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

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## Health care scenario: 42 yo male with dizziness, profuse sweating



## $42 y o$ male with cardiac arrest due to acute myocardial infarction (MI)



## Anoxic brain injury Expired after 10 days in hospital



## 42yo male with fatal, early-onset MI

## MI risk factors prior to event

Total cholesterol $198 \mathrm{mg} / \mathrm{dl}$
LDL cholesterol $124 \mathrm{mg} / \mathrm{dl}$
HDL cholesterol $40 \mathrm{mg} / \mathrm{dl}$
Triglycerides $\quad 170 \mathrm{mg} / \mathrm{dl}$
Blood pressure 122/78
Body mass index 26
Non-smoker
No type 2 diabetes
Family history: father with MI at 54

## ACC/AHA 10y ASCVD risk calculator typically used for statin allocation decision: I.7\% ('low-risk')

Pooled Cohort Risk Assessment

## Equations

Predicts 10-year risk for a first atherosclerotic cardiovascular disease (ASCVD) event

| Risk Factors for ASCVD |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Gender | Male | Female | Systolic BP | 122 | mmHg |
| Age | 42 | years | Receiving treatment for high blood pressure <br> (if SBP > 120 mmHg ) | No | Yes |
| Race | White or other - |  |  |  |  |
|  |  |  | Diabetes | No | Yes |
| Total Cholesterol | 198 | mg/dL | Smoker | No | Yes |
| HDL Cholesterol | 40 | mg/dL |  |  |  |
|  |  | Reset | Calculate |  |  |



## Why is the ACC/AHA pooled cohort equation not useful in young people?

Pooled Cohort Risk Assessment

## Equations

Predicts 10-year risk for a first atherosclerotic cardiovascular disease (ASCVD) event
品 ClinCalc.com " Cardiology \# Pooled Cohort 10-Year ASCVD Risk Assessment Equations


## Model almost entirely driven by 'age'

In population, older you are, more likely you are to have a heart attack!

## Health care scenario

What is predicted?

## Risk for heart attack

Intended target population
Men/women < 55yo

How

For what purpose

## Gene variant(s)

Janssens, Martens, Prediction Research Manual http://www.cecilejanssens.org/wpcontent/uploads/2018/0 I/PredictionManual2.0.pdf

## For early-onset disease, stratifying individuals based on inborn DNA variation an option



Most diseases inherited component

Stratify individuals based on inherited DNA variation

## Inherited component to early heart attack



MI at age < 55 Age onset at MI

Traditional approach:
Genetic prediction focuses on rare, monogenic mutations

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Familial
hypercholesterolemia


Cholesterol
Heart attack 3x increased risk

## $0.4 \%$ of the population

Traditional approach:
Genetic prediction focuses on rare, monogenic mutations

## Familial

 hypercholesterolemia

Identify this risk group early in life Target statin intervention

# Testing for familial hypercholesterolemia mutations: CDC Tier I Genomics Application 

## Tier 1

- FDA label requires use of test to inform choice or dose of a drug
- FDA cleared or approved companion diagnostic device
- CMS covers testing
- Clinical practice guidelines based on systematic review supports testing

| Genomics Application General Information |  |
| :--- | :--- |
| Tier Classification | Tier 1 |
| Disease/Disorder: | Familial hypercholesterolemia (FH) |
| Test or Application: | DNA testing and LDL-C concentration measurement |
| Target Population: |  |
| Intended Use: | Cascade testing of relatives of people diagnosed with FH |
| Application Type | Other |
| Basis: | Clinical Practice Guideline |
| Entered Date: | 08/19/2015 |
| Last Updated Date: | 08/19/2015 |

# Question: Can we identify additional patients with a polygenic risk model? 

## Concept: polygenic risk scores



Kathiresan, N Engl J Med (2008) Ripatti, Lancet (2010) Khera, $N$ Engl J Med (2016)


## Polygenic risk scores: move from top SNPs to a genome-wide set of 6.6 M for prediction

Khera*, Chaffin*, bioRxiv 2017


Amit V. Khera

## Hypothesis: a polygenic score including a genomewide set of SNPs can identify individuals with risk equivalent to a monogenic mutation



Genotypes: from arrays + imputation
Khera*, Chaffin*, bioRxiv (2017)

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Khera*, Chaffin*, bioRxiv (2017)

## A new quantitative metric of genetic liability to heart attack



Khera*, Chaffin*, bioRxiv (2017)

## >20-fold risk gradient across percentile bins of score



Khera*, Chaffin*, bioRxiv (2017)

# Genome-wide polygenic score: little correlation with currently measured MI risk factors 



Khera*, Chaffin*, bioRxiv (2017)

Using polygenic model, can we identify group with risk for MI equivalent to monogenic mutations?

## What if we label top 5\% tail of distribution as <br> 'carriers' and remainder as 'non-carriers'?

Polygenic score of
6.6 million common variants


Khera*, Chaffin*, bioRxiv (2017)

## Top 5\% of polygenic MI score: risk equivalent to monogenic mutations

Polygenic score of
6.6 million common variants


| High <br> polygenic <br> score <br> definition | Odds <br> ratio |
| :--- | ---: |
| Top 5\% | 3.3 |
| Top 1\% | 4.7 |

Khera*, Chaffin*, bioRxiv (2017)

## In UK Biobank, top 5\% of polygenic score risk equivalent to monogenic mutations but what about external validation?

Polygenic score of
6.6 million common variants


| High |
| :--- | ---: |
| polygenic |
| score |
| definition |$\quad$| Odds |
| :--- |
| ratio |

Khera*, Chaffin*, bioRxiv (2017)

## 2,08 I Early-onset MI patients | 3,76I Controls

MI Cases:

- VIRGO: Patients hospitalized across US with first Ml at age $\leq 55$ years


## Controls:

- MESA: Multiethnic population free of cardiovascular disease


## Contributions of monogenic and polygenic models to early MI



Khera*, Chaffin*, under review

## Monogenic familial hypercholesterolemia mutation identified in I．7\％patients－＞3．8－fold increased risk

| 100 patients with myocardial infarction |
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个Risk
$\uparrow \pi$
Monogenic

## Carriers of familial hypercholesterolemia mutations can be distinguished by high LDL cholesterol



Mean LDL Cholesterol
Carriers: 206 mg/dl
Non-carriers: $124 \mathrm{mg} / \mathrm{dl}$

High polygenic score identified in 17\％of patients and confers a $\mathbf{3 . 7 - f o l d}$ increase in risk

| 100 patients with myocardial infarction |  |  | $\uparrow$ Risk |
| :---: | :---: | :---: | :---: |
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|  |  |  |  |

## High polygenic score individuals can NOT be distinguished by high LDL cholesterol



# Mean LDL Cholesterol 

High polygenic: $132 \mathrm{mg} / \mathrm{dl}$
Non-carriers: $124 \mathrm{mg} / \mathrm{d} \mid$

## High polygenic score individuals can NOT be distinguished by clinical risk factors

|  | Neither | High Polygenic Score | FH Mutation |
| :--- | :---: | :---: | :---: |
| N | 1690 | 355 | 32 |
| Race, N (\%) |  |  |  |
| White | $1232(72.9)$ | $281(79.2)$ | $20(62.5)$ |
| Black | $296(17.5)$ | $35(9.9)$ | $5(15.6)$ |
| Hispanic | $129(7.6)$ | $32(9.0)$ | $7(21.9)$ |
| Asian | $33(2.0)$ | $7(2.0)$ | $0(0.0)$ |
| Male sex, N (\%) | $563(33.3)$ | $123(34.6)$ | $21(65.6)$ |
| Age, years; Mean (SD) | $47.6(5.9)$ | $47.8(5.7)$ | $46.8(6.5)$ |
| Hypertension, N (\%) | $1075(63.9)$ | $243(68.5)$ | $24(75.0)$ |
| Diabetes, N (\%) | $593(35.3)$ | $134(37.7)$ | $6(18.8)$ |
| Current Smoking, N (\%) | $848(50.4)$ | $190(53.5)$ | $14(43.8)$ |
| Statin Use, N (\%) | $445(26.5)$ | $113(31.8)$ | $15(46.9)$ |
| Lipid Levels, mg/dl |  |  | $201.5(82.0)$ |
| LDL Cholesterol; Mean (SD)* | $122.1(45.75)$ | $130.4(51.0)$ | $37.6(8.1)$ |
| HDL Cholesterol; Mean (SD) | $40.7(13.75)$ | $38.9(13.0)$ | $162(91-246)$ |
| Triglycerides; Median (IQR) | $133(91-205)$ | $155(105-222)$ |  |

Some traditional risk factors are slightly elevated, but not enough to be useful

## Polygenic score identifies I0x than monogenic mutations

|  | Monogenic | Polygenic |
| :--- | :---: | :---: |
| Prevalence among <br> early MI cases | $1.7 \%$ | $17 \%$ |
| Odd ratio for MI | 3.8 | 3.7 |
| Mode of detection | 个 LDL cholesterol | Currently <br> UNAWARE |
| Mechanism of risk | apoB lipoproteins | 'Gemish' |

## Monogenic, polygenic contributions to early MI

|  | Monogenic | Polygenic |
| :--- | :---: | :---: |
| Prevalence among <br> early MI cases | $1.7 \%$ | $17 \%$ |
| Odd ratio for MI | 3.8 | 3.7 |
| Mode of detection | 个 LDL cholesterol | Currently <br> UNAWARE |
| Mechanism of risk | apoB lipoproteins | 'Gemish' |
| Intervention | Lifestyle <br> Medications | $\boxed{?}$ |
|  |  |  |

## Is polygenic risk for MI modifiable? Yes

## Lifestyle


$\downarrow 48 \%$

Khera, $N$ Engl J Med (2016)

## Medicines


$\downarrow 44 \%$

Mega*, Stitziel*, Lancet (2015)
Natarajan, Circulation (2017)

## Do those at high polygenic risk derive greater benefit from statin therapy?

Determined polygenic risk score for participants of three statin RCTs to prevent first heart attack

The New England<br>Journal of Medicine

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PREVENTION OF CORONARY HEART DISEASE WITH PRAVASTATIN IN MEN WITH
HYPERCHOLESTEROLEMIA HYPERCHOLESTEROLEMIA


#### Abstract

Articles © © Prevention of coronary and stroke events with atorvastatin in hypertensive patients who have average or lower-than-average cholesterol concentrations, in the Anglo-Scandinavian Cardiac Outcomes Trial-Lipid Lowering Arm (ASCOT-LLA): a multicentre randomised controlled trial


Peter S Sever, Björn DahiWr, Neï R Pouiter, Hans Wedel, Gareth Beevers, Mark Cauffield, Ray Collins, Sverre E Kjeldsen, Arni Kristinsson, Gordon T Mclnnes, Jesper Mehlsen, Markku Nieminen, Eoin O'Brien, Jan Östergren, for the ASCOT investigators*


Rosuvastatin to Prevent Vascular Events in Men and Women with Elevated C-Reactive Protein

# Evaluate clinical benefit of statin therapy in genetic risk subgroups: High genetic risk versus all others 

Mega*, Stitziel*, Lancet (2015)
Natarajan*, Young*, Circulation (2017)

# Among those at high polygenic risk, statins confer greater benefit (to prevent first MI) 

Pradeep Natarajan


## $\mathbf{R R} \mathbf{R}=44 \%$

Natarajan*, Young*, Circulation (20I7)

## Approach works for other common diseases. . . including those without monogenic risk factors



## Why much better prediction now?

- Larger genome-wide association studies, more precise effect estimate for each variant
- Better computational methods to create genome-wide polygenic scores
- Larger cohorts to validate and test genome-wide polygenic scores (e.g., UK Biobank, 500K participants with GWAS data)


## Conclusions:

- Now possible to score polygenic component to any complex trait (from genotyping array data, simultaneous for many diseases, at birth)
- Those in extremes of score: at risk for disease approaching or exceeding monogenic mutations
- For MI , top $5 \%$ tail of polygenic score equivalent risk to monogenic mutations and this risk modifiable by lifestyle, statin also consider polygenic risk score

| What is predicted? | Risk for heart attack |
| :--- | :--- |
| Intended target population | Men/women < 55yo |
| How? | Genome-wide polygenic <br> score (top 5\%) |
| For what purpose? | Statin initiation at early age |

