

# Personalized Cardiovascular Medicine and Genomics

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Associate Professor of Medicine

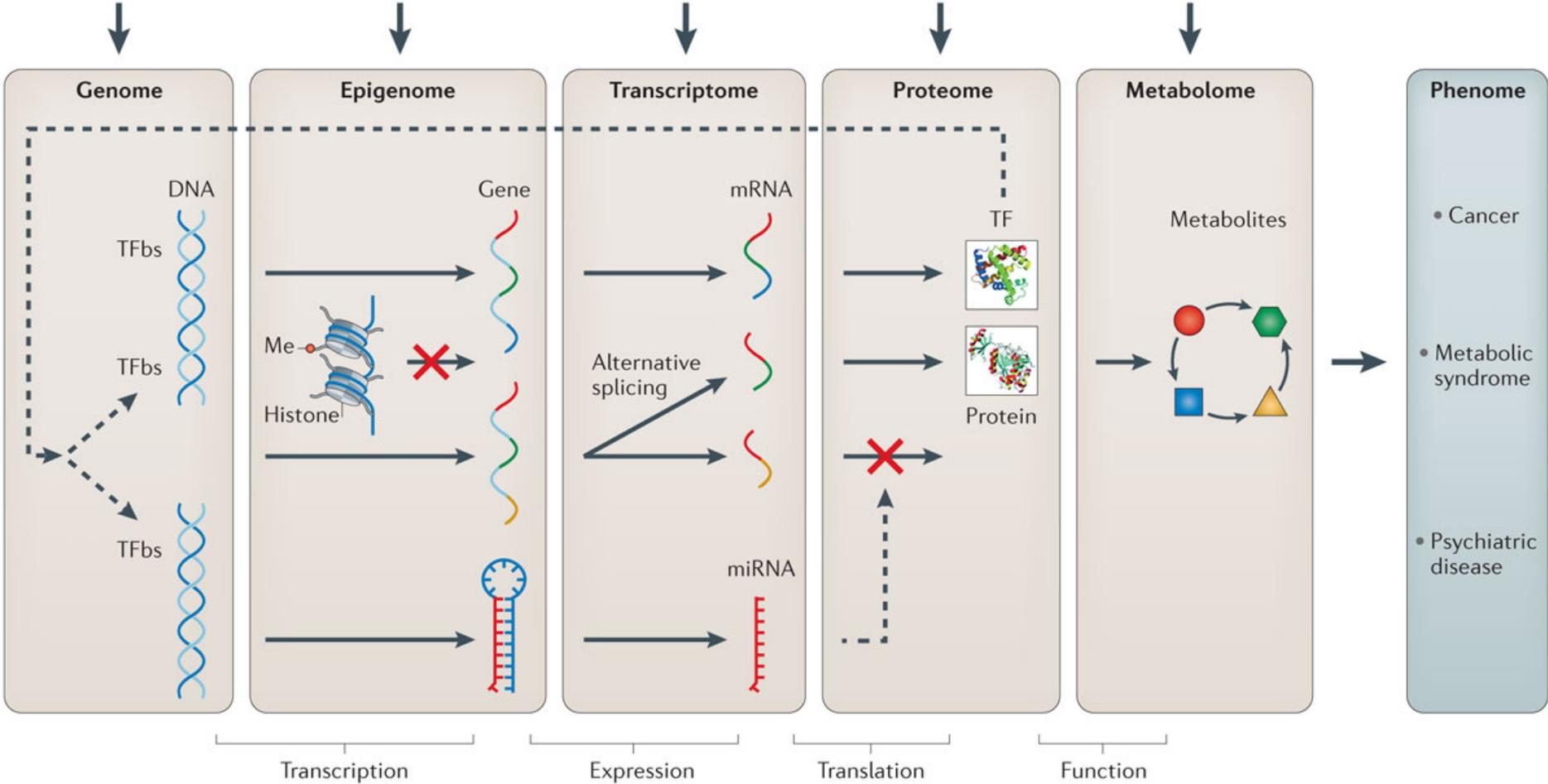
Medical Director, Preventive Cardiology and Cardiac Rehab

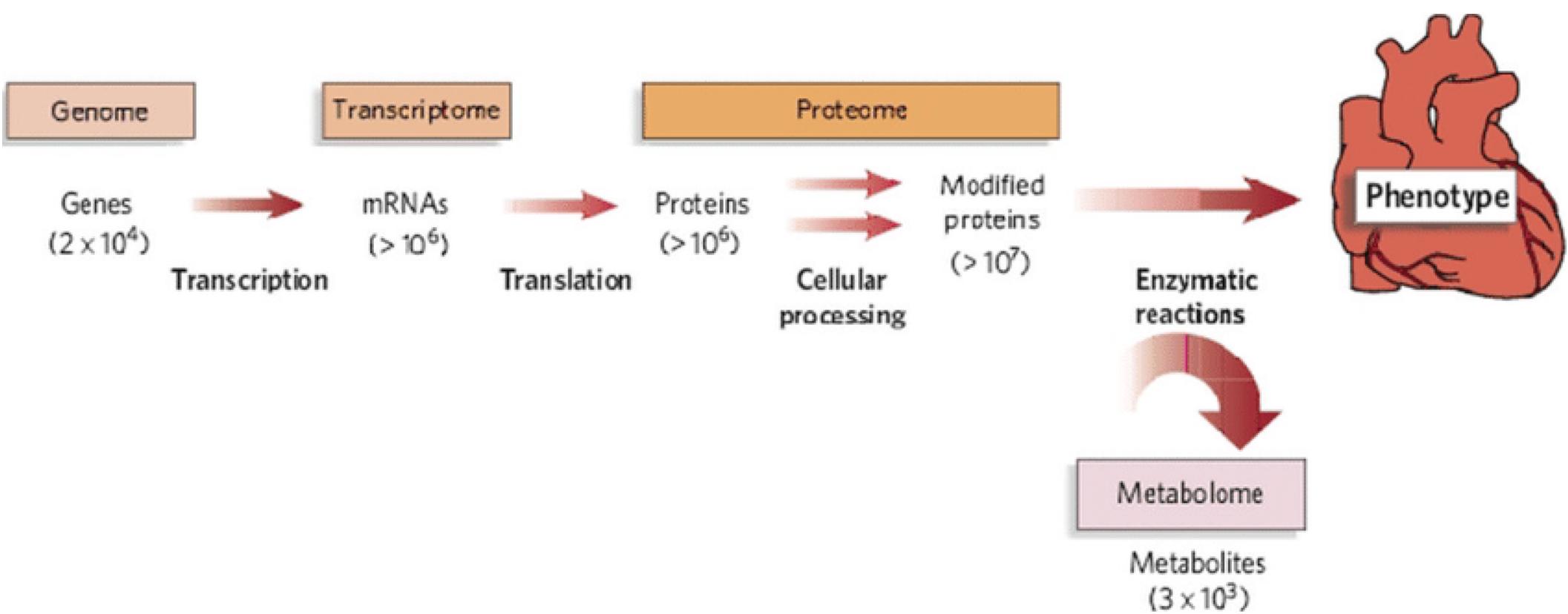
Executive Director, Susan Samueli Integrative Health Institute

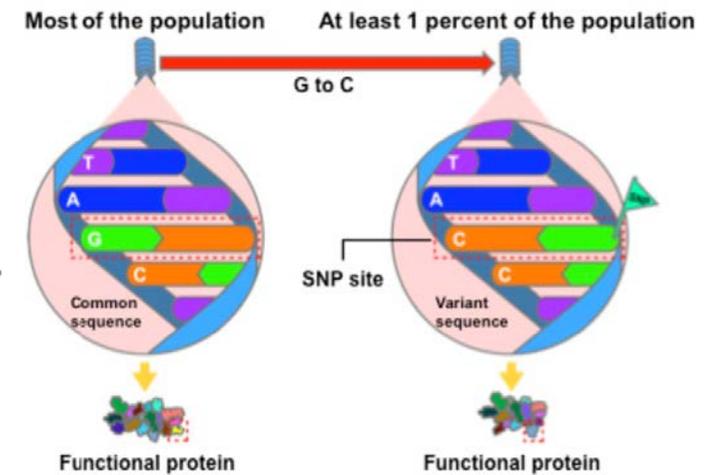
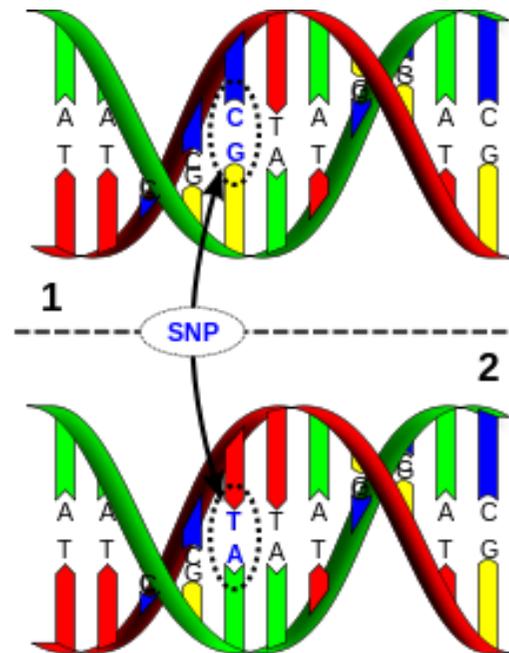
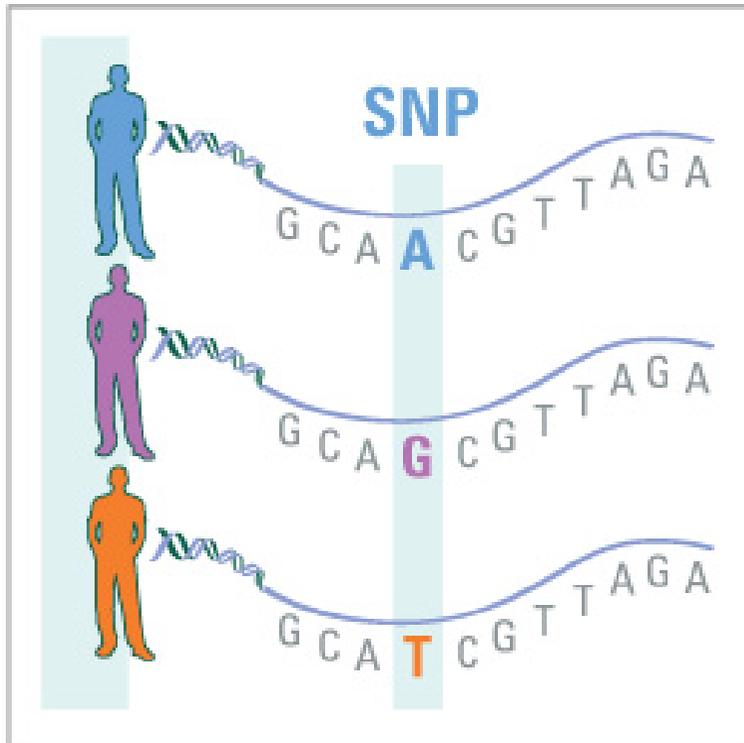
# Disclosures

- None
- Grant Funding
  - NIH/NHLBI R01HL128801
  - NIH/NCCIH R01AT009247
  - NIH/NHLBI R01HL072125

- SNP
  - CNV
  - LOH
  - Genomic rearrangement
  - Rare variant
- DNA methylation
  - Histone modification
  - Chromatin accessibility
  - TF binding
  - miRNA
- Gene expression
  - Alternative splicing
  - Long non-coding RNA
  - Small RNA
- Protein expression
  - Post-translational modification
  - Cytokine array
- Metabolite profiling in serum, plasma, urine, CSF, etc.







A SNP is a single-letter change in DNA, part of the natural genetic variation (at least 1%) within a population. Human genome has 3 billion nucleotides. 500,000 SNPs provide, on average, a marker every 6,000 nucleotides.

Image courtesy of Lauren Solomon, the Broad Institute

# Genome Wide Association Studies (GWAS): SNPs common and occurring on average in 50% of the population.

Chromosomal Location	SNP	Nearby Genes	Risk Allele Frequency (allele)	Odds Ratio	Delivery Route
<b>Risk Variant Associated with LDL Cholesterol</b>					
6q25.3	rs3798220	LPA	0.02 (C)	1.92 (1.48-2.49)	2009
2p24.1	rs515135	APOB	0.83 (G)	1.03	2012
1p13.3	rs599839	SORT1	0.78 (A)	1.29 (1.18-1.40)	2007
19p13.2	rs1122608	LDLR	0.77 (G)	1.14 (1.09-1.19)	2009
19q13.32	rs2075650	APOE	0.14 (G)	1.14 (1.09-1.19)	2011
2p21	rs6544713	ABCG5-ABCG8	0.29 (G)	1.07 (1.04-1.11)	2011
1p32.3	rs11206510	PCSK9	0.82 (T)	1.15 (1.10-1.21)	2009
<b>Risk Variant Associated with HDL Cholesterol</b>					
6p21.31	rs12205331	ANKS1A	0.81 (C)	1.04	2012
<b>Risk Variant Associated with Triglycerides</b>					
8q24.13	rs10808546	TRIB1	0.65 (A)	1.08 (1.04-1.12)	2011
11q23.3	rs964184	ZNF259, APOA5-A4-C3-A1	0.13 (G)	1.13 (1.10-1.16)	2011
<b>Risk Variant Associated with Hypertension</b>					
12q24.12	rs3184504	SH2B3	0.44 (T)	1.13 (1.08-1.18)	2009
10q24.32	rs12413409	CYP17A1, CNM2, NT5C2	0.89 (G)	1.12 (1.08-1.16)	2011
4q31.1	rs7692387	GUCYA3	0.81 (G)	1.13	2012
15q26.1	rs17514846	FURIN-FES	0.44 (A)	1.04	2012

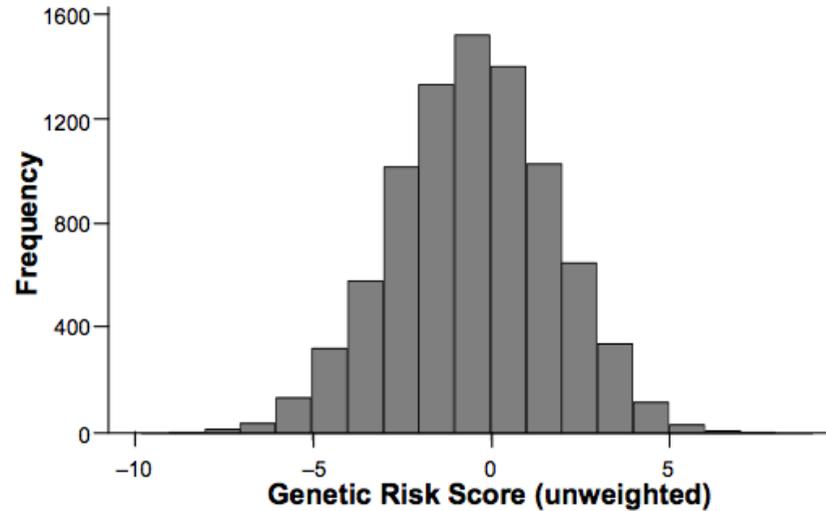
# Genome Wide Association Studies (GWAS): SNPs and CVD risk factor associations

Most SNPs do not code for protein. this means the risk variant mediates its increased risk for CVD directly or indirectly through regulation of DNA sequences that do code for proteins

Chromosomal Location	SNP	Nearby Genes	Risk Allele Frequency (allele)	Odds Ratio	Delivery Route
<b>Risk Variant Associated with Myocardial Infarction</b>					
9q34.2‡	rs579459	ABO	0.21 (C)	1.10 (1.07-1.13)	2011
<b>Risk Variant Mechanism of Risk Unknown</b>					
9p21.3	rs4977574	CDKN2A,CDKN2B	0.46 (G)	1.25 (1.18-1.31) to 1.37 (1.26-1.48)	2007
1q41	rs17465637	MIA3	0.74 (C)	1.20 (1.12-1.30)	2007
10q11.21	rs1746048	CXCL12	0.87 (C)	1.33 (1.20-1.48)	2007
2q33.1	rs6725887	WDR12	0.15 (C)	1.16 (1.10-1.22)	2009
6p24.1	rs12526453	PHACTR1	0.67 (C)	1.13 (1.09-1.17)	2009
21q22.11	rs9982601	MRPS6	0.15 (T)	1.19 (1.13-1.27)	2009
3q22.3	rs2306374	MRAS	0.18 (C)	1.15 (1.11-1.19)	2009
10p11.23	rs2505083	KIAA1462	0.42 (C)	1.07 (1.04-1.09)	2010
1p32.2	rs17114036	PPAP2B	0.91 (A)	1.17 (1.13-1.22)	2011
5q31.1	rs2706399	IL5	0.48 (A)	1.02 (1.01-1.03)	2011
6q23.2	rs12190287	TCF21	0.62 (C)	1.08 (1.06-1.10)	2011
7q22.3	rs10953541	BCAP29	0.75 (C)	1.08 (1.05-1.11)	2011
7q32.2	rs11556924	ZC3HC1	0.62 (C)	1.09 (1.07-1.12)	2011
10q23.31	rs1412444	LIPA	0.34 (T)	1.09 (1.07-1.12)	2011
11q22.3	rs974819	PDGF	0.29 (T)	1.07 (1.04-1.09)	2011
13q34	rs4773144	COL4A1, COL4A2	0.44 (G)	1.07 (1.05-1.09)	2011
14q32.2	rs2895811	HHIPL1	0.43 (C)	1.07 (1.05-1.10)	2011
15q25.1	rs3825807	ADAMTS7	0.57 (A)	1.08 (1.06-1.10)	2011
17p13.3	rs216172	SMG6, SRR	0.37 (C)	1.07 (1.05-1.09)	2011
17p11.2	rs12936587	RASD1, SMCR3, PEMT	0.56 (G)	1.07 (1.05-1.09)	2011
17q21.32	rs46522	UBE2Z, GIP, ATP5G1, SNF8	0.53 (T)	1.06 (1.04-1.08)	2011
5p13.3*	rs11748327	IRX1, ADAMTS16	0.76 (C)	1.25 [1.18-1.33]	2011
6p22.1*	rs6929846	BTN2A1	0.06 (T)	1.51 (1.28-1.77)	2011
6p24.1**	rs6903956	C6orf105	0.07 (A)	1.65 (1.44-1.90)	2011
6p21.3	rs3869109	HCG27 and HLA-C	0.60 (C)	1.15	2012
1q21	rs4845625	IL6R	0.47 (T)	1.09	2012

## A genetic risk score based on direct associations with coronary heart disease improves coronary heart disease risk prediction in the Atherosclerosis Risk in Communities (ARIC), but not in the Rotterdam and Framingham Offspring, Studies

Ariel Brautbar<sup>a,b,c,d,\*</sup>, Lisa A. Pompeii<sup>e</sup>, Abbas Dehghan<sup>f,g</sup>, Julius S. Ngwa<sup>h</sup>, Vijay Nambi<sup>b,d,i</sup>, Fernando Rivadeneira<sup>g,j</sup>, André G. Uitterlinden<sup>g,j</sup>, Albert Hofman<sup>f,g</sup>, J. Witteman<sup>f,g</sup>, Michael J. Pencina<sup>h</sup>, Aaron R. Folsom<sup>k</sup>, L. Adrienne Cupples<sup>h,l</sup>, Illantvne<sup>b,d</sup>, Eric Boerwinkle<sup>e,m,n</sup>



Hazards ratios (HR) per unit score increase as calculated for the unweighted and weighted genetic risk score (GRS) in the ARIC, Rotterdam, and Framingham Offspring Studies.

	Study	HR	Lower CI	Upper CI
Unweighted GRS	ARIC	1.10	1.07	1.13
	Rotterdam	1.08	1.03	1.14
	Framingham	1.12	1.10	1.14
Weighted GRS	ARIC	2.30	1.87	2.83
	Rotterdam	2.05	1.50	2.70
	Framingham	1.12	1.10	1.15

HRs were adjusted for age, sex, smoking, diabetes, systolic blood pressure, antihypertensive medication use, total cholesterol, and high-density lipoprotein cholesterol (HDL-C). In the Rotterdam Study, HRs were calculated for participants younger than 65 years. CI indicates 95% confidence interval.

Weights are generally assigned to each genetic variant according to the strength of their association with disease risk (effect estimate). Individuals are scored based on how many risk alleles they have for each variant (for example, zero, one, or two copies) included in the polygenic score

SNP	Gene Region Name or Locus	HR in ARIC [95% CI]	Published Risk Estimates
rs9818870	<i>MRAS</i>	1.062 [0.949, 1.190]	OR 1.15 [1.11–1.19]
rs2259816	<i>HNF1A</i>	1.019 [0.934, 1.113]	OR 1.08 [1.05–1.11]
rs9982601	<i>SLC5A3, MRPS6, KCNE2</i>	1.171 [1.044, 1.314]	OR 1.2 [1.14–1.27]
rs12526453	<i>PHACTR1</i>	1.141 [1.043, 1.250]	OR 1.12 [1.08–1.17]
rs1746048	<i>CXCL12</i>	1.229 [1.077, 1.401]	OR 1.17 [1.11–1.24]
rs6725887	<i>WDR12</i>	1.073 [0.950, 1.213]	OR 1.17 [1.11–1.23]
rs6922269	<i>MTHFD1L</i>	1.010 [0.920, 1.110]	OR 1.23 [1.15–1.33]
rs501120	<i>CXCL12</i>	1.214 [1.066, 1.383]	OR 1.33 [1.20–1.48]
rs3900940	<i>MYH15</i>	1.127 [1.032, 1.230]	HR 1.17 [1.07–1.28]
rs1010	<i>VAMP8</i>	1.042 [0.959, 1.133]	HR 1.2 [P < 0.019]
rs7439293	<i>PALLD</i>	1.104 [1.012, 1.205]	HR 1.11 [1.02–1.22]
rs2298566	<i>SNX19</i>	1.131 [1.027, 1.247]	HR 1.12 [1.01–1.24]
rs10757274	<i>9p21</i>	1.214 [1.117, 1.319]	OR 1.21 [1.04–1.40]

## Genome-wide polygenic scores for common diseases identify individuals with risk equivalent to monogenic mutations

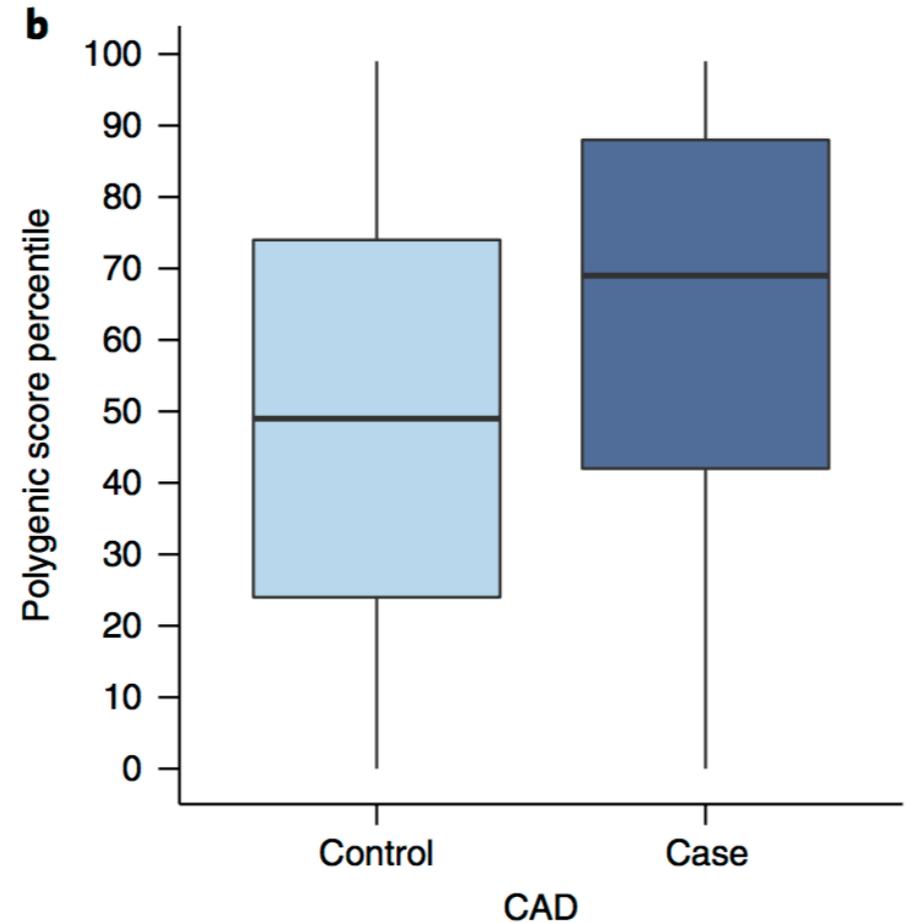
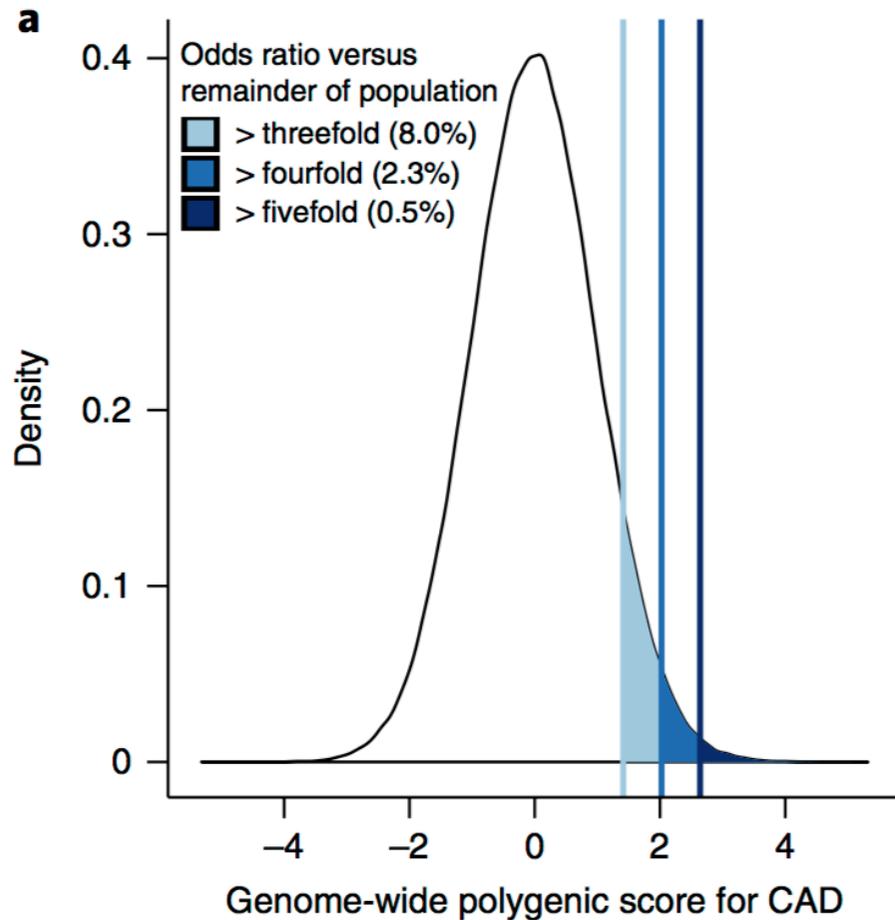
Amit V. Khera<sup>1,2,3,4,5</sup>, Mark Chaffin<sup>4,5</sup>, Krishna G. Aragam<sup>1,2,3,4</sup>, Mary E. Haas<sup>4</sup>, Carolina Roselli<sup>4</sup>, Seung Hoan Choi<sup>4</sup>, Pradeep Natarajan<sup>2,3,4</sup>, Eric S. Lander<sup>4</sup>, Steven A. Lubitz<sup>2,3,4</sup>, Patrick T. Ellinor<sup>2,3,4</sup> and Sekar Kathiresan<sup>1,2,3,4\*</sup>

**Table 1 | GPS derivation and testing for five common, complex diseases**

Disease	Discovery GWAS (n)	Prevalence in validation dataset	Prevalence in testing dataset	Polymorphisms in GPS	Tuning parameter	AUC (95% CI) in validation dataset
CAD	60,801 cases; 123,504 controls <sup>16</sup>	3,963/120,280 (3.4%)	8,676/288,978 (3.0%)	6,630,150	LDPred ( $\rho=0.001$ )	0.81 (0.80–0.81)
Atrial fibrillation	17,931 cases; 115,142 controls <sup>30</sup>	2,024/120,280 (1.7%)	4,576/288,978 (1.6%)	6,730,541	LDPred ( $\rho=0.003$ )	0.77 (0.76–0.78)
Type 2 diabetes	26,676 cases; 132,532 controls <sup>31</sup>	2,785/120,280 (2.4%)	5,853/288,978 (2.0%)	6,917,436	LDPred ( $\rho=0.01$ )	0.72 (0.72–0.73)
Inflammatory bowel disease	12,882 cases; 21,770 controls <sup>32</sup>	1,360/120,280 (1.1%)	3,102/288,978 (1.1%)	6,907,112	LDPred ( $\rho=0.1$ )	0.63 (0.62–0.65)
Breast cancer	122,977 cases; 105,974 controls <sup>33</sup>	2,576/63,347 (4.1%)	6,586/157,895 (4.2%)	5,218	Pruning and thresholding ( $r^2 < 0.2$ ; $P < 5 \times 10^{-4}$ )	0.68 (0.67–0.69)

Area Under Curve (AUC) measures **discrimination**, that is, the ability of the test to correctly classify those with and without the disease.

# Polygenic risk and CAD



# Genetics and Lifestyle

The NEW ENGLAND JOURNAL of MEDICINE

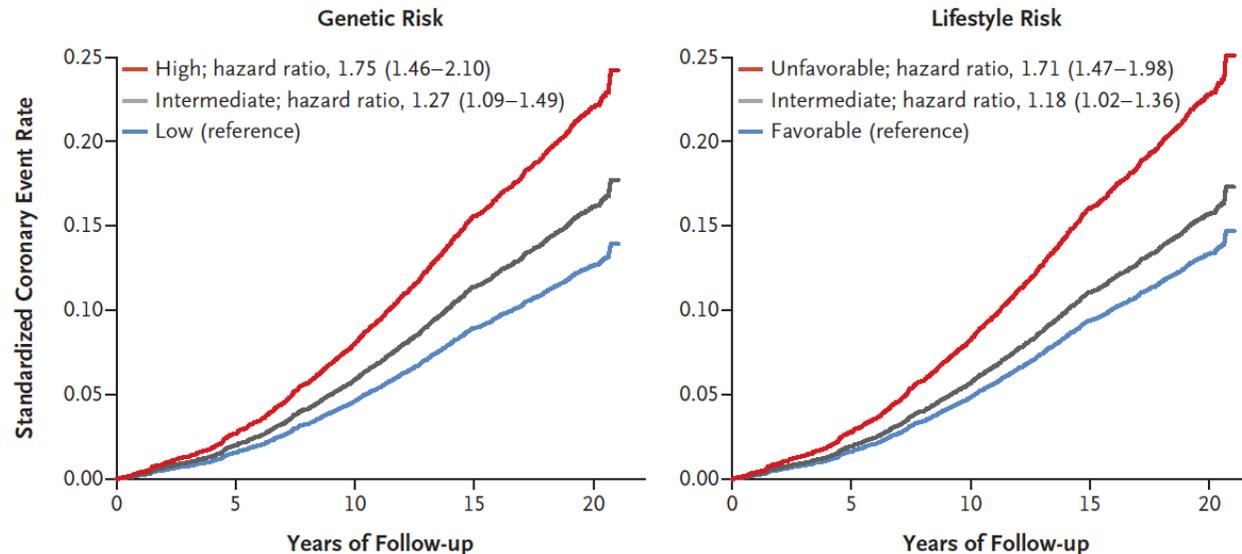
ORIGINAL ARTICLE

## Genetic Risk, Adherence to a Healthy Lifestyle, and Coronary Disease

Amit V. Khera, M.D., Connor A. Emdin, D.Phil., Isabel Drake, Ph.D., Pradeep Natarajan, M.D., Alexander G. Bick, M.D., Ph.D., Nancy R. Cook, Ph.D., Daniel I. Chasman, Ph.D., Usman Baber, M.D., Roxana Mehran, M.D., Daniel J. Rader, M.D., Valentin Fuster, M.D., Ph.D., Eric Boerwinkle, Ph.D., Olle Melander, M.D., Ph.D., Marju Orho-Melander, Ph.D., Paul M. Ridker, M.D., and Sekar Kathiresan, M.D.



### A Atherosclerosis Risk in Communities



## Genetic Risk, Adherence to a Healthy Lifestyle, and Coronary Disease

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### Healthy Lifestyle:

no smoking, no obesity, physical activity at least once weekly, and a healthy diet pattern.

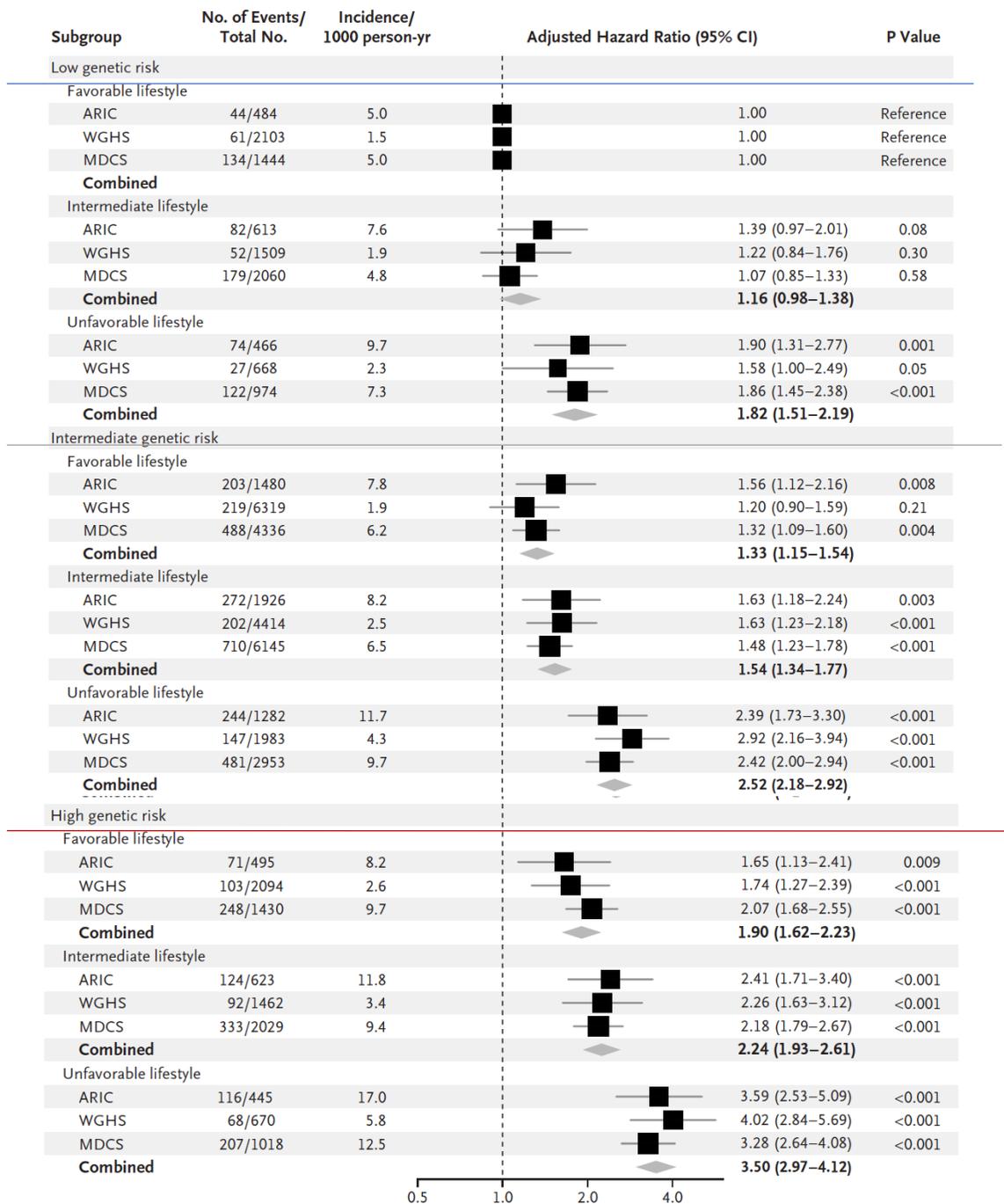
### At least half of the following:

#### Increased:

- fruits, vegetables,
- Nuts
- Whole grains,
- fish,
- dairy products

#### Reduced

- refined grains,
- processed meats, unprocessed red meats,
- sugar-sweetened beverages,
- trans fats
- sodium



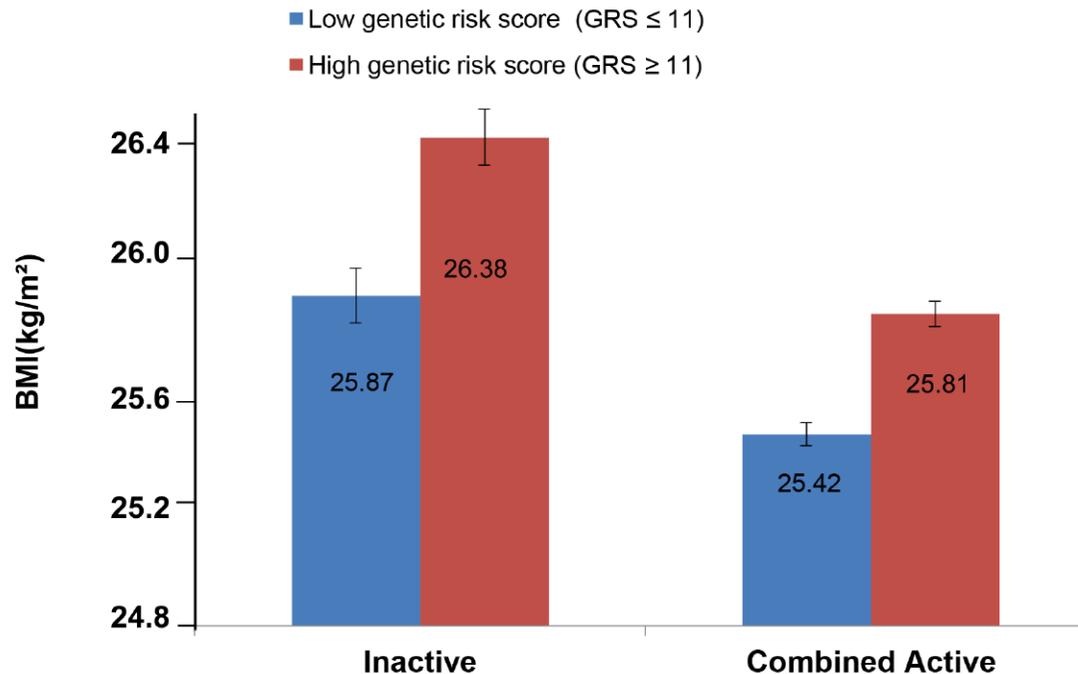
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# Gene $\times$ Physical Activity Interactions in Obesity: Combined Analysis of 111,421 Individuals of European Ancestry



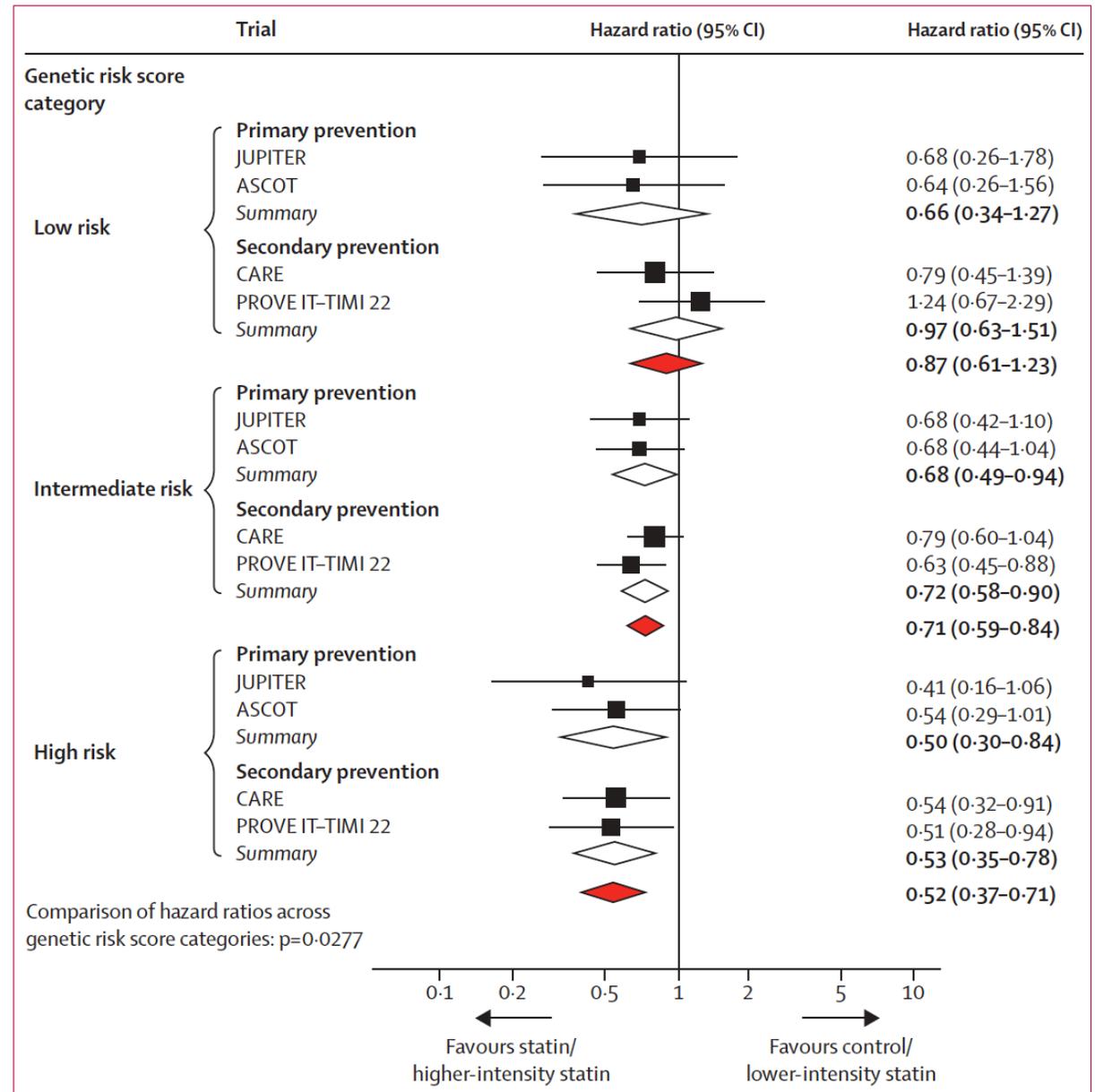
**Figure 3. Adjusted least square mean BMI (95% CI) stratified by GRS level (>11 vs. ≤11 BMI-associated alleles) and by physical activity levels (N = 111,421).** Physical activity was estimated according to the Cambridge Physical Activity Index (CPAI), where the 'inactive' group is defined as individuals with CPAI = 1 and the 'combined active' group as individuals with CPAI = 2–4.  
doi:10.1371/journal.pgen.1003607.g003

Occupational physical activity in most studies was categorized as i) sedentary or standing; ii) light but partly physically active; iii) light and physically active; and iv) sometimes or often physically straining. Leisure time physical activity during the past three months was categorized as exercising: i) occasionally; ii) 1–2 times/week; iii) 2–3 times/week; or iv) 3 times/week

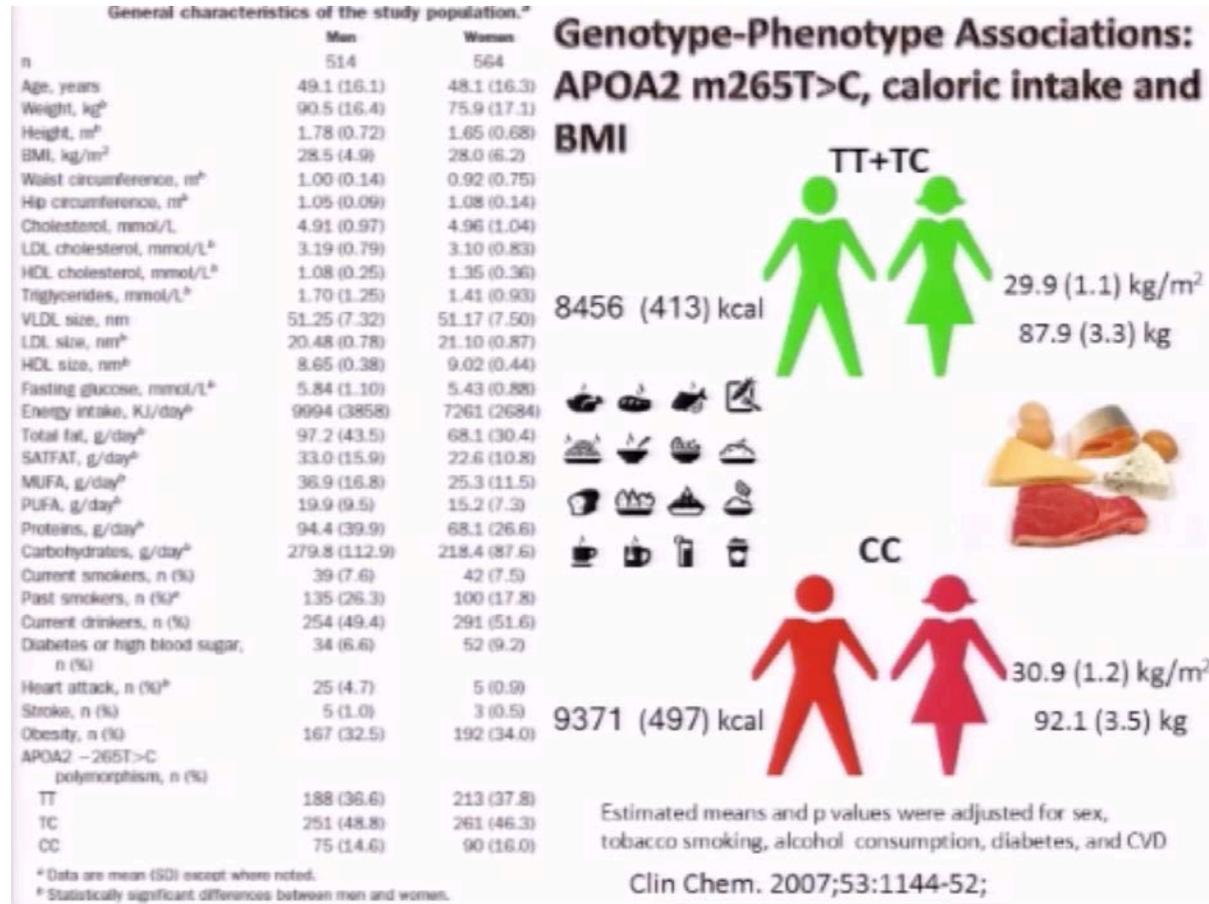
# Genetic risk, coronary heart disease events, and the clinical benefit of statin therapy: an analysis of primary and secondary prevention trials

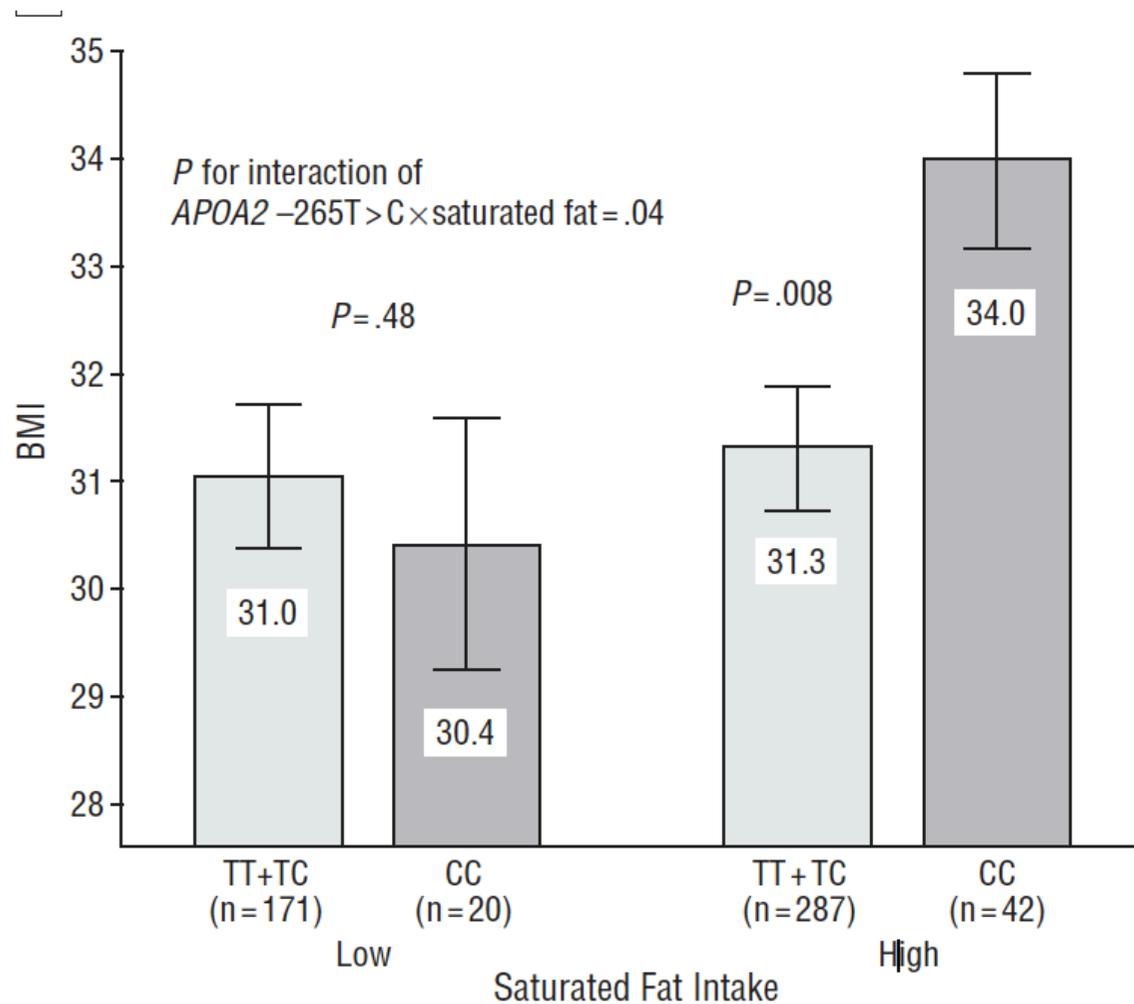
Jessica L Mega\*, Nathan O Stitziel\*, J Gustav Smith, Daniel I Chasman, Mark J Caulfield, James J Devlin, Francesco Nordin, Craig L Hyde, Christopher P Cannon, Frank M Sacks, Neil R Poulter, Peter S Sever, Paul M Ridker, Eugene Braunwald, Olle Melander, Sekar Kathiresan\*, Marc S Sabatine\*

Lancet, 2015



# APOA2 SNP rs





## APOA2, Dietary Fat, and Body Mass Index

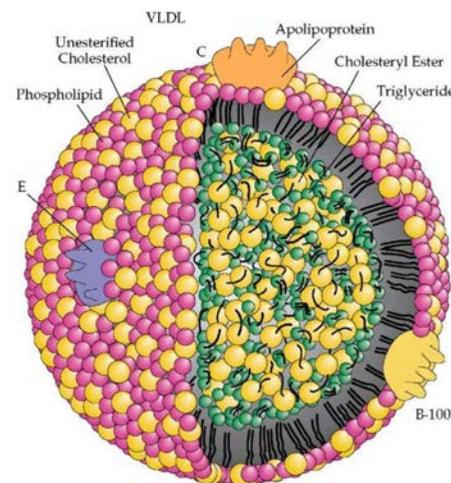
Replication of a Gene-Diet Interaction in 3 Independent Populations

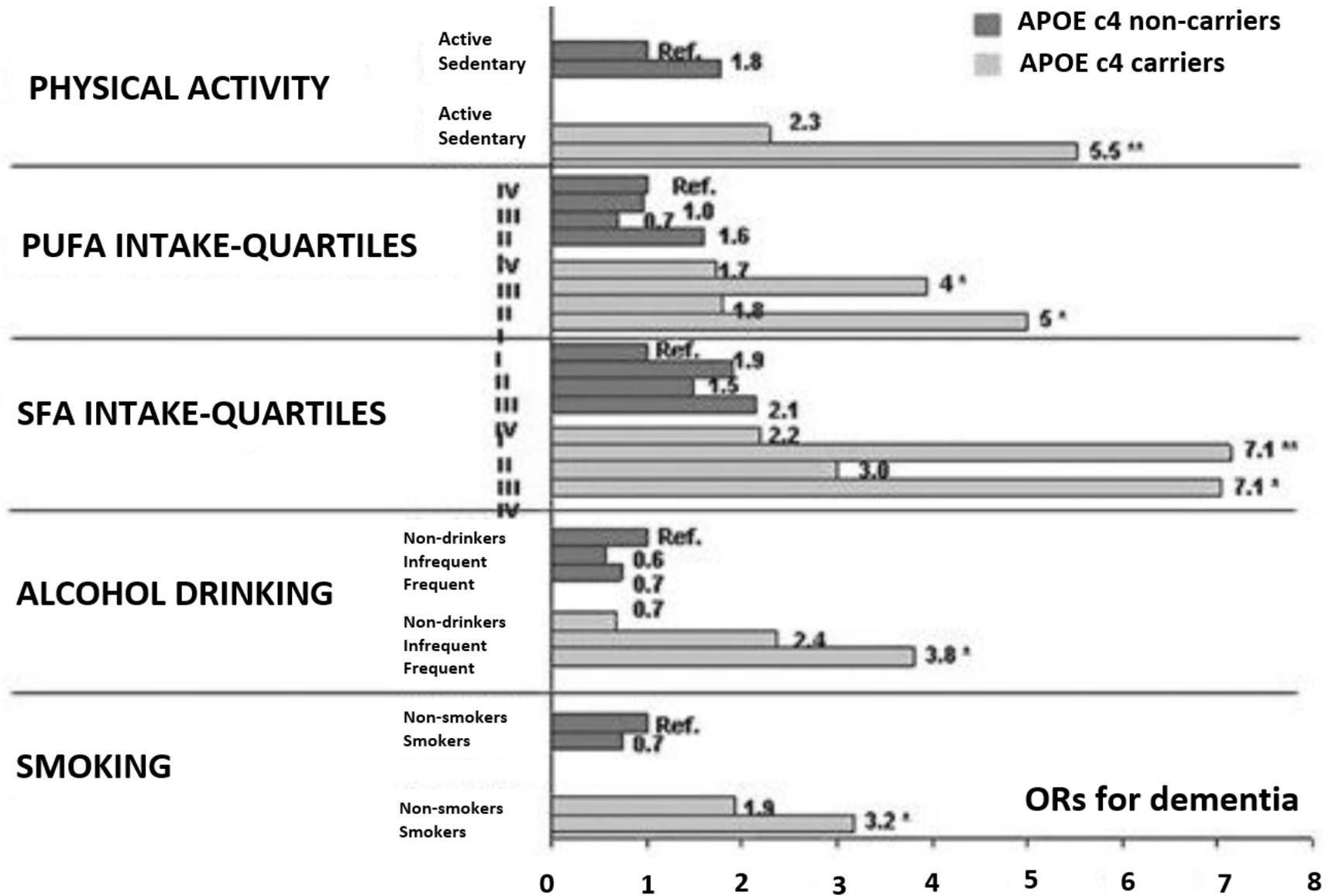
Dolores Corella, PhD; Gina Peloso, MSc; Donna K. Arnett, PhD, MSPH; Serkalem Demissie, PhD; L. Adrienne Cupples, PhD; Katherine Tucker, PhD; Chao-Qiang Lai, PhD; Laurence D. Parnell, PhD; Oscar Coltell, PhD; Yu-Chi Lee, MSc; Jose M. Ordovas, PhD

# Use of ApoE Polymorphism in Guiding Dietary Choices

## Apo E Genotype—Metabolic Expression and Influence on Therapeutic Interventions

	Apo E2 Response		Apo E3 Response		Apo E4 Response	
<b>Genotype</b>	2/2	2/3	3/3	2/4	3/4	4/4
<b>Population Frequency</b>	1%	10%	62%	2%	20%	5%





# Use of ApoE Polymorphism in Guiding Dietary Choices

## Apo E Genotype—Metabolic Expression and Influence on Therapeutic Interventions

Genotype	Apo E2 Response		Apo E3 Response		Apo E4 Response	
	2/2	2/3	3/3	2/4	3/4	4/4
<i>Population Frequency</i>	1%	10%	62%	2%	20%	5%
Fish Oil <sup>1</sup>	↓↓TG ↓ small dense LDL ↑HDL	↓TG ↓ small dense LDL ↑HDL	↓TG ↓ small dense LDL ↑HDL	↓TG ↓ small dense LDL ↑HDL	↓TG ↓↓ small dense LDL ↓HDL ↑↑LDL	↓TG ↓↓ small dense LDL ↓HDL ↑↑LDL
Low Fat Diet <sup>2,3</sup>	↓LDL ↑ small dense LDL	↓LDL ↑ small dense LDL	↓LDL ↔ small dense LDL	↓LDL ↔ small dense LDL	↓↓LDL ↓ small dense LDL	↓↓LDL ↓ small dense LDL
Moderate Fat Diet <sup>3</sup>	↔LDL ↔ small dense LDL	↔LDL ↔ small dense LDL	↓LDL ↓ small dense LDL	↓LDL ↓ small dense LDL	↓LDL ↑↑ small dense LDL	↓LDL ↑↑ small dense LDL
Moderate Alcohol <sup>4</sup>	↑HDL ↓LDL	↑HDL ↓LDL	↑HDL	↑HDL	↓HDL ↑LDL	↓HDL ↑LDL

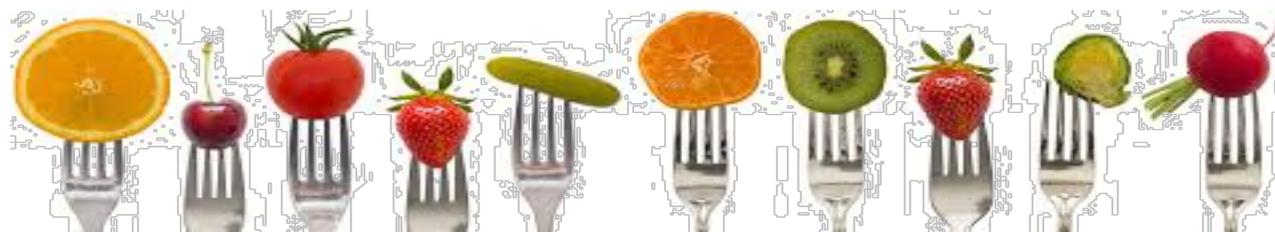
# Section I: OPTIMAL Nutrition

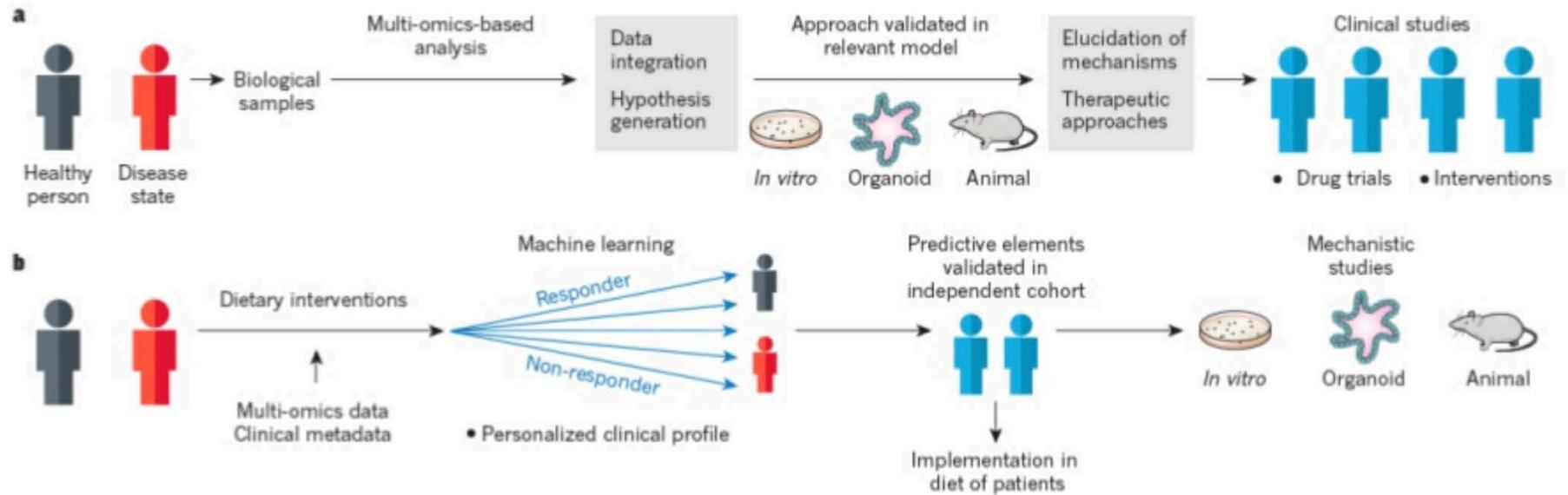
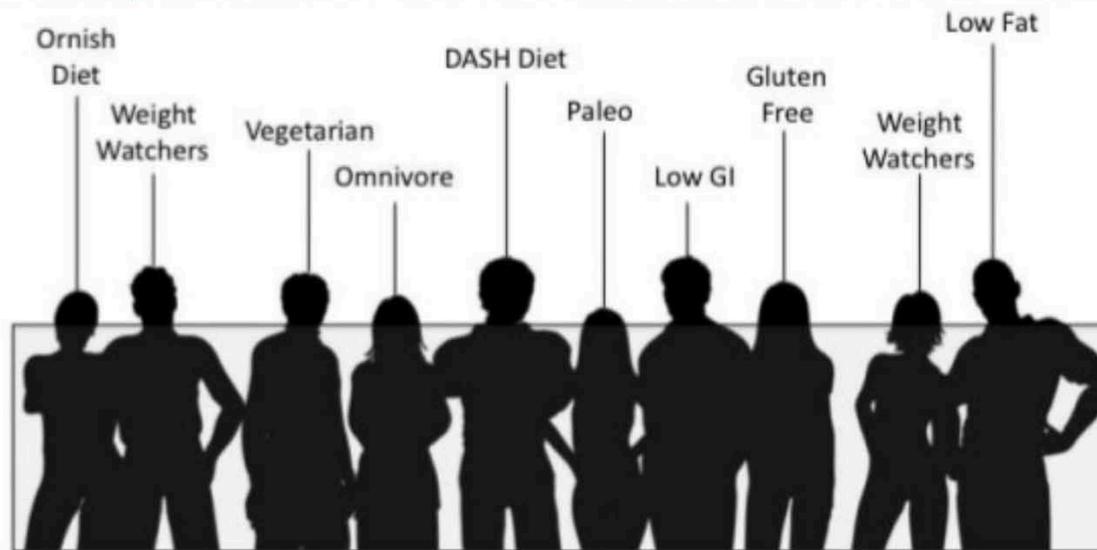
Thank you for taking the Eurogenetica NutriGENE program –this section will give you your results and all you need to know about how to make useful modifications to your diet and lifestyle in order to benefit your health and wellbeing. You should read the report carefully and also discuss it with your nutritionist who will be able to help you to plan the recommended changes. If you need to lose weight please also consult section II.

## Overview – Modifications to introduce

Increase*	<b>Folic Add, Vit B6 e B12 Vitamin D Calcium Omega 3 Fiber</b>
Decrease*	<b>Salt Caffeine Refined carbs / sugars Grilled Meat</b>
Lactose intolerance	<b>Lactose tolerant</b>
Celiac	<b>Possible predisposition</b>

\*To increase or decrease relative to the official RDA guidelines





Sonnenburg JL, Bäckhed F. Diet-microbiota interactions as moderators of human metabolism. *Nature*. 2016 Jul 6;535(7610):56-64.

# Conclusion

- Genetic Risk Scoring can have good discrimination
- Understanding pathways will be key
- Need to be tested for clinical utility

