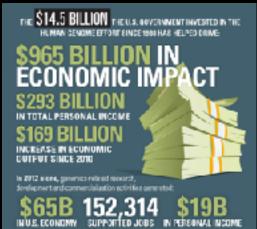




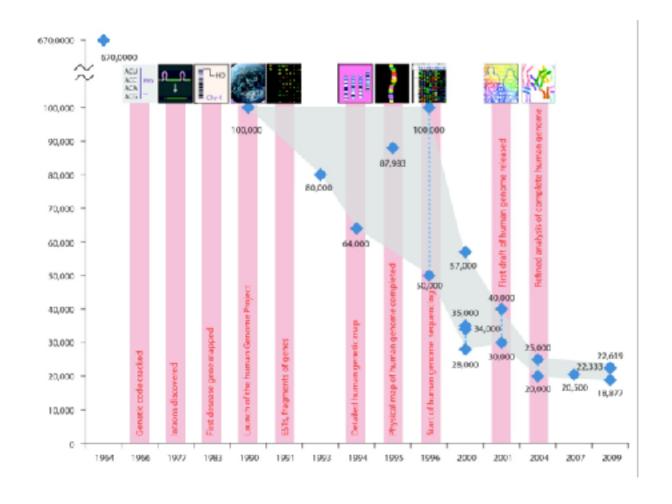
# The Human Genome Project "paid forward" and paved the way for modern day genomics







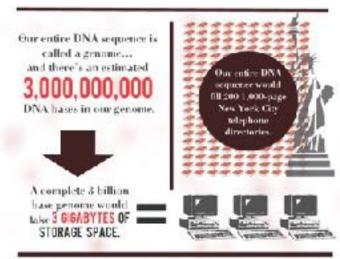
# (Finally) a complete map

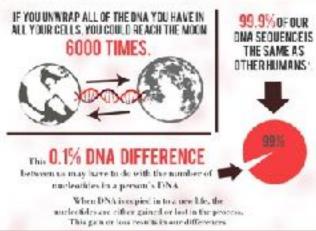


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## Human Genome: some statistics

- 3.2 billion base pairs in the haploid genome
- ≈ 18,000-25,000 genes
  - ≈23,000 coding for proteins
  - Only 1.5% of the total genome
- Rest of the genome:
  - Non-coding RNA (rRNA, tRNA)
  - Regulatory sequences, e.g. promoter, enhancer regic
  - Repetitive elements and other variations
  - Transposable elements
- (So there's no such thing as "junk DNA"...)







It would take a person typing 60 words per minute, 8 hours a day, mound 50 years to type the human genome.

**CGATCTTGC** TTTACTTGC CAGCAAAG CATATCGTCATCGTACTGACTGTCTAGTCTAAACACACCTATGCCGATCGTACGACACATATCGTCATCGTAC TGCCCACGT CATAGCTCA **ACTTTGGCA CTATATTCGA ACTGCGGTC ACATATATGC** CCACATCGC **ACACATTCG ACTGCGCCT ACATATAATG CACATTTCG** 

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CGATCTTGC
TTTACTTGC
CAGCAAAG
CATATCGTCATCGTACTGACTGTCTAGTCTAAACACACCTATGCCGATCGTACGACACATATCGTCATCGTAC
TGCCCACGT
CATAGCTCA
ACTTTGGCA
CTATATTCGA
ACTGCGGTC
ACATATATGC
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ACACATTCG
ACTGCGCCT
ACATATAATG
CACATTTCG
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CGATCTTGC
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CAGCAAAG
CATATCGTCATCGTACTGACTGTCTAGTCTAAACACACCTCTATGCCGATCGTACGACACATATCGTCATCGTAC
TGCCCACGT
CATAGCTCA
TTGGCA
Most of genetic variation is due to single nucleotide
 polymorphisms (SNPs) -- single base changes that
   are common in the general population
CCACATCGC
ACACATTCG
ACTGCGCCT
ACATATAATG
CACATTTCG
```

# Human genome: individual variations

- Human genome is ~99 % similar between individuals
- 0.5-1% different

#### articles

# A map of human genome sequence variation containing 1.42 million single nucleotide polymorphisms

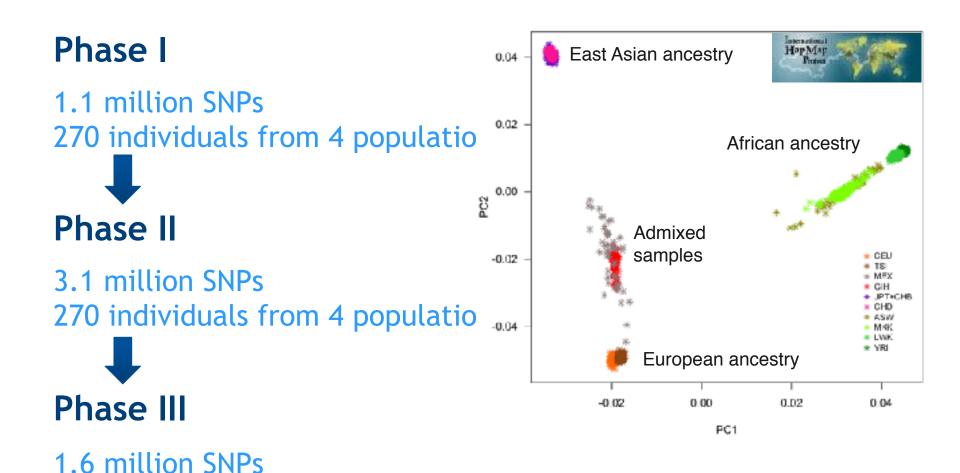
The International SNP Map Working Group\*

A full list of authors appears at the end of this paper.

We describe a map of 1.42 million single nucleotide polymorphisms (SNPs) distributed throughout the human genome, providing an average density on available sequence of one SNP every 1.9 kilobases. These SNPs were primarily discovered by two projects: The SNP Consortium and the analysis of clone overlaps by the International Human Genome Sequencing Consortium. The map integrates all publicly available SNPs with described genes and other genomic features. We estimate that 60,000 SNPs fall within exon (coding and untranslated regions), and 85% of exons are within 5 kb of the nearest SNP. Nucleotide diversity varies greatly across the genome, in a manner broadly consistent with a standard population genetic model of human history. This high-density SNP map provides a public resource for defining haplotype variation across the genome, and should help to identify biomedically important genes for diagnosis and therapy.

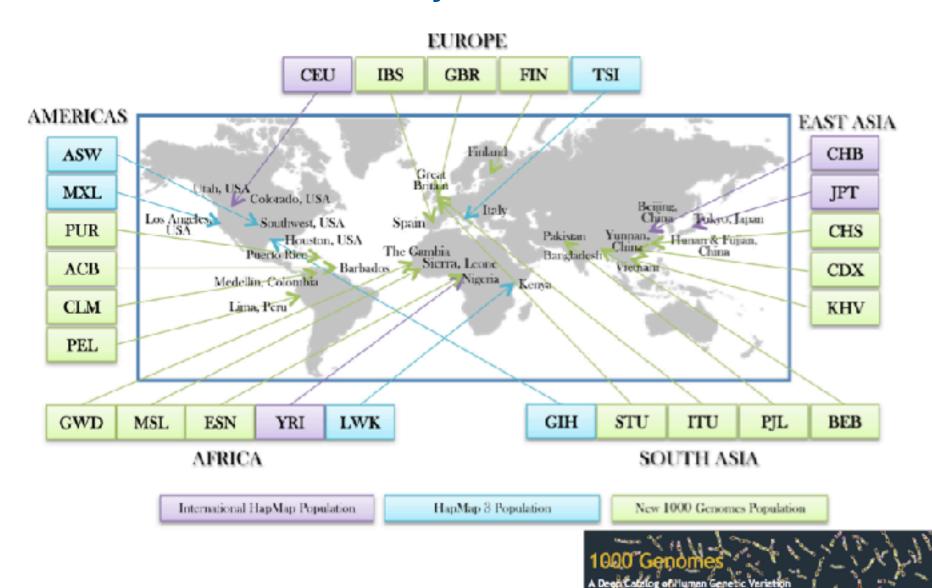
# The International HapMap Project

1,184 individuals from 11 populations



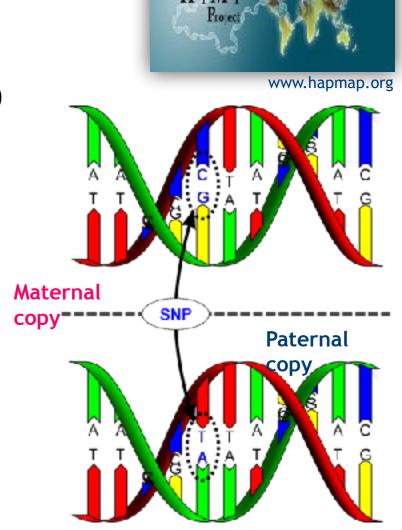
March 7, 2019 | 10

# **The 1000 Genomes Project**



# Single-Nucleotide Polymorphism

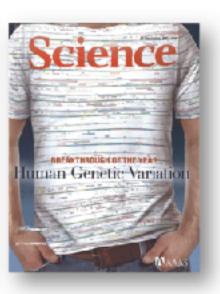
- "one base pair variation"
  - > 1% general population (common)
  - ≈10 million SNPs (≈0.25% genome)
  - Makes you and me unique
  - Most common type of genetic variation



International

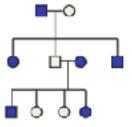






Linkage analysis Candidate gene studies

**GWAS** 









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# Common variant, common disease hypothesis

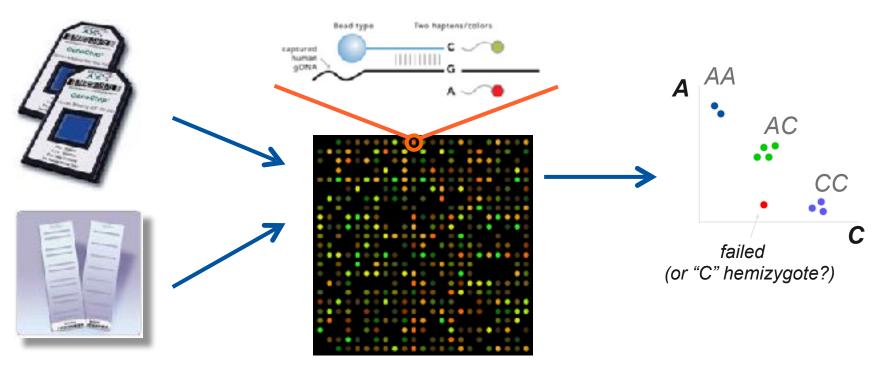
- Most common diseases happen later in life
- If common variants are not selected against, they may associate to late-onset (after reproduction) disease
- Common variants are easier to find and characterize

# The beginnings of GWAS

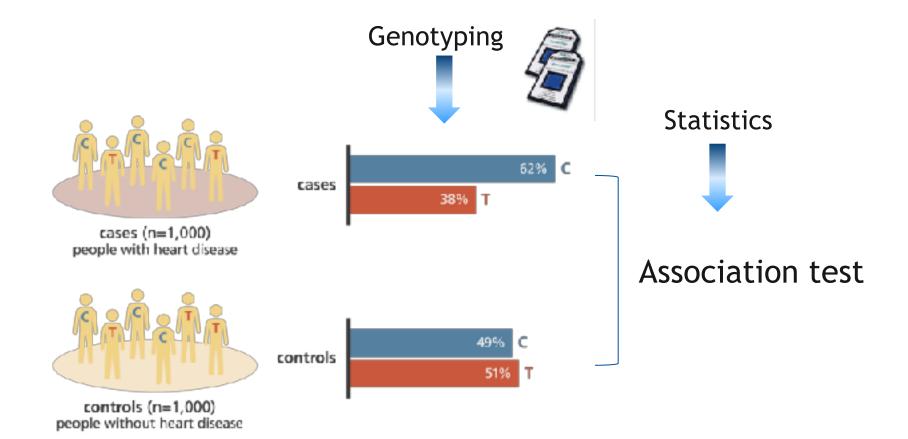


# **Genotyping platforms**

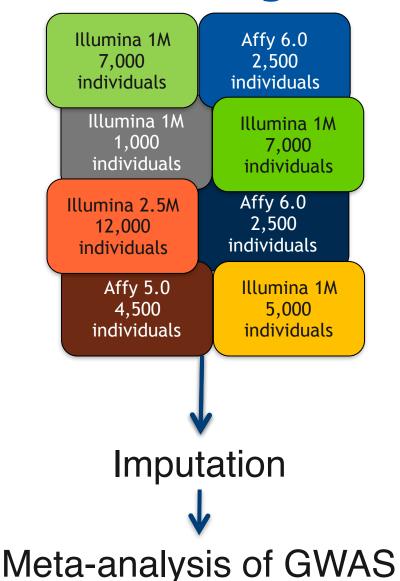
- Genome-wide SNP microarrays allow measurement of genotypes of 100,000's of SNPs in a single experiment
- Variety of microarrays (different SNP density, cost, etc)
   by Illumina and Affymetrix



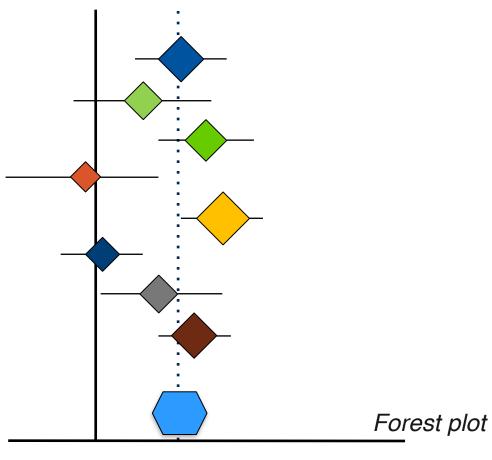
# GWAS (the big picture)



# **Combining GWAS datasets**



#### **Results for one SNP**

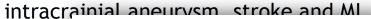


1.0 1.12

Odds ratio =  $ln(\beta)$ 

# deCODE Genetics, Inc.

- >50% adult population of Iceland (>140,000) in biobank (blood)
- Pedigree information going back to the first settlements (≈1000 years ago)
- Extensive medical records & genotypic data
- Over 250 high-impact publications (Nature, Science,
- 50 common diseases
  - Stroke (=CVA) association with ALOX5AP
  - MI association with ALOX5AP
  - Association of a variant on 9p21.1 with Abdominal aortic aneurysm (AAA),



The gene encoding 5-lipoxygenase activating protein confers risk of myocardial infarction and stroke

Anna Heigadovar<sup>1</sup>, Andrei Missolesca<sup>1</sup>, Gudmar Thoriefisos<sup>1</sup>, Solvig Gestandovar<sup>1</sup>, Heiga Jonadovar<sup>1</sup>, Umar Thorsteinodovar<sup>1</sup>, Silvah I Saman I<sup>1</sup>, Gudmandur Gudmandssen<sup>1</sup>, Strum I<sup>1</sup> A Gasm<sup>1</sup>, Gudmandur I horganisos<sup>2</sup>, Signifug Svishjornadovar<sup>1</sup>, Kinar N Valdmanssen<sup>2</sup>, Stein E Mathusson<sup>2</sup>, Halilor Johanneson<sup>3</sup>, Chief Gudmandotarr<sup>1</sup>, Mark E Gumar<sup>1</sup>, Jesus Silva<sup>3</sup>, Margor Thorial Schott<sup>3</sup>, Vargor Andredoviti<sup>3</sup>, Michael L Frigge<sup>3</sup>, Inis (Topol<sup>4</sup>, Augustine Song , Vilhundur Gudmson<sup>3</sup>, Halion Halionarsen<sup>3</sup>, Jetry E Guidher<sup>3</sup> & Kail Schusson<sup>3</sup>

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Helgadottir, A., et al. Nature Genetics; volume 36, 233; 2004



#### A Common Variant on Chromosome 9p21 Affects the Risk of Myocardial Infarction

Anno Helgadotti, <sup>1</sup>a Gudman Thorkelfason, <sup>1</sup>a Andrei Munelesco, <sup>1</sup>a Solveig Gretarsdettir, <sup>1</sup>
Thorarian Blombit, <sup>1</sup> Aslawy jonacdettir, <sup>1</sup> Adelbjorg jonacdettir, <sup>1</sup> Angel: Sigurdoson, <sup>1</sup>
Adam Bases, <sup>1</sup> Annar Palson, <sup>1</sup> Gisti Masson, <sup>2</sup> Guntei F. Gedirjamsson, <sup>1</sup> Artstian P. Magnesson, <sup>1</sup>
Kuri Andersen, <sup>2</sup> Alian I. Levey, <sup>3</sup> Valgerdur M. Backman, <sup>3</sup> Sigurdoso Blatth Issocitir, <sup>3</sup>
Thorbjorg Jorodottir, <sup>3</sup> Stellas Palsoan, <sup>3</sup> Heigu Binundettir, <sup>3</sup> Sprinson Casmundettir, <sup>3</sup>
Amalder Gylfisson, <sup>3</sup> Viola Vaccarine, <sup>3</sup> M. Craig Booper, <sup>3</sup> Moradoch P. Bellip, <sup>4</sup>
Christopher B. Granger, <sup>3</sup> Forland Austin, <sup>3</sup> Savici J. Rader, <sup>3</sup> Sveti H. Shab, <sup>5</sup> Arshed A. Quyyumi, <sup>3</sup>
Jeffrey R. Guicher, <sup>3</sup> Gudmandur Thorpeinson, <sup>3</sup> Umar Thersteinsdottir, <sup>3</sup>
Angustine Rong, <sup>5</sup> † Karl Shefansson, <sup>5</sup>

Helgadottir, A., et al. Science volume 316, 1491; 2007

### Wellcome Trust Case-Control Consortium

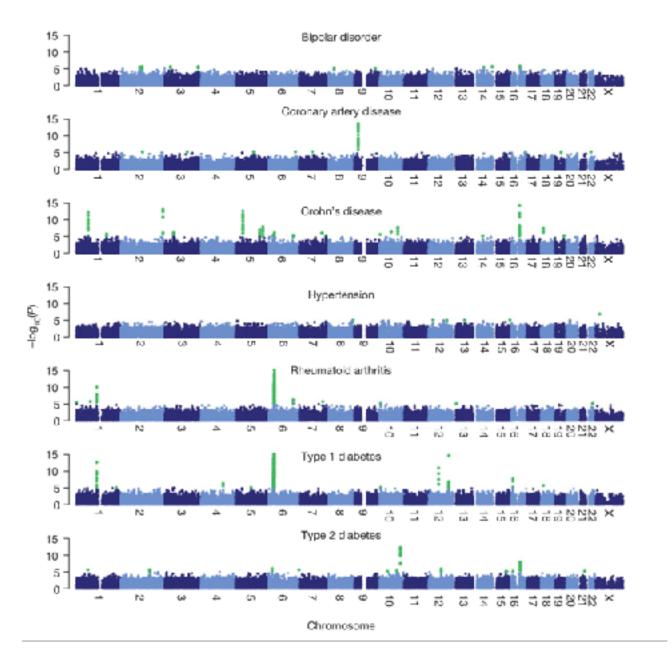
- 1,500 1958 Birth Cohort Controls (58BC)
- 1,500 UK Blood Services Controls (UKBS)
- 14,000 cases of seven common diseases
  - Bipolar disorder
  - Coronary artery disease
  - Crohn's disease
  - Hypertension
  - Rheumatoid arthritis
  - Type 1 diabetes
  - Type 2 diabetes

Vol 447|7 June 2007 |dot:10.1038/mature05911 matture:

ARTICLES

Genome-wide association study of 14,000 cases of seven common diseases and 3,000 shared controls

The Wellcome Trust Case Control Consortium\*



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# One famous example

- deCODE Genetics was the first to discover a SNP associated with myocardial infarction (MI) in 2007
- WTCCC, McPherson, and Samani were able to replicate the same finding in the same year, and many have reconfirmed it in different populations



#### A Common Variant on Chromosome 9p21 Affects the Risk of Myocardial Infarction

Anna Belgadottir, <sup>3a</sup> Gudman Tho-Seifeson, <sup>3a</sup> Andrei Manelesco, <sup>3a</sup> Solveig Gretaridettir, <sup>1</sup>
Thorarian Blondel, <sup>5</sup> Asleng Jonardettir, <sup>5</sup> Adelbjurg Jonardettir, <sup>5</sup> Asgel: Sigurideon, <sup>5</sup>
Adam Bases, <sup>5</sup> Amar Falsson, <sup>5</sup> Gisti Masson, <sup>5</sup> Quintet F. Gedhjamsson, <sup>5</sup> Kirti Anderson, <sup>5</sup> Atlan I. Levey, <sup>5</sup> Valgerdar M. Backman, <sup>5</sup> Sigurborg Batthassottir, <sup>5</sup>
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Amalder Gyffisson, <sup>5</sup> Viola Vaccarins, <sup>5</sup> M. Craig Hooper, <sup>5</sup> Moradoch F. Beilly, <sup>6</sup>
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Jeffry R. Gulcher, <sup>5</sup> Gusmandar Thorpeinson, <sup>5</sup> Umar Thorteinsdottir, <sup>5</sup>
Angostine Nong, <sup>5</sup> Kari Stefansson, <sup>5</sup>



ESTABLISHED IN 1812

AUGUST 2, 2007

VOL. 357 NO. 5

Genomewide Association Analysis of Coronary Artery Disease

THE ASSESSMENT STREET, WITHOUT THE PARTY OF THE PARTY OF

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# A Common Allele on Chromosome 9 Associated with Coronary Heart Disease

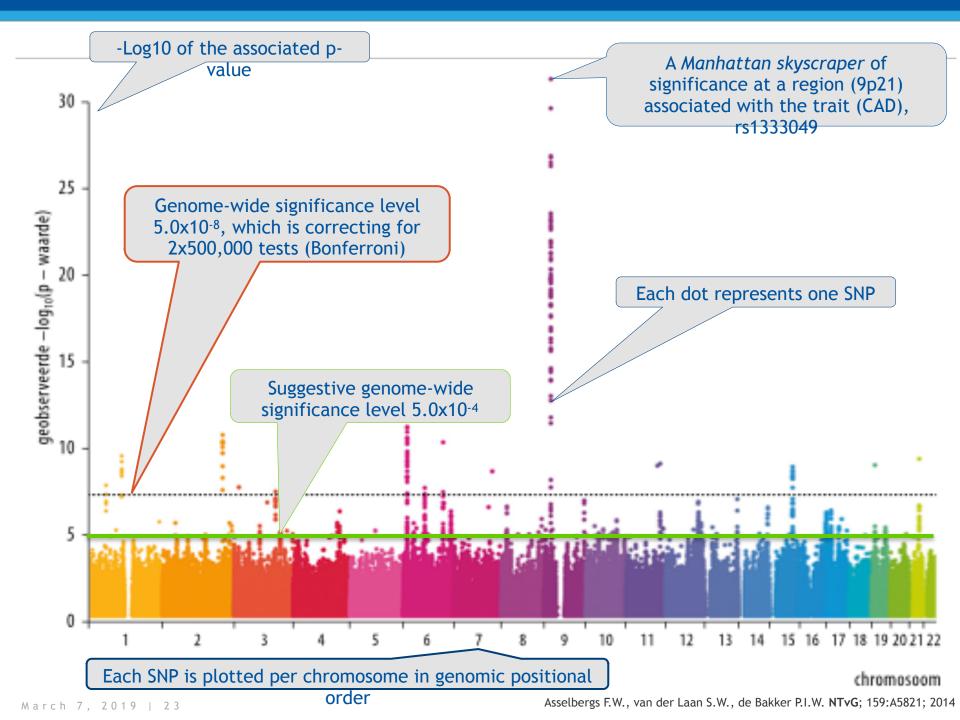
Ruth McPherson, <sup>3</sup>\*† Alexander Pertsemtidis, <sup>2</sup>\* Nihan Kavaslar, <sup>1</sup> Alexandre Stewart, <sup>3</sup> Robert Roberts, <sup>1</sup> David R. Cox, <sup>2</sup> David A. Hinds, <sup>3</sup> Len A. Pernacchio, <sup>4,5</sup> Anne Tybjaerg-Hansen, <sup>6</sup> Aaron R. Folsom, <sup>7</sup> Eric Boerwinkle, <sup>8</sup> Helen H. Hobbs, <sup>2,5</sup> Jonathan C. Cohen<sup>2,80</sup>†

ARTICLES

Genome-wide association study of 14,000 cases of seven common diseases and 3,000 shared controls

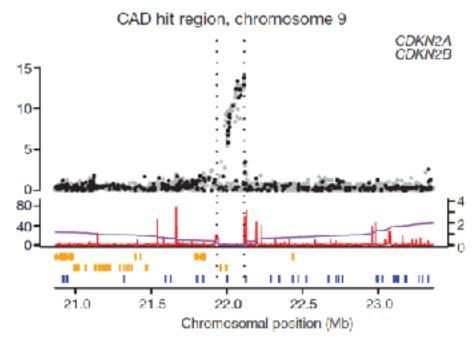
The Wellcome Trust Case Control Consortium\*

Helgadottir, A., et al. Science; 316(5830):1491-1493, 2007 McPherson, R., et al. Science; 316(5830):1488-1491, 2007 Wellcome Trust Case Control Consortium. Nature; 447(7145):661-678, 2007 Samani, N.J., et al., N. Engl. J. Med; 357(5):443-453, 2007



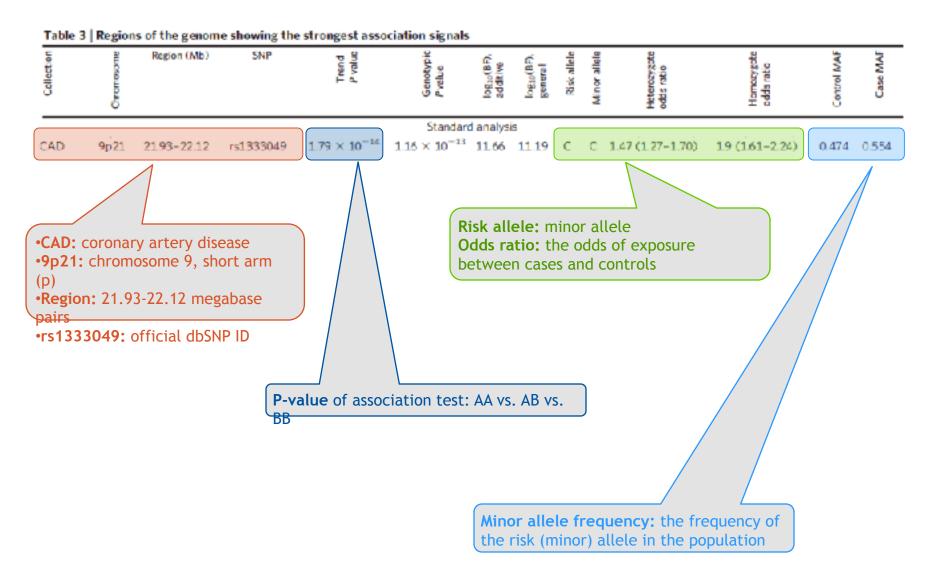
# 9p21 and cardiovascular disease

- The SNPs associated with CAD on 9p21.1 are rs1333049, rs10757274, rs2383207, rs2891168, and rs10757278
- They are found in an intergenic region
- Genes nearby: CDKN2A, CDKN2B
  - also associated with type 2 diabetes mellitus
  - regulating cell proliferation, cell aging and the associated degeneration, and programmed cell death of many cell types



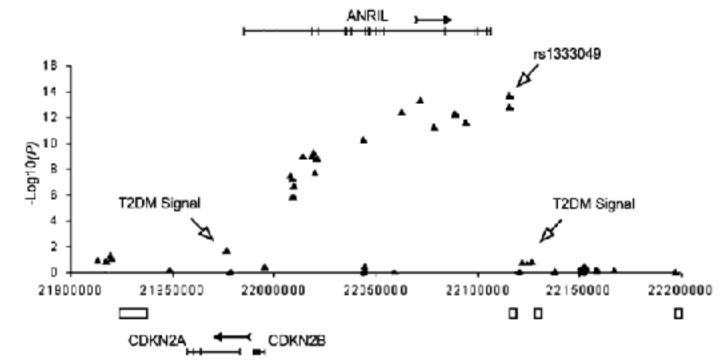
Wellcome Trust Case Control Consortium. Nature; 447(7145):661-678, 2007

## A closer look at the results...



# 9p21 points to a RNA gene

- Resequencing unveiled a RNA gene, ANRIL
- Current efforts are aimed to elucidate the role of ANRIL in (A)MI
- Might be involved in early-onset MI (before age of 50 years)



# CARDIoGRAMplusC4D Study

- Coronary Artery Disease Genome-Wide Replication And Meta-Analysis Study: **CARDIOGRAM**
- > 63,000 cases and > 130,000 controls
  - Myocardial infarction (MI), coronary artery disease (CAD) or both
  - CAD: MI, CABG, PTCA, AP
  - Age limit: 45-66
- Sample size greatly influences power and effect size to discover new variants
- CARDIoGRAMplusC4D sought to solves this issue
- 55 susceptibility loci for CAD were discovered

#### Large-scale association analysis identifies new risk loci for coronary artery disease.

The CARDINGRAMplusCID Gensoritum<sup>a</sup>

Constany artery disease (CAB) is the commoney: cause of diguth. Here, we report an association analysis invits,745 CAD cases and 130,661 controls identifying 15 loci searthing persons-wide significance, taking the number of susceptibility loci for CAB to 44, and a further 164 independent variants in < 3.2 strongly associated with CA3 at a 5% false discovery rate #DE. Together, these variants explain approximately 10.6% of CAD horizability. Of the 46 genome-wide significant lead 50 to 12 show a significant association with a light inch, and I show a significant association with blood pressure, but none is significantly associated with diabetes. Network analysis with 201 cardidate genes (lock at 10% FOR) percented Sinteraction networks comprising EVS, of these patience general mended or CAE. The four most agentican' pathways mapping to these networks are lined to initimetaboism and inflammation, undersooning the causal role of these activities in the genetic misley of CAD Our shally provides insights into the genetic basis of CAD and identifies her biological pathways.

Commany othery discrete studies mean complication, represents in their. Auto-analysis (CARDIN & AAA) Commercians, which involves (CARDIN & AAA) Commercians, which involves (CARDIN & AAA) (Commercians), which involves (CARDIN & AAA) (Commercians), which is received (CARDIN & AAA) (Commercians), which is received (CARDIN & AAA) (Commercians). tion, is the leading cause of death worldwide. Although, epidemiological studies have alcatified many risk factors for GAD, including plants lipid emountations, blood passers, amoking, diabetes and markers of inflammation, a causal role has been proven only for sent (for example, low-fensity Epoprotein (LPL) cholement and blood recessor's reimen's through mademized dinicultrials of drag though directed at the risk factor? Evin and family studies have documented that assignfroat provotors oft-orthood suscendents. te CND in his table (for a neriew, sweref, 2), however generityen are nor continueded by continuemental exposures, generic conducts has the potential tradefine which risk factors are indeed crossdand to identify pathways and therapout it rargets<sup>1-4</sup>. Yo date, growner-wisin association. stalle: (CVAS) has refer tively reported a total of H. Issi, associand with CAD risk at grasses with significance  $(F \times S \times 10^{-6})^{3-6}$ . however, variants at throulous explain leastfran 19% of the bentability of GAD. One litally reason for shadowing given the polygrain nature of complex traits and the relatively small observed affect sizes of the lack identified, more generally issuedated variants du not reach the stringest it value threshold for princip whole significance, Indeed, there is increasing a falous a that the gene is an interstant who ensures traits involves a large number of crossitive alleles with very small effected, addressing this self-require the fiscourry of additional lack while leveraging large-scale general; data to identify the melocalar pathwops undulying the pathogenesis of CAD. Such discovery is facilitated by building molecular networks, on the basis of BG's, RSA and proble meractions, which have no on with over biological function that the slow evidence of association with title variancelle CAD and related matabalic trait

In the largest CM/RS materialsysts of CaD involvetables to date.

cases and 64,752 commits, madelmento loci regioneda: generae-wide significance, a lickage disoquilibrium (UE)-graned set of 6211 varinets achieved a nominal procedules F value of line than 3.01. Here we test these 6.222 95 Phins a meta-analysis obover 190,000 individuals. with the primary aim whiten thying additional succeptibility loci for GAE: To this end, we used the Metabookip array ", which is a ressure ISBLECT chip (Illumina) custaining 196725 SVDs, designed to or idless an relative associations in several cardiomerabolic trans. including CAE, and 60 flor may confirmed but for time intin-All BiPs on the amoy with care in the CARCS+CRAM study warconsidered for analysis (78.1 385NPs, of which 6.221 were the replication SNPs and DLA76 were fine-mapping SNPs in the 22 CaD inscytibility for identified at the time etwhich the army was beigned. the assumining SSBs were submitted by the other consortia contributing to the Metabackip array. 5. In addition, we assess whether the genome wisierignifican C/D riskalides so: brough enditional risk Severally considering the available large CNAS for these trans (4.18 Finally, we identify abroader set of SADs passing a conservation EEG threshold for association with CAD and use this set to undertake network analysis to find her budge, all pathways underlying the pethogenois of CAD.

#### Study durkers

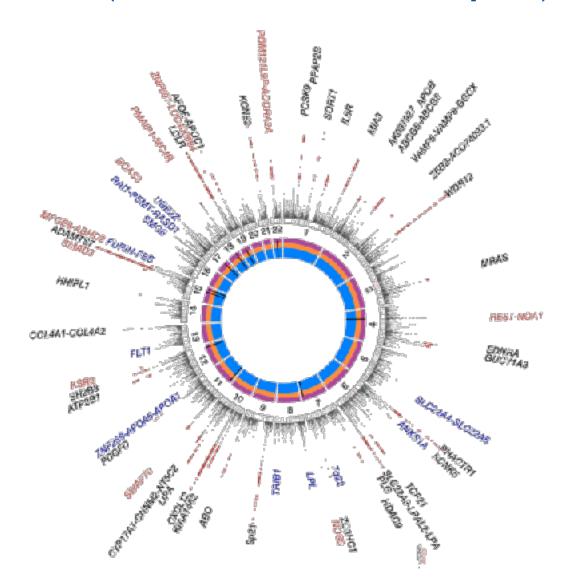
Westpaniel heCARNicGRAN chowery fats on \$23.50 case and 64.7k2controof.stage1) with 34additional CAD sample collections Orage Dis/Durspean or weak /sian descens comprising 48.313 cases and 65.985 controls (study descriptions and sample characteristics as given in Supplementary Tables In and 24, respectively) and under by the Cartagry Micry (North Sentembered) registration and those a Setap methodolymetric and North or the Metabachapturing

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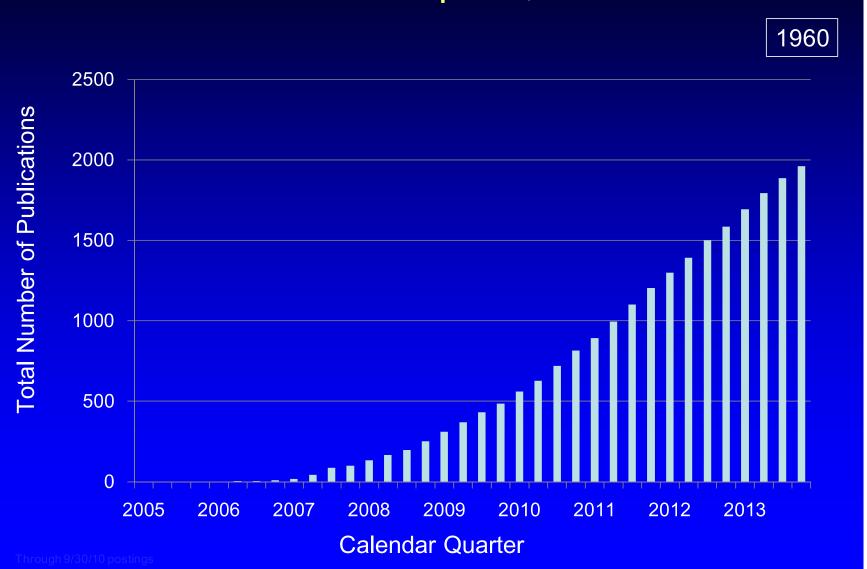
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# And 8 years later (>15 times more samples)

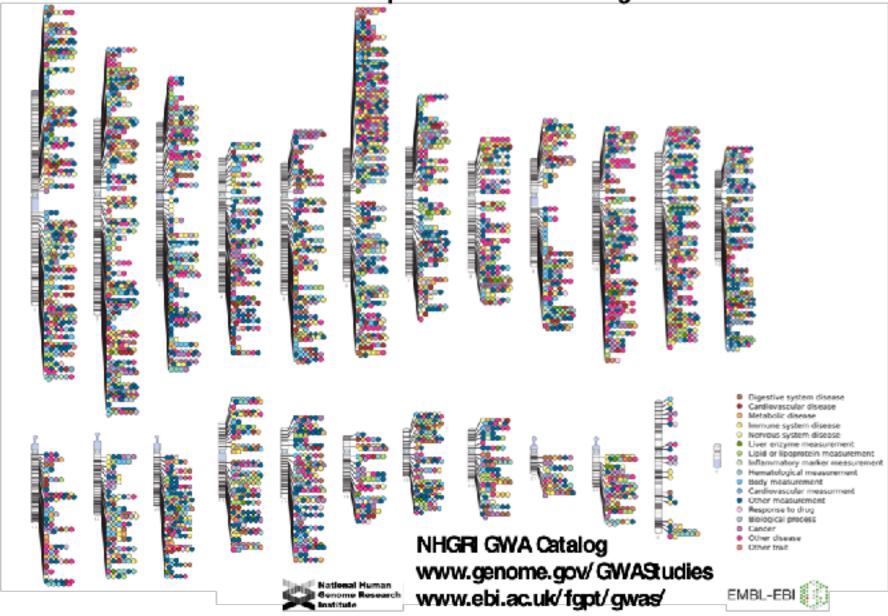


9p21 plus an additional 47 loci (!)

# Published GWA Reports, 2005 – 2013



Published Genome-Wide Associations through 12/2013 Published GWA at p≤5X10<sup>-8</sup> for 17 trait categories



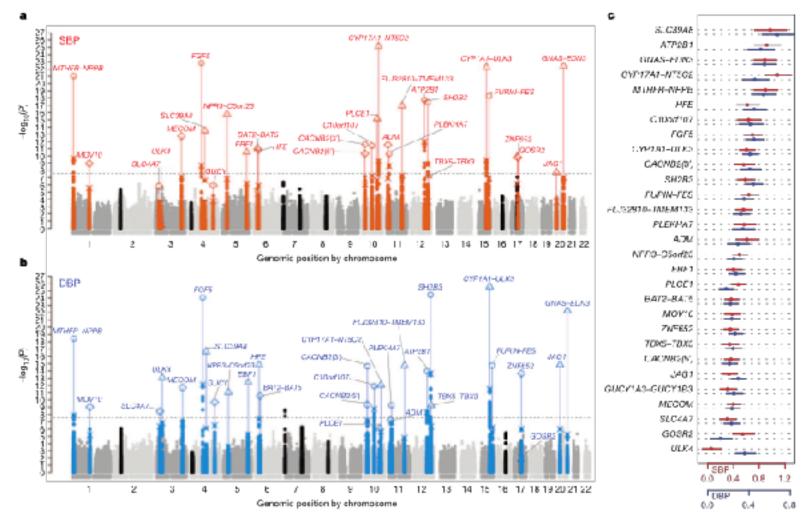
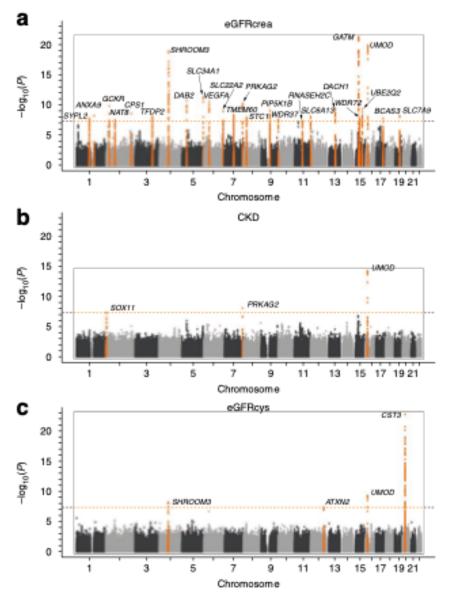


Figure 1 Genome-wide  $-\log_{10} P$ -value plots and effects for significant loci, a, b, Genome-wide  $-\log_{10} P$ -value plots are shown for SBP (a) and DBP (b). SNPs within loci reaching genome-wide significance are labelled in red for SBP and blue for DBF ( $\pm 2.5$  Mb of lowest P value) and lowest P values in the initial genome-wide analysis as well as the results of analysis including validation data are labelled separately. The lowest P values in the initial GWAS are denoted with a X. The range of different sample sizes in the final meta-

analysis including the validation data are indicated as: circle (96,000–140,000), triangle (>140,000–180,000) and diamond (>180,000–220,000). SNPs near unconfirmed loct are in black. The horizontal dotted line is  $F=2.5\times10^{-8}$ . GUCY denotes GUCYIA3 GUCYIB3. c, Effect size estimates and 95% confidence bars per blood-pressure-increasing affels of the 29 significant variants for SBP (red) and DBF (blue). Effect sizes are expressed in mm Hg per allele.



**Figure 1** Genome-wide  $-\log_{10} P$  value plot from stage 1. (**a-c**) Plots show discovery analysis of eGFRcrea (**a**), CKD (**b**) and eGFRcys (**c**). The dotted line indicates the genome-wide significance threshold at  $P = 5 \times 10^{-8}$ .

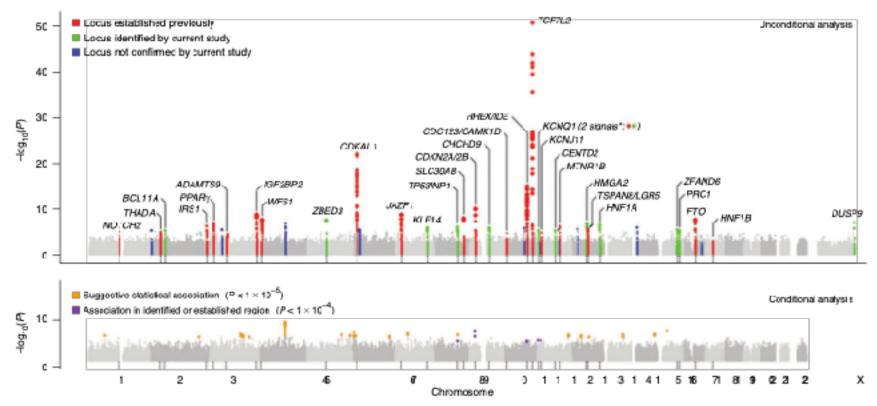
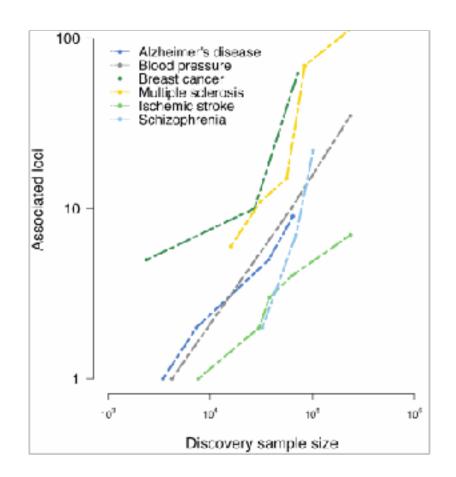
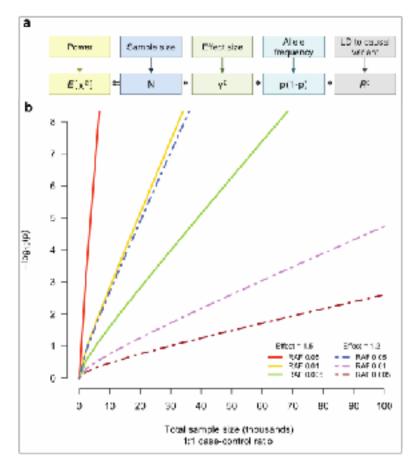
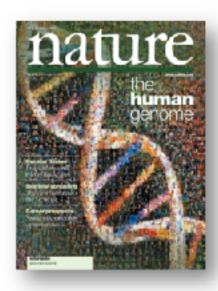


Figure 1. Genome-wide Manhattan plots for the DIAGRAM+ stage 1 meta-analysis. Top panel summarizes the results of the unconditional meta-analysis. Previously established loci are denoted in red and loci identified by the current study are denoted in green. The ten signals in blue are those taken forward but not confirmed in stage 2 analyses. The genes used to name signals have been chosen on the basis of proximity to the index SNP and should not be presumed to indicate causality. The lower panel summarizes the results of equivalent meta-analysis after conditioning on 30 previously established and newly identified autosomal T2D-associated SNPs (denoted by the dotted lines below these loci in the upper panel). Newly discovered conditional signals (outside established loci) are denoted with an orange dot if they show suggestive levels of significance (P < 10<sup>-5</sup>), whereas secondary signals close to already confirmed T2D loci are shown in purple (P < 10<sup>-4</sup>).

# Power, Effect size, Sample size...









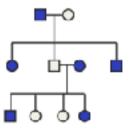




Linkage analysis Candidate gene studies

**GWAS** 

Sequencing







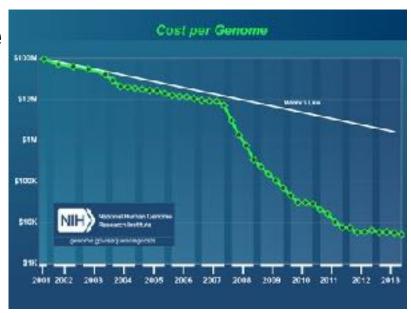


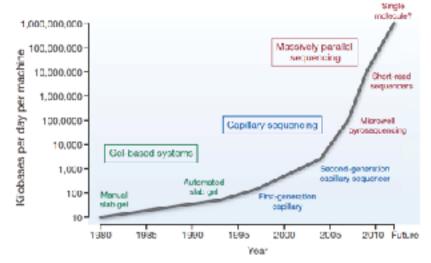


# **Next-generation sequencing**

Milestone: \$1000 dollar genome (2014, Illumina HiSeq X Ten Sequencer)

But how much money needs to be spend on annotation and (even more important) interpretation of the results?





March 7, 2019 | 36 Stratton et al. Nature 2009

# Summary: what's been (being) done?

- Family-based linkage studies
  - Rare, Mendelian traits
- Candidate gene association studies
  - Many claims, few robust findings
  - Terrible track record in terms of reproducibility
- Genome-wide association studies (GWAS)
  - Complex traits and common diseases
- Whole-exome sequencing studies
  - Rare, Mendelian diseases (unsolved cases)
  - Complex traits and common diseases
- Whole-genome sequencing studies