORC1 A/A status                                                                                                     |
|                | CYP2C9 status<br>(absent = 0, present =1)                                     | -0.441 x CYP2C9 *1/*2 status<br>-0.964 x CYP2C9 *1/*3 status<br>-1.160 x CYP2C9 *2/*2 status<br>-1.527 x CYP2C9 *2/*3 status<br>-3.003 x CYP2C9 *3/*3 status |
| Other Meds     | Is patient taking amiodarone?                                                 | -0.827 x amiodarone status                                                                                                                                   |
|                | Is patient taking an enzyme inducer?<br>(e.g., Rifampin, Diltiazem, Tegretol) | +0.188 x enzyme inducer status                                                                                                                               |

# Warfarin Dosing Model Fidelity

## BioVU Data Validation

| Algorithm                                    | Mean Absolute Error (mg/wk) |
|----------------------------------------------|-----------------------------|
| Fixed 5 mg Dose                              | 13.9                        |
| International Warfarin Pgx Consortium (IWPC) | 12.2                        |
| Warfarindosing.org                           | 11.9                        |
| Vanderbilt-specific Model                    | 9.7                         |

Target Clinics



Prognostic Flag for Testing



Preemptively Tested



Reactive/Indication Testing



Genotyped for PREDICT



CYP2C19  
Variant

TPMT  
Variant

VKORC1 +  
CYP2C9

CYP3A5  
Variant

Clopidogrel

Thiopurines

Warfarin

Tacrolimus

Has genetic risk  
variant

Exposed to new or  
recent prescription

Genotyping

Genetic  
Risk

Clinical  
Application

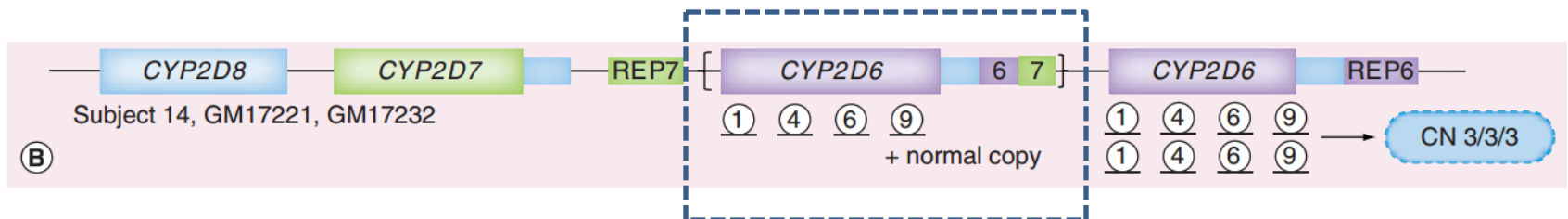
# PREDICT Genotyping Accuracy

| Gene Variants | Call Rate for Actionable Variants | Concordance on Repeat Samples | CAP Certification |
|---------------|-----------------------------------|-------------------------------|-------------------|
| CYP2C19 *2-*8 | 99.9%                             | 100%                          | Concordant        |
| SLC01B1 *5    | 99.7%                             | 100%                          | *                 |
| VKORC1        | 99.8%                             | 100%                          | Concordant        |
| CYP2C9 *2,*3  | 99.4%                             | 100%                          | Concordant        |
| TPMT *2, *3   | 99.7%                             | 100%                          | *                 |

# Quality of Genotyping

- Genotyping platforms for pharmacogenomics are high quality with known trouble spots

## 1) CYP2D6 copy number variation:



# Policy and Infrastructure Barriers

## Standards for exchanging genomic results

Labcorp Report

Page 1 of 1



February 8, 2013

Labcorp Of America  
Oncology Department RTP  
1912 Alexander Drive  
RESEARCH TRIANGLE, NC 27709

Test Results of: CYTOCHROME DUMMY  
DOB: 01/01/1980 Age: 33.1 Y Sex: NI  
Collected on: 02/07/2013  
Received on: 02/07/2013  
Reported on: 02/08/2013

Branch Number: NCB13  
Account Number: 90001325  
Specimen Number: 038-225-9005-0  
Specimen Type: Blood

Patient ID#:

Physician:

Test: CYTOCHROME P450 2C19

Result:

CYP2C19 \*1/\*1, Extensive Metabolizer

### Interpretation:

The phenotype assigned is based on an FDA-cleared algorithm introduced in 2005 using the highest functioning allele to predict the metabolizer phenotype for that individual. Emerging data suggests that, at least for some drugs such as clopidogrel, gene dosage drug response differences can be clinically significant.

- Extensive metabolizers (EM) are anticipated to have an expected response to a standard drug dose.
- Poor metabolizers (PM) have significantly reduced or absent enzyme activity. Drugs are metabolized slowly or not at all causing increased concentrations of active drug with the potential for serious side effects.
- Intermediate metabolizers (IM) have reduced enzyme activity, and may experience some, or none, of the consequences similar to poor metabolizers.
- Ultra-rapid metabolizers (UM) have elevated enzyme activity. UM individuals may not reach therapeutic levels of active drug due to rapid clearance, and may be at increased risk for adverse reactions due to reaching higher concentrations of active metabolite than expected.

The metabolism of drugs is also influenced by race, ethnicity, diet and other medications and all factors should be considered prior to initiating therapy. All results must be interpreted in the context of other test results and clinical findings. This does not rule out the possibility of variant alleles in other drug metabolism pathways.

Common<sup>1</sup> prescription medications that may be impacted by CYP2C19 gene variants are listed below.

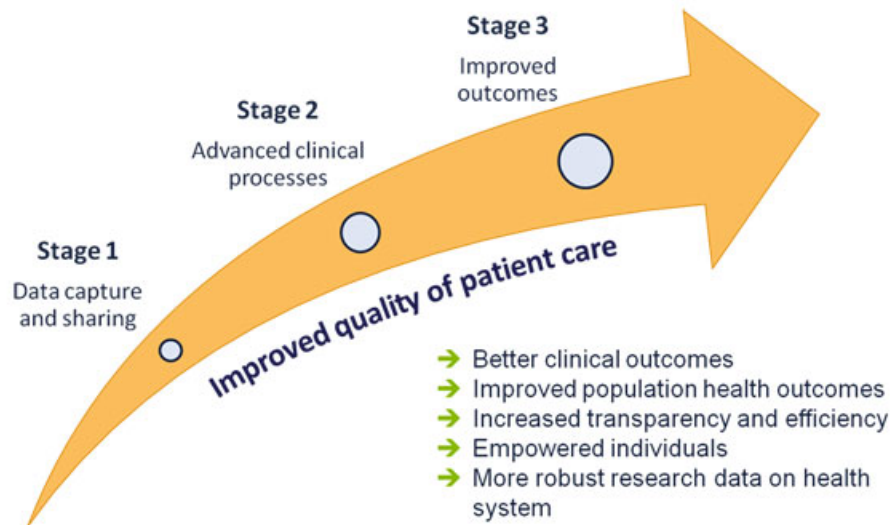
| Drug                                                                                    | Important Interactions                                                                                                                                                                                                                                                                                                                                                                                                                                                                                            |
|-----------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Platelet aggregation inhibitor:<br>Clopidogrel                                          | Poor metabolizers (PM) and intermediate metabolizers (IM) are at risk for recurrence of cardiovascular atherosclerotic disease. Ultra-metabolizers (UM) will have an enhanced response to clopidogrel, and may be at increased risk of bleeding. Co-administration of clopidogrel alongside CYP2C19 inhibitors such as omeprazole, esomeprazole, cimetidine, fluconazole, ketoconazole, voriconazole, efavirenz, felbamate, fluoxetine, fluvoxamine and ticlopidine can reduce clopidogrel's platelet inhibition. |
| Tri-cyclic antidepressants<br>(TCA): amitriptyline,<br>nortriptyline                    | Studies suggest that PMs may benefit from a lower starting dose.                                                                                                                                                                                                                                                                                                                                                                                                                                                  |
| Selective Serotonin Reuptake<br>inhibitor (SSRI): paroxetine,<br>fluoxetine, sertraline | Mean clearance rates may be decreased in PMs as compared with EMs. Studies suggest that PMs may be at risk for SSRI related cardiotoxicity.                                                                                                                                                                                                                                                                                                                                                                       |
| Proton pump<br>inhibitors: omeprazole                                                   | Data suggests improved cure rates for EM and PM with double or triple therapy.                                                                                                                                                                                                                                                                                                                                                                                                                                    |
| Anti-epileptics: diazepam,<br>phenytoin                                                 | Diazepam half-life is significantly prolonged in 2C19 PM and may cause prolonged sedation, particularly if administered with inhibitors of 2C19.                                                                                                                                                                                                                                                                                                                                                                  |

<sup>1</sup>Common drugs are those included in the Top 300 Drugs prescribed in 2004. This table is intended as a guide and may not be inclusive of all clinically relevant 2C19

# Regulatory clarity around patient access to results

## Patient Access to Health Records

### ■ HIPAA & HITECH



An individual has a right of access to inspect and obtain a copy of protected health information about the individual in a designated record set, for as long as the protected health information is maintained in the designated record set.

-- HITECH Act

# Shared knowledge resources

- Phenotyping algorithm libraries
- Variant calling
- Clinical interpretation
- CDS rule repository

PheKB

ClinVar

ClinGen

HGNC  
HUGO Gene Nomenclature Committee



MY CANCER GENOME™  
GENETICALLY INFORMED CANCER MEDICINE



**PharmGKB**



my **DRUG** GENOME  
*The right drug, the right dose, the first time.*

**CPIC: Implementing PGx**  
a **PharmGKB** & PGRN collaboration

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