



Data-driven Systems and Personalized Medicine

Atul Butte, MD, PhD

abutte@stanford.edu

Chief, Division of Systems Medicine,

 [@atulbutte](https://twitter.com/atulbutte)

Department of Pediatrics,

Department of Medicine, and, by courtesy,

Computer Science

Center for Pediatric Bioinformatics, LPCH

Stanford University

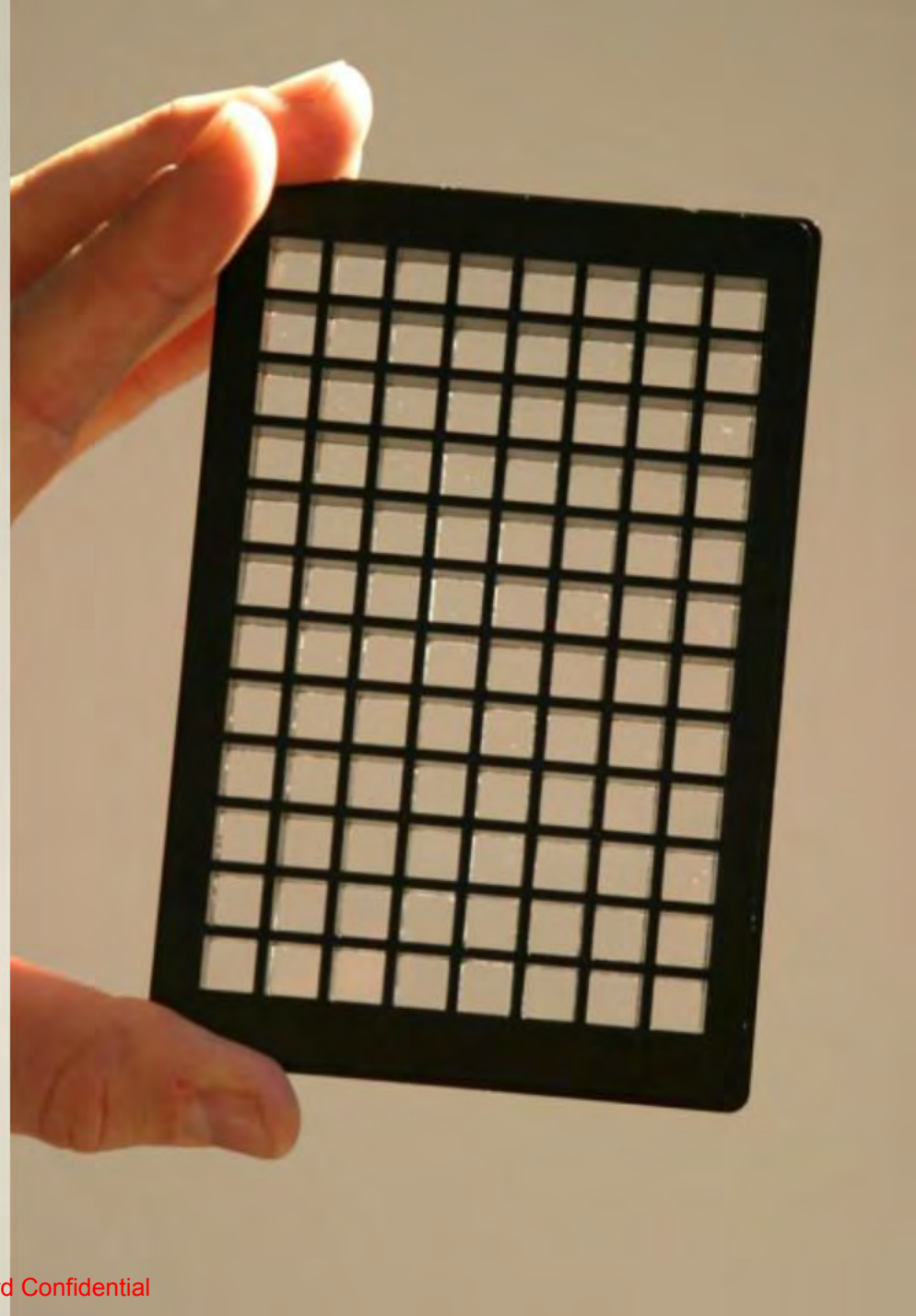


Butte Lab

Systems Medicine • Stanford Pediatrics • Packard Children's Hospital

Disclosures

- Scientific founder and advisory board membership
 - Genstruct
 - NuMedii
 - Personalis
- Past or present consultancy
 - Lilly
 - NuMedii
 - Johnson and Johnson
 - Genstruct
 - Tercica
 - Ansh Labs
 - Previa
- Honoraria
 - Lilly
 - Siemens



Gene Expression Omnibus: a public functional genomics data repository supporting [MIAME-compliant](#) data submissions. Array- and sequence-based data are accepted. Tools are provided to help users query and download experiments and curated gene expression profiles. [More information »](#)

GEO navigation

QUERY

DataSets

Gene profiles

GEO accession

GEO BLAST

DataSets

Platforms

Site contents

Public data

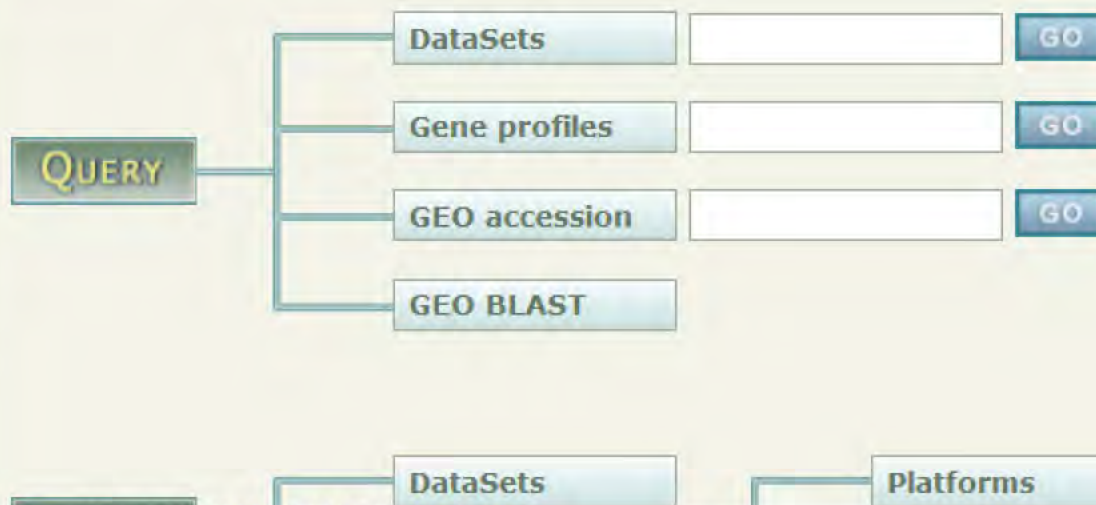
Platform	9,381
Samples	625,511
Series	25,166
DataSets	2,720

Documentation

[Overview](#) | [FAQ](#) | [Find](#)
[Submission guide](#)
[Linking & citing](#)
[Journal citations](#)
[Construct a Query](#)

Gene Expression Omnibus: a public functional genomics data repository supporting MIAME-compliant data submissions. Array- and sequence-based data are accepted. Tools are provided to help users query and download experiments and curated gene expression profiles. [More information »](#)

GEO navigation



Site contents

Public data

Platform	9,381
Sample	625,511
Series	25,166
DataSets	2,720

Documentation

Overview | FAQ | Find
Submission guide
Linking & citing
Journal citations
Construct a Query

Total 800,000 microarrays available
Doubles every two years

**Butte AJ. Translational Bioinformatics:
coming of age. JAMIA, 2008.**

ID	
E-MTAE	
E-MTAE	
E-MEXP	
E-MEXP	
E-MTAE	
E-MEXP	
E-MEXP	
E-MEXP	
E-MEXP	
E-MEXP	
E-MEXP	
E-MTAE	
E-MEXP	
E-MEXP-2950	Transcription profiling by array of mo
E-MEXP-2920	Transcription profiling by array of Dro
E-MEXP-2932	Naringin the Major Grapefruit Flavono
E-MTAB-767	Genomic binding of Pol III transcripti
E-MEXP-2916	RNAi - MBD2 - MRC5 cells
E-MEXP-1915	Transcription profile of Campylobac
E-TABM-1204	Hepatic transcriptomic analysis of inte
E-MTAB-766	Microarray based molecular marker o
	5218 experiments, 170389 assays. Display



assay depot

the marketplace for pharmaceutical research services

All the Services you need

Researchers around the world use
Assay Depot to find the
latest research services

Take the Tour



or click on a button below to browse research services

biology



chemistry



dmpk



pharmacology



toxicology





assay depot

the marketplace for pharmaceutical research services

biology

chemistry

dmpk

pharmacology

toxicology

Home » Pharmacology

➤ Bone Models

Bone Metastases
Osteoarthritis
Osteoporosis

➤ Cardiovascular Models

Atrial Arrhythmias
Coronary Artery Disease
Hypertension
Ischemia
Myocardial Infarction
Restenosis
Ventricular Tachycardia

➤ Dermatology Models

Acne
Atopic Dermatitis
Hair Growth
Lupus
Psoriasis
Rosacea
Skin Graft
Wound Healing

➤ Diabetes Models

BB/W Rats
Food Intake
Goto-Kakizaki Rats
Non Obese Diabetic Mice
Obese Mice
Primate Diabetes
Streptozotocin Mice
Streptozotocin Rats

[More...](#)

➤ Genitourinary Models

Chronic Kidney Disease
Cystometry
Endometriosis
IGA Glomerulonephritis
Interstitial Cystitis
Spinalized Rats

➤ In Vitro Models

In Vitro Bone Models
In Vitro CVD Models
In Vitro Diabetes Models
In Vitro Eye Models
In Vitro Oncology Models
In Vitro Skin Models

➤ In Vivo Technologies

Cognition
EEG
Electrophysiology
Imaging
Microdialysis

➤ Infectious Disease

Bacterial Infection
Dengue Virus
Hepatitis C Virus
Influenza
LCMV Mouse
Malaria

➤ Inflammation Models

Arthritis
Delayed Type Hypersens
Edema
Hemophilia
Irritable Bowel Disease
Irritant
LPS Acute Response
Mucositis

[More...](#)

➤ Neurological Models

Alzheimer's Disease
Anxiety
Behavioral Tests
Cerebral Palsy
Circadian Profiling
Depression
Epilepsy
Olfactory Testing

[More...](#)

➤ Oncology Models

Angiogenesis
Cachexia

➤ Ophthalmic Models

Cataract
Corneal Dystrophy

➤ Otology Models

Hearing Loss
Meniere's Disease

➤ Pain Models

General Pain
Inflammatory Pain

➤ Respiratory Models

Ascaris Lung Allergy
Cough

Stanford Confidential

ob/ob Diabetes Model - 16 Mice

Service Description

Provider: Links Biosciences is a US company with laboratories in Hangzhou, China. The laboratory has been offering exploratory (non-GLP) pharmacology services to US and Chinese biopharma since 2004.

Background: The obese mutant mouse model was first reported by Ingalls A *et al* from the Jackson Laboratory in 1951 ([Obese, a New Mutation in the House Mouse](#) [164 KB]). The obese mouse resulted from a spontaneous mutation in a gene that was named *ob* in the V stock. Mice homozygous for the obese spontaneous mutation, ($Lep^{ob^{ob}}$; commonly referred to as *ob* or *ob/ob*), are first recognizable at about 4 weeks of age. Homozygous mutant mice gain weight rapidly and may reach three times the weight of wild-type controls. In addition to obesity, mutant mice exhibit hyperphagia, a diabetes-like syndrome of hyperglycemia, glucose intolerance, elevated plasma insulin, subfertility, impaired wound healing, and an increase in hormone production from both pituitary and adrenal glands. Friedman J *et al* reported leptin in 1994, and demonstrated that leptin, the product of the *ob* gene, was produced in white adipose tissue and served as the peripheral signal to the central nervous system of nutritional status.

Service Details: This service offers a 28 day db/db mouse model of T2DM and obesity. Customer has various options that are conveyed to Links Biosciences using a Service Order Form. Customer assigns up to 16 mice to

ob/ob Diabetes Model - 16 Mice

Service Description

Provider: Links Biosciences is a US company with laboratories in Hangzhou, China. The laboratory has been offering exploratory (non-GLP) pharmacology services to US and Chinese biopharma since 2004.

Background: The obese mutant mouse model was first reported by Ingalls A *et al* from the Jackson Laboratory in 1951 ([Obese, a New Mutation in the House Mouse](#) [164 KB]). The obese mouse resulted from a spontaneous mutation in a gene that was named *ob* in the V stock. Mice homozygous for the obese spontaneous mutation, (*Lep^{ob}ob*; commonly referred to as *ob* or *ob/ob*), are first recognizable at about 4 weeks of age. Homozygous mutant mice gain weight rapidly and may reach three times the weight of wild-type controls. In addition to obesity, mutant mice exhibit hyperphagia, a diabetes-like syndrome of hyperglycemia, glucose intolerance, elevated plasma insulin, subfertility, impaired wound healing, and an increase in hormone production from both pituitary and adrenal glands. Friedman J *et al* reported leptin in 1994, and demonstrated that leptin, the product of the *ob* gene, was produced in white adipose tissue and served as the peripheral signal to the central nervous system of nutritional status.

Service Details: This service offers a 28 day db/db mouse model of T2DM and obesity. Customer has various options that are conveyed to Links Biosciences using a Service Order Form. Customer assigns up to 16 mice to

\$9,000.00 USD
per service

9 week
turn around time

Provided By
[Links Biosciences](#)



Request Info



Add to Cart

SHARE

**Validation methods are
increasingly commoditized**

Scroll down to browse a list of available research models for **Type I and Type II diabetes, hyperglycemia, insulin resistance, diet-induced obesity and related diseases**. Use the filters on the left to refine the list and then click on any listing to view technical information or to ask a question.

Click on the Vendors tab to view a complete list of CROs that offer diabetes and obesity pharmacology models.

VIEW SERVICES

VIEW VENDORS

133 results

get help

Search Filters

Diabetes and Obesity

BB/W Rats

Food Intake

Goto-Kakizaki Rats

Non Obese Diabetic Mice

Obese Mice

Obese Primates

Primate Diabetes

Streptozotocin Mice

Streptozotocin Rats

db/db Diabetic Mice

fa/fa Zucker Diabetic Rats

Certifications

GLP (48)

AAALAC (28)

GMP (20)

ISO 9001 (7)

GCP (7)

FDA (5)

USDA (4)

more

Locations

United States (64)

Univ. of Maryland School of Medicine Obesity and Diabetes Research Center

University of Maryland School of Medicine Obesity and Diabetes Research Center focuses on research of obesity, diabetes, and aging in nonhuman primates.

vendor info

+ Add

Transgenic Rabbit Models

Transgenic Rabbit Models offers transgenic rabbit models for the study of atherosclerosis, ophtalmology, hypertrophic myopathies, diabetes, obesity, hemostasis, respiratory diseases, AIDS, and cancer.

vendor info

+ Add

Ophthy-DS

Ophthy-DS offers ophthalmic model services for macular degeneration, diabetes, uveitis, and dry eye.

vendor info

+ Add

PharmaNess

PharmaNess offers pharmacokinetics, pharmacodynamics, formulations, behavioral assay, in vivo screening, ex vivo screening, microscopy, stereology and histology staining services.

vendor info

+ Add

Wisconsin National Primate Research Center

Wisconsin National Primate Research Center focuses on research of regenerative medicine, reproduction, immunology, virology, aging, and metabolic diseases.

vendor info

+ Add

Are you a vendor?

Visit our Backoffice to find out how you can offer your services on Assay Depot

Visit the Backoffice >>

Request a demo

Contact Corey Jacklin to schedule a demonstration

215-369-0965

cjacklin@assaydepot.com

Ask An Expert

Use our free service locator program to find the research services you need.

Search PubMed

Search PubMed for "Diabetes and Obesity" using BioWizard.

Selected Vendors

Stanford Confidential

Translational Pipeline

Clinical and Molecular Measurements



Translational Question or Trial

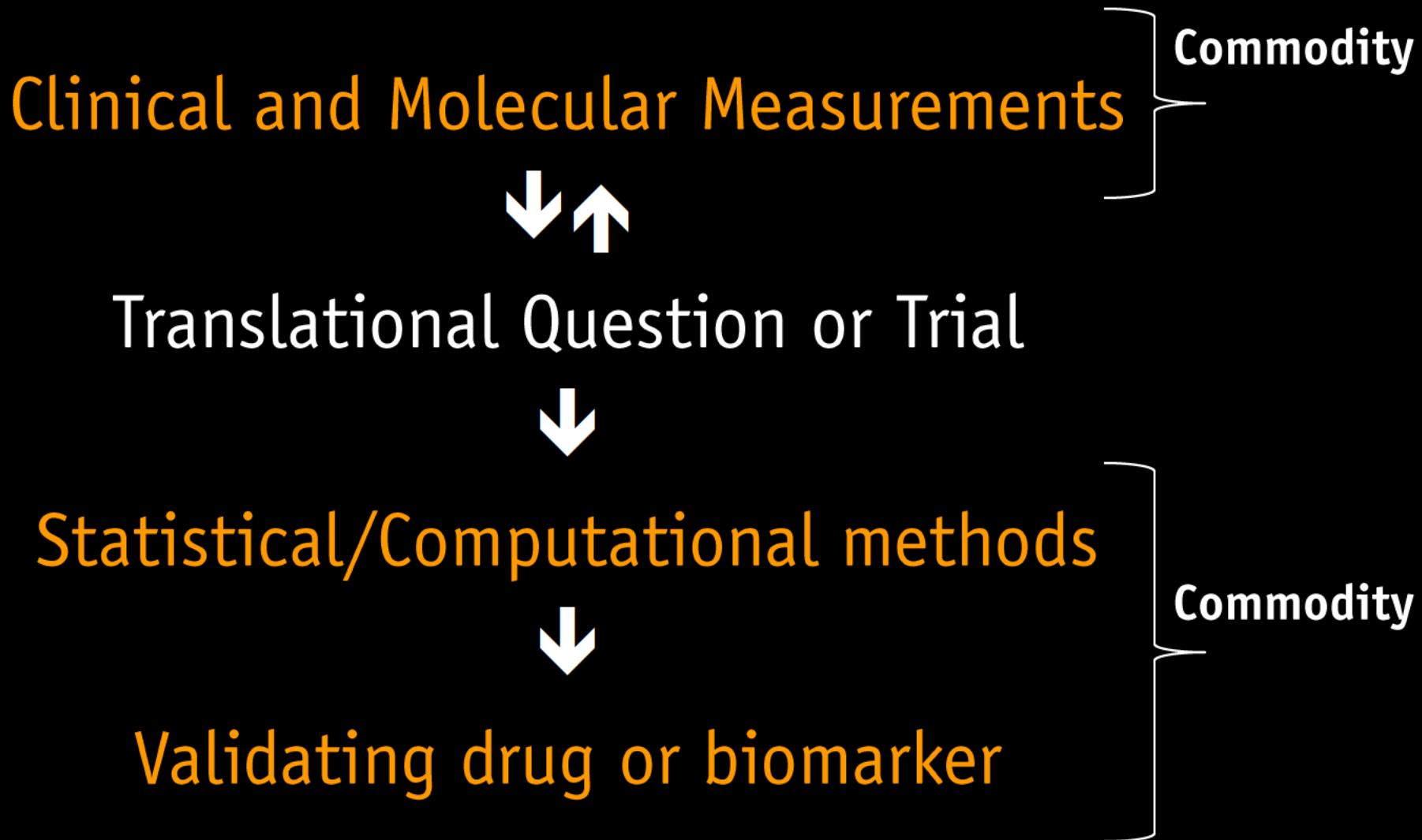


Statistical/Computational methods



Validating drug or biomarker

Translational Pipeline



We are used to starting
computer, IT, and Internet
companies in garages...

Potentials for starting a
“garage biotech”?

Agenda

- Integrative genomics to find causal factors for complex disorders [Link](#)
- Genomic nosology and drug/diagnostic discovery [Link](#)
- Personalized disease-risk prediction and prevention [Link](#)

Genetics

(a) **Mass spectrometry**

(b)

(c)

A

Phenotypes

F2 male
genotype
homozygote
SS/SS at
D10Mgh14
marker on chr
10

BP with NE

1.0 0 -1.0

Haplotypes

Gene Expression

Clinical Measurements

Stanford Confidential

~~Stanford Confidential~~

Genetics

Proteomics

Mass spectrometry

Algorithms to integrate genetic, genomic, proteomic, model, and clinical measurements are needed for the next step in addressing complex disorders

Phenotypes

Haplotypes

Gene Expression

Clinical Measurements

Coordinated reduction of genes of oxidative metabolism in humans with insulin resistance and diabetes: Potential role of *PGC1* and *NRF1*

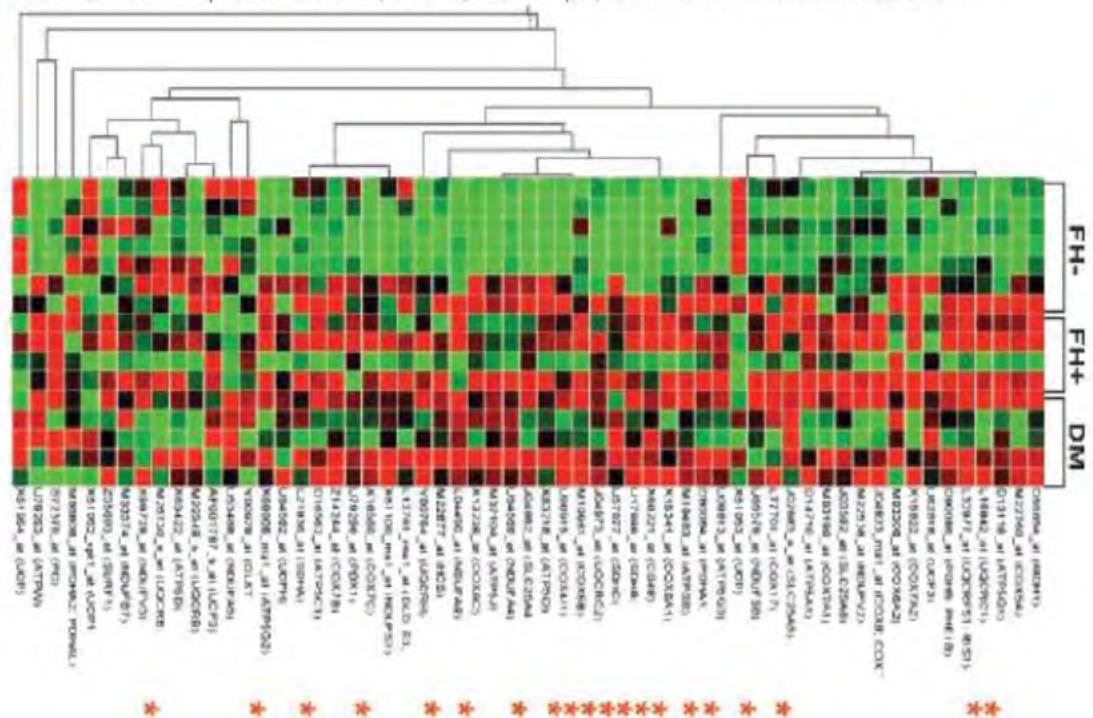
Mary Elizabeth Patti^{*†‡}, Atul J. Butte^{*†§}, Sarah Crunkhorn^{*}, Kenneth Cusi[¶], Rachele Berria[¶], Sangeeta Kashyap[¶], Yoshinori Miyazaki[¶], Isaac Kohane[§], Maura Costello^{*}, Robert Saccone^{*}, Edwin J. Landaker^{*}, Allison B. Goldfine^{*}, Edward Mun[¶], Ralph DeFronzo[¶], Jean Finlayson[¶], C. Ronald Kahn^{*}, and Lawrence J. Mandarino[¶]

^{*}Research Division, Joslin Diabetes Center, Boston, MA 02215; [§]Division of Informatics and Endocrinology, Children's Hospital, Boston, MA 02115; [¶]Department of Surgery, Beth Israel Deaconess Medical Center, Boston, MA 02215; and [¶]University of Texas Health Science Center, San Antonio, TX 78229

Contributed by C. Ronald Kahn, May 14, 2003

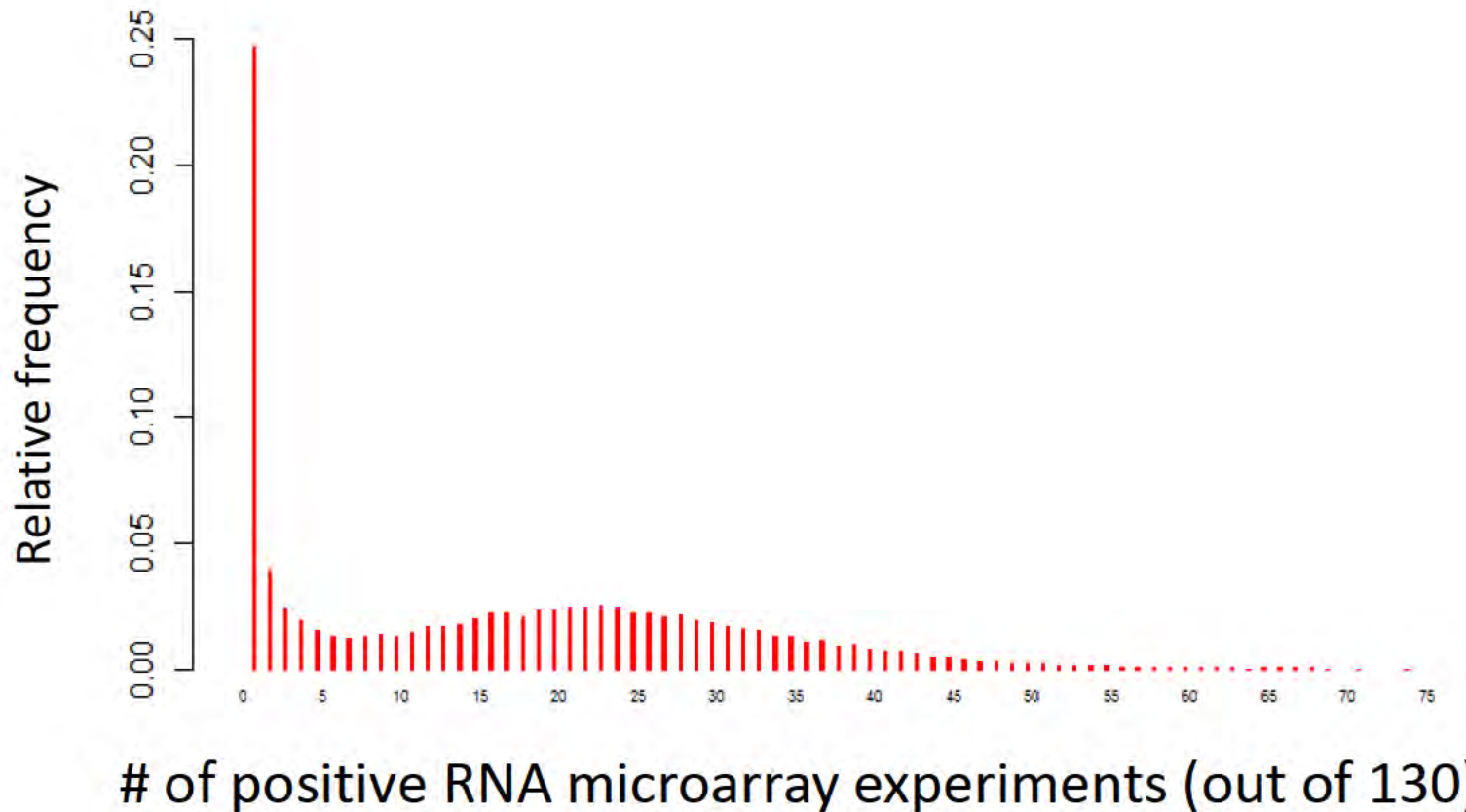
Type 2 diabetes mellitus (DM) is characterized by insulin resistance and pancreatic β cell dysfunction. In high-risk subjects, the earliest detectable abnormality is insulin resistance in skeletal muscle. Impaired insulin-mediated signaling, gene expression, and accumulation of intramyocellular triglycerides have all been linked with insulin resistance, but no single gene responsible for insulin resistance and DM has been identified in humans. To identify genes potentially important in the etiology of DM, we analyzed gene expression in skeletal

muscle. Expression of peroxisomal proliferator activator receptor γ coactivator (*PGC1*) α and β (*PPARGC1* and *PERC*), coacti-

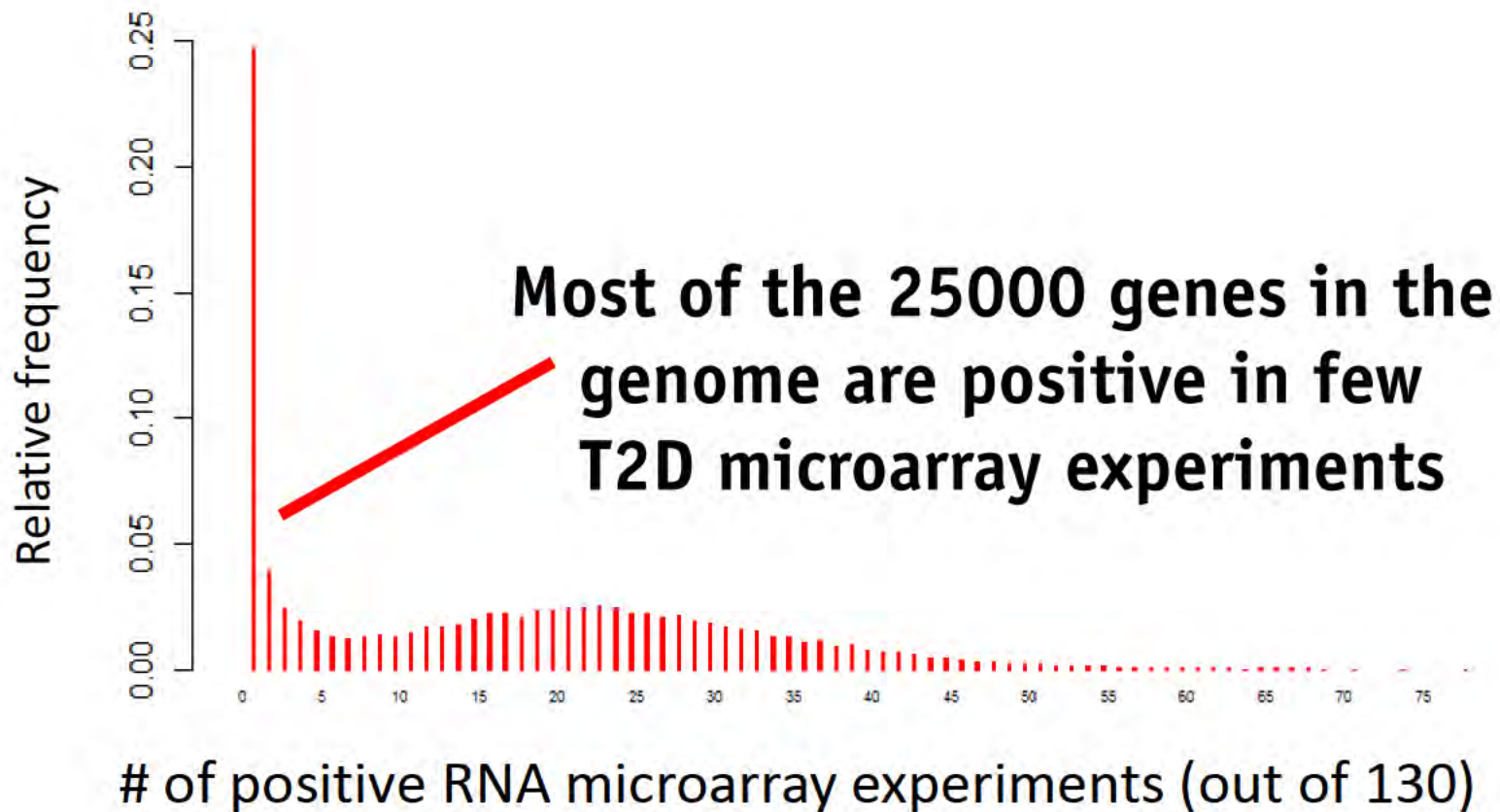


- One example of a microarray experiment with diabetes and control samples
- 187 genes differentially expressed

Intersect 130 T2D microarray experiments

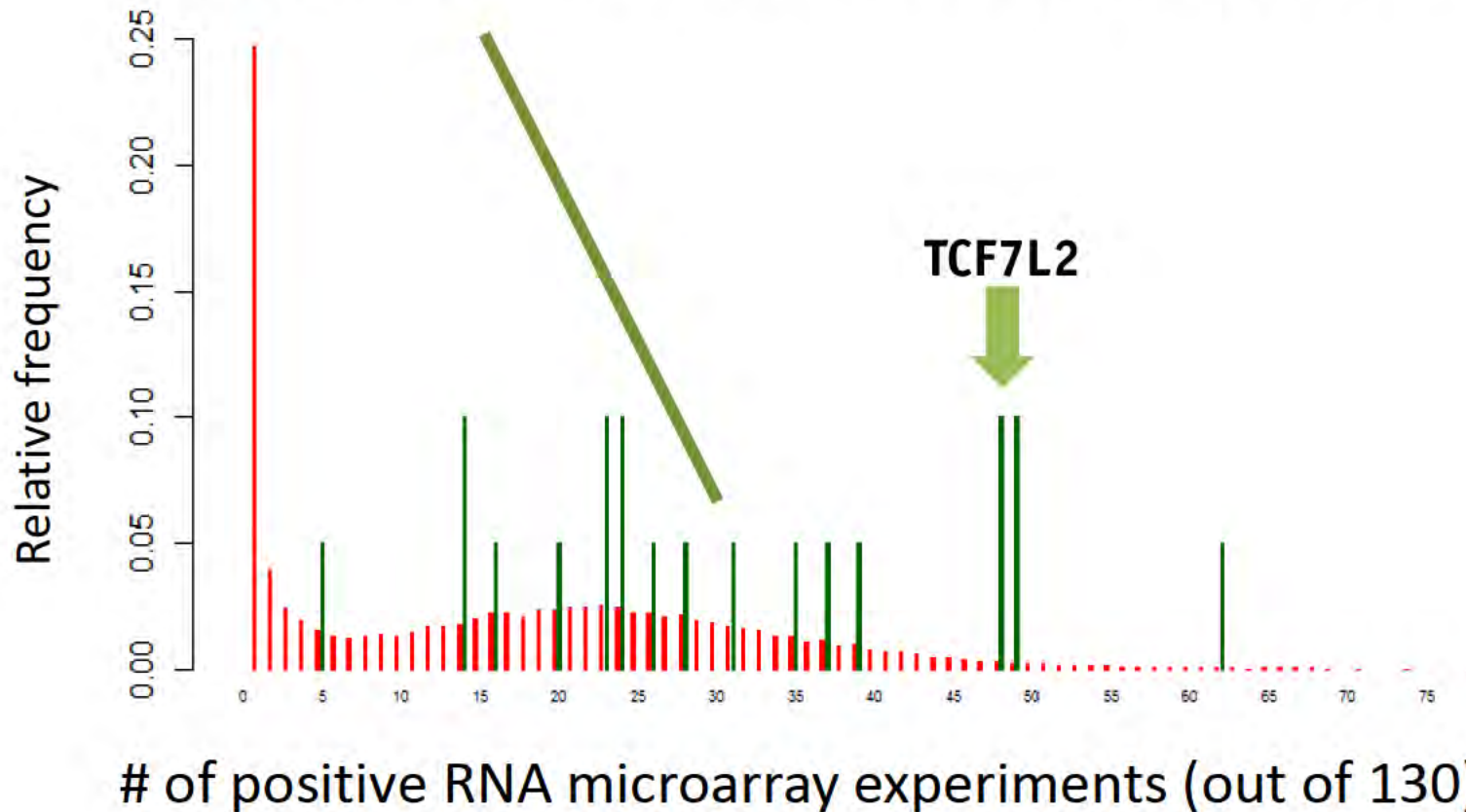


Intersect 130 T2D microarray experiments



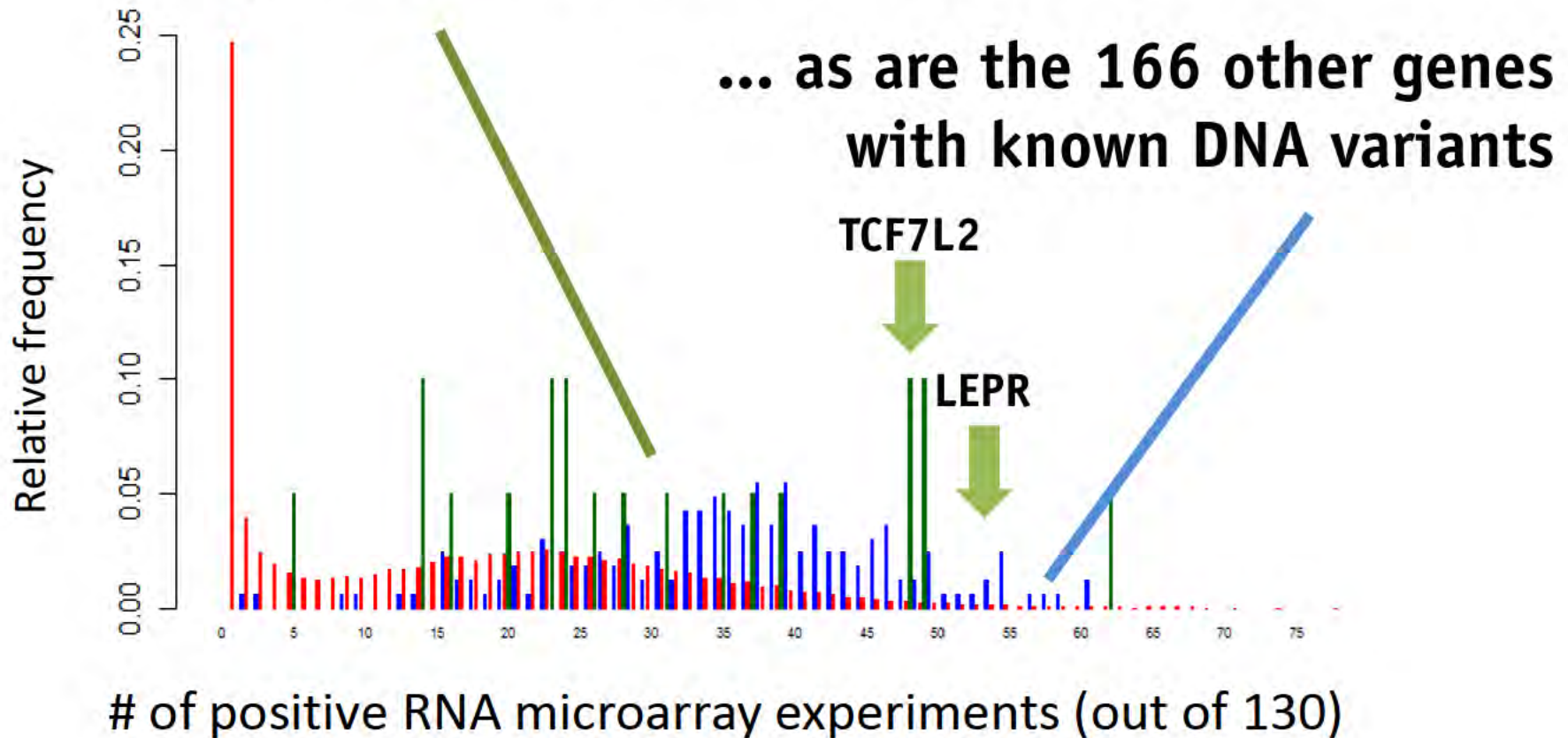
Intersect 130 T2D microarray experiments

The 20 best known genes with DNA variants (from GWAS) are positive in more experiments...

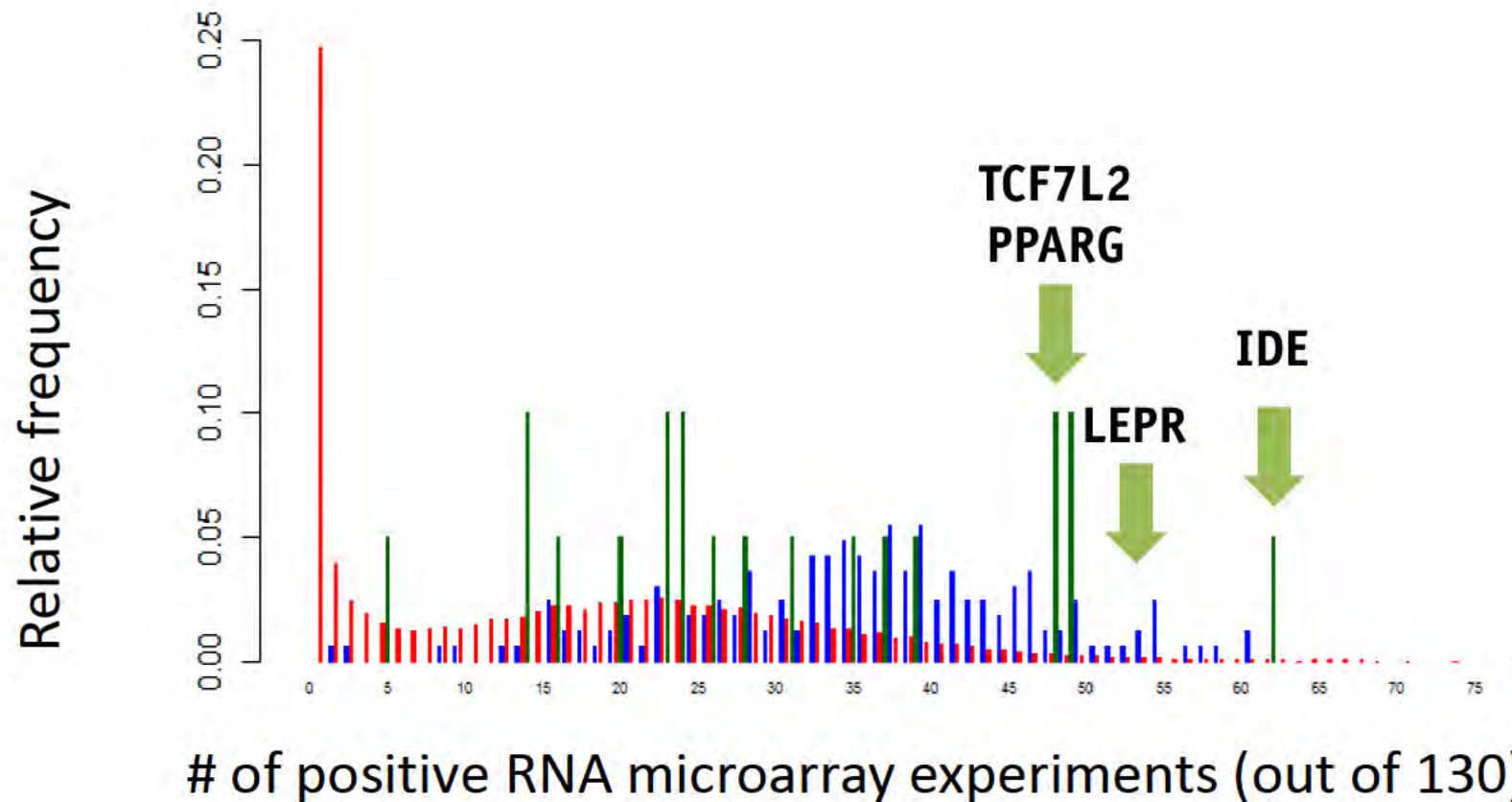


Intersect 130 T2D microarray experiments

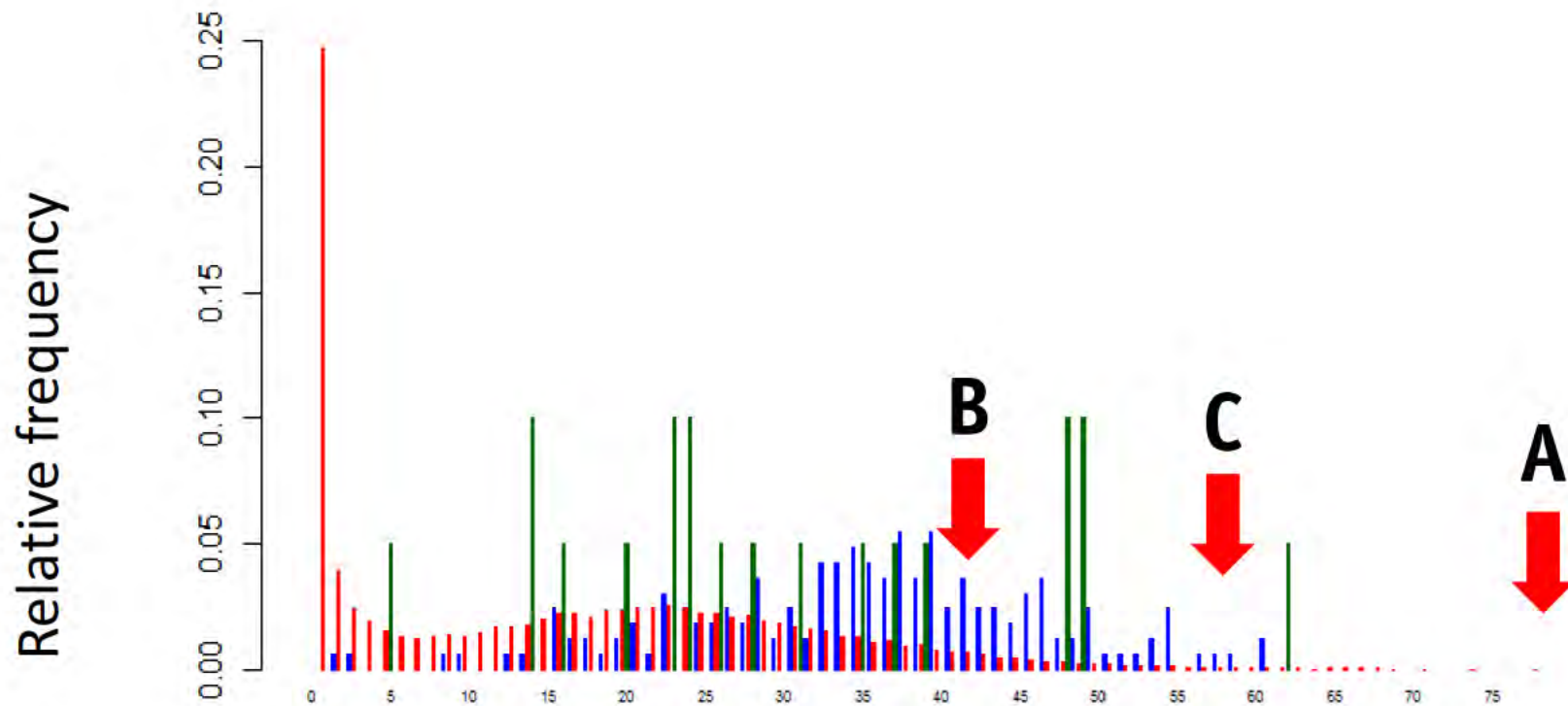
The 20 best known genes with DNA variants (from GWAS) are positive in more experiments...



Intersect 130 T2D microarray experiments



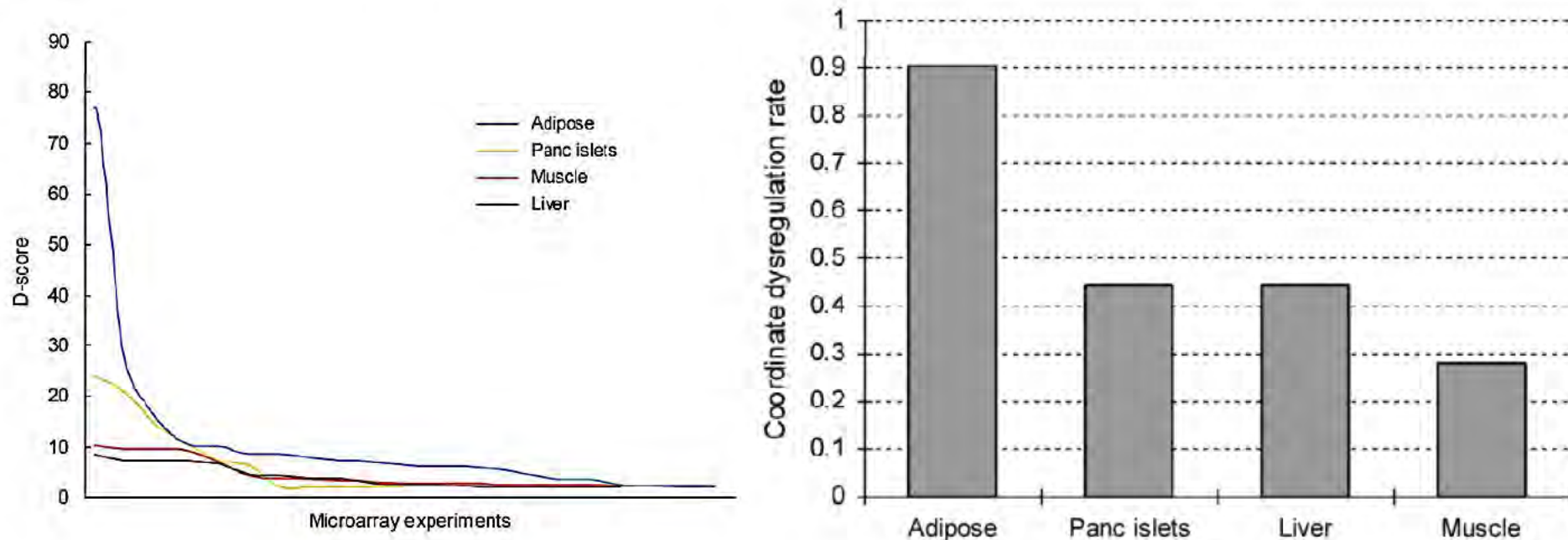
Intersect 130 T2D microarray experiments



of positive RNA microarray experiments (out of 130)

Close collaboration with Dr. Takashi Kadowaki, Momoko Horikoshi,
Kazuo Hara, University of Tokyo

- Gene A changes the most in adipose tissue and islet experiments
- Adipose and islets also show Gene C change

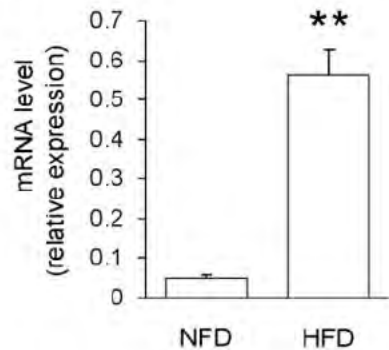


Gene A is higher in high fat diet

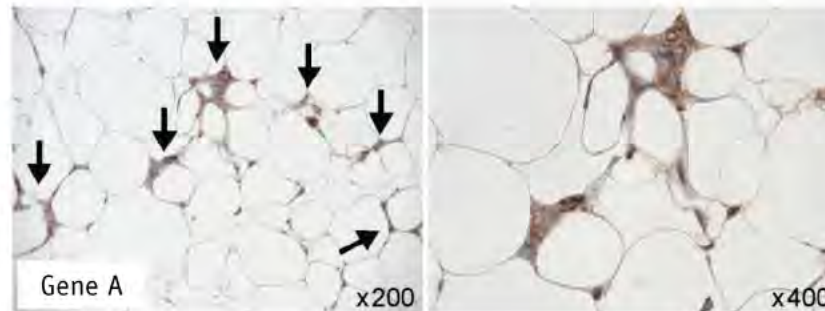
Gene A is expressed in mouse fat infiltrate

Gene A and C are co-expressed in fat

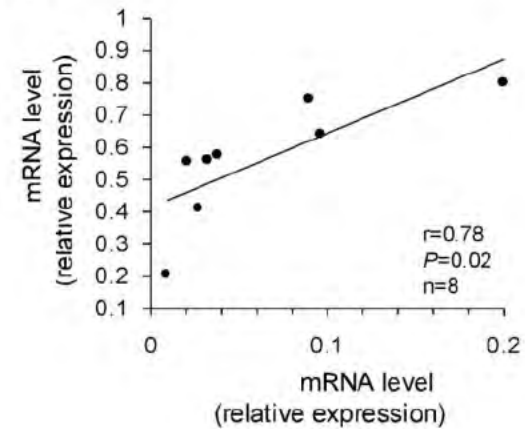
A



B



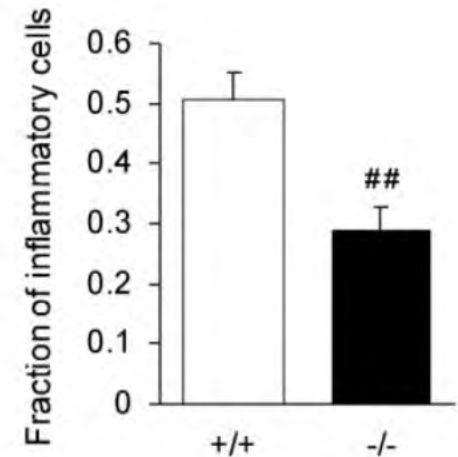
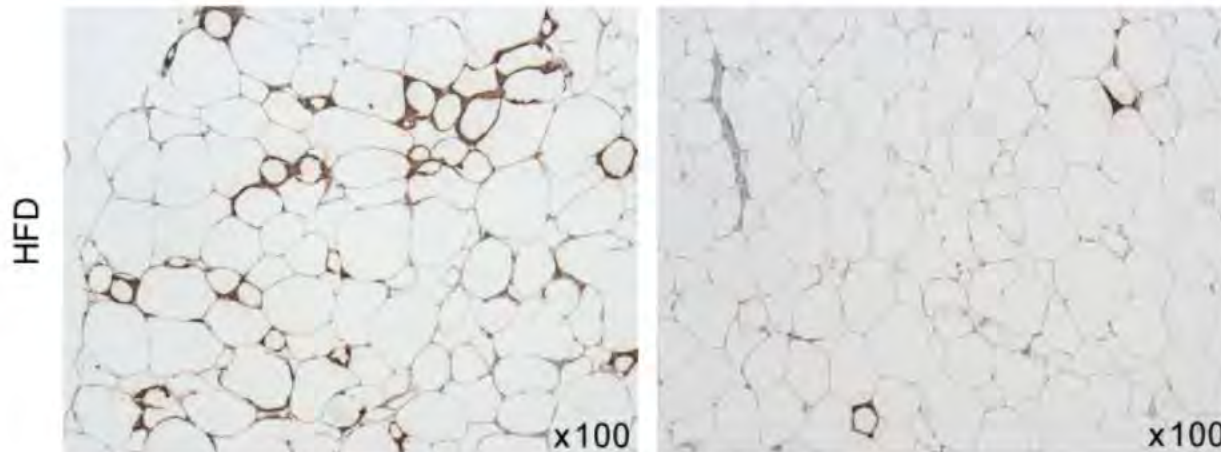
C



Keiichi Kodama
Kyoko Toda

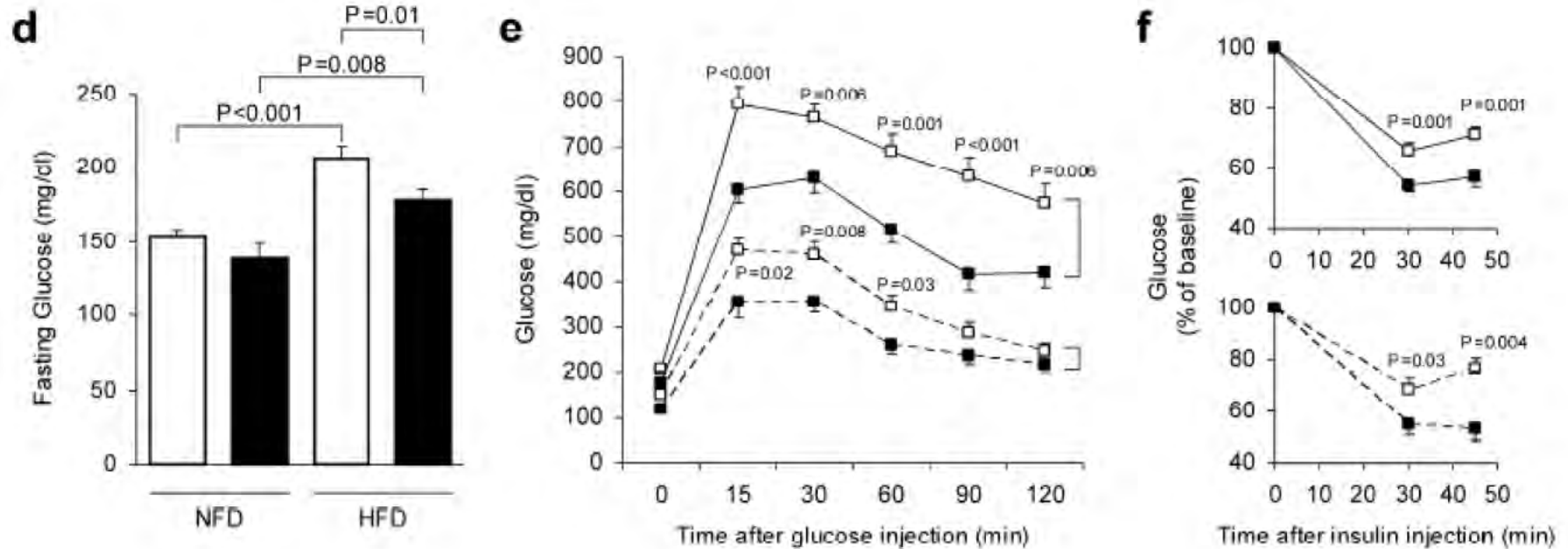
Gene A knockout has reduced infiltrate in fat

- **Mac-2 stain**



Keiichi Kodama
Kyoko Toda

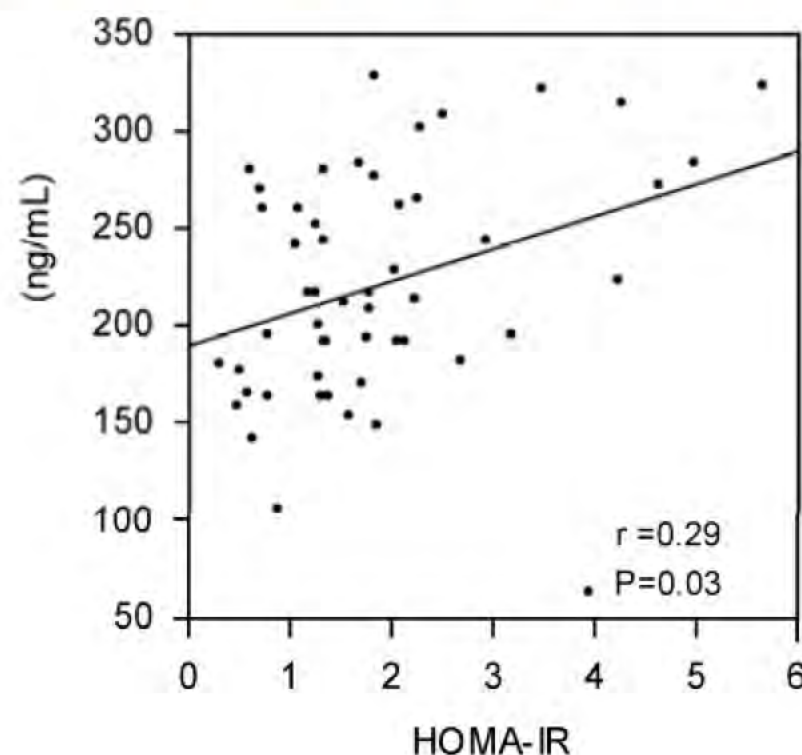
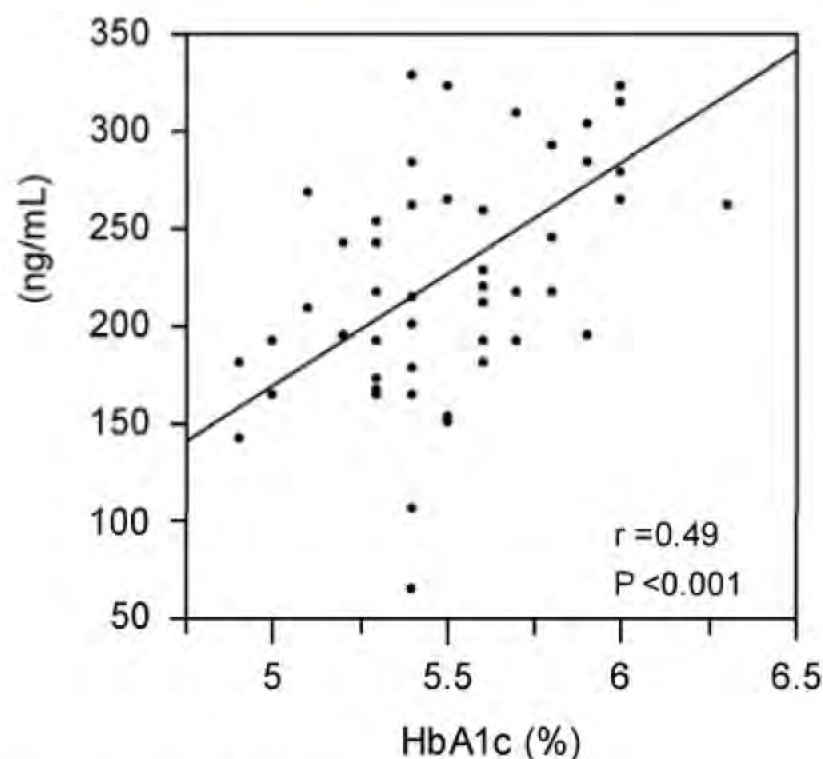
Gene A knockout has increased insulin sensitivity



- No change in weight gain

Keiichi Kodama
Kyoko Toda

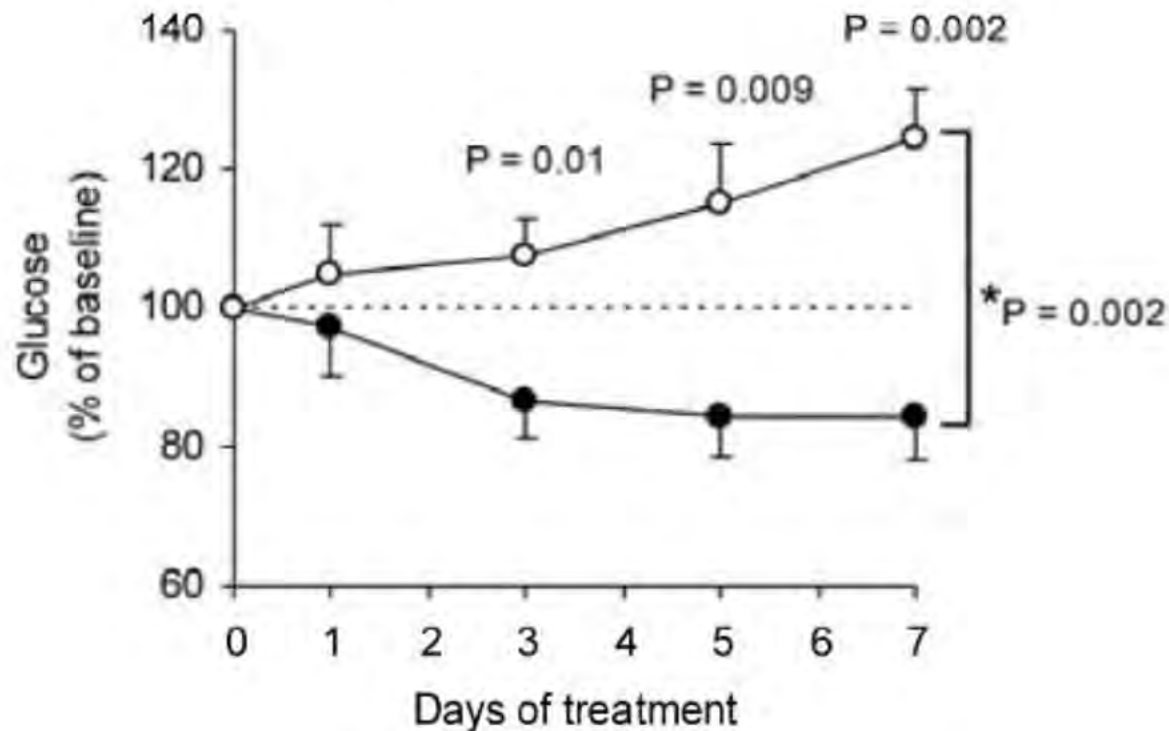
Serum soluble Gene A protein correlates with human HbA1c and insulin resistance



- $n = 55$ non-diabetics
- 60.3 years of age ± 15 , 36 males, 19 females
- BMI 23.2 ± 4.3 kg/m²

Keiichi Kodama
Momoko Horikoshi

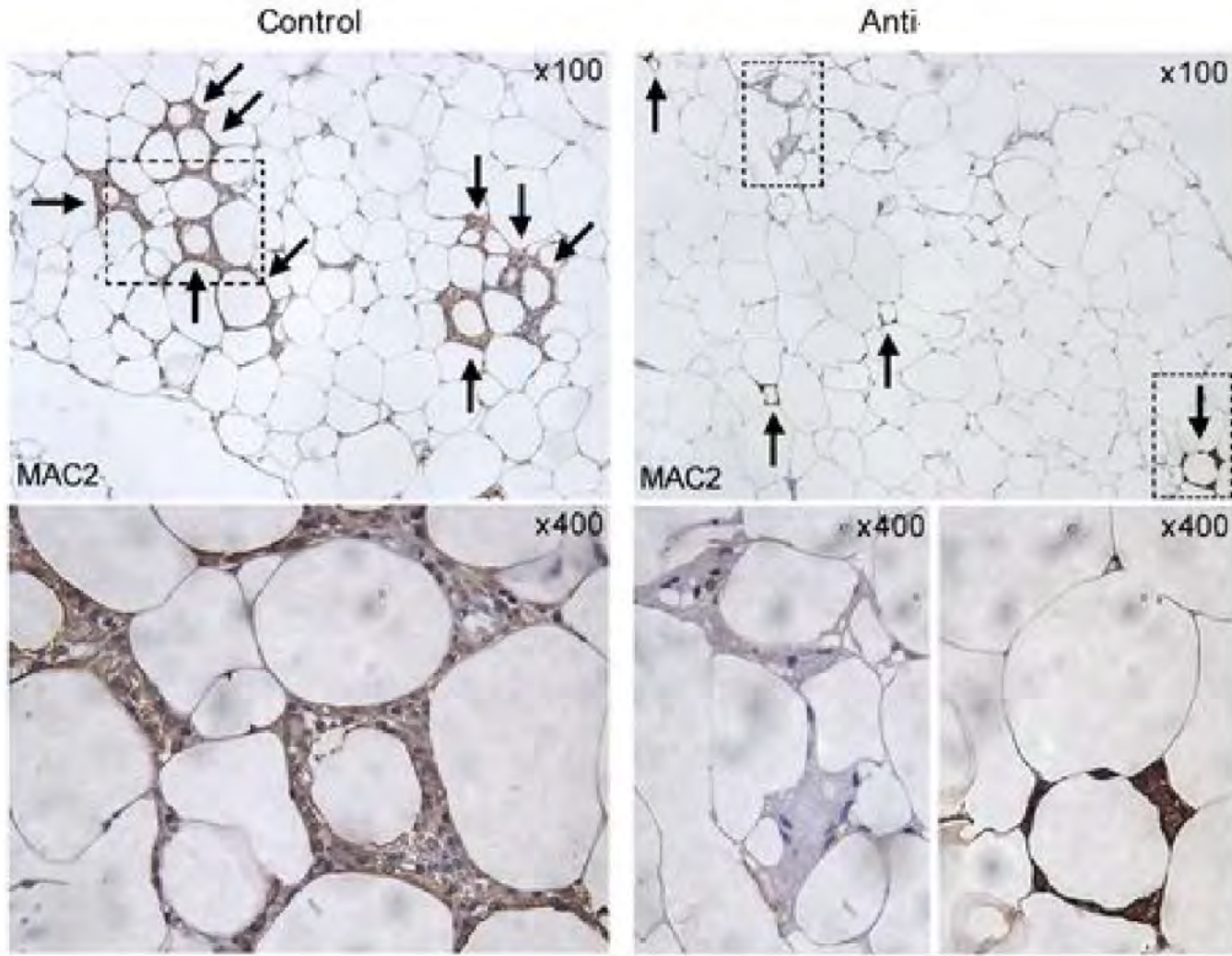
Therapeutic antibody against Gene A → reduces glucose



- C57BL6/6J fed high-fat diet for 18 weeks
- Intraperitoneal injection of rat anti-mouse anti-A antibody (n=8) or isotype control (n=8)
- 100 μ g at day 0 and 50 μ g at day 1-7

Keiichi Kodama

Therapeutic antibody against Gene A → reduces fat inflammatory infiltrate



**Keiichi
Kodama**

Agenda

- Integrative genomics to find causal factors for complex disorders [Link](#)
- Genomic nosology and drug/diagnostic discovery [Link](#)
- Personalized disease-risk prediction and prevention [Link](#)

Generalized ischemic myocardial dysfunction
 Primary idiopathic dilated cardiomyopathy
 Pulmonary emphysema
 alpha-1-Antitrypsin deficiency
 Asthma
 Papillary renal cell carcinoma
 Renal cell carcinoma, chromophobe cell
 Neurofibromatosis type 1
 Cocaine dependence
 Hantavirus pulmonary syndrome
 Marfan's syndrome
 Atopy
 HIV infection
 Retinitis pigmentosa
 Ulcerative cystitis
 Diabetes mellitus - adult onset
 Leprosy
 Malignant melanoma
 Malignant neoplasm of female breast
 Uterine leiomyoma - fibroids
 Cystic fibrosis of pancreas
 SCID due to absent class II HLA antigens
 Morbid obesity
 Simple obesity
 Critical illness polyneuropathy
 Familial combined hyperlipidemia
 Hyperglycemia
 Hypertensive heart disease with congestive HF
 Left ventricular hypertrophy
 Salmonella infection
 Hepatocellular carcinoma
 Chronic airway obstruction
 pT2a (IIA) cervical cancer

Human Disease Gene Expression Collection

Joel Dudley

~300 Diseases
and Conditions

Blue: gene goes
down in disease
Yellow: gene goes up
in disease

20k+ Genes

Butte AJ, Kohane IS. *Nature Biotechnology*, 2006, 24:55.

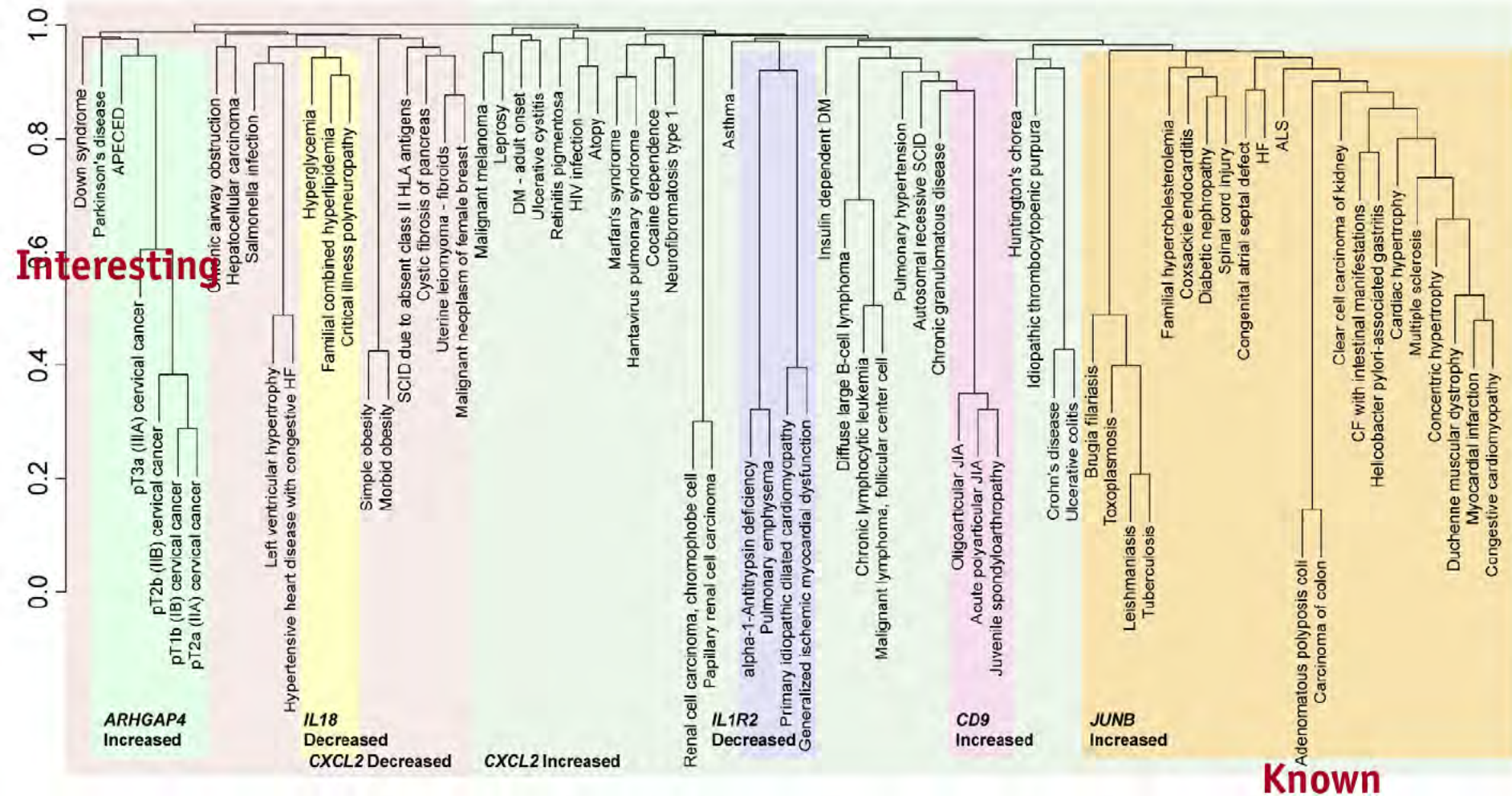
Butte AJ, Chen R. *Proc AMIA Fall Symposium*, 2006.

Chen R, Butte AJ. *Nature Methods*, 2007.

Dudley J, Tibshirani R, Deshpande T, Butte AJ. *Molecular Systems Biology*, 2009.

Shen-Orr S, ... Davis MM, Butte AJ. *Nature Methods*, 2010.

Stanford Confidential



- The Gene-expression Nosology of Medicine (GNOMED):
across all disciplines**

Dudley J, Butte AJ. *Pacific Symposium on Biocomputing*, 2008.

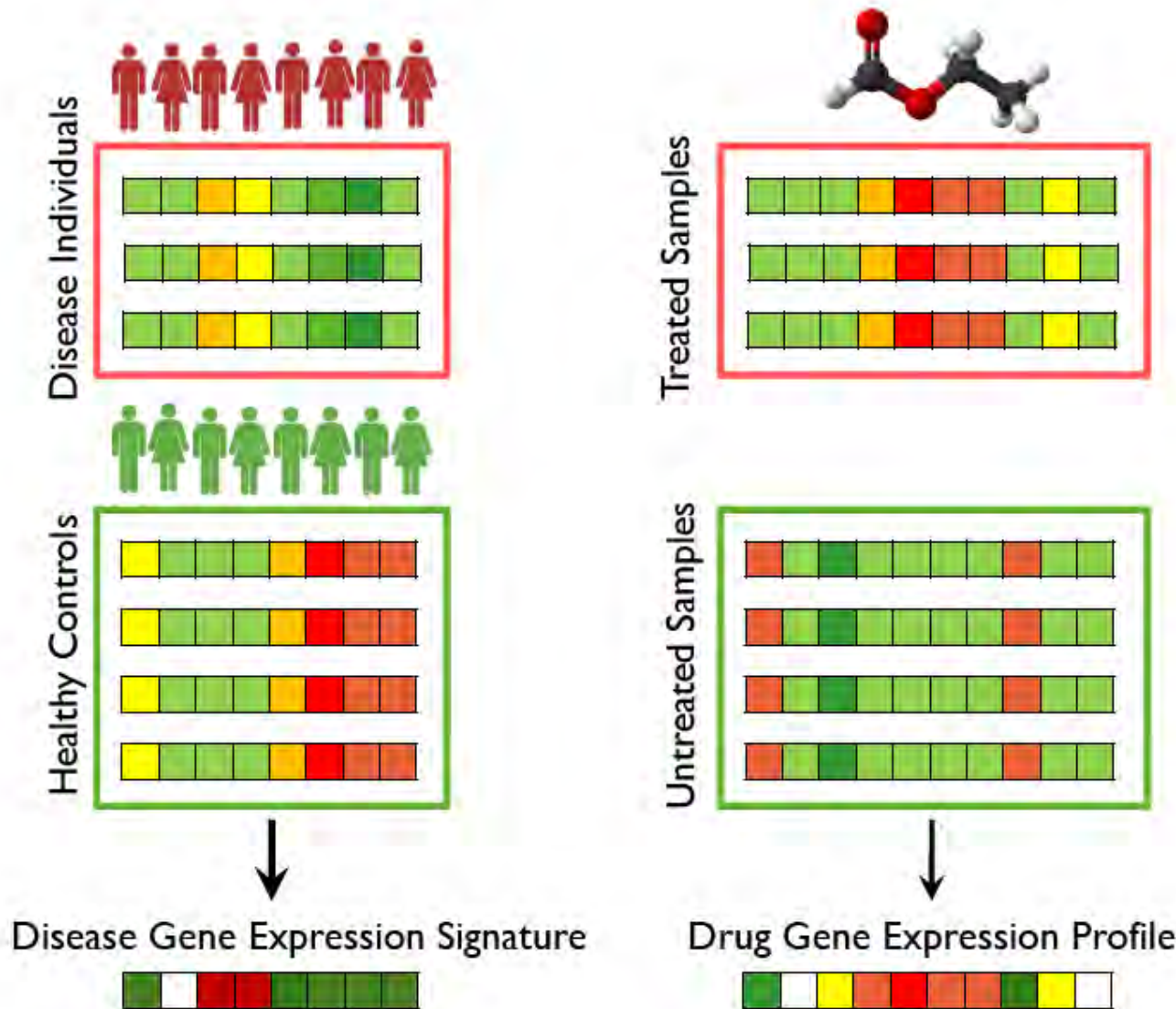
Dudley J, Butte AJ. *Pacific Symposium on Biocomputing*, 2009.

Dudley J, Tibshirani R, Deshpande T, Butte AJ. *Molecular Systems Biology*, 2009.

Dudley J, Butte AJ. *Pacific Symposium on Biocomputing*, 2008, 2009.

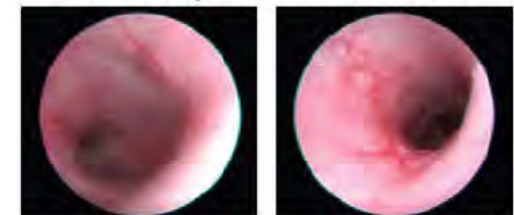
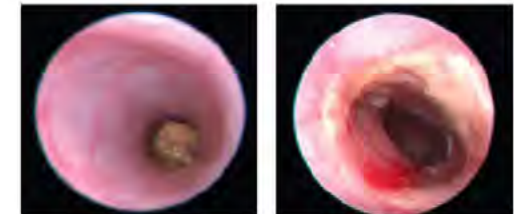
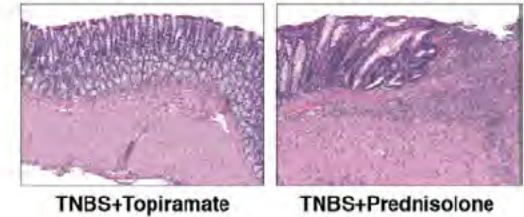
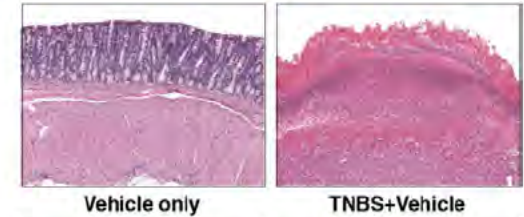
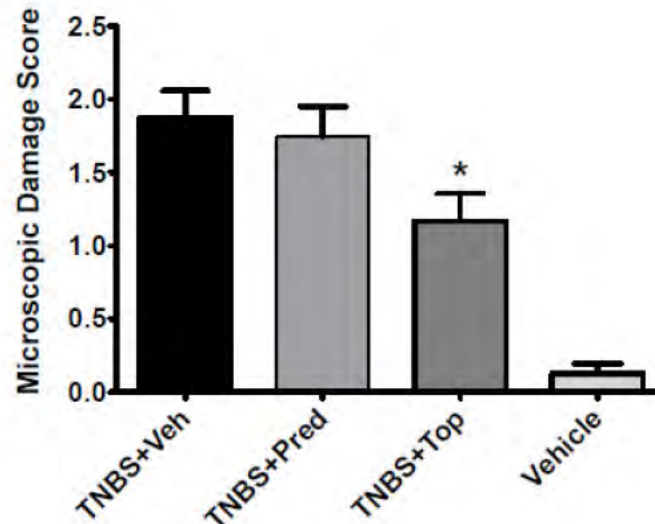
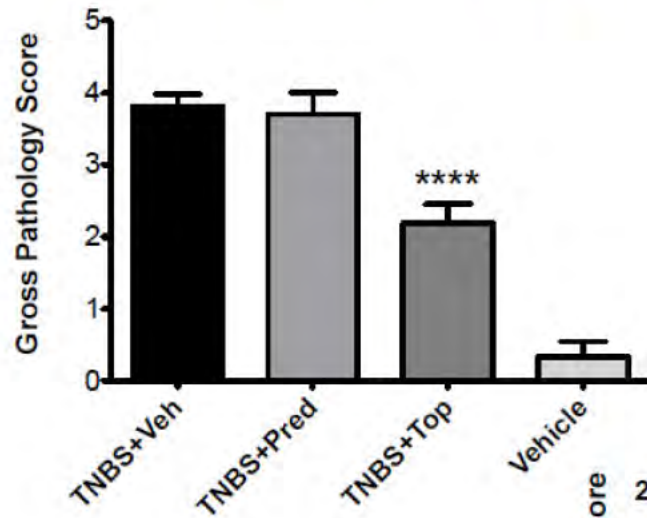
Stanford Confidential

Suthram S, et al. *PLoS Computational Biology*, 2010.



Lamb J, ..., Golub TR. *Science*, 2006.
Sirota M, Dudley JT, ..., Sweet-Cordero A, Sage J, Butte AJ.
Stanford Confidential *Science Translational Medicine*, 2011.

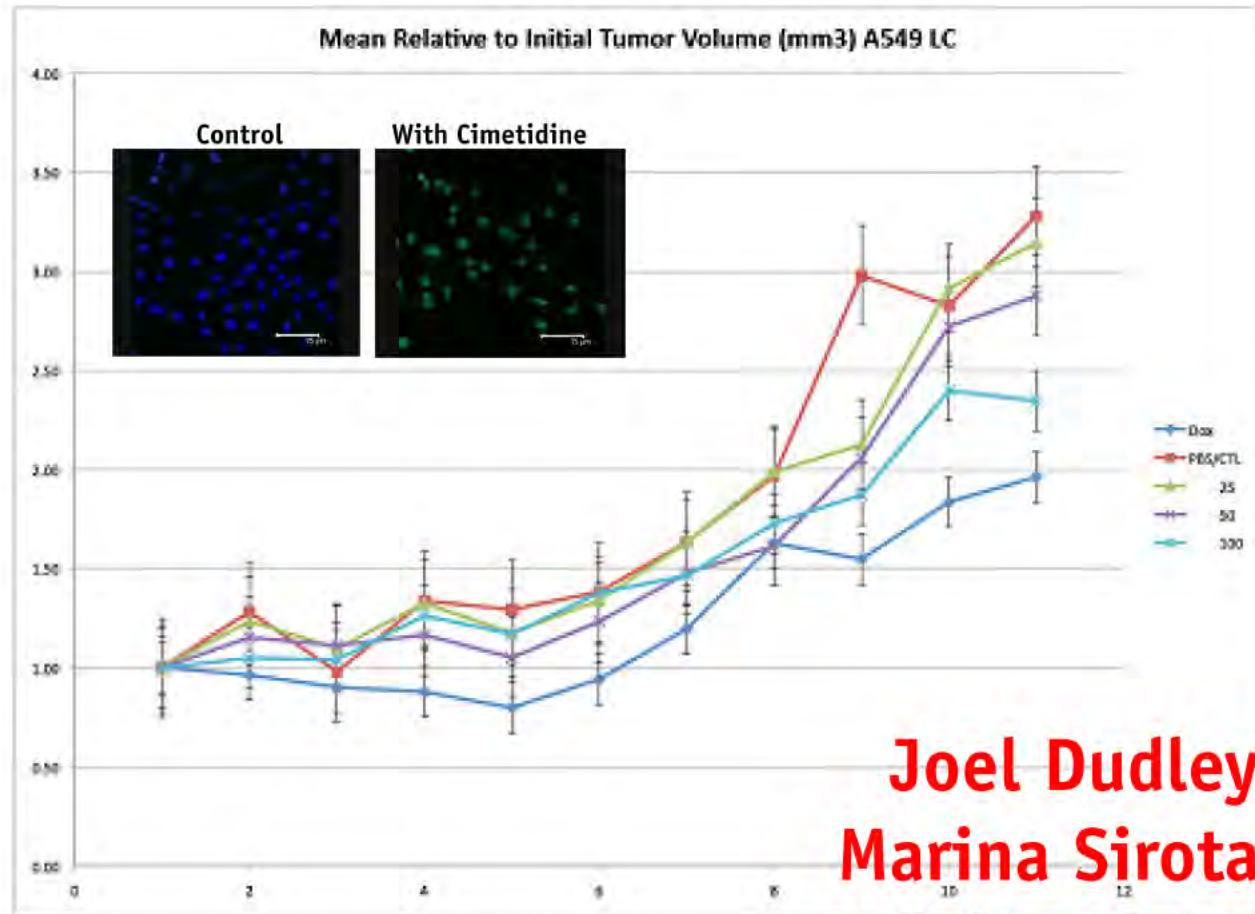
Anti-seizure drug works against a rat model of inflammatory bowel disease



Marina Sirota
Joel Dudley
Mohan M Shenoy
Jay Pasricha

Anti-ulcer drug works for lung adenocarcinoma

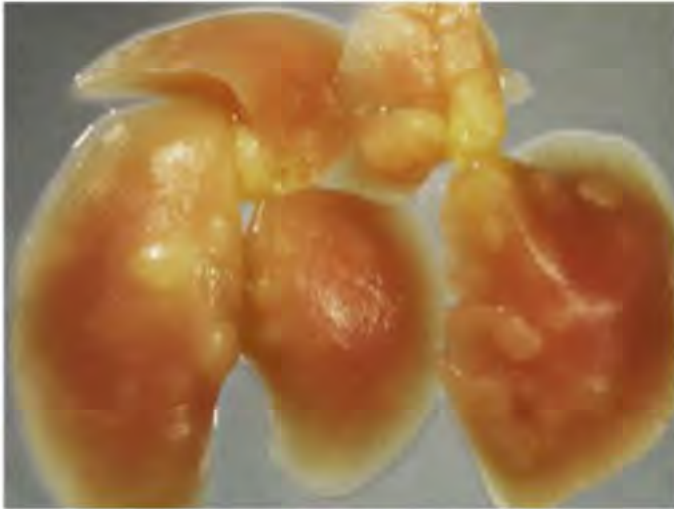
- Human lung adenocarcinoma cell lines explanted into mouse models
- Followed growth over 11 days
- Positive-control dose of doxorubicin grew to 2x original volume
- Tumors in mice treated with vehicle grew to 3.25x original volume
- Not only did our compound work statistically better than control, it worked in a dose-dependent manner
- Tumors in mice treated with 50 mg/kg/day grew 2.8x
- Those treated with 100 mg/kg/day grew only 2.3x.



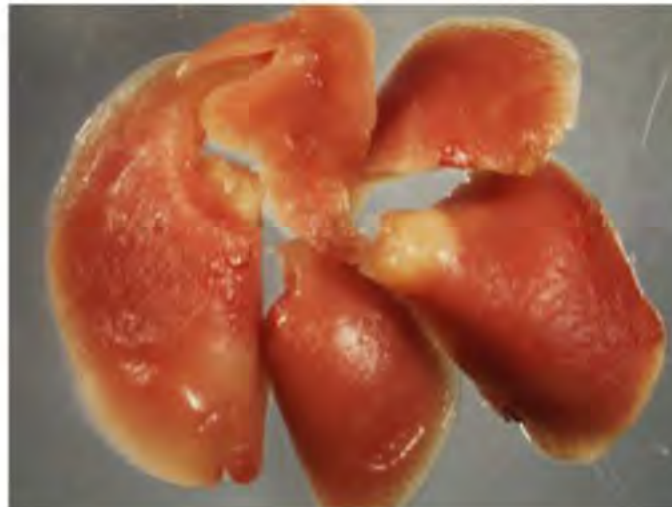
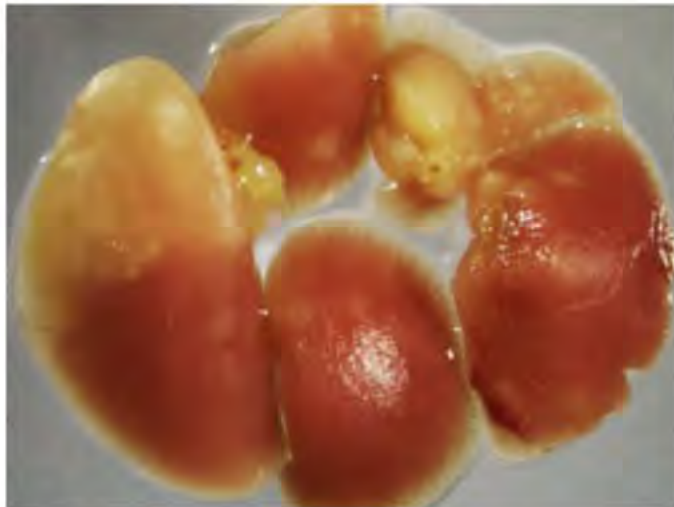
Joel Dudley
Marina Sirota
Julien Sage

Drug X Shows Significant Activity Against Small Cell Lung Cancer

Joel Dudley
Alejandro Sweet-Cordero
Julien Sage
NuMedii



*P53/Rb/p130
triple knockout
model of SCLC*



*Mice dosed after
tumor formation*

Vehicle control

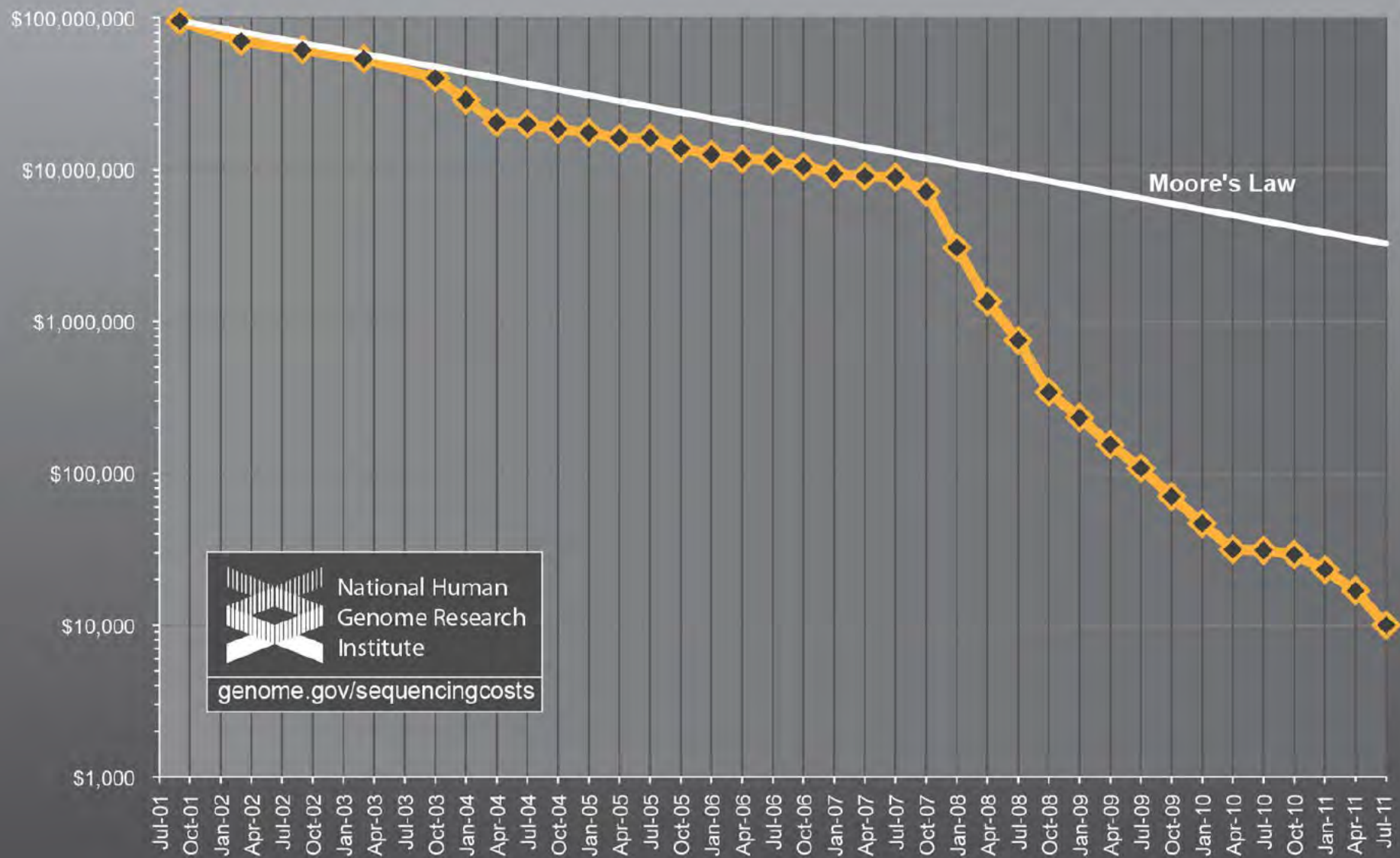
Drug X

Stanford Confidential

Agenda

- Integrative genomics to find causal factors for complex disorders [Link](#)
- Genomic nosology and drug/diagnostic discovery [Link](#)
- Personalized disease-risk prediction and prevention [Link](#)

Cost per Genome



Single-molecule sequencing of an individual human genome

Dmitry Pushkarev^{1,2}, Norma F Neff^{1,2} & Stephen R Quake¹

Recent advances in high-throughput DNA sequencing technologies have enabled order-of-magnitude improvements in both cost and throughput. Here we report the use of single-molecule methods to sequence an individual human genome. We aligned billions of 24- to 70-bp reads (32 bp average) to ~90% of the National Center for Biotechnology Information (NCBI) reference genome, with 28× average coverage. Our results were obtained on one sequencing instrument by a single operator with four data collection runs. Single-molecule sequencing enabled analysis of human genomic information without the need for cloning, amplification or ligation. We determined ~2.8 million single nucleotide polymorphisms (SNPs) with a false-positive rate of less than 1% as validated by Sanger sequencing and 99.8% concordance with SNP genotyping arrays. We identified 752 regions of copy number variation by analyzing coverage depth alone and validated 27 of these using digital PCR. This milestone should allow widespread application of genome sequencing to many aspects of genetics and human health, including personal genomics.

on a surface can be extended asynchronously, thereby allowing substantial flexibility in the kinetics of sequencing chemistry. Previous reports of single-molecule sequencing have been proofs of principle^{11–13}, and their sequencing throughput has not been competitive with alternative approaches. Generally, read lengths have been relatively short and error rates have been dominated by deletions; it has not been clear whether the resulting sequence quality is suitable for human genome sequencing applications.

The Heliscope Single Molecule Sequencer (Helicos Biosciences) is the first commercial release of a single-molecule sequencing instrument. It allows one to follow ~1 billion individual molecules as they are sequenced over the course of a week—a throughput that is practical for human genome sequencing. There have been several technical improvements to the platform since the reported sequencing of a viral genome¹², including more than a 1,000-fold improvement in parallelism, a new generation of sequencing reagents that allows digital measurement of homopolymer sequences, and a new software algorithm, IndexDP, for performing alignments to the entire human genome.

We used two of the instrument's 50 flow-cell channels to resequence the

Clinical assessment incorporating a personal genome

Euan A Ashley, Atul J Butte, Matthew T Wheeler, Rong Chen, Teri E Klein, Frederick E Dewey, Joel T Dudley, Kelly E Ormond, Aleksandra Pavlovic, Alexander A Morgan, Dmitry Pushkarev, Norma F Neff, Louanne Hudgins, Li Gong, Laura M Hodges, Dorit S Berlin, Caroline F Thorn, Katrin Sangkuhl, Joan M Hebert, Mark Woon, Hersh Sagreiya, Ryan Whaley, Joshua W Knowles, Michael F Chou, Joseph V Thakuria, Abraham M Rosenbaum, Alexander Wait Zaranek, George M Church, Henry T Greely, Stephen R Quake, Russ B Altman

Summary

Background The cost of genomic information has fallen steeply, but the clinical translation of genetic risk estimates remains unclear. We aimed to undertake an integrated analysis of a complete human genome in a clinical context.

Methods We assessed a patient with a family history of vascular disease and early sudden death. Clinical assessment included analysis of this patient's full genome sequence, risk prediction for coronary artery disease, screening for causes of sudden cardiac death, and genetic counselling. Genetic analysis included the development of novel methods for the integration of whole genome and clinical risk. Disease and risk analysis focused on prediction of genetic risk of variants associated with mendelian disease, recognised drug responses, and pathogenicity for novel variants. We queried disease-specific mutation databases and pharmacogenomics databases to identify genes and mutations with known associations with disease and drug response. We estimated post-test probabilities of disease by applying likelihood ratios derived from integration of multiple common variants to age-appropriate and sex-appropriate pre-test probabilities. We also accounted for gene-environment interactions and conditionally dependent risks.

Lancet, May 1, 2010.

Patient zero

40 year old male in good health presents to his doctor with his whole genome

No symptoms

Exercises regularly

Takes no medications

Family history of aortic aneurysm

Family history of sudden death

Presents with 2.8 million SNPs

752 copy number variants

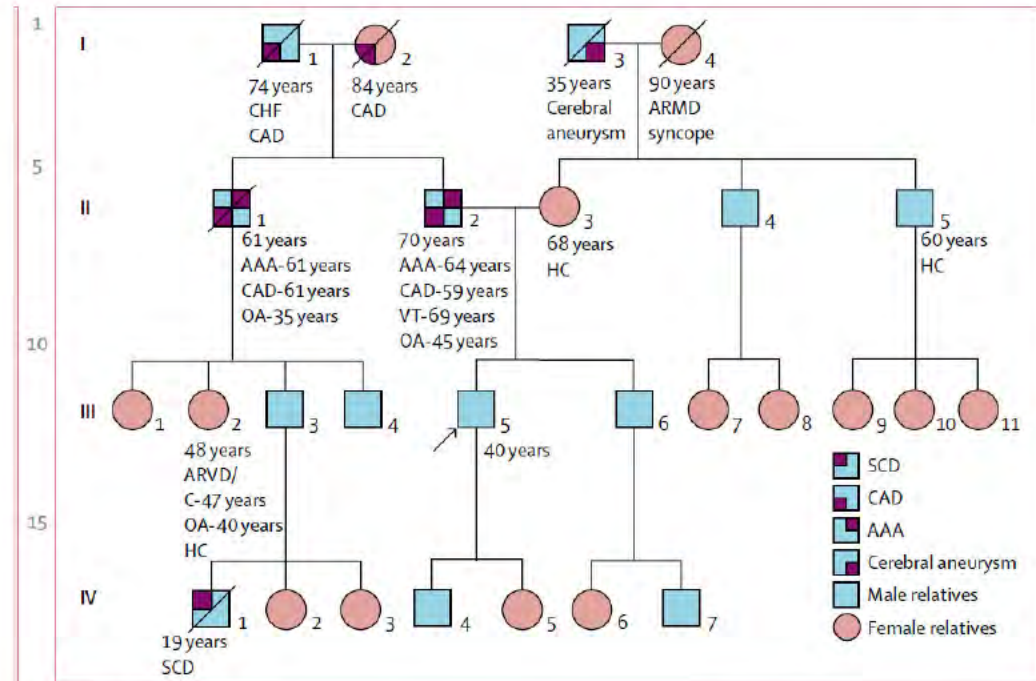


Figure 2: Patient pedigree
The arrow shows the patient. Diagonal lines show relatives who are deceased. Years are age at death or diagnosis. AAA=abdominal aortic aneurysm. ARMD=age-related macular degeneration. ARVD/C=arrhythmogenic right-ventricular dysplasia or cardiomyopathy. CAD=coronary artery disease. CHF=congestive heart failure. HC=hypercholesterolaemia. HTN=hypertension. OA=osteoarthritis. SCD=sudden cardiac death (presumed). VT=paroxysmal ventricular tachycardia.

Variants predisposing to cardiac risk

Amino-acid substitution	Gene name	Chromosome number	Position	SNP location	Reference base*	Patient genotype	Associated disease†	Mutation databases‡	Functional prediction§	Mode of disease-gene inheritance	
Previously described rare variants in genes associated with common disease											
LPA ¹⁵	I4399M	Apolipoprotein A precursor, lipoprotein(a)	6	160881127	rs3798220	T	C/T	Coronary artery disease	Associated with high lipoprotein(a) concentrations	Benign	NA
FRZB ¹⁷	R200W	Frizzled-related protein	2	183411581	rs288326	G	A/G	Osteoarthritis	Possibly associated with osteoarthritis	Damaging	NA
Previously described rare variants in genes associated with rare disease											
HFE	H63D	Hereditary haemochromatosis protein precursor	6	26199158	rs1799945	C	C/G	Haemochromatosis	Previously described, disease-associated	Damaging	Recessive, incomplete penetrance
BTBD ¹⁸	D444H	Biotinidase precursor	3	15661697	rs13078881	G	C/G	Biotinidase deficiency	Previously described, intermediate phenotype	Damaging	Recessive
SLC26A2 ¹⁹	R492W	Solute carrier family 26 (sulphate transporter), member 2	5	149340823	None	C	C/T	Diastrophic dysplasia	Disease-associated	Damaging	Recessive
LAMB3 ²⁰	R635X	Laminin, β3	1	207865689	None	G	A/G	Epidermolysis bullosa, junctional	Disease-associated, most common mutation	Truncated protein	Recessive
SLC3A1 ²¹	M467T	Solute carrier family 3 (cystine, dibasic, and neutral aminoacid transporters), member 1	2	44393296	None	T	C/T	Cystinuria	Disease-associated, most common mutation	Damaging	Recessive
Previously described variants of unknown importance in disease-associated genes											
TMEM43 ²²	M41V	Transmembrane protein 43	3	14146021	None	A	A/G	ARVD/C	Reported in one of 150 probands with ARVD/C	Benign	Dominant, incomplete penetrance
MYBPC3 ²³	R326Q	Myosin-binding protein C, cardiac-type	11	47324447	rs34580776	C	C/T	Familial hypertrophic cardiomyopathy	Variant of unknown importance	Intermediate	Dominant, incomplete penetrance
Novel variants potentially associated with rare disease											
DSP ²⁴	R1838H	Desmoplakin	6	7528007	Novel	G	A/G	ARVD/C	Not found	Damaging	Dominant, incomplete penetrance
CDK7 ²⁵	Q430X	Parafibromin	1	191468879	Novel	C	C/T	Hyperparathyroidism, jaw tumour	Not found	Truncated protein	Dominant, loss of heterozygosity
CFTR ²⁶	G458R	Cystic fibrosis transmembrane conductance regulator	7	116976093	Novel	G	A/G	Cystic fibrosis	Not found	Damaging	Recessive
HFE2	H174Y	Haemojuvelin precursor	1	144127058	Novel	C	C/T	Haemochromatosis, juvenile	Not found	Damaging	Recessive

Stanford Confidential

- Rare variants in 3 genes clinically associated with sudden cardiac death: *TMEM43*, *DSP*, and *MYBPC3*
- Variant in *LPA* consistent with a family history of coronary artery disease

Euan Ashley and team
 Ashley et al (2010), *Lancet*
 375:1525

Variants predisposing to cardiac risk

	Amino-acid substitution	Gene name	Chromosome number	Position	SNP location	Reference base*	Patient genotype	Associated disease†	Mutation databases‡	Functional prediction§	Mode of disease-gene inheritance
Previously described rare variants in genes associated with common disease											
LPA ¹⁵	I4399M	Apolipoprotein A precursor, lipoprotein(a)	6	160881127	rs3798220	T	C/T	Coronary artery disease	Associated with high lipoprotein(a) concentrations	Benign	NA
FRZB ¹⁷	R200W	Frizzled-related protein	2	183411581	rs288326	G	A/G	Osteoarthritis	Possibly associated with osteoarthritis	Damaging	NA
Previously described rare variants in genes associated with rare disease											
HFE	H63D	Hereditary haemochromatosis protein precursor	6	26199158	rs1799945	C	C/G	Haemochromatosis	Previously described, disease-associated	Damaging	Recessive, incomplete penetrance
BTBD ¹⁸	D444H	Biotinidase precursor	3	15661697	rs13078881	G	C/G	Biotinidase deficiency	Previously described, intermediate phenotype	Damaging	Recessive
SLC26A2 ¹⁹	R492W	Solute carrier family 26 (sulphate transporter), member 2	5	149340823	None	C	C/T	Diastrophic dysplasia	Disease-associated	Damaging	Recessive
LAMB3 ²⁰	R635X	Laminin, β3	1	207865689	None	G	A/G	Epidemolysis bullosa, junctional	Disease-associated, most common mutation	Truncated protein	Recessive
SLC3A1 ²¹	M467T	Solute carrier family 3 (cystine, dibasic, and neutral aminoacid transporters), member 1	2	44393296	None	T	C/T	Cystinuria	Disease-associated, most common mutation	Damaging	Recessive
Previously described variants of unknown importance in disease-associated genes											
TMEM43 ²²	M41V	Transmembrane protein 43	3	14146321	None	A	A/G	ARVD/C	Reported in one of 150 probands with ARVD/C	Benign	Dominant, incomplete penetrance
MYBPC3 ²³	R326Q	Myosin-binding protein C, cardiac-type	11	47324447	rs34580776	C	C/T	Familial hypertrophic cardiomyopathy	Variant of unknown importance	Intermediate	Dominant, incomplete penetrance
Novel variants potentially associated with rare disease											
DSP ²⁴	R1838H	Desmoplakin	6	7528007	Novel	G	A/G	ARVD/C	Not found	Damaging	Dominant, incomplete penetrance
CDK7 ²⁵	Q430X	Parafibrin	1	191468879	Novel	C	C/T	Hyperparathyroidism, jaw tumour	Not found	Truncated protein	Dominant, loss of heterozygosity
CFTR ²⁶	G458R	Cystic fibrosis transmembrane conductance regulator	7	116976093	Novel	G	A/G	Cystic fibrosis	Not found	Damaging	Recessive
HFE2	H174Y	Haemojuvelin precursor	1	144127058	Novel	C	C/T	Haemochromatosis, juvenile	Not found	Damaging	Recessive

Stanford Confidential

Stanford Confidential

- Rare variants in 3 genes clinically associated with sudden cardiac death: *TMEM43*, *DSP*, and *MYBPC3*
- Variant in *LPA* consistent with a family history of coronary artery disease

Euan Ashley and team
 Ashley et al (2010), *Lancet*
 375:1525

Pharmacogenomics predictions

- Heterozygous null mutation in *CYP2C19* → clopidogrel resistance?
- Variants associated with positive response to lipid-lowering therapy
- *CYP4F2* and *VKORC1* variants → low initial warfarin dose

	Gene name	SNP location	Patient genotype	Drug(s) affected	Summary of effects	Level of evidence
SLCO1B1	Solute carrier organic anion transporter family, member 1B1	rs4149056	T/T	HMG-CoA reductase inhibitors (statins)	No increased risk of myopathy	High ^{32,34}
CYP2C19	Cytochrome P450, family 2, subfamily C, polypeptide 19	rs4244285	A/G	Clopidogrel and CYP2C19 substrates	CYP2C19 poor metaboliser; many drugs might need adjustment	High ³⁵
VKORC1	Vitamin K epoxide reductase complex, subunit 1	rs9923231	C/T	Warfarin	Reduced dose needed	High ³⁶
CYP4F2	Cytochrome P450, family 4, subfamily F, polypeptide 2	rs2108622	C/C	Warfarin	Reduced dose needed	High ³⁷
ADRB1	β1 adrenergic receptor	rs1801252	A/A	Atenolol, metoprolol	Might be preferable to calcium-channel blockers	High ^{38,39}
SLCO1B1	Solute carrier organic anion transporter family, member 1B1	rs11045819	A/C	Fluvastatin	Good response	Medium ⁴⁰
HMGCR	HMG-CoA reductase	rs17238540	T/T	Pravastatin	Patient might have good response	Medium
HMGCR	HMG-CoA reductase	rs17244841	A/A	Pravastatin, simvastatin	No reduced efficacy	Medium
ADRB2	β2 adrenergic receptor, surface	rs1042713	A/G	β blockers	Other treatment options might be preferable	Medium ⁴¹
ADRB2	β2 adrenergic receptor, surface	rs1042714	C/C	β blockers	Other treatment options might be preferable	Medium ^{41,42}
CYP2D6	Cytochrome P450, family 2, subfamily D, polypeptide 6	rs3892097 rs1800716	C/C	Metoprolol and other CYP2D6 substrates	Normal CYP2D6 metaboliser	Medium ⁴³
CDKN2A/B	Cyclin-dependent kinase inhibitor 2A/2B	rs10811661	T/T	Metformin	Reduced likelihood of response	Medium ⁴⁴
CDKN2A/B	Cyclin-dependent kinase inhibitor 2A/2B	rs10811661	T/T	Troglitazone	Reduced likelihood of response	Medium ⁴⁴

SNP=single nucleotide polymorphism. HMG-CoA=3-hydroxy-3-methylglutaryl-coenzyme A.

Table 3: Pharmacogenomic variants with summary of effects and level of evidence

Russ Altman and team

Ashley EA*, Butte AJ*, Wheeler MT, Chen R, Klein TE, Dewey FE, Dudley JT, Ormond KE, Pavlovic A, Hudgins L, Gong L, Hodges LM, Berlin DS, Thorn CF, Sangkuhl K, Hebert JM, Woon M, Sagreiya H, Whaley R, Morgan AA, Pushkarev D, Neff NF, Knowles W, Chou M, Thakuria J, Rosenbaum A, Zaranek AW, Church G, Greely HT*, Quake SR*, Altman RB*.

Stanford Clinical evaluation incorporating a personal genome. *Lancet*, 2010.

Existing SNP-disease databases are too limited for application to a human genome

Genome-wide association studies

- NHGRI GWAS Catalog
 - 1032 papers → 5050 SNPs for 557 diseases (6280 records), but 26% without OR, 33% without risk/protective alleles

Individual candidate-gene associations

- NIH Genetic Association Database
 - 56,000 papers, 130,000 records, ~2000 genes, only 4% with dbSNP ids, 1706 with alleles, none with risk/protective
- Online Mendelian Inheritance in Man
 - no dbSNP ids, monogenic
- Human Genome Mutation Database
 - 113247 mutations, most Mendelian disease, few SNPs, no genotypes, or odds ratios

Association of *IL23R*, *TNFRSF1A*, and HLA-DRB1*0103 Allele Variants with Inflammatory Bowel Disease Phenotypes in the Finnish Population

Maarit Lappalainen, MSc,*† Leena Halme, MD, PhD,‡ Ulla Turunen, MD,§ Päivi Saavalainen, PhD,*† Elisabet Einarsdottir, PhD,*† Martti Färkkilä, MD, PhD,§ Kimmo Kontula, MD, PhD,*† and Paulina Paavola-Sakki, MD, PhD*‡§

Background: Crohn's disease (CD) and ulcerative colitis (UC), 2 major forms of inflammatory bowel disease (IBD), are complex disorders with significant genetic predisposition. The first CD-associated gene, *CARD15/NOD2*, was recently identified and since then several reports on novel IBD candidate genes have emerged. We investigated disease phenotype association to genetic variations in *IL23R*, *ATG16L1*, *DLG5*, *ABCB1/MDR1*, *TLR4*, *TNFRSF1A*, chromosome 5 risk haplotype including *SLC22A4* and *SLC22A5*, and HLA-DRB1*0103 allele among Finnish IBD patients.

Methods: A total of 699 IBD patients were genotyped for disease-associated variants by polymerase chain reaction (PCR) and restriction enzyme digestion or Sequenom iPLEX method.

Results: Five markers spanning the *IL23R* gene were associated with CD. The SNP (single nucleotide polymorphism) rs2201841 gave the strongest association ($P = 0.002$). The rare HLA-DRB1*0103 allele was found to associate with UC ($P = 0.008$), and the *TNFRSF1A* A36G variant was associated with familial UC ($P = 0.007$). Upon phenotypic analysis we detected association between familial UC and rare *TNFRSF1A* alleles 36G and IVS6+10G ($P = 0.001$ and $P = 0.042$, respectively). In addition, *IL23R* markers were associated with stricturing CD ($P = 0.010$ – 0.017), and ileocolonic CD was more prevalent in the carriers of the same 2 *TNFRSF1A* variants ($P = 0.021$ and $P = 0.028$, respectively). Less significant genotype-phenotype associations were observed for the *TLR4* and HLA variants.

Conclusions: We were able to replicate the association of the *IL23R* variants with CD as well as HLA-DRB1*0103 with UC; confirmation of *TNFRSF1A* association with UC needs additional studies. Our findings also suggest that polymorphisms at *IL23R* and *TNFRSF1A*, and possibly HLA and *TLR4*, loci may account for phenotypic variation in IBD.

(*Inflamm Bowel Dis* 2008;14:1118–1124)

Key Words: Finnish, inflammatory bowel disease, HLA-DRB1*0103, *IL23R*, *TNFRSF1A*

Since the initial discovery of the association of *CARD15/NOD2* gene variants with Crohn's disease (CD),^{1–3} several new susceptibility genes for inflammatory bowel disease (IBD) have been reported. In 2004 the positional cloning approach led to the identification of the associated variants in solute carrier family 22 (*SLC22A* members 4 and 5)⁴ and the discs large homolog 5 (*DLG5*)⁵ genes that are implicated in fatty acid oxidation and in maintaining epithelial integrity, respectively. It has not, however, been unequivocally proved that the *SLC22A* genes represent the actual disease genes.^{6–13} Most of the studies have confirmed the association of CD with the *SLC22A* gene variants or with the chromosome 5 risk haplotype; however, a study of more than 981 Belgian IBD patients could not replicate the association with IBD, CD, or ulcerative colitis (UC).¹⁴ A recent study by Silverberg et al¹⁵ using a large cohort of IBD trios excluded the *SLC22A5* gene variant as the potential causal variant. The association of genetic variations in the *DLG5* gene with IBD and CD was initially described in 2 large European study samples.⁵ The haplotype A, tagged by SNP DLG5_e26 ins/delA, was significantly undertransmitted in IBD and CD, whereas haplotype D, tagged by the SNP G113A (R30Q), was significantly overtransmitted in both IBD and CD. Several groups have not been able to replicate the association since the original report.^{13,14,16} However, in 1 case gender-specific analysis revealed an association.¹⁷

The association of IBD with genetic variation in the Toll-like receptor 4 (*TLR4*) gene has been investigated by many groups but the results have been controversial, which

- Study published in 2008 in *Inflammatory Bowel Disease*
- Crohn's Disease and Ulcerative Colitis
- Investigated 9 loci in 700 Finnish IBD patients
- We record 100+ items
 - GWAS, non-GWAS papers
 - Disease, Phenotype
 - Population, Gender
 - Alleles and Genotypes
 - p-value (and confidence)
 - Odds ratio (and confidence)
 - Technology, Study design
 - Genetic model
- Mapped to UMLS concepts

Received for publication January 23, 2008; Accepted January 26, 2008.

From the *Research Program for Molecular Medicine, Biomedicum Helsinki, Finland, †Department of Medicine, University of Helsinki, Helsinki, Finland, ‡Department of Transplantation and Liver Surgery, Helsinki University Hospital, Helsinki, Finland, §Department of Gastroenterology, Helsinki University Hospital, Helsinki, Finland, Department of Medical Genetics, Biomedicum Helsinki, Finland.

Supported by a grant from the Special State Funds of the Helsinki University Central Hospital (EVO), University of Helsinki, the Finnish Academy, and the EU commission (MEXT-CT-2005-025270).

Reprints: Kimmo Kontula, Department of Medicine, University of Helsinki, Haartmaninkatu 4, FIN-00290 Helsinki, Finland (e-mail: kimmo.kontula@helsinki.fi).

Copyright © 2008 Crohn's & Colitis Foundation of America, Inc.

DOI 10.1002/ibd.20423

Published online 13 March 2008 in Wiley InterScience (www.interscience.wiley.com).

Rong Chen
Optra Systems

Association of *IL23R*, *TNFRSF1A*, and HLA-DRB1*0103 Allele Variants with Inflammatory Bowel Disease Phenotypes in the Finnish Population

Maarit Lappalainen, MSc,^{*,†} Leena Halme, MD, PhD,[‡] Ulla Turunen, MD,[§] Päivi Saavalainen, PhD,^{*,§} Elisabet Einarsdottir, PhD,^{*,§} Martti Färkkilä, MD, PhD,[§] Kimmo Kontula, MD, PhD,^{*,†} and Paulina Paavola-Sakki, MD, PhD^{‡,§}

Background: Crohn's disease (CD) and ulcerative colitis (UC), 2 major forms of inflammatory bowel disease (IBD), are complex disorders with significant genetic predisposition. The first CD-associated gene, *CARD15/NOD2*, was recently identified and since then several reports on novel IBD candidate genes have emerged. We investigated disease phenotype association to genetic variations in *IL23R*, *ATG16L1*, *DIG5*, *ABCB1/MDR1*, *TLR4*, *TNFRSF1A*, chromosome 5 risk haplotype including *SLC22A4* and *SLC22A5*, and HLA-DRB1*0103 allele among Finnish IBD patients.

Methods: A total of 699 IBD patients were genotyped for disease-associated variants by polymerase chain reaction (PCR) and restriction enzyme digestion or Sequenom iPLEX method.

Results: True findings regarding the *IL23R* gene were associated with

Conclusions: We were able to replicate the association of the *IL23R* variants with CD as well as HLA-DRB1*0103 with UC; confirmation of *TNFRSF1A* association with UC needs additional studies. Our findings also suggest that polymorphisms at *IL23R* and *TNFRSF1A*, and possibly HLA and *TLR4*, loci may account for phenotypic variation in IBD.

(*Inflamm Bowel Dis* 2008;14:1118–1124)

Key Words: Finnish, inflammatory bowel disease, HLA-DRB1*0103, *IL23R*, *TNFRSF1A*

Since the initial discovery of the association of *CARD15/NOD2* gene variants with Crohn's disease (CD),^{1–3} sev-

- Study published in 2008 in *Inflammatory Bowel Disease*
- Crohn's Disease and Ulcerative Colitis
- Investigated 9 loci in 700 Finnish IBD patients
- We record 100+ items
 - GWAS, non-GWAS papers

Lappalainen et al

Inflamm Bowel Dis • Volume 14, Number 8, August 2008

TABLE 1. Case-control Analysis of the *IL23R* Gene Including 8 SNPs

dbSNP ID	Allele	Location	Controls <i>n</i> = 292	IBD <i>n</i> = 697	<i>P</i> value	CD <i>n</i> = 238	<i>P</i> value	UC <i>n</i> = 459	<i>P</i> value
rs1004819	C T	Intron 5	0.751 0.249	0.704 0.296	0.037	0.671 0.329	0.005	0.721 0.279	0.215

sniki, Häärmäntö 4, FIN-00290 Helsinki, Finland (e-mail: kimmo.kontula@hus.fi).
Copyright © 2008 Crohn's & Colitis Foundation of America, Inc.
DOI 10.1002/ibd.20431
Published online 13 March 2008 in Wiley InterScience (www.interscience.wiley.com).

1118

port.^{13,14,16} However, in 1 case gender-specific analysis revealed an association.¹⁷

The association of IBD with genetic variation in the Toll-like receptor 4 (*TLR4*) gene has been investigated by many groups but the results have been controversial, which

Inflamm Bowel Dis • Volume 14, Number 8, August 2008

- Genetic model
- Mapped to UMLS concepts

- Study published in 2009 in *Rheumatology*
- Ankylosing spondylitis
- Investigated 8 SNPs in IL23R in 2000 UK case-control patients

Rheumatology 2009;48:386–389
Advance Access publication 2 February 2009

Concise Report

Association between the interleukin 23 receptor and ankylosing spondylitis is confirmed by a new UK case–control meta-analysis of published series

Tugce Karaderi¹, David Harvey¹, Claire Farrar¹, Louise H. Appleton¹, M. Roger D. Sturrock³, Matthew A. Brown⁴, Paul Wordsworth¹ and Jennifer

Objectives. It has been shown previously that *IL-23R* variants are associated with AS. We conducted a case-control study and a meta-analysis with the previously published studies, in order to refine these *IL-23R* associations. **Methods.** The UK case–control study included 730 new cases and 1331 healthy controls. In the combined with 1088 published cases. Allelic associations were analysed using contingency tables. **Results.** In the UK case–control study with new cases, four of the eight SNPs showed significant associations ($P < 0.05$) with AS, mainly when cases with IBD and/or psoriasis were excluded. The meta-analysis showed significant associations were again seen not only with rs11209032 ($P = 4.06 \times 10^{-9}$, OR ~ 1.2) but also with rs11209026 and rs11465804 upon exclusion of cases with IBD and/or psoriasis. **Conclusions.** *IL-23R* polymorphisms are clearly associated with AS, but the primary causal association could contribute either increased or decreased susceptibility to AS; functional studies. Additionally, observed stronger associations with SNPs rs11209026 and rs11465804 upon exclusion of cases with IBD and/or psoriasis represent an independent association with AS.

Key words: IL-23 receptor, AS, Polymorphism, SpA, Genetic association.

Introduction

The heritability of AS estimated from twin studies in the United Kingdom and elsewhere is in excess of 90% [1]. The best known component of this arises from the HLA-B27 immune response gene that contributes 20–30% of the total genetic risk [2]. Substantial progress has now been made in identifying non-MHC genes causing susceptibility to AS; *IL-23R*, encoding one component of the interleukin 23 receptor, is one of these genes identified by genome-wide association studies [3]. *IL-23R*, a member of haemopoietin receptor superfamily, is the IL-23R-specific component of the heterodimeric receptor for the cytokine IL-23. The other subunit, IL-12R β 1, is also a component of the IL-12 receptor (together with the IL-12R β 2 subunit). Cells expressing the IL-23R subunit respond to IL-23 rather than IL-12 [4]. The IL-23 receptor is important in CD4 T-cell differentiation into the T_H17 lymphocyte subset that mediates inflammation in several animal models of autoimmunity [5, 6]. In various experimental models, T_H17 cells producing IL-17 have been shown to cause tissue damage in the brain, joints, heart, lungs and intestines [7]. *IL-23R* variants have also been implicated in

susceptibility to human ankylosing spondylitis and multiple sclerosis, common susceptibility loci associated with the seronegative spondyloarthropathies [8]. In a previous study, which is strongly associated with ankylosing spondylitis, a previous study, an extended UK study, strengthening the evidence for an association between *IL-23R* and AS ($P < 0.05$).

Methods

Study population

All patients were seen by a rheumatologist and defined as AS, as defined by the modified New York criteria [9]. Cases were recruited from those attending the Rheumatology Clinic (Oxford, UK) and the Rheumatology Clinic (Bath, UK). All cases were confirmed by radiographs of the spine and sacroiliac joints and by referral for histological examination of the sacroiliac joints. The study was carried out with relevant ethical approval (Oxford 98/5/23).

New UK case–control study

In this study, 730 new AS cases were recruited from the Oxford and Bath Rheumatology Clinics. None of the new cases were from the Oxford Rheumatology Clinic (MassArray, Sequenom, San Diego, CA, USA).

Fig. 1. Results of the new and extended UK case–control study, combining UK WTCCC cases and new UK cases

Minor Allele	Study I						Study II					
	MAF cases	MAF controls	Chi-square	P-value	OR	95% CI	MAF cases	MAF controls	Chi-square	P-value	OR	95% CI
	Case-control study: A. Including all new AS cases only (730)											
A	0.33	0.3	3.12	0.077	1.13	0.99, 1.30	0.33	0.3	9.83	0.0017	1.19	1.07, 1.32
G	0.43	0.45	2.41	0.12	0.9	0.79, 1.03	0.43	0.45	4.08	0.043	0.9	0.81, 1.00
C	0.04	0.06	6.45	0.011	0.68	0.50, 0.92	0.04	0.06	11.12	0.0009	0.68	0.54, 0.85
A	0.05	0.06	5.41	0.02	0.71	0.53, 0.95	0.05	0.06	12.74	0.0004	0.67	0.53, 0.83
A	0.32	0.34	1.7	0.19	0.91	0.79, 1.05	0.32	0.34	6.05	0.014	0.87	0.79, 0.97
A	0.36	0.31	7.86	0.0051	1.21	1.06, 1.39	0.36	0.31	12.91	0.0003	1.22	1.09, 1.35
A	0.37	0.32	10.78	0.001	1.25	1.09, 1.43	0.37	0.32	22.22	<10 ⁻⁵	1.29	1.16, 1.43
G	0.47	0.44	3.33	0.068	1.13	0.99, 1.29	0.47	0.44	9.19	0.0024	1.17	1.06, 1.29
Extended study: C. Including all new AS cases (730) and WTCCC cases (1088)												
A	0.33	0.3	3.12	0.077	1.13	0.99, 1.30	0.33	0.3	9.83	0.0017	1.19	1.07, 1.32
G	0.43	0.45	2.41	0.12	0.9	0.79, 1.03	0.43	0.45	4.08	0.043	0.9	0.81, 1.00
C	0.04	0.06	6.45	0.011	0.68	0.50, 0.92	0.04	0.06	11.12	0.0009	0.68	0.54, 0.85
A	0.05	0.06	5.41	0.02	0.71	0.53, 0.95	0.05	0.06	12.74	0.0004	0.67	0.53, 0.83
A	0.32	0.34	1.7	0.19	0.91	0.79, 1.05	0.32	0.34	6.05	0.014	0.87	0.79, 0.97
A	0.36	0.31	7.86	0.0051	1.21	1.06, 1.39	0.36	0.31	12.91	0.0003	1.22	1.09, 1.35
A	0.37	0.32	10.78	0.001	1.25	1.09, 1.43	0.37	0.32	22.22	<10 ⁻⁵	1.29	1.16, 1.43
G	0.47	0.44	3.33	0.068	1.13	0.99, 1.29	0.47	0.44	9.19	0.0024	1.17	1.06, 1.29

- Study published in 2009 in *Rheumatology*

Rheumatology 2009;48:386–389
Advance Access publication 2 February 2009

doi:10.1093/rheumatology/ken501

Concise Report

Association between the interleukin 23 receptor and ankylosing spondylitis is confirmed by a new UK case–control study and meta-analysis of published series

new UK WTCCC cases and new UK cases
version
to cal-
statistic
ts and
s [14].
ochran
der to
-value
ss the
ore be
>0.05)

TABLE 1. Results of the new and extended UK case–control study, combining UK WTCCC cases and new UK cases

Study I								
SNP	Minor Allele	MAF cases	MAF controls	Chi-square	P-value	OR	95% CI	MAF cases
Case–control study: A. Including all new AS cases only (730)								Extended study: C
rs1004819	A	0.33	0.3	3.12	0.077	1.13	0.99, 1.30	0.33
rs10489629	G	0.43	0.45	2.41	0.12	0.9	0.79, 1.03	0.43
rs11465804	C	0.04	0.06	6.45	0.011	0.68	0.50, 0.92	0.04
rs11209026	A	0.05	0.06	5.41	0.02	0.71	0.53, 0.95	0.05
rs1343151	A	0.32	0.34	1.7	0.19	0.91	0.79, 1.05	0.32
rs10889677	A	0.36	0.31	7.86	0.0051	1.21	1.06, 1.39	0.36
rs11209032	A	0.37	0.32	10.78	0.001	1.25	1.09, 1.43	0.37
rs1495965	G	0.47	0.44	3.33	0.068	1.13	0.99, 1.29	0.47

Nuffield Department of Orthopaedics, Rheumatology and Musculoskeletal Sciences, Oxford University Institute of Musculoskeletal Sciences, Botnar Research Centre, Nuffield Orthopaedic Centre, Oxford, ²Royal National Hospital for Rheumatic Diseases, Bath, ³Department of Immunology, Infection and Inflammation, Centre for Rheumatic Diseases, University of Glasgow, Glasgow, UK and ⁴Diamond Institute for Cancer, Immunology and Metabolic Medicine, University of Queensland, Queensland, Australia.

Submitted 29 August 2008; revised version accepted 10 December 2008.

Correspondence to: Jennifer J. Pointon, Oxford University Institute of Musculoskeletal Science, Botnar Research Centre, Nuffield Orthopaedic Centre, Windmill Road, Headington, Oxford OX3 7LD, UK. Email: jennyp@weh.ox.ac.uk

was carried out with relevant ethical approval (WTCCC project no. 98/5/23).

New UK case–control study and extended UK study of association between IL-23R and AS

In this study, 730 new AS cases, 1088 published cases and 1331 healthy controls from the UK were compared using a case–control design. None of the new UK cases has been included in previous reports. New cases were genotyped using iPLEX technology (MassArray, Sequenom, San Diego, CA, USA) except for SNP

- Tables can be rotated
- NLP is hard

TABLE 1. Case-control Analysis of the *IL23R* Gene Including 8 SNPs

dbSNP ID	Allele	Location	Controls <i>n</i> = 292	IBD <i>n</i> = 697	<i>P</i> value	CD <i>n</i> = 238	<i>P</i> value
rs1004819	C	Intron 5	0.751	0.704	0.037	0.671	0.005
	T		0.249	0.296		0.329	

w UK
TCCC
version
to cal-
statistic
ts and
s [14].
echran
der to
-value
ss the
ore be
>0.05)

nd the
table 1
cases
imilar.
04819,
2 and
ongest
a IBD
control
SNPs
owed
with
and/or
s from
sis led
and/or
09026
both
ations
ations
again

TABLE 1. Results of the new and extended UK case-control study, combining UK WTCCC cases and new UK cases

Study I								
SNP	Minor Allele	MAF cases	MAF controls	Chi-square	<i>P</i> -value	OR	95% CI	MAF cases
Case-control study: A. Including all new AS cases only (730)								Extended study: C
rs1004819	A	0.33	0.3	3.12	0.077	1.13	0.99, 1.30	0.33
rs10489629	G	0.43	0.45	2.41	0.12	0.9	0.79, 1.03	0.43
rs11465804	C	0.04	0.06	0.46	0.011	0.68	0.50, 0.92	0.04
rs11209026	A	0.05	0.06	5.41	0.02	0.71	0.53, 0.95	0.05

TABLE 1. Case-control Analysis of the *IL23R* Gene Including 8 SNPs

dbSNP ID	Allele	Location	Controls <i>n</i> = 292	IBD <i>n</i> = 697	<i>P</i> value	CD <i>n</i> = 238	<i>P</i> value
rs1004819	C	Intron 5	0.751	0.704	0.037	0.671	0.005
	T		0.249	0.296		0.329	

What are the alleles for rs1004819?

new UK
WTCCC
cases
and the
table 1
cases
similar.
rs1004819,
rs10489629 and
rs11465804 are the
most frequent
IBD control
SNPs
associated
with
IBD
cases
from
this study
and/or
WTCCC
cases
again

TABLE 1. Results of the new and extended UK case-control study, combining UK WTCCC cases and new UK cases

Study I								
SNP	Minor Allele	MAF cases	MAF controls	Chi-square	<i>P</i> -value	OR	95% CI	MAF cases
Case-control study: A. Including all new AS cases only (730)								
rs1004819	A	0.33	0.3	3.12	0.077	1.13	0.99, 1.30	0.33
rs10489629	G	0.43	0.45	2.41	0.12	0.9	0.79, 1.03	0.43
rs11465804	C	0.04	0.06	0.46	0.011	0.68	0.50, 0.92	0.04
rs11209026	A	0.05	0.06	5.41	0.02	0.71	0.53, 0.95	0.05
Extended study: C								

Alleles for rs1004819 are C and T

Population Diversity

ss#	Sample Ascertainment				Genotype Detail ^{NEW}				Alleles	
	Population	Individual Group	Chrom. Sample Cnt.	Source	C/C	C/T	T/T	HWP	C	T
ss120253447	ENSEMBL Venter		2	IG	1.000				1.000	
ss137986136	ENSEMBL Watson		2	IG		1.000			0.500	0.500
ss143546670	ENSEMBL Venter		2	IG		1.000			0.500	0.500
	ENSEMBL celera		4	IG	0.500		0.500		0.500	0.500
ss1466382	CEPH		184	AF					0.730	0.270
	HapMap-CEU	European	226	IG	0.513	0.398	0.088	1.000	0.712	0.288
	HapMap-HCB	Asian	86	IG	0.116	0.512	0.372	0.584	0.372	0.628
	HapMap-JPT	Asian	172	IG	0.221	0.442	0.337	0.343	0.442	0.558
	HapMap-YRI	Sub-Saharan African	226	IG	0.416	0.496	0.088	0.251	0.664	0.336
	HAPMAP-ASW		98	IG	0.469	0.510	0.020	0.100	0.724	0.276
	HAPMAP-CHB	Asian	82	IG	0.268	0.488	0.244	1.000	0.512	0.488
	HAPMAP-CHD		170	IG	0.141	0.482	0.376	1.000	0.382	0.618
	HAPMAP-GIH		176	IG	0.182	0.500	0.318	1.000	0.432	0.568
	HAPMAP-LWK		180	IG	0.556	0.389	0.056	0.752	0.750	0.250
	HAPMAP-MEX		100	IG	0.580	0.380	0.040	0.655	0.770	0.230

~11% of records reported genotypes in the negative strand

Stanford Confidential

NBC News - Science
Evolution

THE SCIENCE OF EVOLUTION IS ONE OF THE MOST IMPORTANT AND MOST MISUNDERSTOOD OF ALL SCIENTIFIC THEORIES.

It is the theory that all life on Earth is related and that it has evolved over time through a process of natural selection. The theory was first proposed by Charles Darwin in 1859, and it has since become the foundation of modern biology.

Evolution explains how species change over time and how they are related to each other. It is a process that occurs through natural selection, which is the survival of the fittest. Organisms that are better adapted to their environment are more likely to survive and reproduce, passing on their traits to their offspring.

Evolution is a process that occurs over a long period of time, and it is a process that is ongoing. It is a process that has shaped the diversity of life on Earth, and it is a process that continues to shape life today.

Evolution is a process that is supported by a large body of scientific evidence, including fossil records, comparative anatomy, and molecular biology. It is a process that is widely accepted by the scientific community, and it is a process that is essential to our understanding of life on Earth.

Evolution is a process that is often misunderstood, and it is a process that is often used to support religious beliefs. However, it is a process that is based on scientific evidence, and it is a process that is essential to our understanding of life on Earth.

Evolution of Paleontology in the American West
History and the Discovery of the Fossil Record
Evolution in the West

THE HISTORY OF PALEONTOLOGY IN THE AMERICAN WEST IS A STORY OF DISCOVERY AND EXPLORATION. IT IS A STORY OF THE SEARCH FOR THE Fossil Record, and it is a story of the discovery of the evolution of life on Earth.

The history of paleontology in the American West begins in the 1840s, when the first fossilized bones were discovered in the region. These bones were found by a group of men who were exploring the area for fur and trade. They discovered the bones of a large animal, and they were amazed by the discovery.

The discovery of these bones led to the discovery of the fossil record, and it led to the discovery of the evolution of life on Earth. It was a discovery that changed the way we think about life on Earth, and it was a discovery that has shaped the field of paleontology ever since.

The history of paleontology in the American West is a story of discovery and exploration. It is a story of the search for the fossil record, and it is a story of the discovery of the evolution of life on Earth. It is a story that has shaped the field of paleontology, and it is a story that continues to shape the field today.

NBC News - Science
Evolution

THE SCIENCE OF EVOLUTION IS ONE OF THE MOST IMPORTANT AND MOST MISUNDERSTOOD OF ALL SCIENTIFIC THEORIES.

It is the theory that all life on Earth is related and that it has evolved over time through a process of natural selection. The theory was first proposed by Charles Darwin in 1859, and it has since become the foundation of modern biology.

Evolution explains how species change over time and how they are related to each other. It is a process that occurs through natural selection, which is the survival of the fittest. Organisms that are better adapted to their environment are more likely to survive and reproduce, passing on their traits to their offspring.

Evolution is a process that occurs over a long period of time, and it is a process that is ongoing. It is a process that has shaped the diversity of life on Earth, and it is a process that continues to shape life today.

Evolution is a process that is supported by a large body of scientific evidence, including fossil records, comparative anatomy, and molecular biology. It is a process that is widely accepted by the scientific community, and it is a process that is essential to our understanding of life on Earth.

Evolution is a process that is often misunderstood, and it is a process that is often used to support religious beliefs. However, it is a process that is based on scientific evidence, and it is a process that is essential to our understanding of life on Earth.

Evolution in 19th century science
Evolution in 19th century science

THE SCIENCE OF EVOLUTION IS ONE OF THE MOST IMPORTANT AND MOST MISUNDERSTOOD OF ALL SCIENTIFIC THEORIES.

It is the theory that all life on Earth is related and that it has evolved over time through a process of natural selection. The theory was first proposed by Charles Darwin in 1859, and it has since become the foundation of modern biology.

Evolution explains how species change over time and how they are related to each other. It is a process that occurs through natural selection, which is the survival of the fittest. Organisms that are better adapted to their environment are more likely to survive and reproduce, passing on their traits to their offspring.

Evolution is a process that occurs over a long period of time, and it is a process that is ongoing. It is a process that has shaped the diversity of life on Earth, and it is a process that continues to shape life today.

Evolution is a process that is supported by a large body of scientific evidence, including fossil records, comparative anatomy, and molecular biology. It is a process that is widely accepted by the scientific community, and it is a process that is essential to our understanding of life on Earth.

Evolution is a process that is often misunderstood, and it is a process that is often used to support religious beliefs. However, it is a process that is based on scientific evidence, and it is a process that is essential to our understanding of life on Earth.

Evolution in 19th century science
Evolution in 19th century science

THE SCIENCE OF EVOLUTION IS ONE OF THE MOST IMPORTANT AND MOST MISUNDERSTOOD OF ALL SCIENTIFIC THEORIES.

It is the theory that all life on Earth is related and that it has evolved over time through a process of natural selection. The theory was first proposed by Charles Darwin in 1859, and it has since become the foundation of modern biology.

Evolution explains how species change over time and how they are related to each other. It is a process that occurs through natural selection, which is the survival of the fittest. Organisms that are better adapted to their environment are more likely to survive and reproduce, passing on their traits to their offspring.

Evolution is a process that occurs over a long period of time, and it is a process that is ongoing. It is a process that has shaped the diversity of life on Earth, and it is a process that continues to shape life today.

Evolution is a process that is supported by a large body of scientific evidence, including fossil records, comparative anatomy, and molecular biology. It is a process that is widely accepted by the scientific community, and it is a process that is essential to our understanding of life on Earth.

Evolution is a process that is often misunderstood, and it is a process that is often used to support religious beliefs. However, it is a process that is based on scientific evidence, and it is a process that is essential to our understanding of life on Earth.

NBC News - Science
Evolution

THE SCIENCE OF EVOLUTION IS ONE OF THE MOST IMPORTANT AND MOST MISUNDERSTOOD OF ALL SCIENTIFIC THEORIES.

It is the theory that all life on Earth is related and that it has evolved over time through a process of natural selection. The theory was first proposed by Charles Darwin in 1859, and it has since become the foundation of modern biology.

Evolution explains how species change over time and how they are related to each other. It is a process that occurs through natural selection, which is the survival of the fittest. Organisms that are better adapted to their environment are more likely to survive and reproduce, passing on their traits to their offspring.

Evolution is a process that occurs over a long period of time, and it is a process that is ongoing. It is a process that has shaped the diversity of life on Earth, and it is a process that continues to shape life today.

Evolution is a process that is supported by a large body of scientific evidence, including fossil records, comparative anatomy, and molecular biology. It is a process that is widely accepted by the scientific community, and it is a process that is essential to our understanding of life on Earth.

Evolution is a process that is often misunderstood, and it is a process that is often used to support religious beliefs. However, it is a process that is based on scientific evidence, and it is a process that is essential to our understanding of life on Earth.

Stanford Confidential

VARIMED: Variants Informing Medicine

Number of papers curated	Distinct SNPs	Diseases and phenotypes	Narrow phenotypes	Records
~7,300	~119,000	~2,200	~19,000	~330,000

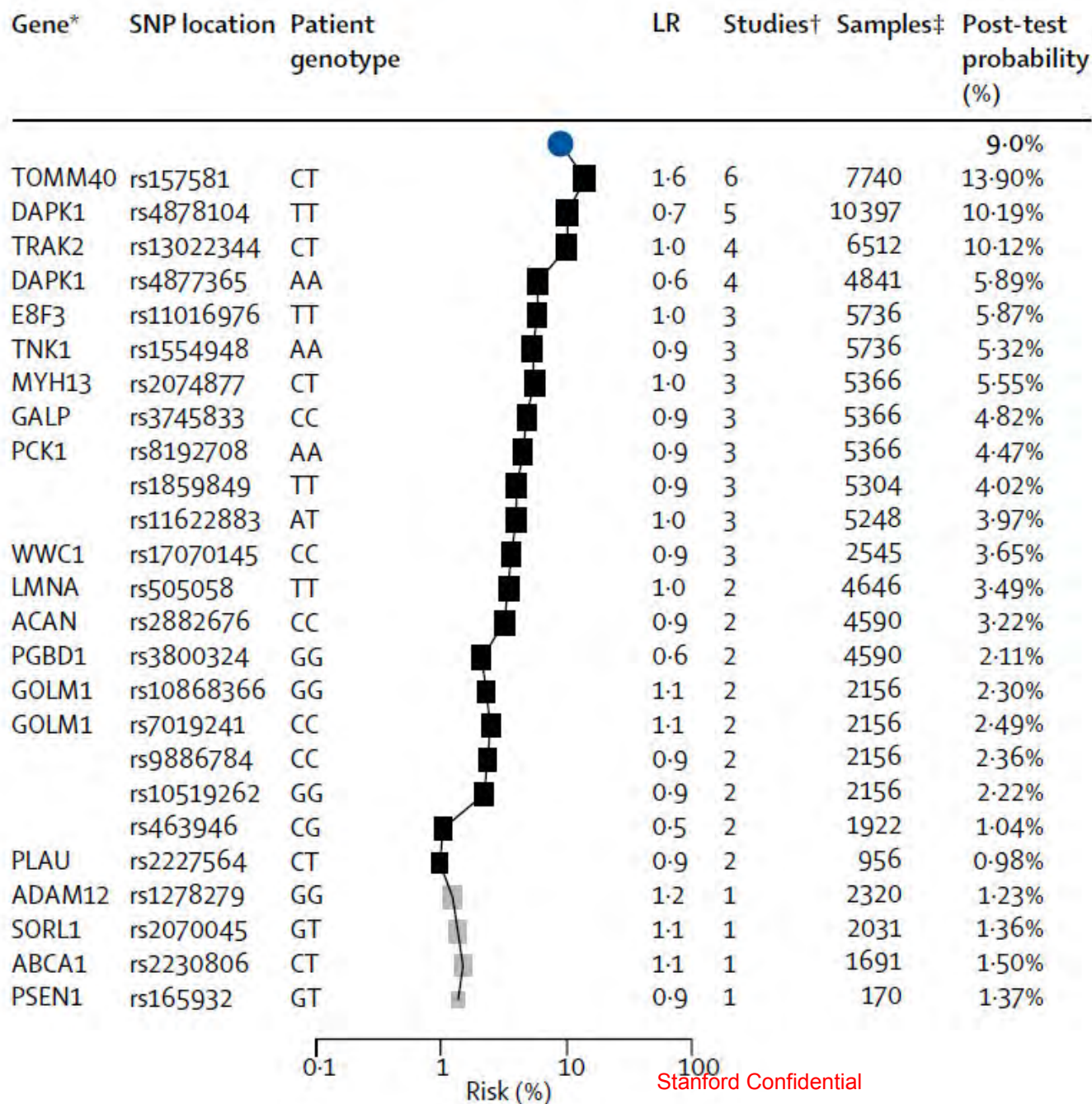
Chen R, Davydov EV, Sirota M, Butte AJ.
PLoS One.
2010 October: 5(10): e13574.

Rong Chen
Optra Systems

45% of known published disease SNPs are outside exons

		SNPs	Diseases	SNP/Disease Associations
All	Exome	35,727	1,490	45,896
	Outside	31,581	740	35,031
p < 1E-6	Exome	4,820	403	5,782
	Outside	3,836	317	4,476
p < 5E-8	Exome	3,889	332	4,641
	Outside	2,911	262	3,402

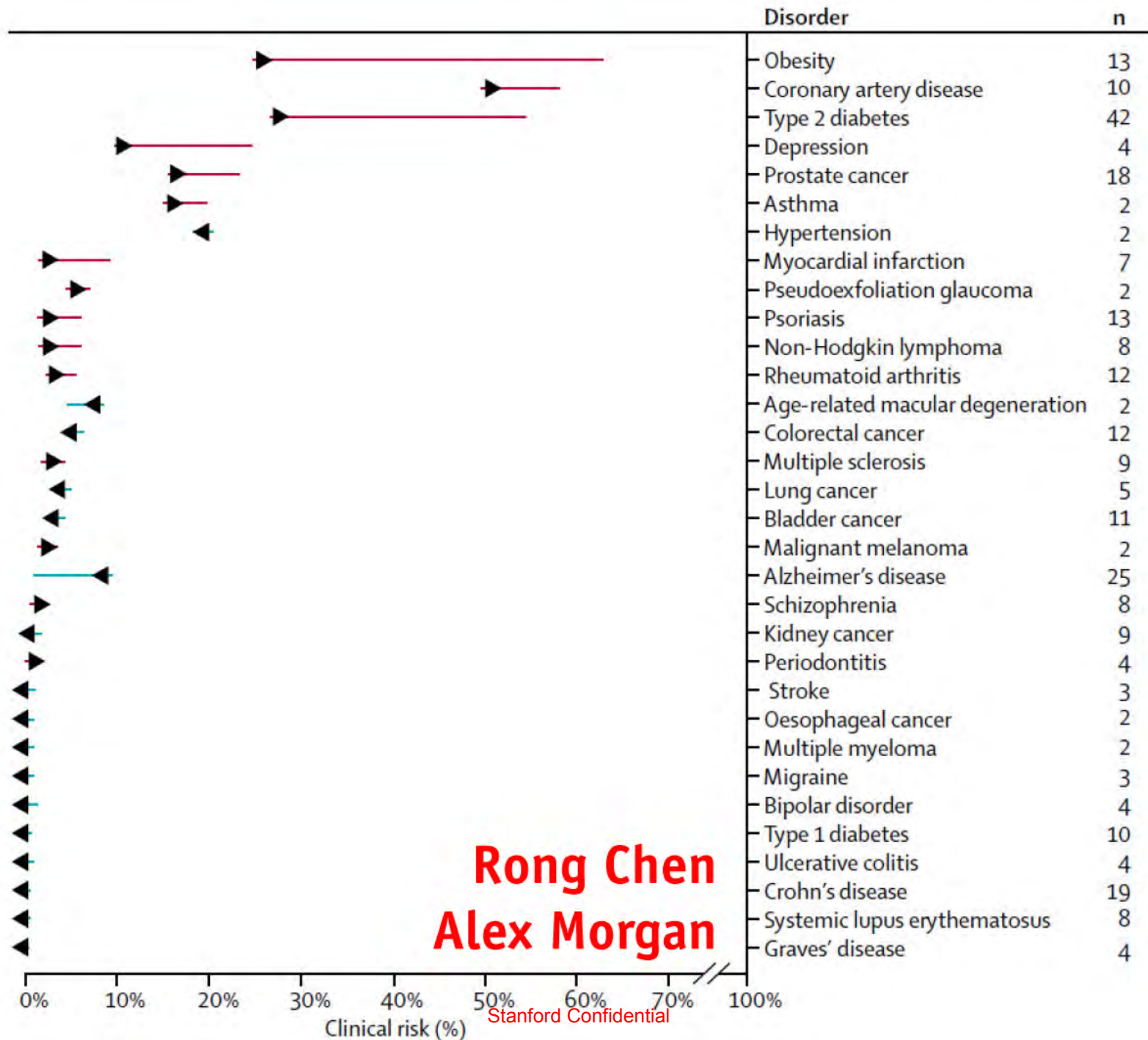
D Alzheimer's disease



Stanford Confidential

Rong Chen
Alex Morgan

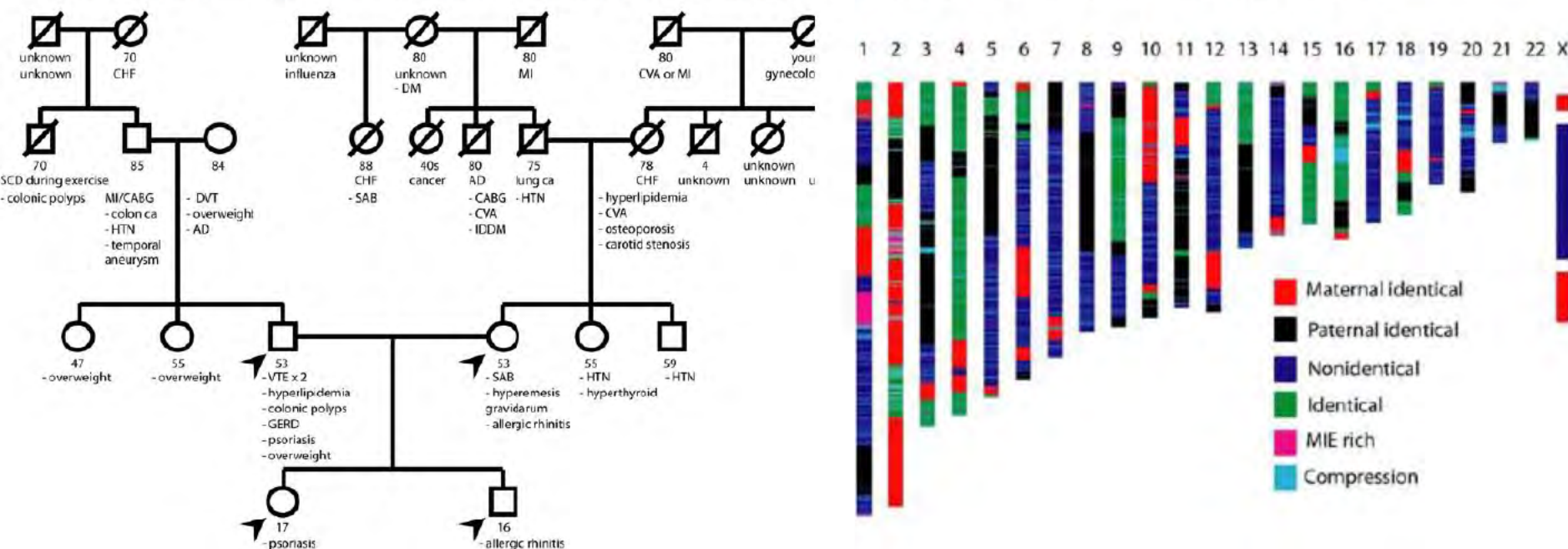
Ashley EA*, Butte AJ*,
Wheeler MT, Chen R,
Klein TE, Dewey FE,
Dudley JT, Ormond KE,
Pavlovic A, Hudgins L,
Gong L, Hodges LM,
Berlin DS, Thorn CF,
Sangkuhl K, Hebert JM,
Woon M, Sagreiya H,
Whaley R, Morgan AA,
Pushkarev D, Neff NF,
Knowles W, Chou M,
Thakuria J, Rosenbaum
A, Zaranek AW, Church
G, Greely HT*, Quake
SR*, Altman RB*.
Clinical evaluation
incorporating a personal
genome. *Lancet*, 2010.



Phased Whole-Genome Genetic Risk in a Family Quartet Using a Major Allele Reference Sequence

Frederick E. Dewey¹, Rong Chen², Sergio P. Cordero³, Kelly E. Ormond^{4,5}, Colleen Caleshu¹, Konrad J. Karczewski^{3,4}, Michelle Whirl-Carrillo⁴, Matthew T. Wheeler¹, Joel T. Dudley^{2,3}, Jake K. Byrnes⁴, Omar E. Cornejo⁴, Joshua W. Knowles¹, Mark Woon⁴, Katrin Sangkuhl⁴, Li Gong⁴, Caroline F. Thorn⁴, Joan M. Hebert⁴, Emidio Capriotti⁴, Sean P. David⁴, Aleksandra Pavlovic¹, Anne West⁶, Joseph V. Thakuria⁷, Madeleine P. Ball⁸, Alexander W. Zaranek⁸, Heidi L. Rehm⁹, George M. Church⁸, John S. West¹⁰, Carlos D. Bustamante⁴, Michael Snyder⁴, Russ B. Altman^{4,11}, Teri E. Klein⁴, Atul J. Butte², Euan A. Ashley^{1*}

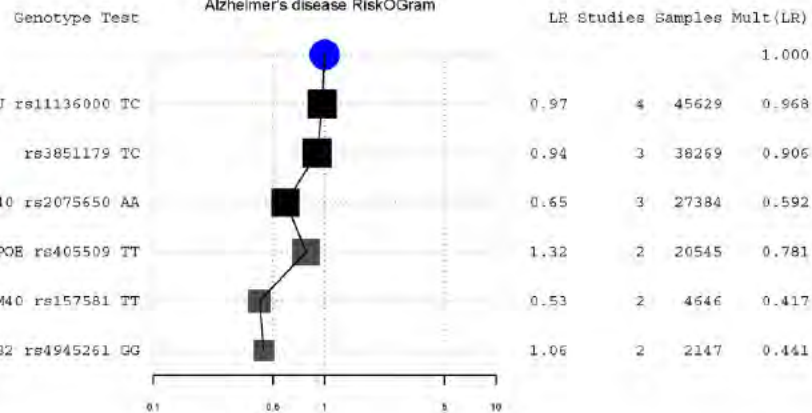
1 Center for Inherited Cardiovascular Disease, Division of Cardiovascular Medicine, Stanford University, Stanford, California, United States of America, **2** Division of Systems Medicine, Department of Pediatrics, Stanford University School of Medicine, Stanford, California, United States of America, **3** Biomedical Informatics Graduate Training Program, Stanford University School of Medicine, Stanford, California, United States of America, **4** Department of Genetics, Stanford University School of Medicine, Stanford, California, United States of America, **5** Center for Biomedical Ethics, Stanford University, Stanford, California, United States of America, **6** Wellesley College



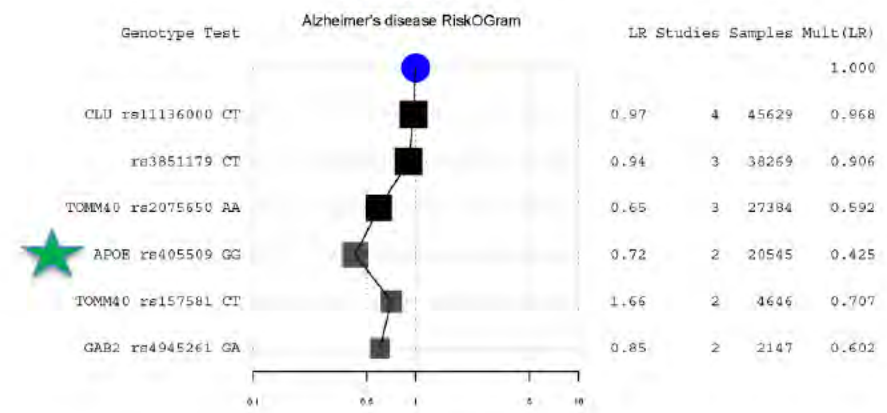
Alzheimer's Disease: All family members have protective SNPs, except the son

Rong Chen

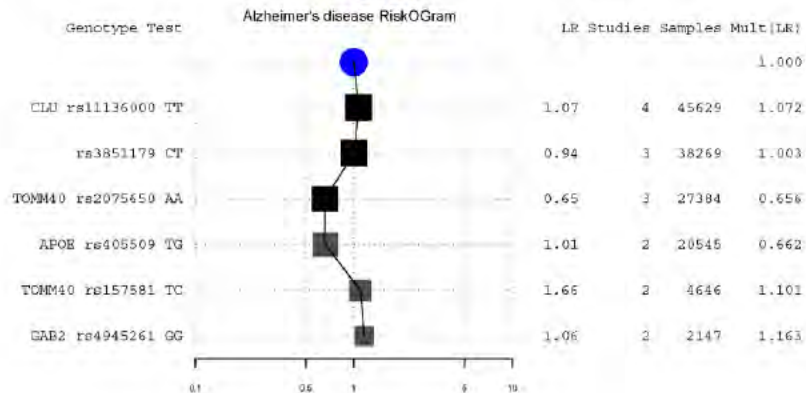
Father



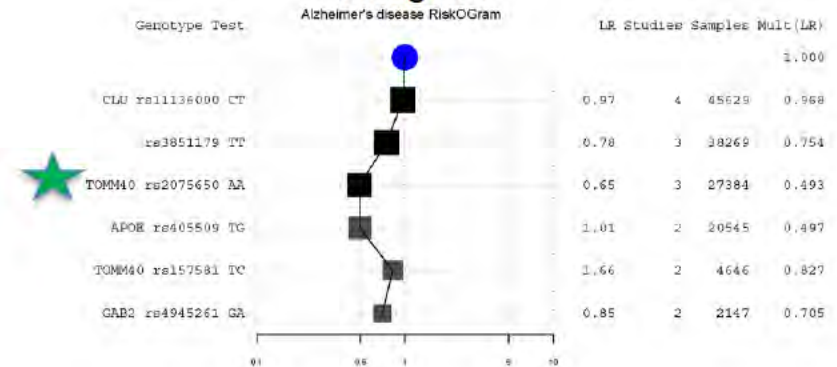
Mother



Son

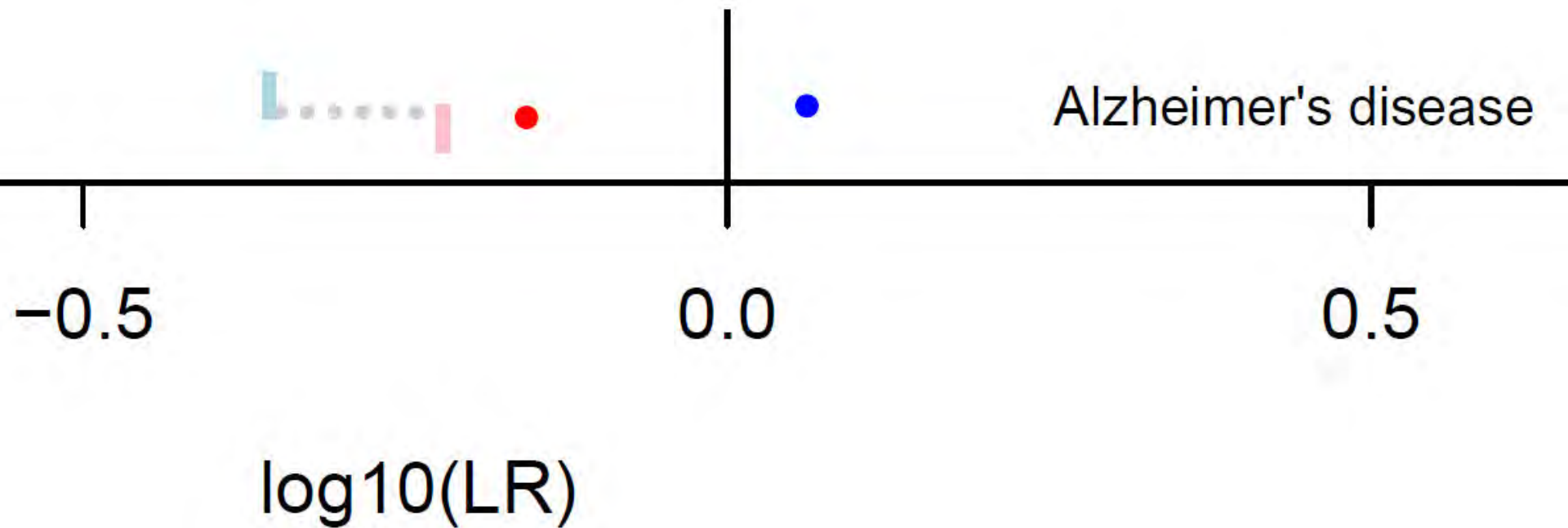


Daughter



PLoS Genetics, 2011.

Plotting family disease risk



Rong Chen

All in the family... Not.

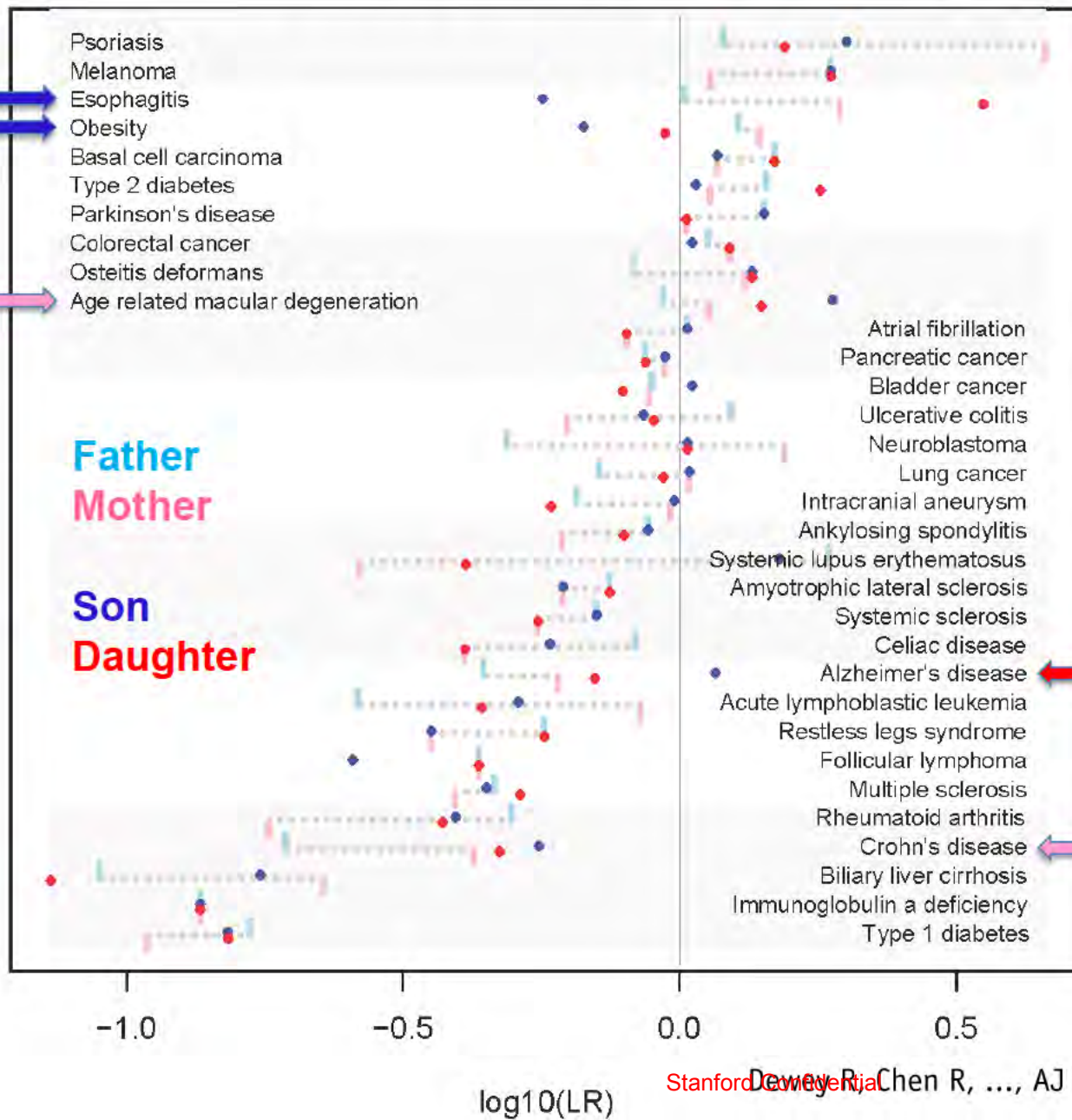
Rong Chen

Both the son and daughter are protective from **obesity** while both parents are at risk.

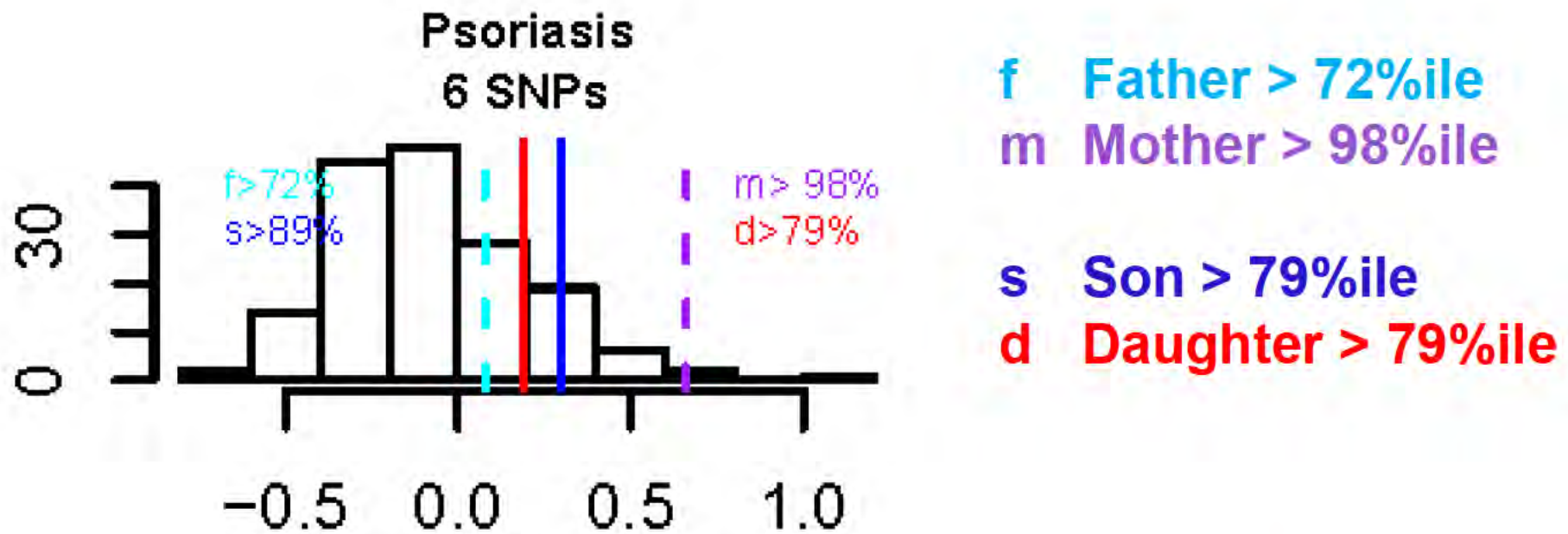
Both parents are at slight risk on **esophagitis**, and the daughter is at high risk and the son has protection.

Both parents are protective from **Alzheimer's disease**. The son is at high risk and the daughter is protective although less protective than the parents.

Both the son and the daughter have higher risk of **Crohn's disease** than the parents, but all family members are at the protective side.



Visualizing family psoriasis risk compared to background HapMap individuals



Rong Chen

Dewey R, Chen R, ..., AJ Butte, E Ashley. *PLoS Genetics*, 2011.

Stanford Confidential

Take Home Points



- Molecular, clinical, and epidemiological data and tools already exist → diagnostics, therapeutics, and disease mechanisms. Integration is enabling.



- Bioinformatics is not just about building tools. We know our tools; we should use them first.



- We need new investigators who can imagine basic questions to ask of these repositories of clinical and genomic measurements.

Translational Bioinformatics

Biomedical Informatics 217

CS 275

Spring 2012

bmi217.stanford.edu

scpd.stanford.edu



AMIA Summit on Translational Bioinformatics 2012

www.amia.org/jointsummits2012

March 2012

Collaborators

- Takashi Kadowaki, Momoko Horikoshi, Kazuo Hara, Hiroshi Ohtsu / U Tokyo
- Kyoko Toda, Satoru Yamada, Junichiro Irie / Kitasato Univ and Hospital
- Shiro Maeda / RIKEN
- Alejandro Sweet-Cordero, Julien Sage / Pediatric Oncology
- Mark Davis, C. Garrison Fathman / Immunology
- Russ Altman, Steve Quake / Bioengineering
- Euan Ashley, Joseph Wu, Tom Quertermous / Cardiology
- Mike Snyder, Carlos Bustamante, Anne Brunet / Genetics
- Jay Pasricha / Gastroenterology
- Rob Tibshirani, Brad Efron / Statistics
- Hannah Valantine, Kiran Khush / Cardiology
- Ken Weinberg / Pediatric Stem Cell Therapeutics
- Mark Musen, Nigam Shah / National Center for Biomedical Ontology
- Minnie Sarwal / Nephrology
- David Miklos / Oncology



Stanford Confidential

Butte Lab
Systems Medicine • Stanford Pediatrics • Packard Children's Hospital

Support

- Lucile Packard Foundation for Children's Health
- NIH: NLM, NIGMS, NCI, NIAID; NIDDK, NHGRI, NIA, NHLBI, NCRR
- March of Dimes
- Hewlett Packard
- Howard Hughes Medical Institute
- California Institute for Regenerative Medicine
- PhRMA Foundation
- Stanford Cancer Center, Bio-X
- Tarangini Deshpande
- Alan Krensky, Harvey Cohen
- Hugh O'Brodovich
- Isaac Kohane

Admin and Tech Staff

- Susan Aptekar
- Meelan Phalak
- Camilla Morrison
- Alex Skrenchuk



Stanford Confidential

Butte Lab
Systems Medicine • Stanford Pediatrics • Packard Children's Hospital