

# Somatic cancer genomics

Anne Krogh Nøhr, PhD, Assist. Prof

# LETS GET STARTED



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# AGENDA

- 08:15 – 08:30** Recap [*Somatic cancer genomics*]
- 08:30 – 09:00** Group work
- 09:00 – 09:15** Break
- 09:15 – 09:45** Lecture 1 [*Rare and common germline variants*]
- 09:45 – 10:15** Exercise 1
- 10:15 – 10:30** Break
- 10:30 – 10:45** Lecture 2 [*Combining common and rare germline variants and cancer risk prediction*]
- 10:45 – 11:55** Exercise 2 - 6
- 11:55 – 12:00** Evaluation at Moodle



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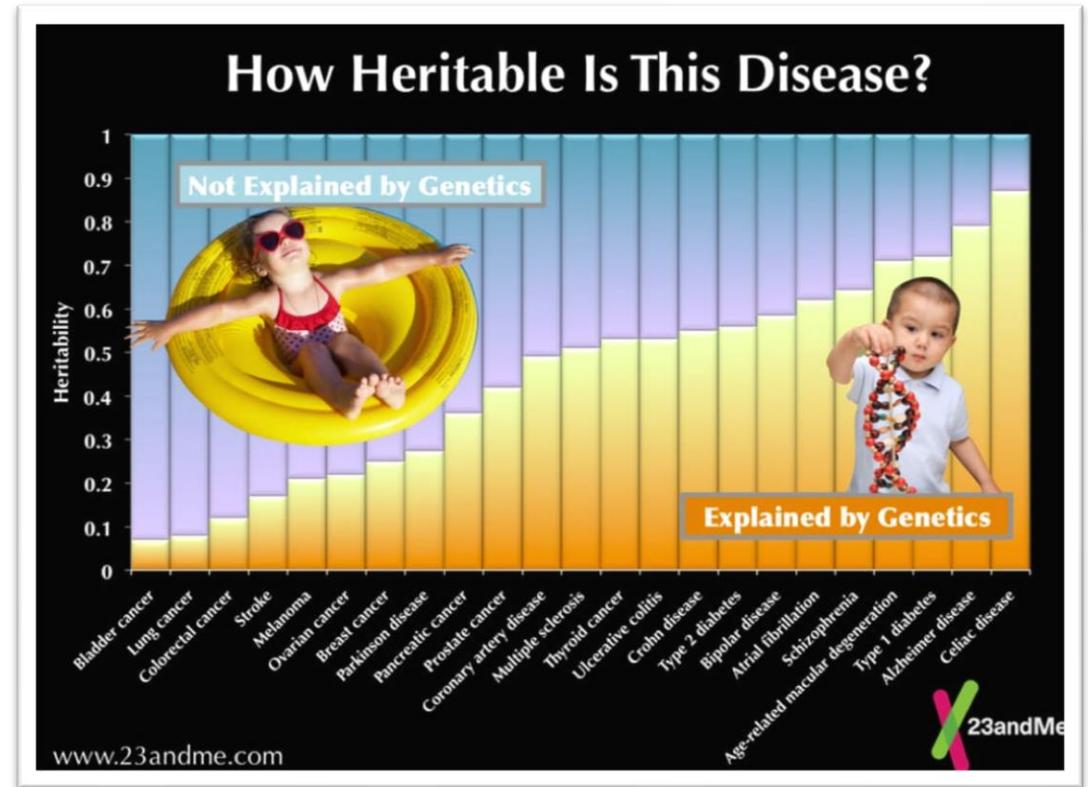
# Last time

Common features of all cancers:

- ❯ Caused by uncontrolled growth of abnormal cells
- ❯ Multifactorial, influenced by both environmental and polygenic factors

How cancers differ:

- ❯ Varying environmental factors
- ❯ Different high-penetrance genetic variants
- ❯ Differences in heritability



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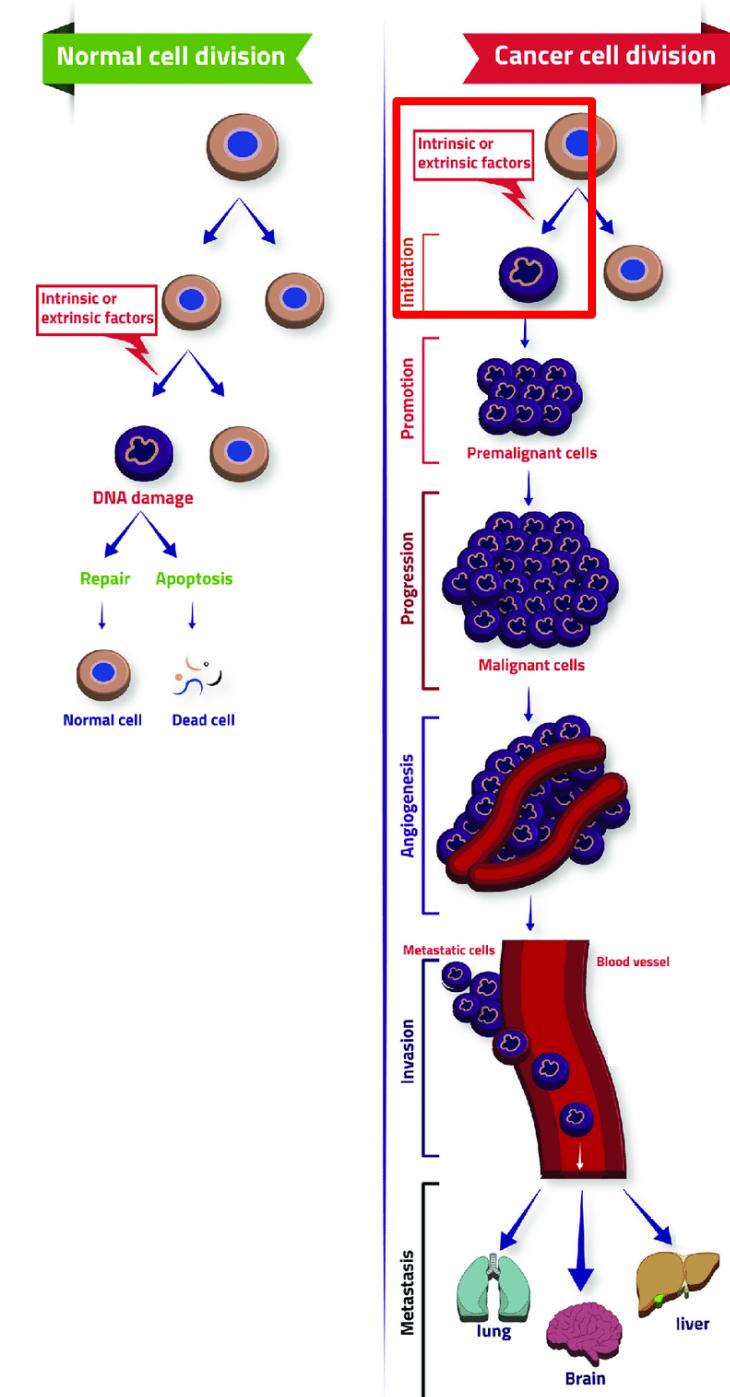
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# Cancer is a genetic disease

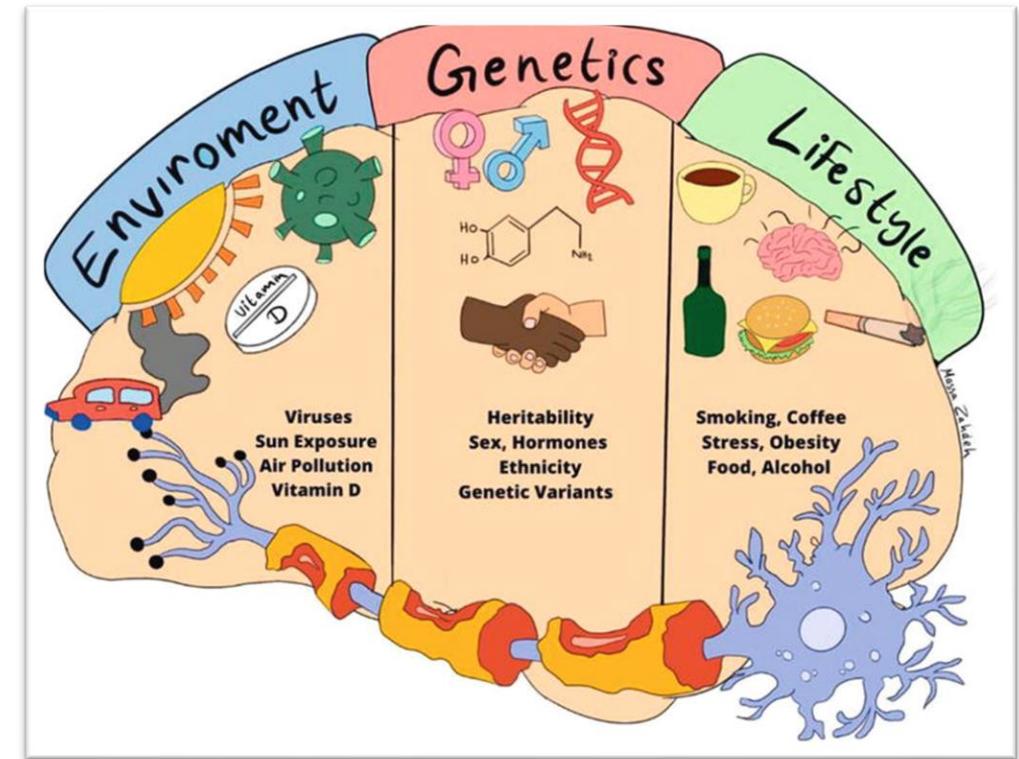
- A group of diseases caused by uncontrolled growth of abnormal cells.
- The DNA in a human cell undergoes thousands to a million harmful events per day.
- Normal Cell Division
  - In case of cellular damage, the cell undergoes repair or apoptosis.
- Cancer Cell Division
  1. Initiation: Cellular damage → somatic mutation in a cell.
  2. Promotion: Stimulated increased cell division → large number of clones.
  3. Progression: Gradual transformation from a benign tumor to a malignant tumor.
  4. Angiogenesis: Tumors form blood vessels by releasing chemical signals.
  5. Invasion: Cancer cells invade nearby tissue.
  6. Metastasis: Spread of cancer cells through the circulatory system or the lymphatic system.



# What cause cancer?

Mutations caused by:

- Environmental factors
- Inherited
- Random mistakes
- Cancer form when mutations occur in **cancer-causing genes** regulating growth and differentiation



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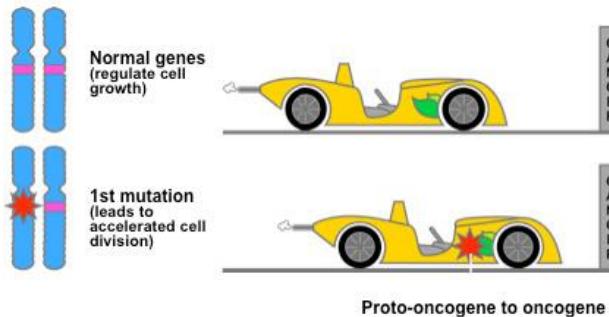


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# Three major classes of cancer-causing genes

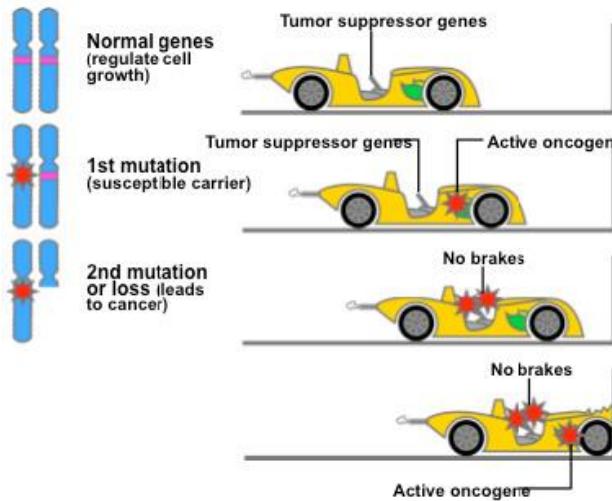
## Oncogenes:

The bad guys, turn on unregulated growth (gas pedal)



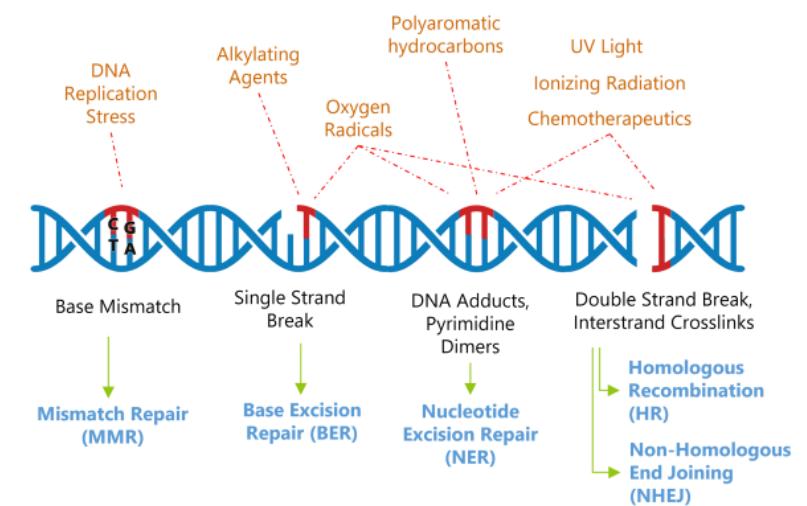
## Tumor suppressor genes:

The good guys, control cell division (brake pedal)



## DNA repair genes:

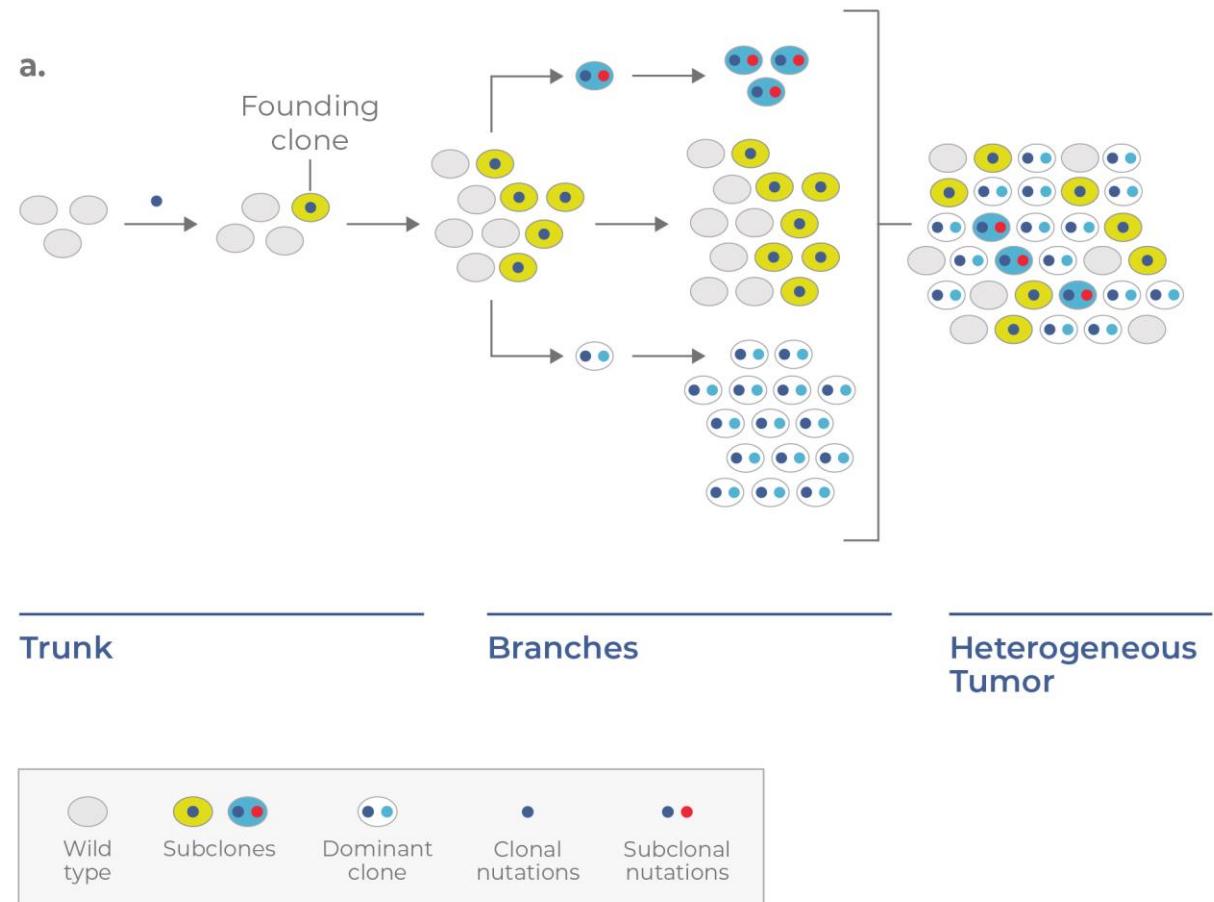
More good guys- repair genes



# Clonal evolution drives tumor heterogeneity

- **Clones:** Cells that are genetically identical.
- **Founder clone:** A healthy cell that acquires a driver mutation.
- **Subclone:** A clone that originates from another clone but has acquired additional mutation(s).
- **Dominant clone:** The clonal population that occurs with the highest frequency in the tumor.

Branched model



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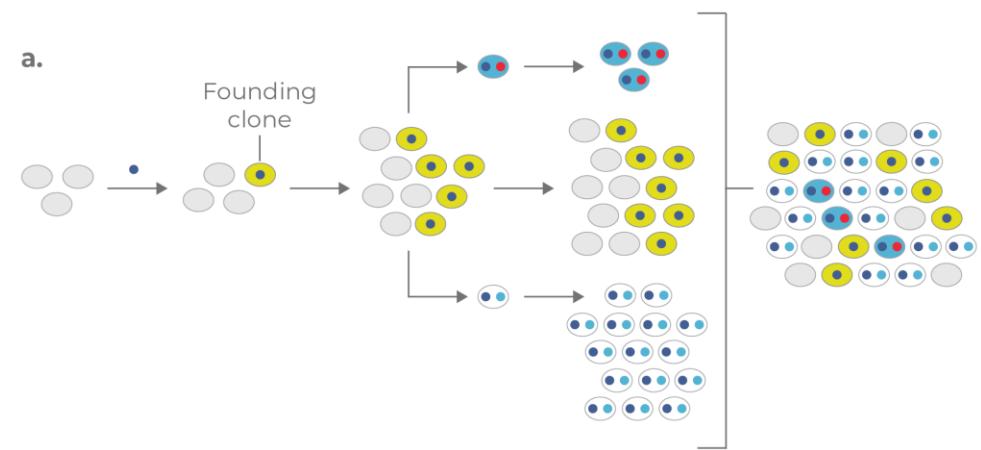
# Driver mutations

**Driver mutations:** induce cell proliferation and tumour growth advantage - provide a **selective advantage** to the clone

- Cancer genomes contained **4–5 driver** mutations.
- In around 5% of cases no drivers are identified.

**Passenger mutations:** have no direct effect on cell proliferation and tumour growth

- The number of passenger mutations far exceeds the number of driver mutations.



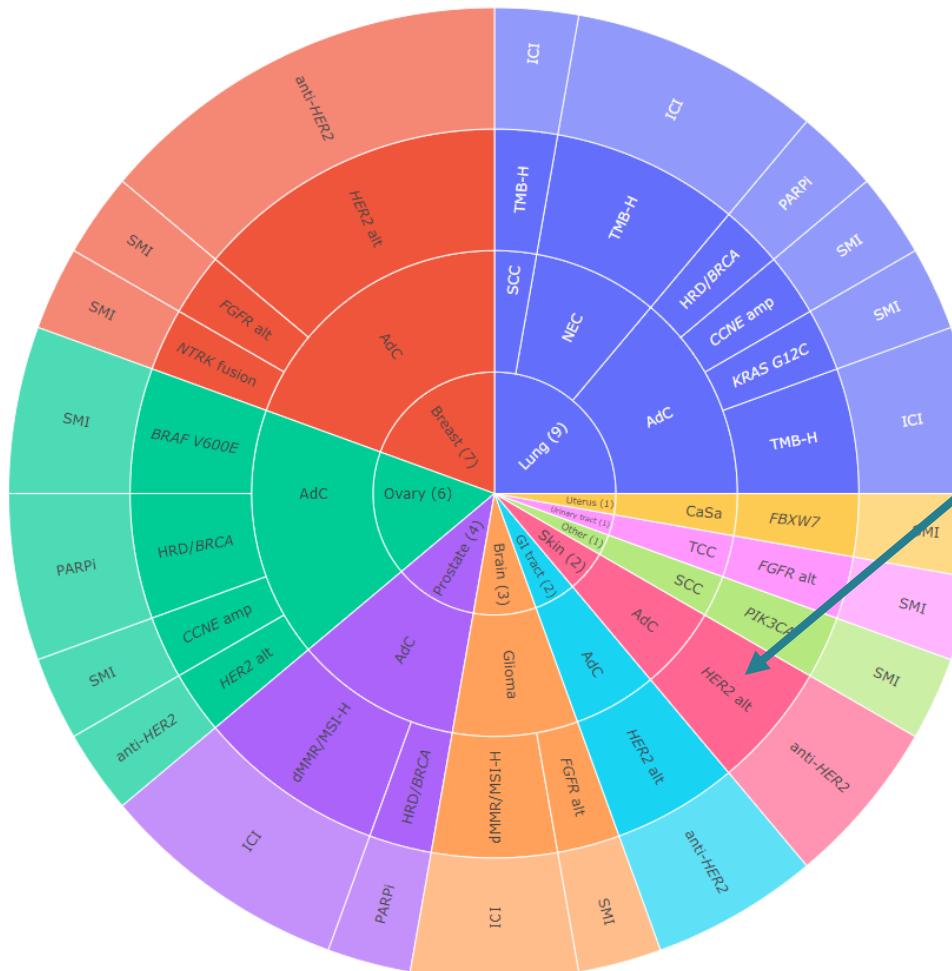
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# Cancer-causing genes in personalized medicine



HER2 oncogene (growth factor receptor)  
Treatment = anti-HER2

**ESMO OPEN** SCIENCE FOR OPTIMAL CANCER CARE

**ORIGINAL ARTICLE**

**Longer survival with precision medicine in late-stage cancer patients**

**ACTA ONCOLOGICA**  
2023, VOL. 62, NO. 3, 261–271  
<https://doi.org/10.1080/03005771.2023.2185542>

**ORIGINAL ARTICLE**

**Feasibility and early clinical benefit of precision medicine in late-stage cancer patients in a regional cancer center**

Morten Ladekær<sup>a,b</sup>, Anne Krogh Nehr<sup>c,d</sup>, Mads Sønderkær<sup>a</sup>, A. Pagh<sup>a</sup>, A. Carus<sup>a,b</sup>, T. Lörincz<sup>a</sup>, C. A. Haslund<sup>a</sup>, L. Ø. Poulsen<sup>a,b</sup>, A. Ernst<sup>a,c</sup>, J. S. Bedker<sup>a,b</sup>, S. C. Dahl<sup>a</sup>, L. Sunde<sup>a,b</sup>, A. H. Brügmann<sup>a,b</sup>, C. Vesteghem<sup>a,b</sup>, I. S. Pedersen<sup>a,b</sup>, & M. Ladekær<sup>a,b</sup>

<sup>a</sup>Department of Oncology and Clinical Cancer Research Center, Aalborg University Hospital, Aalborg; <sup>b</sup>Center for Clinical Data Science, Aalborg University Hospital and Aalborg University Hospital, Aalborg; <sup>c</sup>Molecular Diagnostics and Clinical Cancer Research Center, Aalborg University Hospital, Aalborg; <sup>d</sup>Department of Clinical Medicine, Aalborg University, Aalborg; <sup>e</sup>Department of Clinical Genetics and Clinical Cancer Research Center, Aalborg University Hospital, Aalborg; <sup>f</sup>Department of Pathology, Aalborg University Hospital, Aalborg; <sup>g</sup>Department of Radiology, Aalborg University Hospital, Aalborg

# GROUP WORK

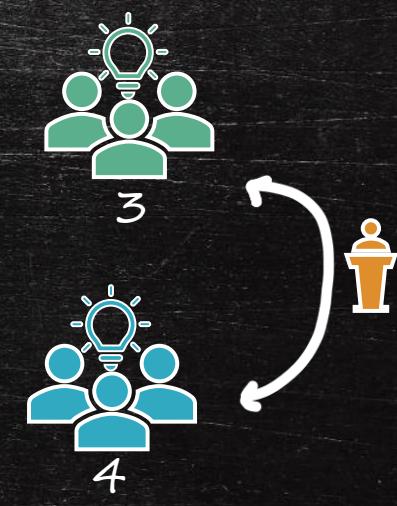
## THE HERITABILITY OF HUMAN DISEASE

### PART 1

- 1) Make 4 groups & prepare a 5-7 min presentation
  - Feasibility and early clinical impact of precision medicine for late-stage cancer patients in a regional public academic hospital
  - Longer survival with precision medicine in late-stage cancer patients

### PART 2 – *next time* (7/6)

- Group 1 present to group 2 and *vise versa*
- Group 3 present to group 4 and *vise versa*



# GROUP WORK

## THE HERITABILITY OF HUMAN DISEASE

All should include:

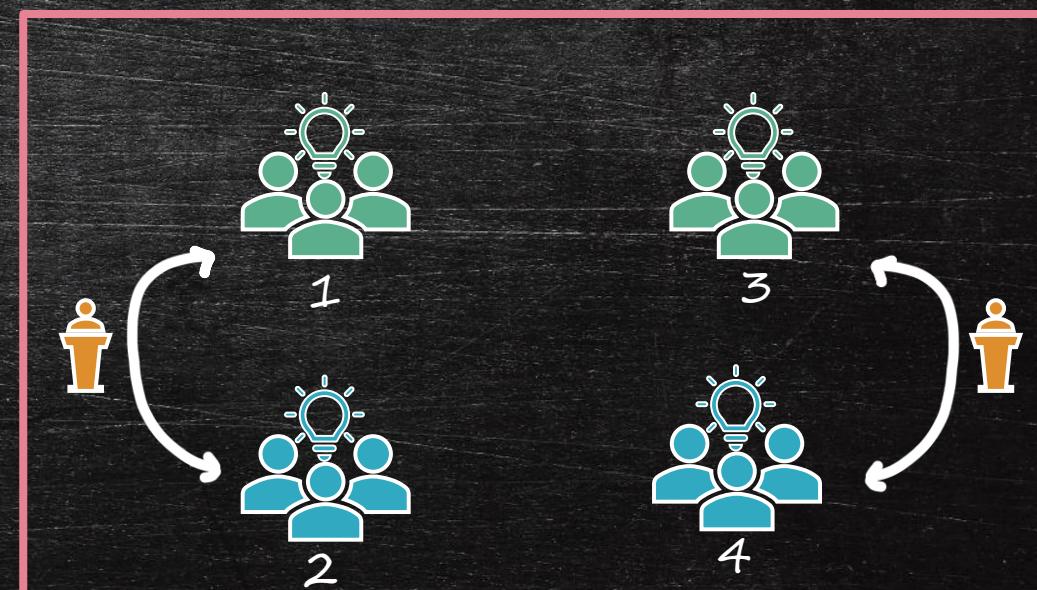
- Brief description of the study
- Limitations
- Conclusion

Feasibility and early clinical impact of precision medicine for late-stage cancer patients in a regional public academic hospital:

- The flow of patients from inclusion to treatment recommendation and NMTB recommendations (figure 1)
- Treatment duration and response for targeted treatments (figure 3)

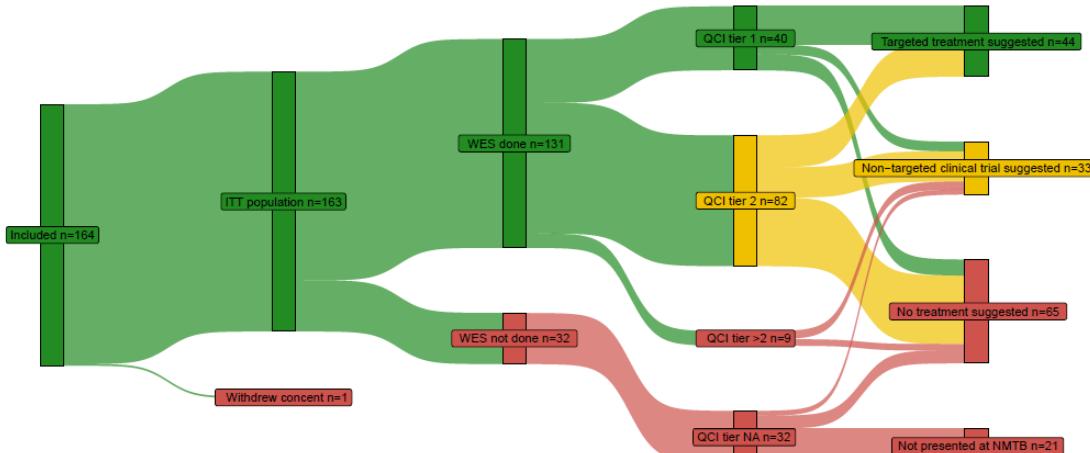
Longer survival with precision medicine in late-stage cancer patients

- Describe the 196 molecularly profiled patients (table 1)
- Overall survival of the patients (figure 4)

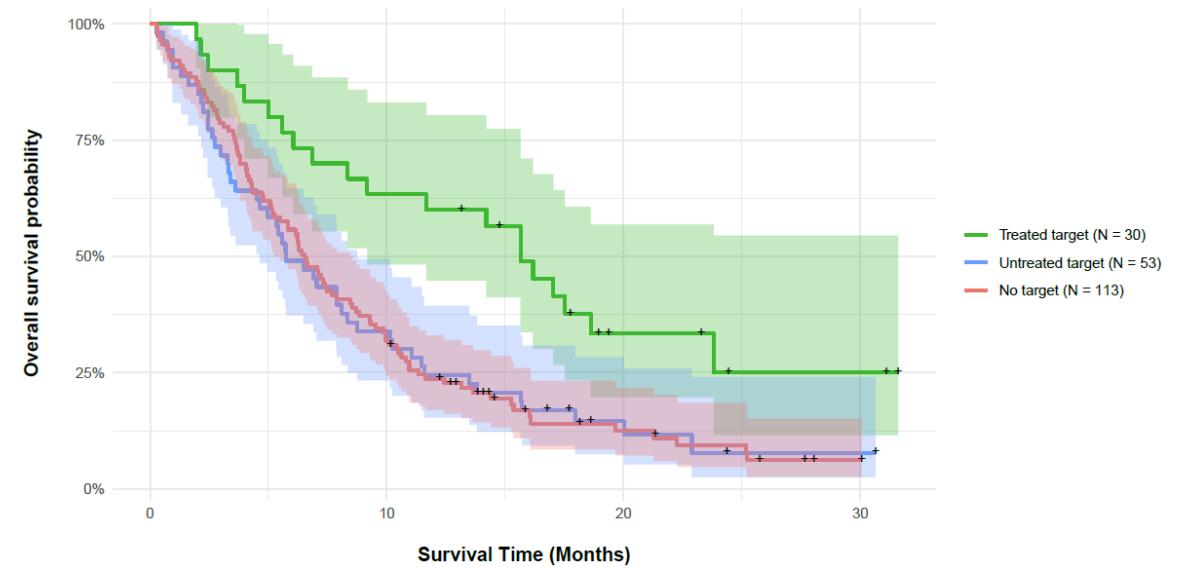


# What did you learn?

Feasibility and early clinical impact of precision medicine for late-stage cancer patients in a regional public academic hospital



Longer survival with precision medicine in late-stage cancer patients



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BREAK

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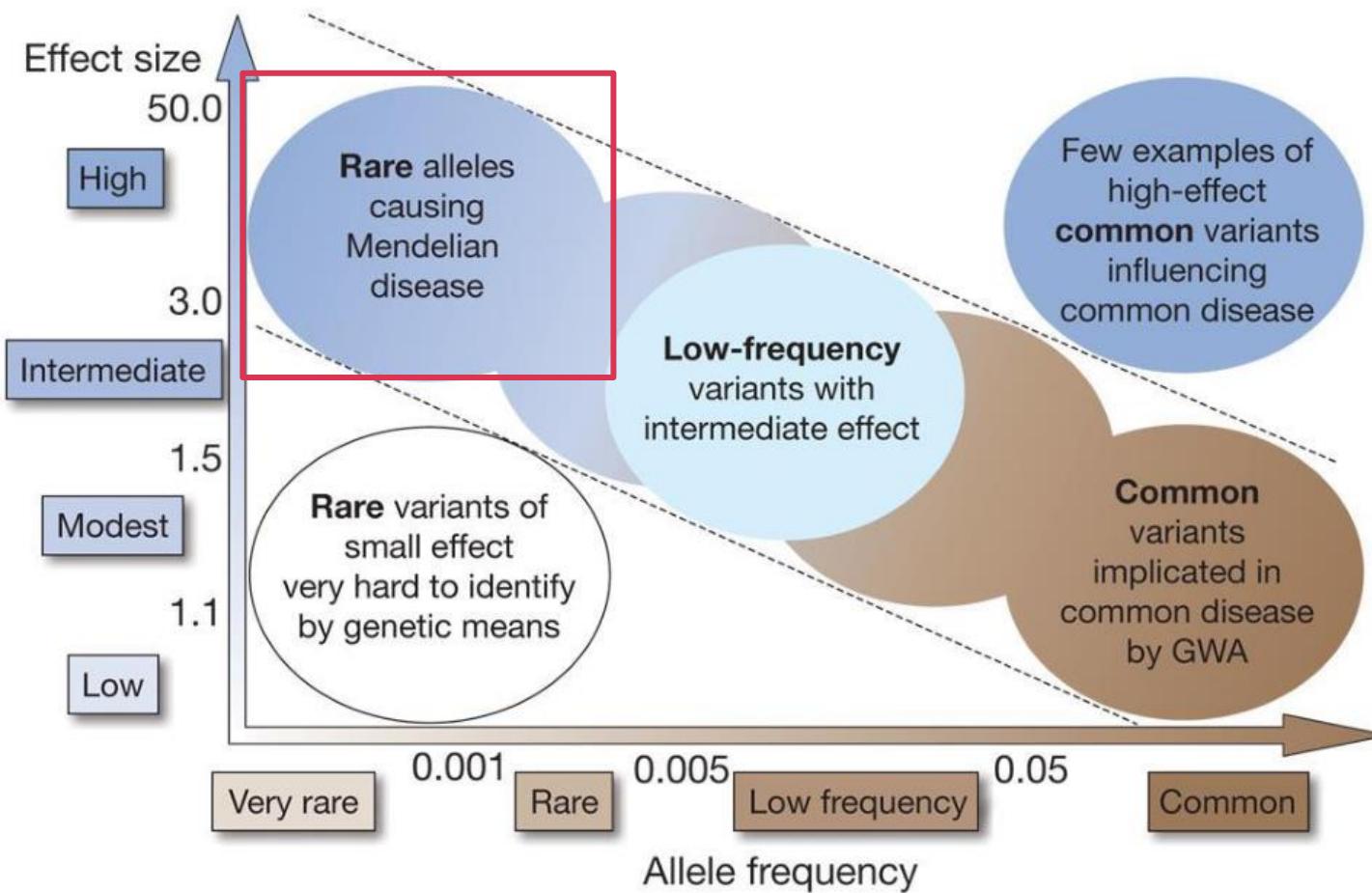
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# Rare germline cancer-causing variants



# Driver mutations – facts

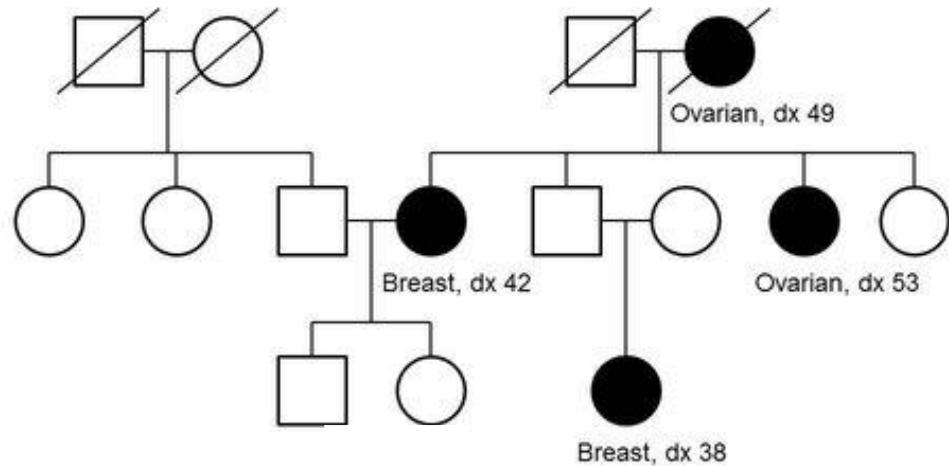
- Cancer genes show:
  - ~10% **germline** and **somatic** mutations
  - ~80% only **somatic** mutations
  - ~10% only **germline** mutations
- Classic examples of **inherited** driver mutations
  - BRCA1 and BRCA2 mutations in familial breast and ovarian cancer
  - APC mutations in familial adenomatous polyposis.
- Driver mutations in the germline demonstrates that **somatic driver mutations** can be acquired **decades** before the cells become cancerous.
- This is possible because a cell requires **multiple mutations** to become cancerous - acquired gradually over time.



# Rare variants with high penetrance

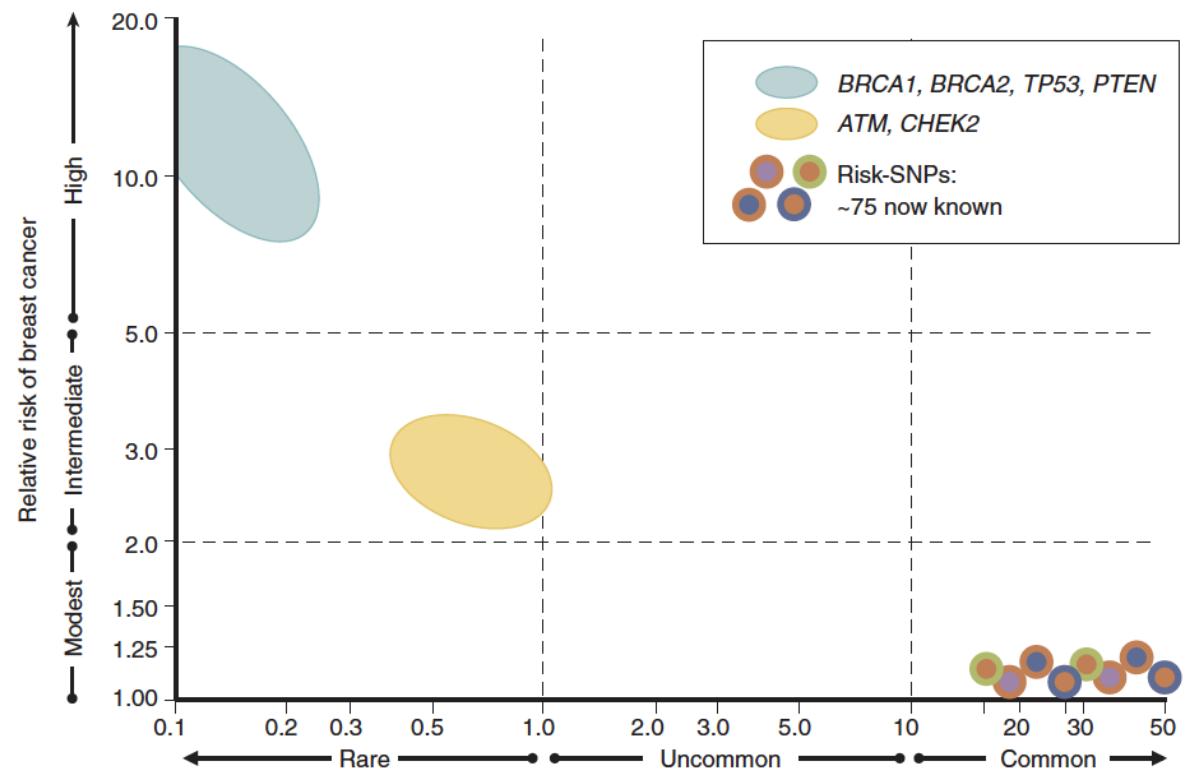
- ▶ Nearly 10% of all cancers are inherited.
- ▶ The majority are inherited in an autosomal dominant manner with incomplete penetrance.
- ▶ How does inherited cancer present?
  - Early age of onset
  - Occurrence of the disorder often in all generations (vertical transmission)
  - Cancer occurring in a gender in which it does not commonly occur
  - Bilaterally affected organs

**Classic *BRCA1* Pedigree**



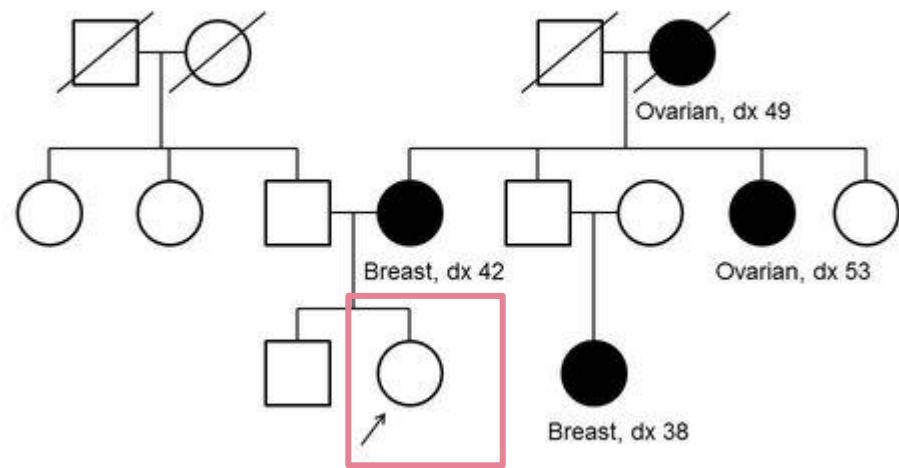
# Breast cancer

- The lifetime prevalence of breast cancer in women is 1 in 8.
- 1-3% of cases are due to inherited mutations in BRCA1 and BRCA2.
- Women with a positive family history of both breast and ovarian cancer have inherited a BRCA1 or BRCA2 mutation in 60-80% of cases.
- Lifetime risk of breast cancer:
  - BRCA1 mutation: 50%-80%
  - BRCA2 mutation: 50%



# Complete vs. incomplete penetrance

Classic *BRCA1* Pedigree

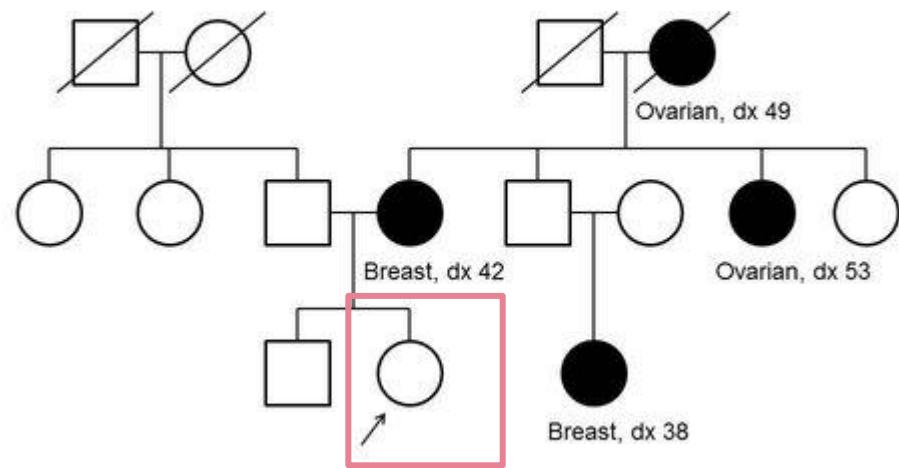


Assuming complete penetrance and autosomal dominant inheritance.

What is the risk that this person is affected?

# Complete vs. incomplete penetrance

Classic *BRCA1* Pedigree

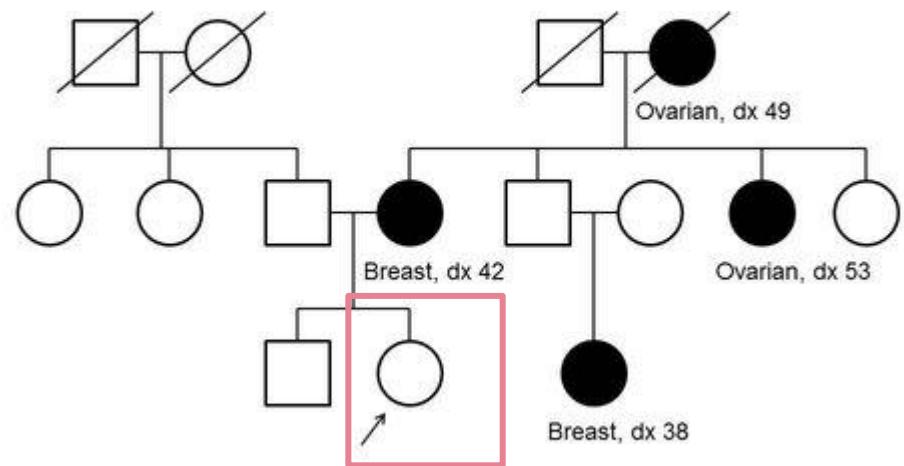


Assuming 70% penetrance and autosomal dominant inheritance.

What is the risk that this person is affected?

# Complete vs. incomplete penetrance

Classic *BRCA1* Pedigree



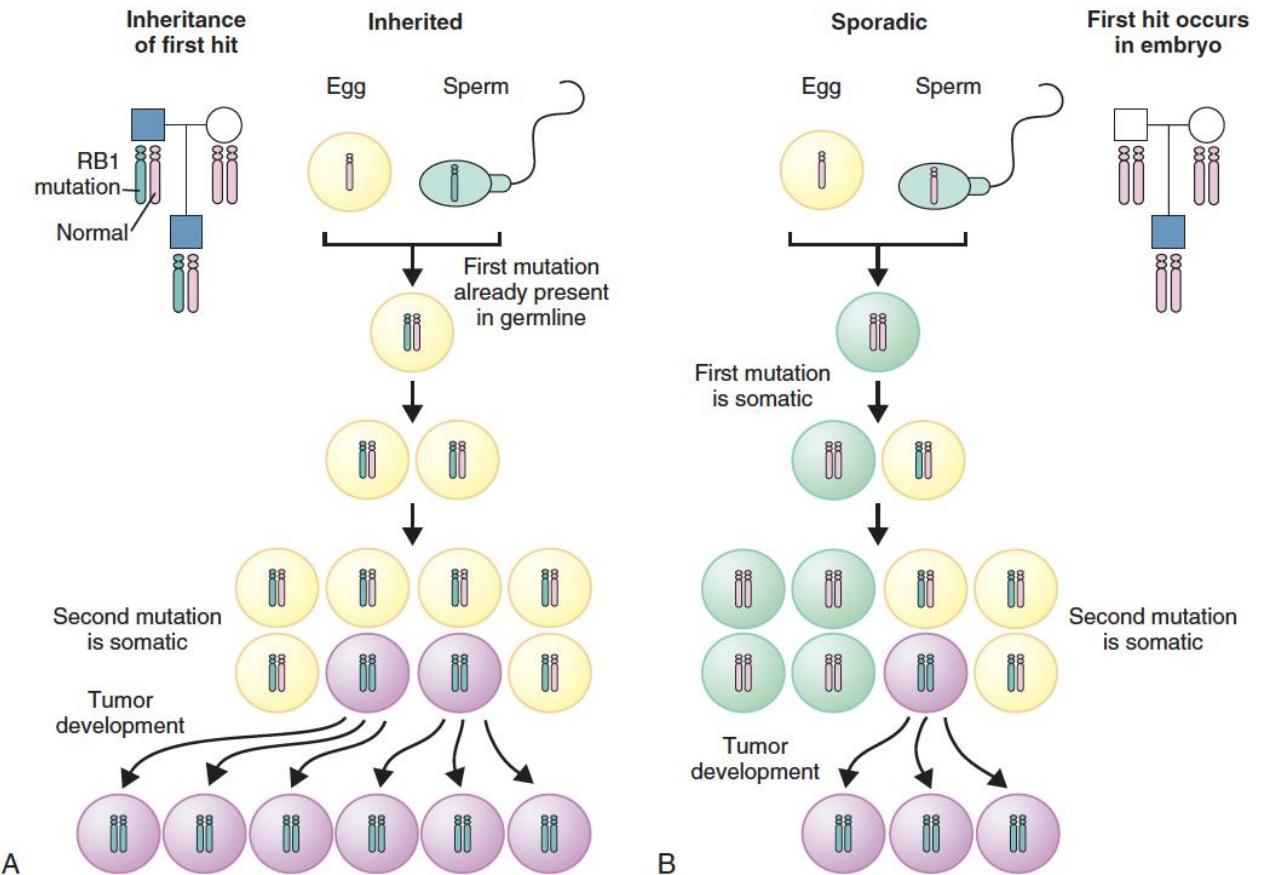
Assuming 70% penetrance and autosomal dominant inheritance.

What is the risk that this person is affected?

What indicates this is a *BRCA1*?

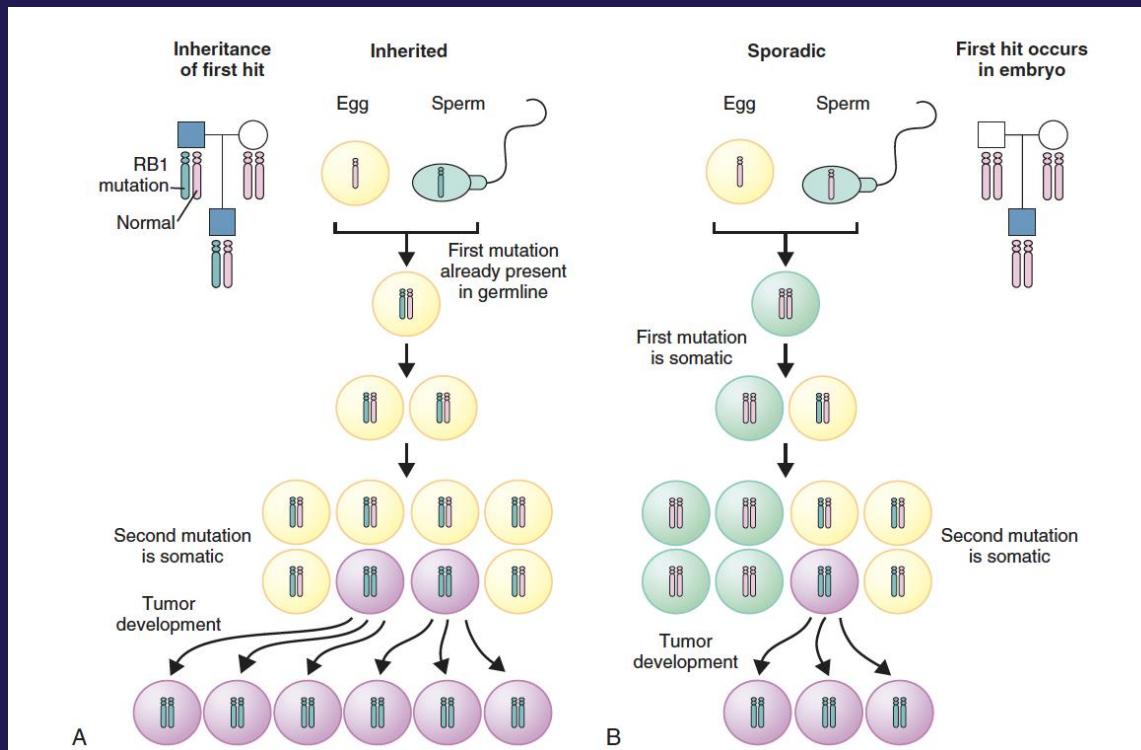
# Rare variants with high penetrance – Breast cancer

- BRCA1 and BRCA2 follow the "two-hit" model for tumor suppressor genes.
- If inherited:
  - Dominant at the individual level
  - Recessive at the cellular level

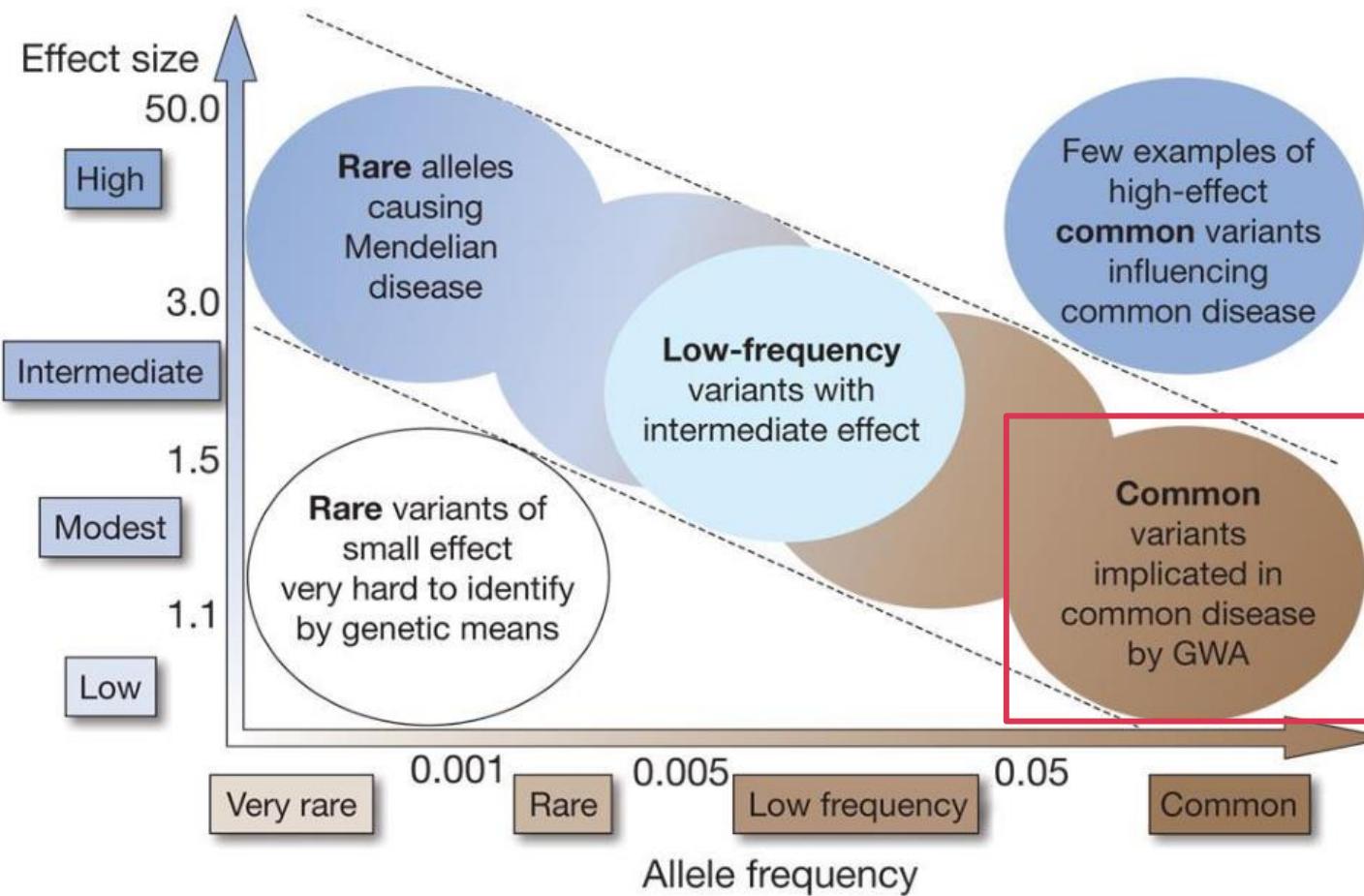


## Take one minute each to explain to your neighbor:

- How does the "two-hit" model for tumor suppressor genes differ between **inherited** and **sporadic** cancer?

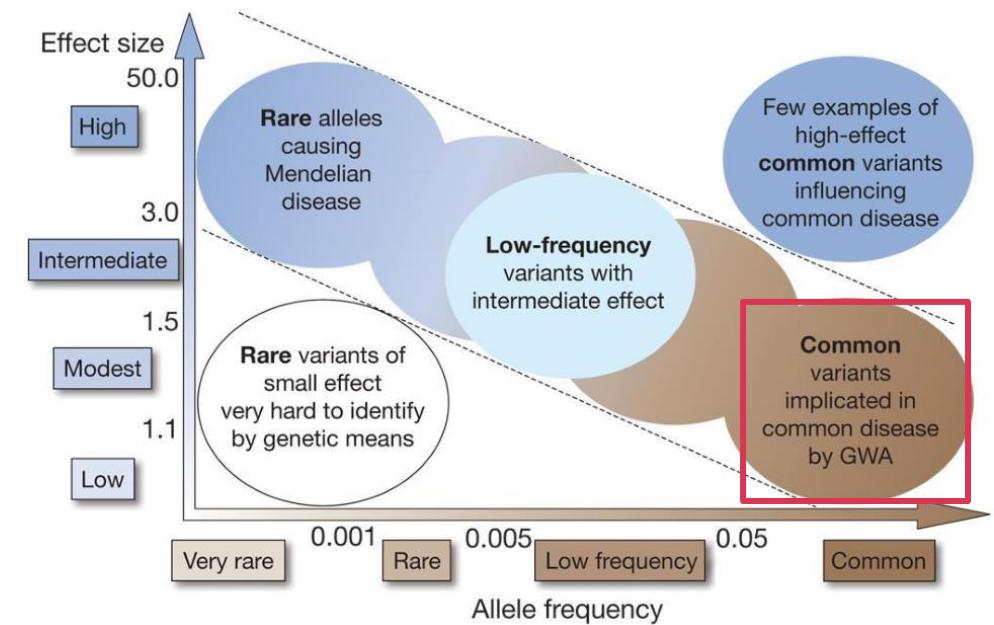


# Common germline variants



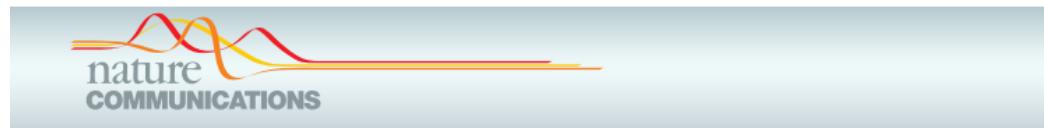
# Common germline variants in cancer

- Driver mutations are typically defined as having a large impact on fitness
- SNPs do not have a strong enough effect on fitness to be considered driver mutations
- We can use SNPs to estimate cancer risk



# Rashkin et al. 2020

- 64,962 cases and 410,350 controls
- Meta-analysis of 18 cancers



ARTICLE

<https://doi.org/10.1038/s41467-020-18246-6>

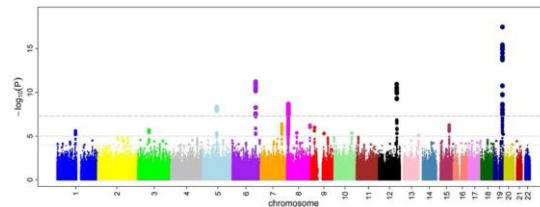
OPEN

Check for updates

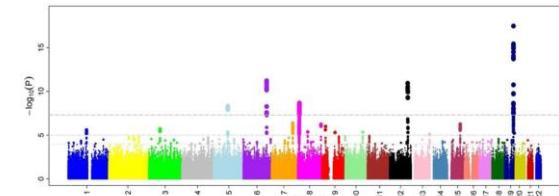
## Pan-cancer study detects genetic risk variants and shared genetic basis in two large cohorts

Sara R. Rashkin<sup>1,8</sup>, Rebecca E. Graff<sup>1,2,8</sup>, Linda Kachuri<sup>1</sup>, Khanh K. Thai<sup>2</sup>, Stacey E. Alexeef<sup>2</sup>, Maruta A. Blatchins<sup>2</sup>, Taylor B. Cavazos<sup>1,3</sup>, Douglas A. Corley<sup>2</sup>, Nima C. Emami<sup>1,3</sup>, Joshua D. Hoffman<sup>1</sup>, Eric Jorgenson<sup>1,2</sup>, Lawrence H. Kushi<sup>1,2</sup>, Travis J. Meyers<sup>1</sup>, Stephen K. Van Den Eeden<sup>1,2,4</sup>, Elad Ziv<sup>5,6,7</sup>, Laurel A. Habel<sup>2</sup>, Thomas J. Hoffmann<sup>1,2,5</sup>, Lori C. Sakoda<sup>1,2,9</sup> & John S. Witte<sup>1,4,5,7,9</sup>

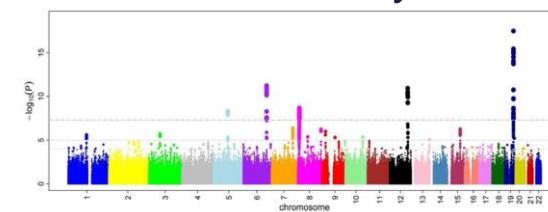
GERA



UK-biobank



Meta-analysis



For each cancer:

- SNPs
- Heritability

Pan-cancer:

- Pleiotropy
- Genetic correlation



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# How many common variants were found?

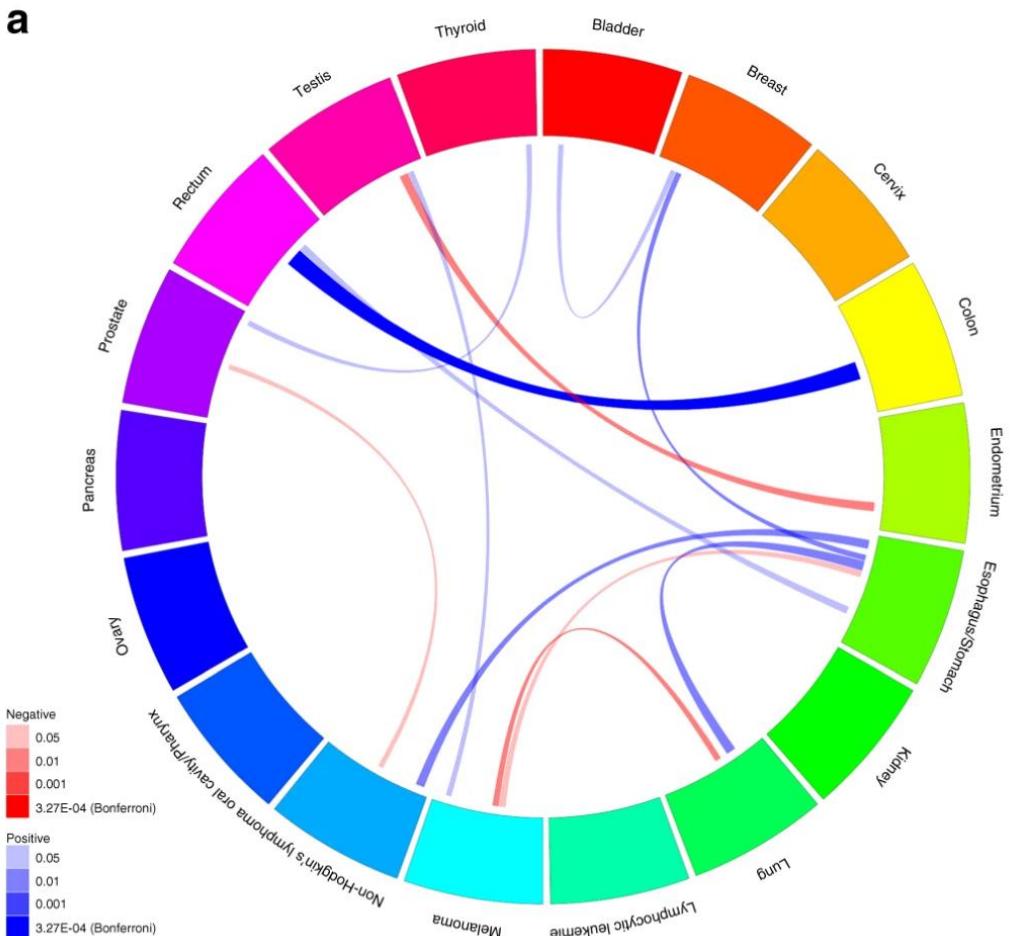
- ⦿ Heritability estimates range between 4%-26%
- ⦿ No. of variants associated with the risk of individual cancers differs
  - ⦿ Colorectal cancer: 205 variants
  - ⦿ Breast cancer: 210 variants
  - ⦿ Oral cavity/pharynx: 29 variants
- ⦿ Have we discovered all variants yet?

Cancer site	Current study (array based)
Bladder	0.08 (0.04–0.12)
Breast	0.10 (0.08–0.13)
Cervix	0.07 (0.02–0.12)
Colon	0.07 (0.04–0.10)
Endometrium	0.13 (0.07–0.18)
Esophagus/stomach	0.14 (0.07–0.21)
Kidney	0.09 (0.04–0.15)
Lung	0.15 (0.10–0.20)
Lymphocytic leukemia	0.14 (0.05–0.23)
Melanoma	0.08 (0.04–0.11)
Non-Hodgkin's lymphoma	0.13 (0.03–0.23)
Oral cavity/pharynx	0.04 (0.00–0.13)
Ovary	0.07 (0.01–0.13)
Pancreas	0.06 (0.00–0.18)
Prostate	0.16 (0.13–0.20)
Rectum	0.11 (0.07–0.16)
Testis	0.26 (0.15–0.38)
Thyroid	0.21 (0.09–0.33)



# Pleiotropic variants

- ⦿ One-directional pleiotropic variants = 85
  - ⦿ 84/85 were in regions previously associated with cancer
  - ⦿ 68/85 were associated with at least one cancer not previously reported
- ⦿ Bidirectional pleiotropic associations = 15
  - ⦿ all were in regions that have previously been associated with cancer
  - ⦿ all were associated with at least one cancer not previously reported
- ⦿ 1 significant genetic correlation



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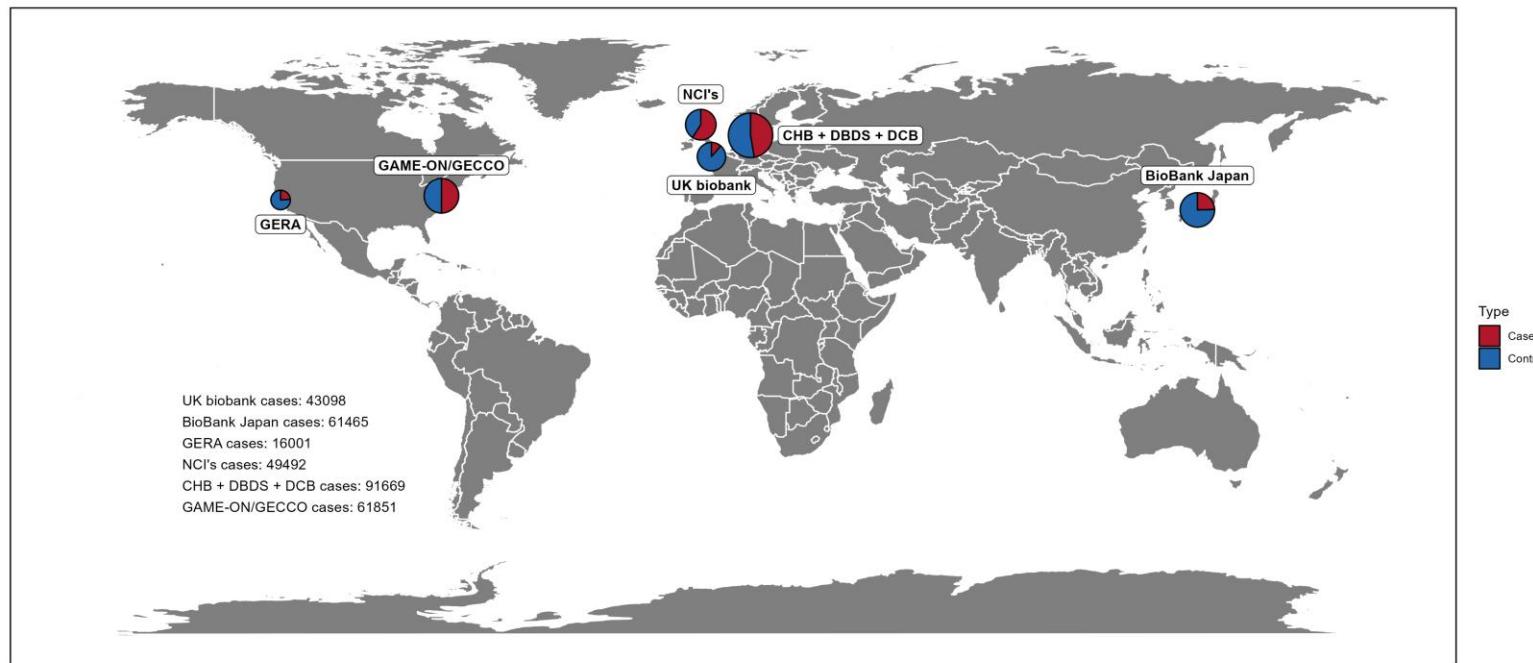


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# Importance of sample size

Not all cancers are equally represented:

Rashkin et al. 2020: **663 (pancreas)** –  
17,881 (breast)



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# Adjusting for multiple testing

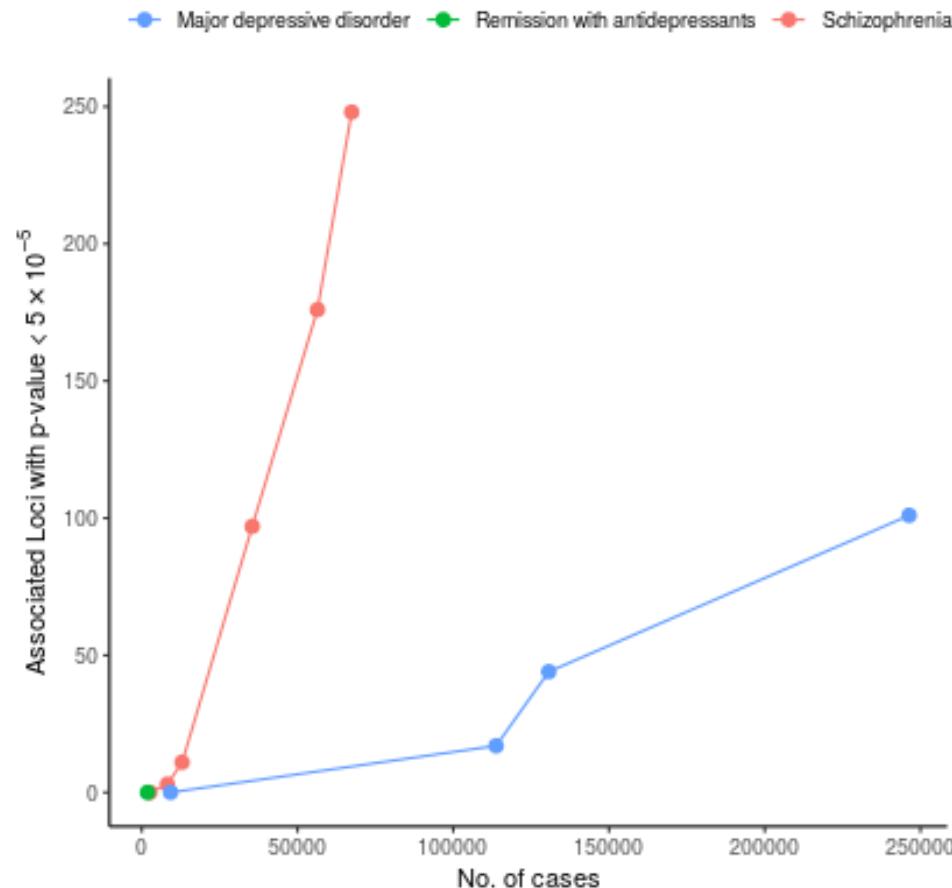
How many cases do you need?

That will depend on:

- No. of controls
- MAF
- Effect size

Breast cancer:

- Large GWAS: 210 variants ( $N = 118,474$ )
- This study: 105 variants ( $N = 17,881$ )



# Exercise 1

BREAK

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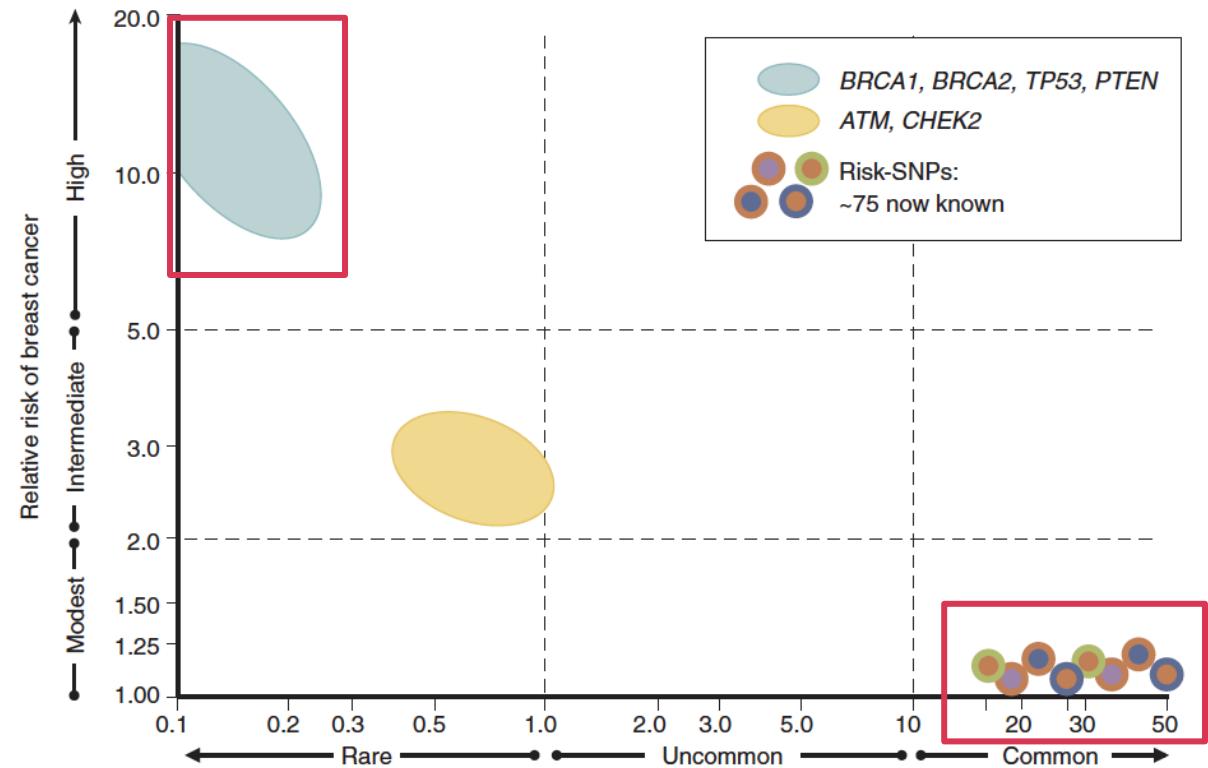
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# Can we combine common and rare germline variants?

- BRCA1 and BRCA2 less common in Finns
- Two frameshift mutations in tumor suppressor genes have high allele frequency in Finns
  - PALB2
  - CHEK2
- Mutations in the high penetrance genes account for less than 25% of the overall inherited predisposition
- GWAS have identified:
  - 210 common variants
  - Heritability of 16%
- 122,978 women in FinnGen, 8401 with breast cancer



# *Can we combine common and rare germline variants?*

**Table 2 Risk for breast cancer events in the population in carriers of the *PALB2* and *CHEK2* frameshift mutations, and in the top decile of the polygenic risk score (PRS).**

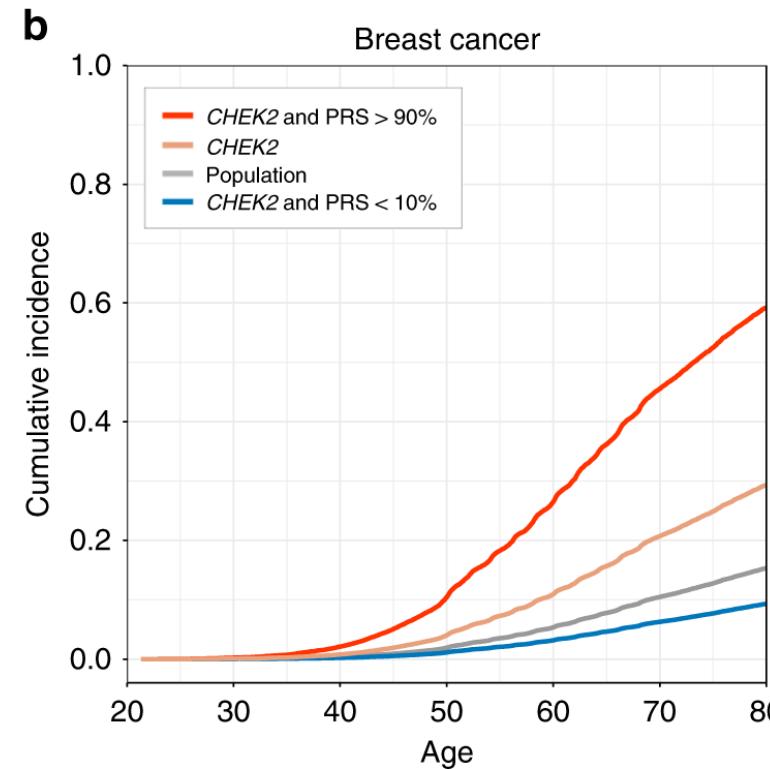
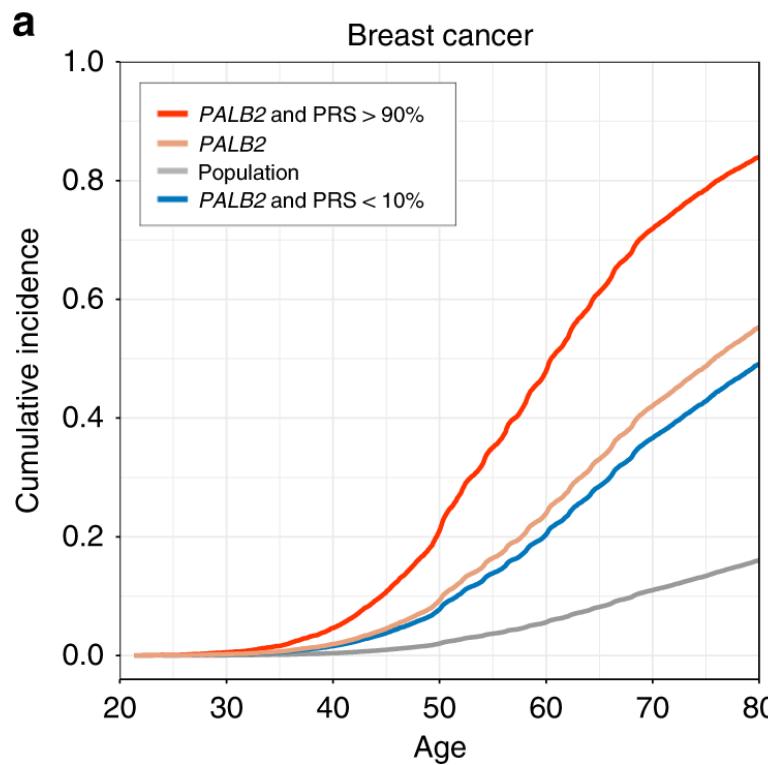
From: [The role of polygenic risk and susceptibility genes in breast cancer over the course of life](#)

	<i>PALB2</i>	<i>CHEK2</i>	PRS > 90%
Number of individuals	336	1648	12,298
Number of cases	84	214	1821
Lifetime risk of breast cancer, % (95% CI)	56.1 (50.8–61.4)	31.7 (29.5–33.9)	32.5 (31.6–33.4)
Mean age at disease onset in cases (SD)	53.1 (10.4)	56.5 (12.0)	57.8 (11.3)

Lifetime risk was estimated by age 80. The variants were rs180177102 (c.1592delT) for *PALB2* and rs555607708 (c.1100delC) for *CHEK2*. The *PALB2* analysis was done in 109,371 women, and the *CHEK2* and PRS analyses in 122,978 women.

*C*/confidence interval, *SD* standard deviation.

# PRS modifies the risk in PALB2 and CHEK2 mutation carriers



Population level was defined as women with PRS between the 10th and 90th percentiles. The *PALB2* analysis was done in 109,371 women and *CHEK2* analysis in 122,978 women. Adjusted survival curves Cox proportional hazards model.

# Is there an interaction?

**Table 5 To test for interaction in all 122,978 women, we compared the polygenic risk score (PRS) effect size in pooled mutation carriers (pooling *PALB2* and *CHEK2*) and in non-carriers.**

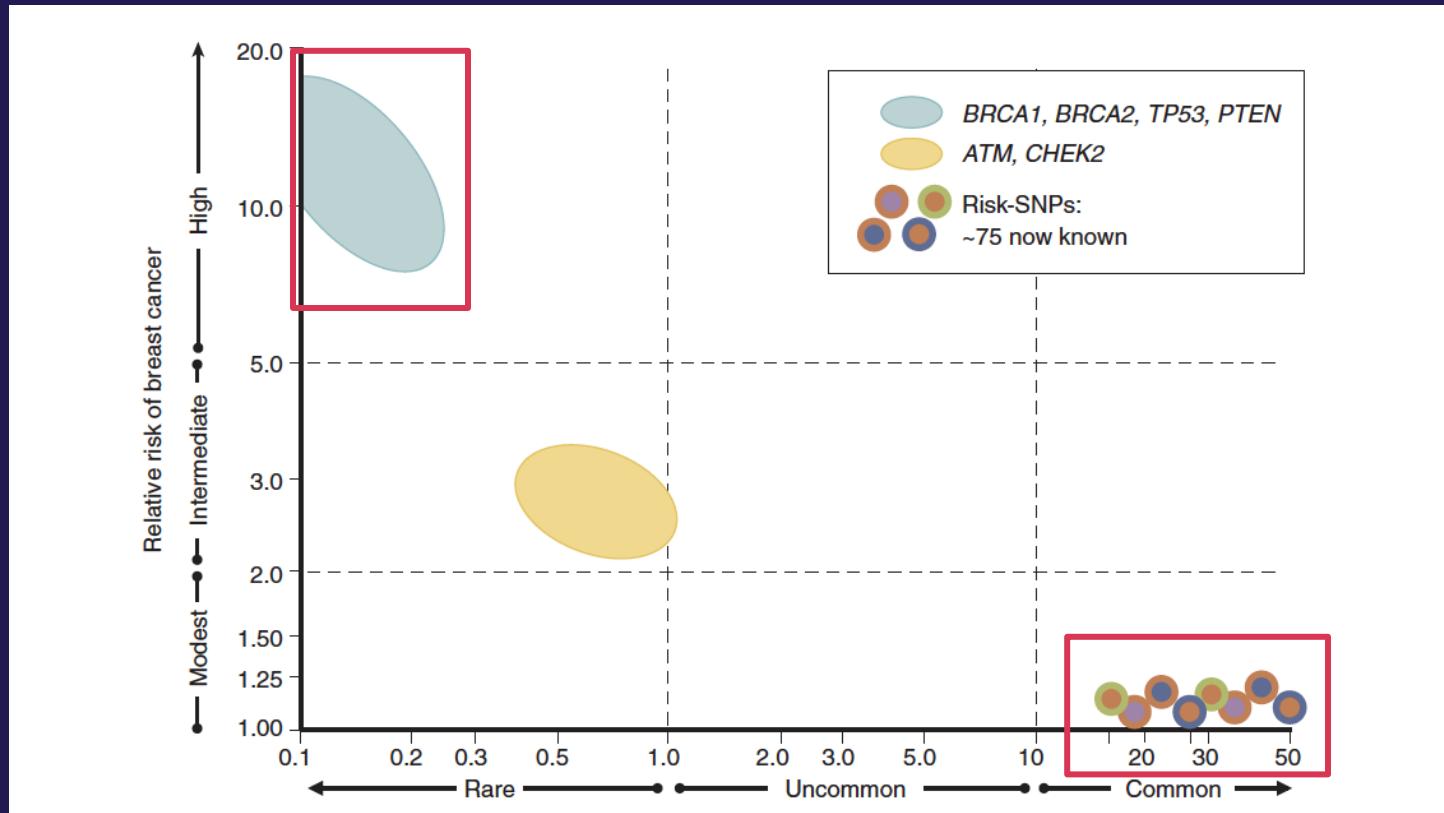
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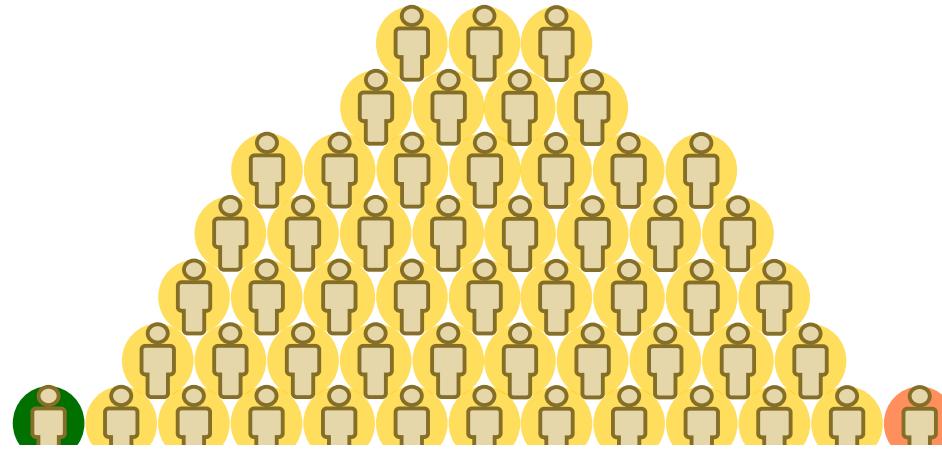
	PRS < 10%	PRS 10–90%	PRS > 90%
Mutation	0.42 (0.23–0.79)	1.00 (reference)	2.44 (1.82–3.28)
No mutation	0.38 (0.34–0.43)	1.00 (reference)	2.37 (2.25–2.50)

The table shows the hazard ratios and 95% confidence intervals for the bottom and top deciles, comparing them to women with an average risk (PRS between the 10th and 90th percentiles).



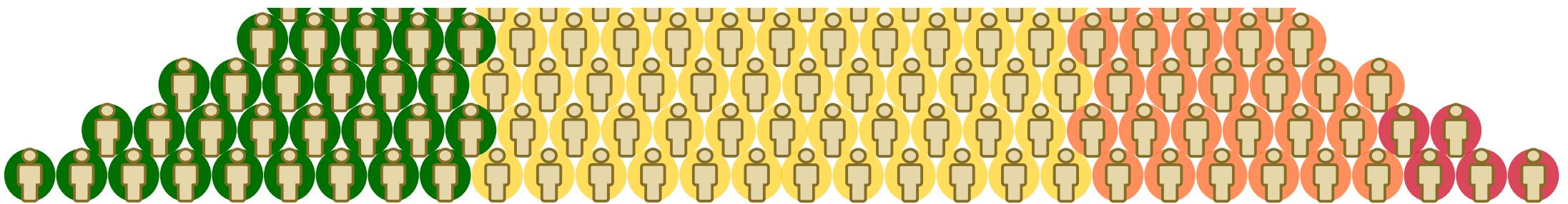
# Are you surprised by the impact of the PRS?



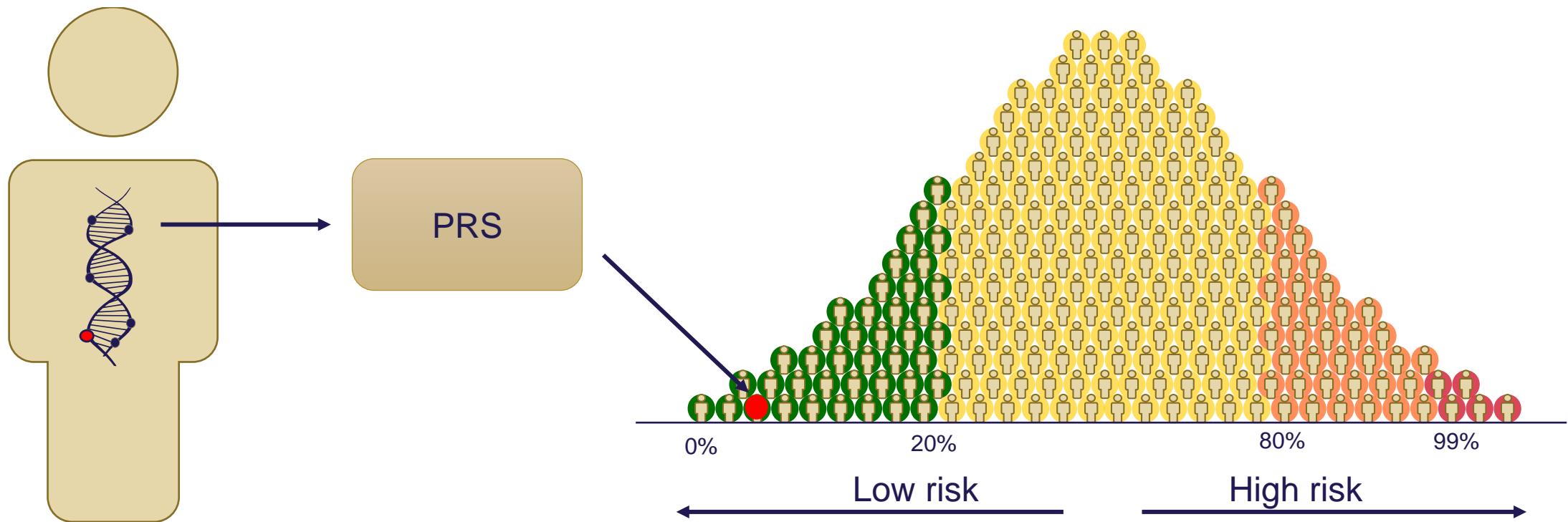


## Cancer risk prediction

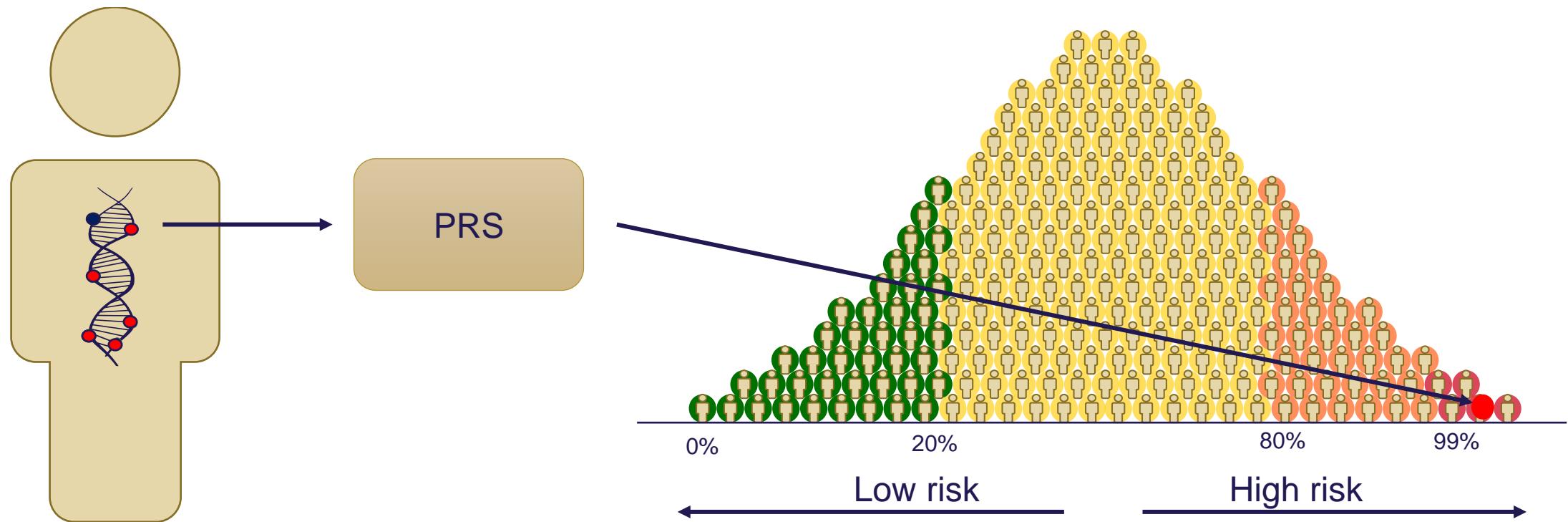
- *Can we improve the current colorectal cancer screening program by combining genetic data with registry data?*



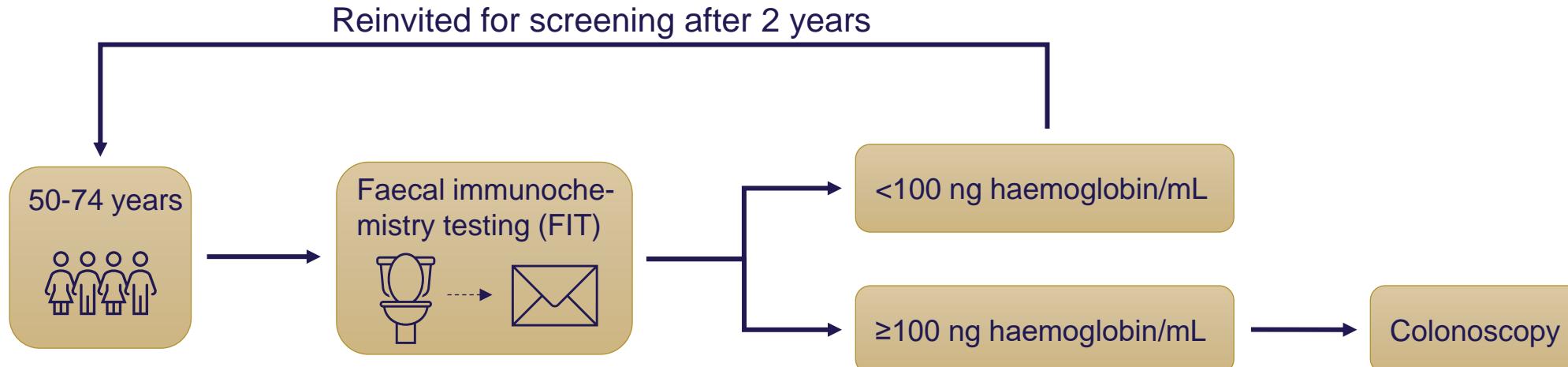
# Genetic risk and common variants



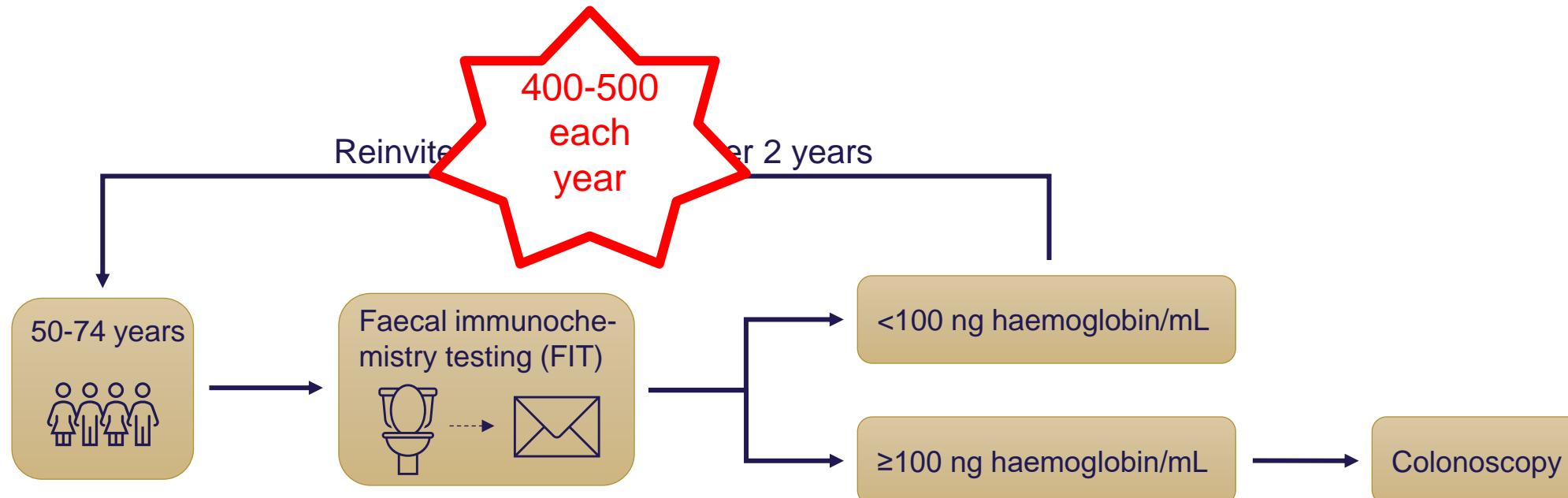
# Genetic risk and common variants



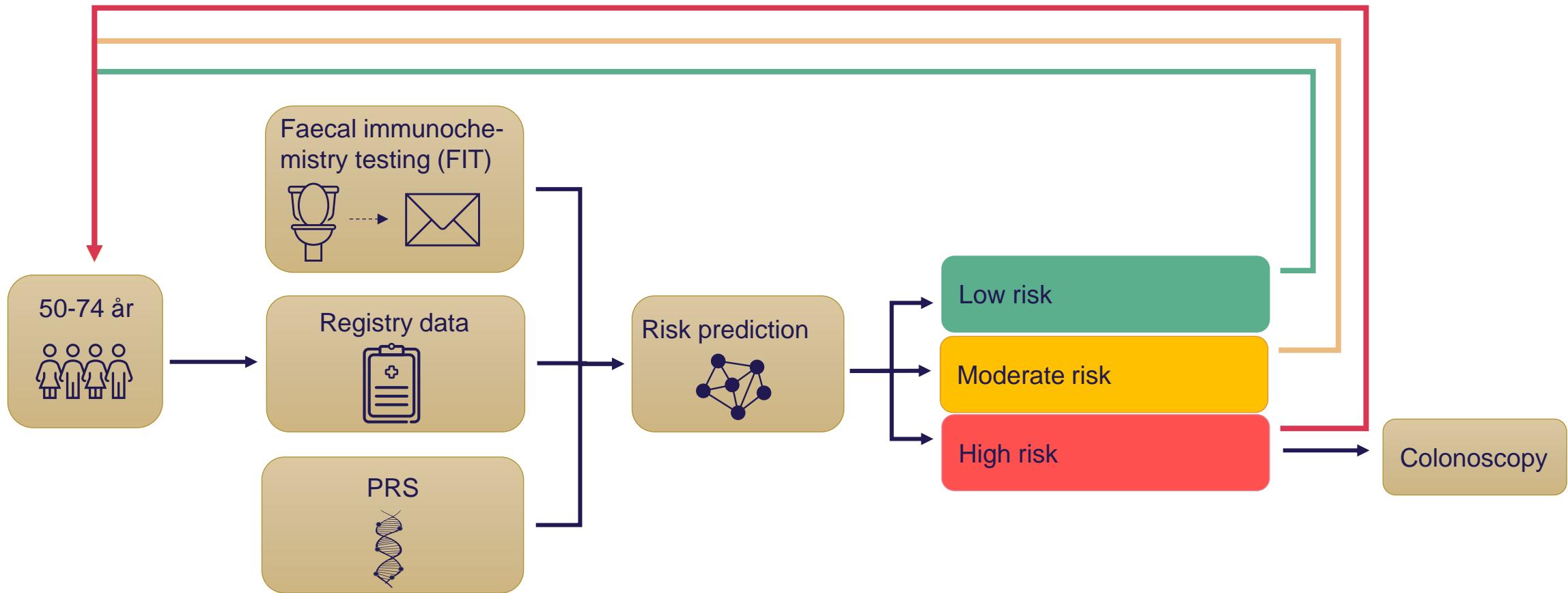
# Why improve the current screening program?



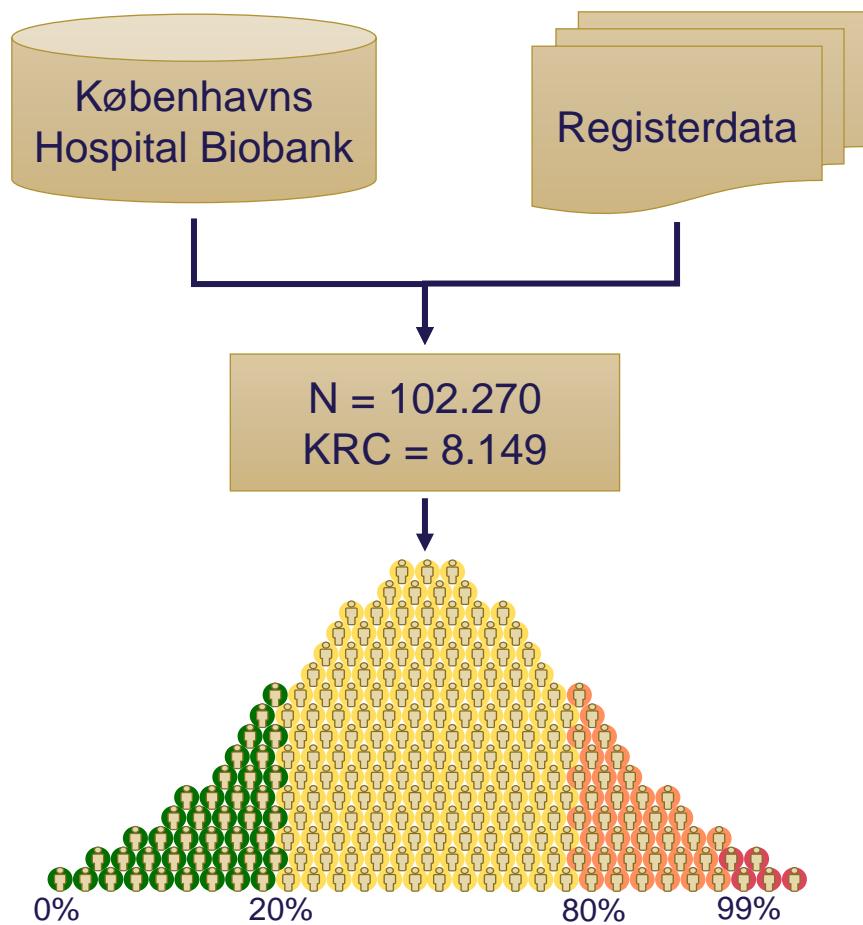
# Why improve the current screening program?

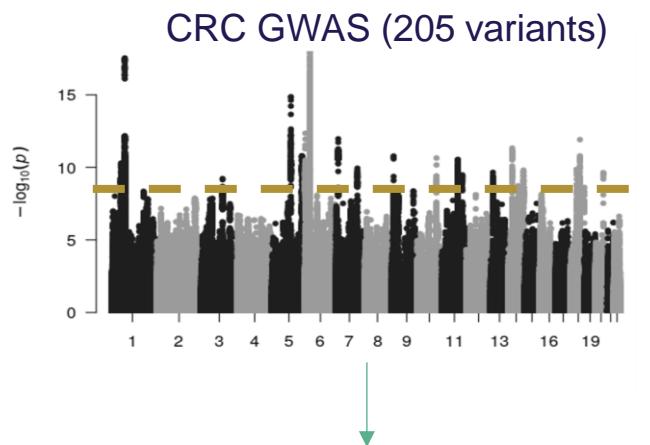


# Why improve the current screening program?

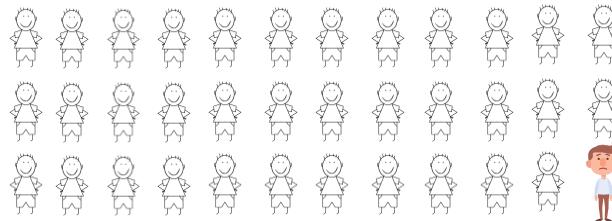


# Preliminary results





Copenhagen hospital biobank



	SNP 1	SNP 2	SNP 3	SNP 4
Individual 1	TT	AG	TG	CA
Individual 2	AT	CT	GG	CC
Individual 3	TC	TT	CC	AG

### CRC PRS

$$\begin{array}{l} \text{Individual 1} \quad -1 + 0 - 1.5 + 2 = \mathbf{-0.5} \\ \text{Individual 2} \quad -0.5 + 1 - 0 + 0 = \mathbf{0.5} \\ \text{Individual 3} \quad -0.5 + 0 - 0 + 2 = \mathbf{1.5} \end{array}$$



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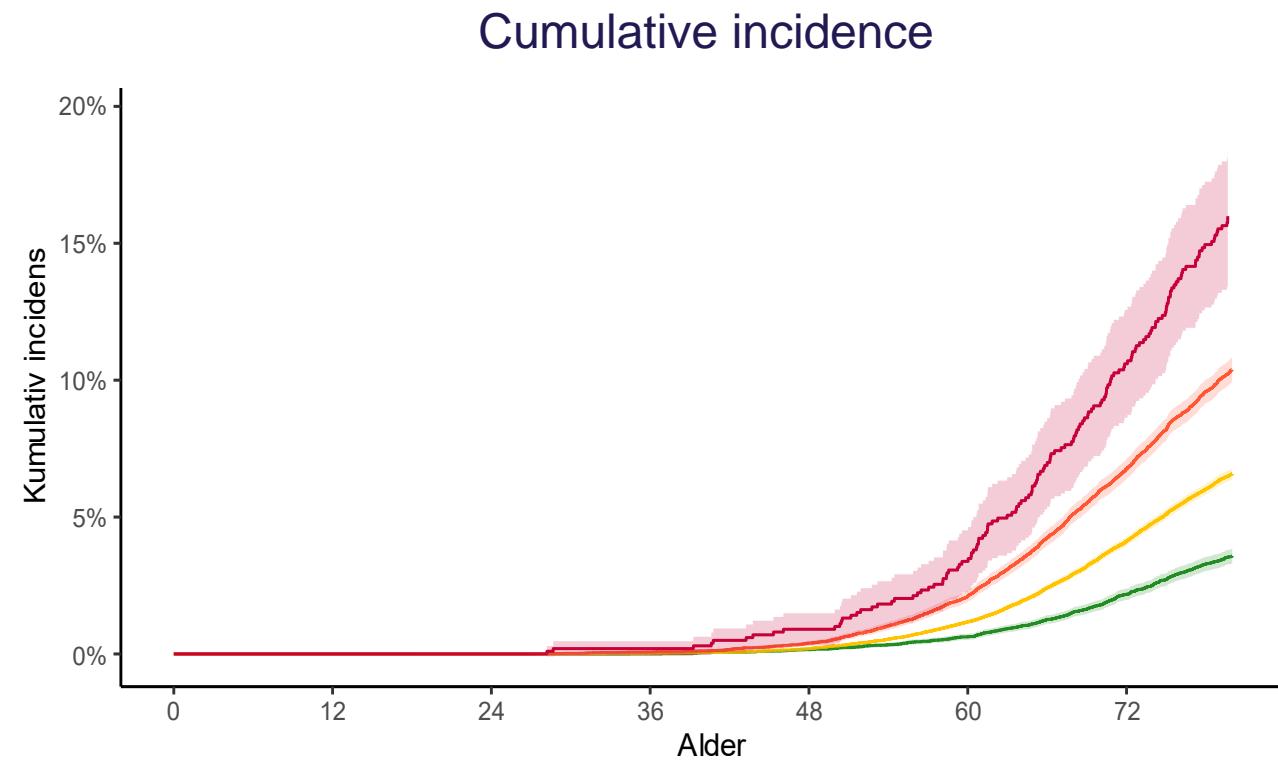
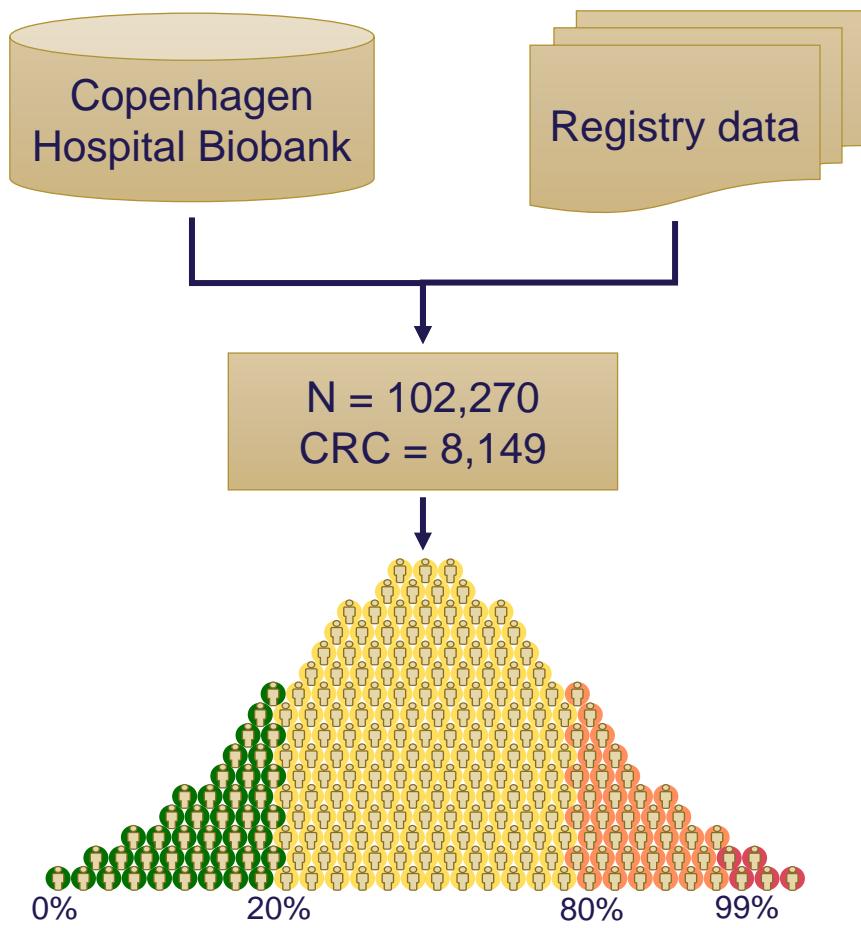


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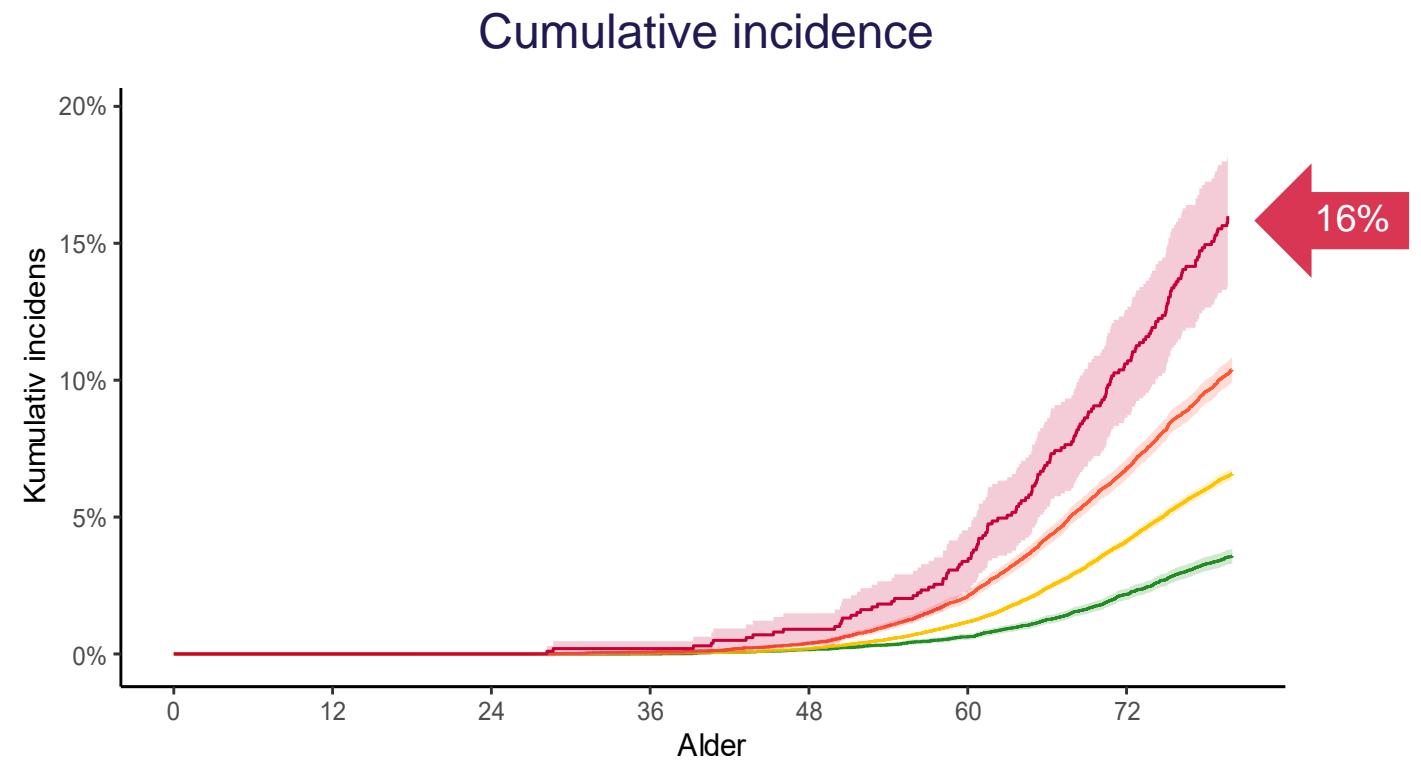
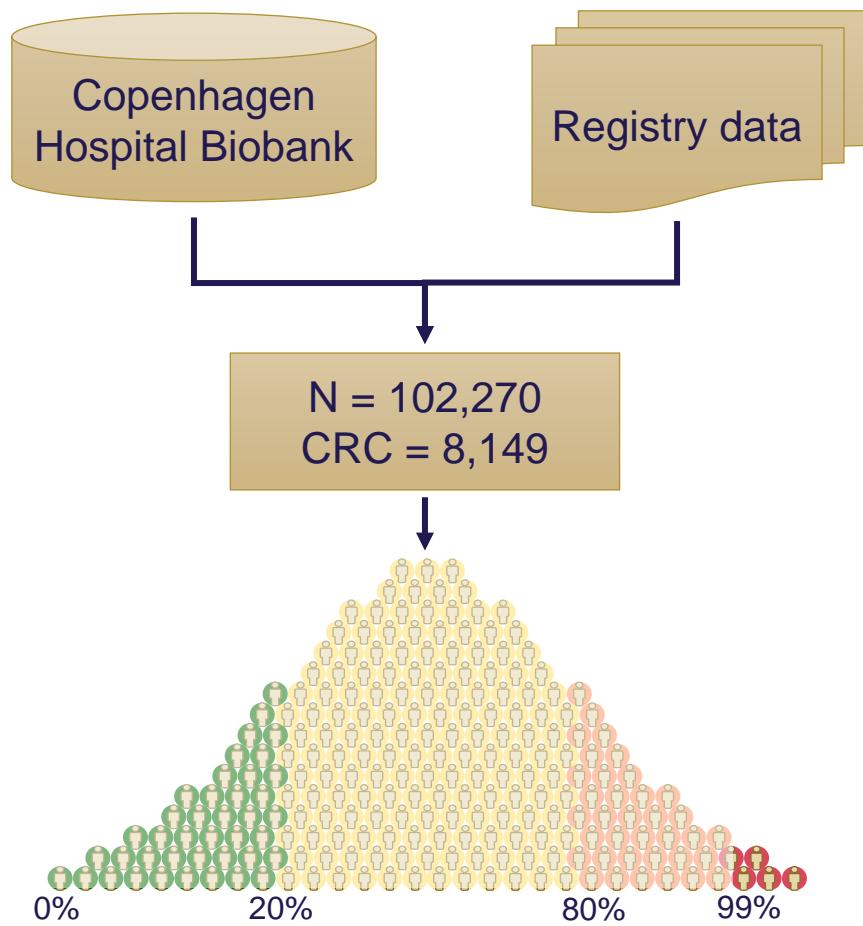
Why did I not use one of the new fancy LD-based methods?



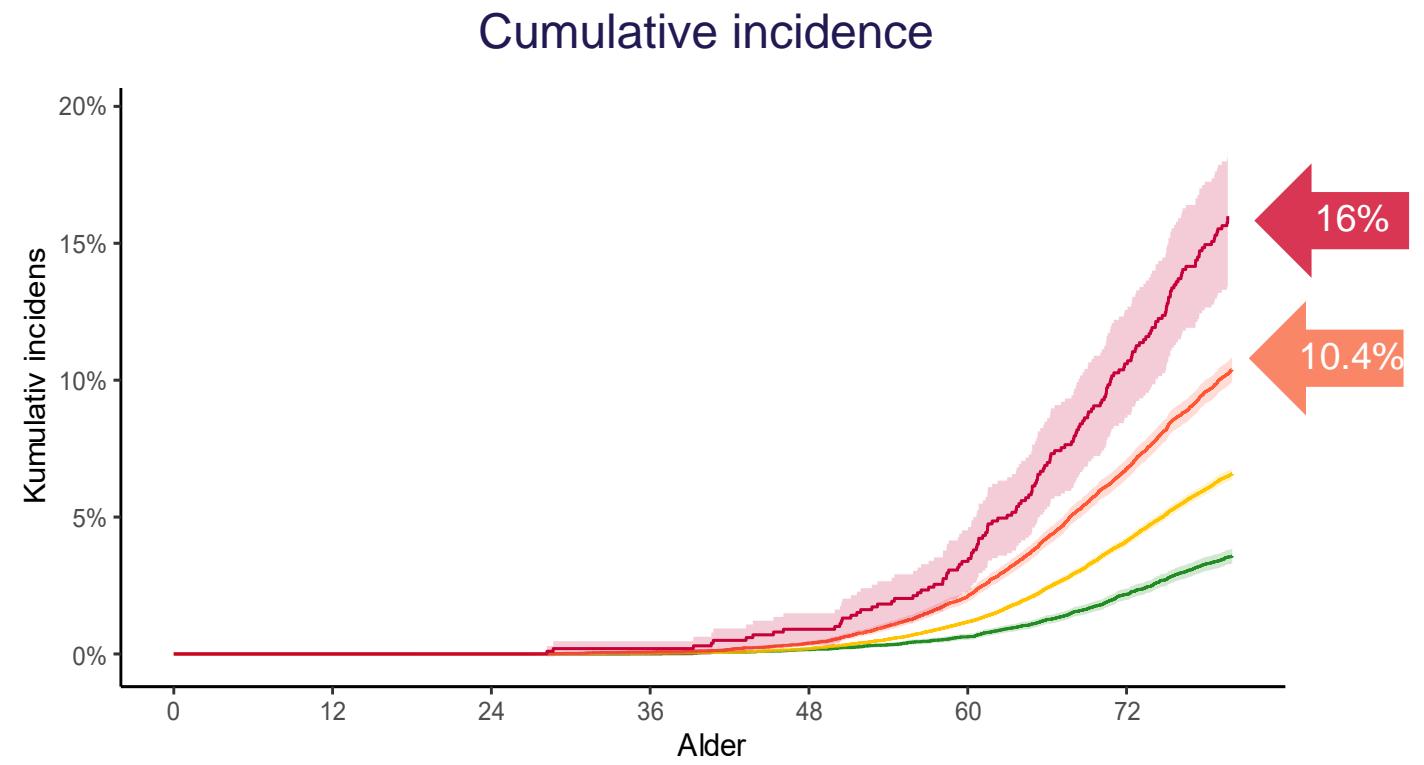
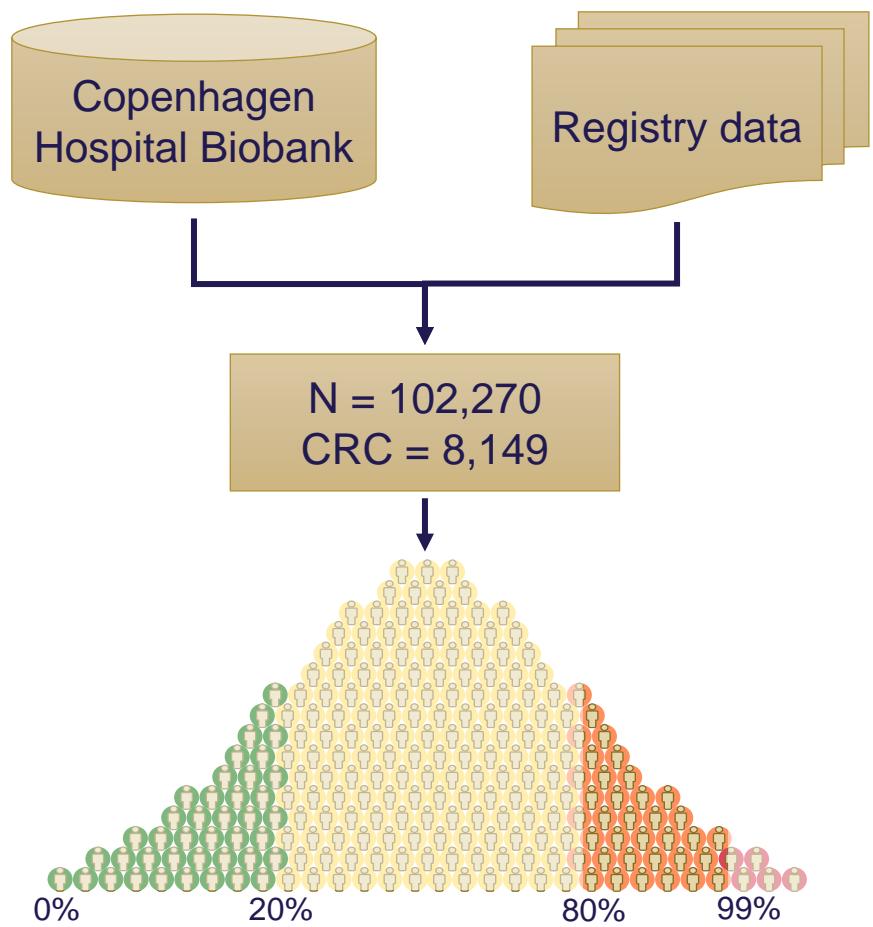
# Preliminary results



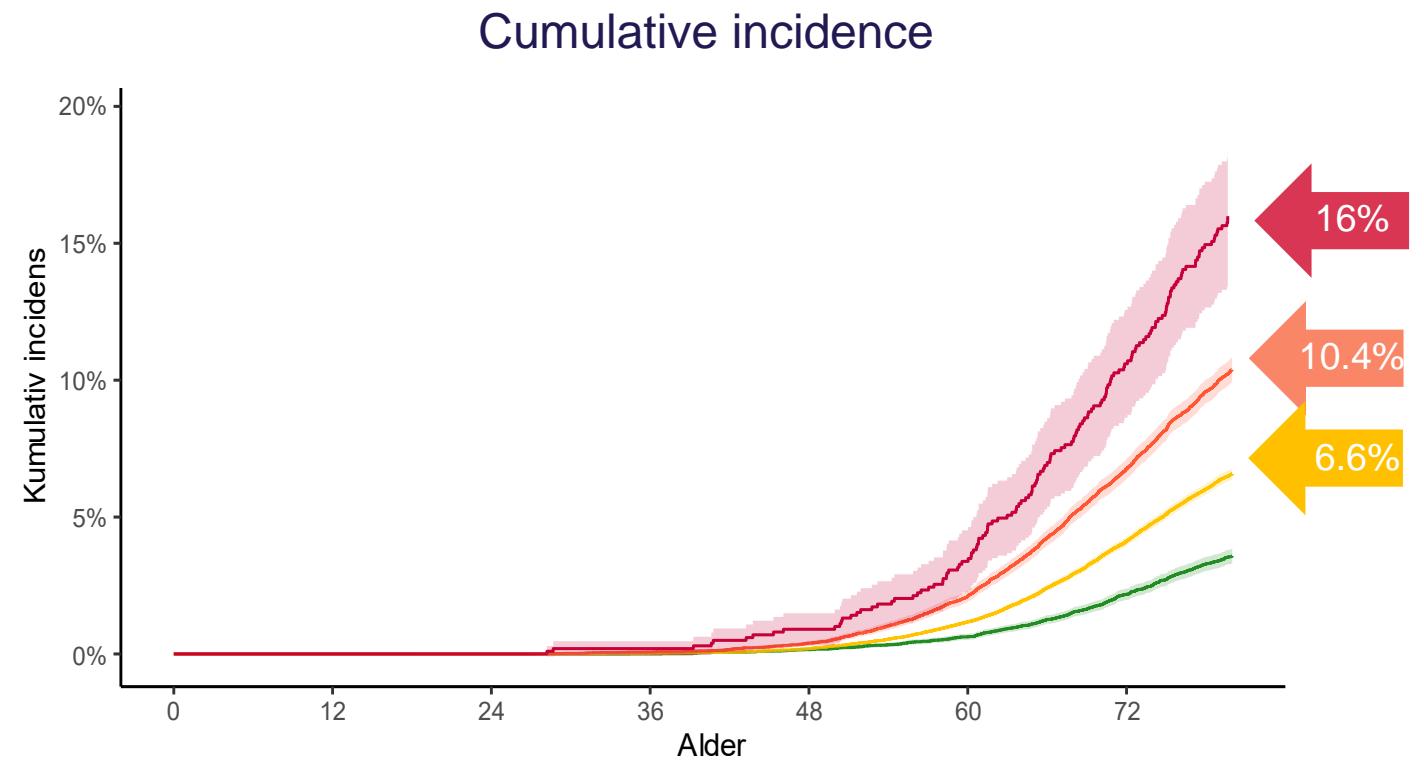
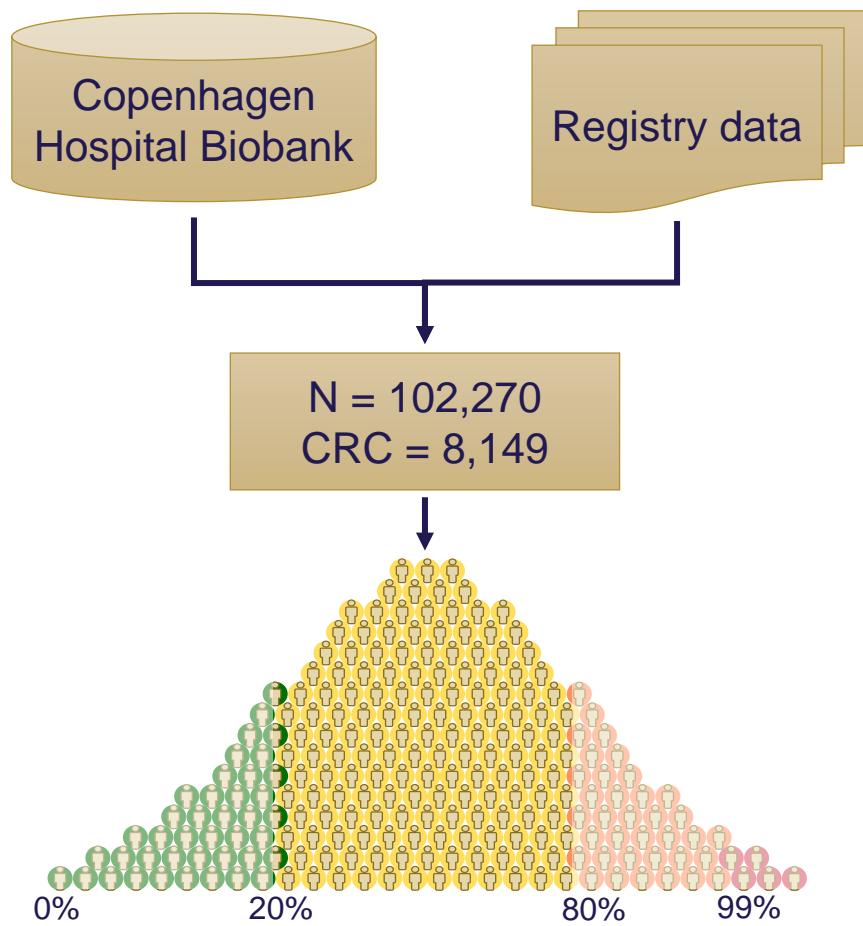
# Preliminary results



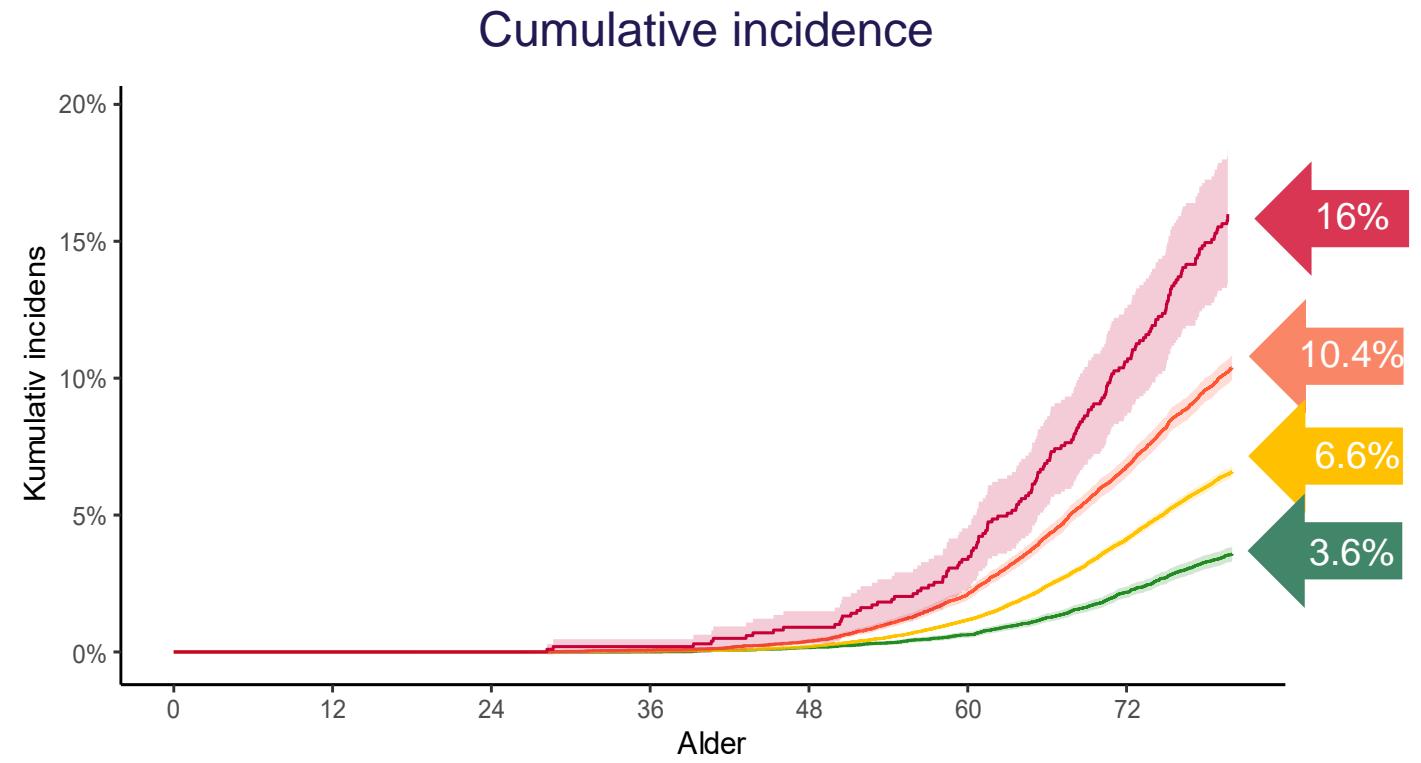
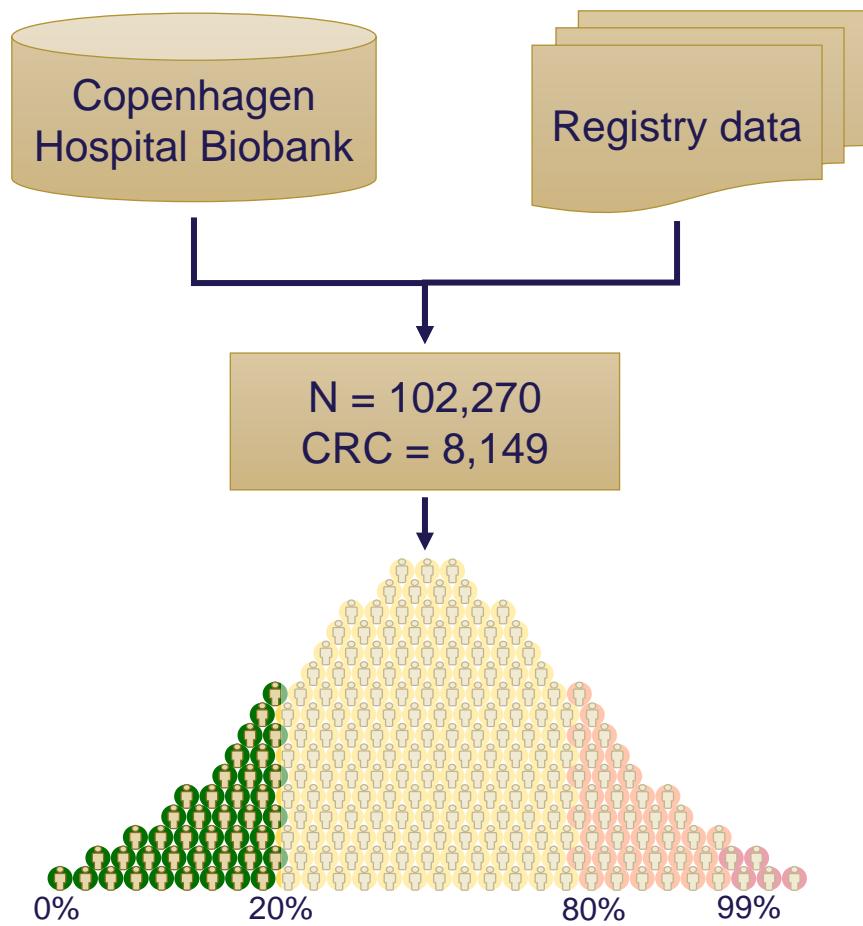
# Preliminary results



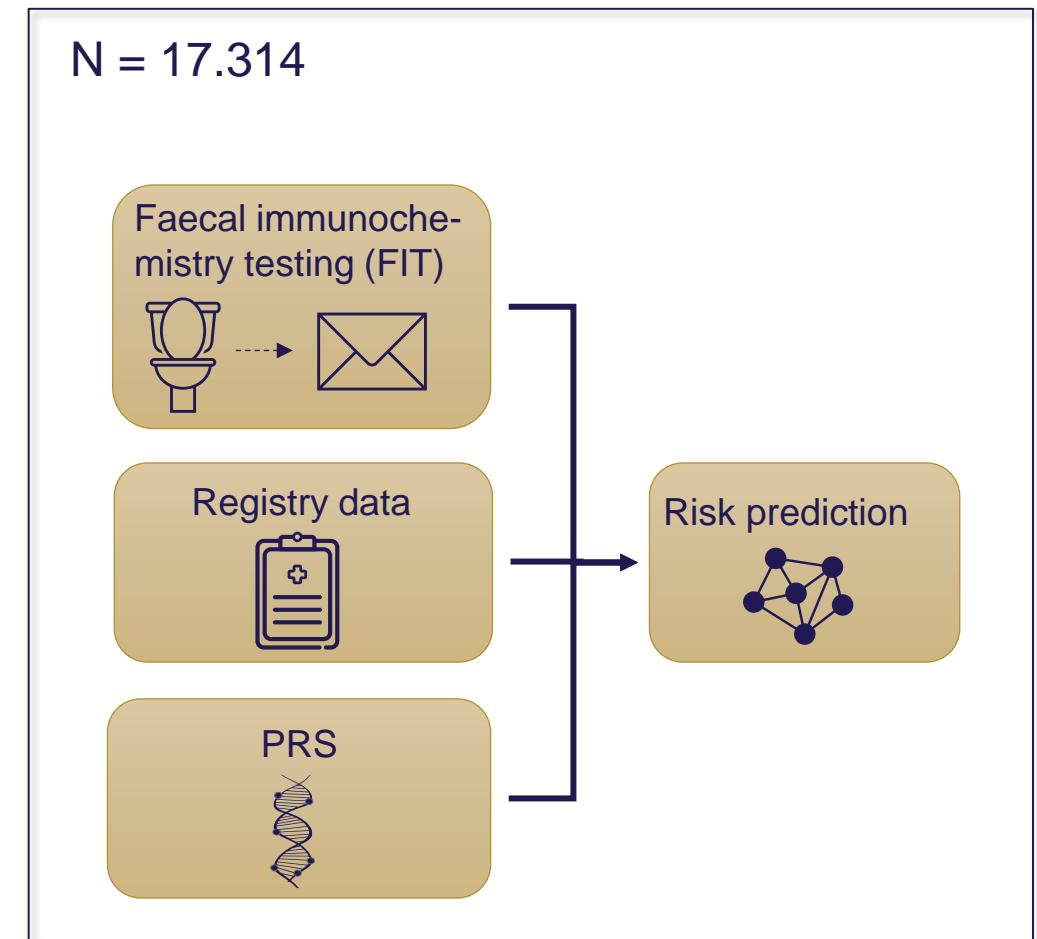
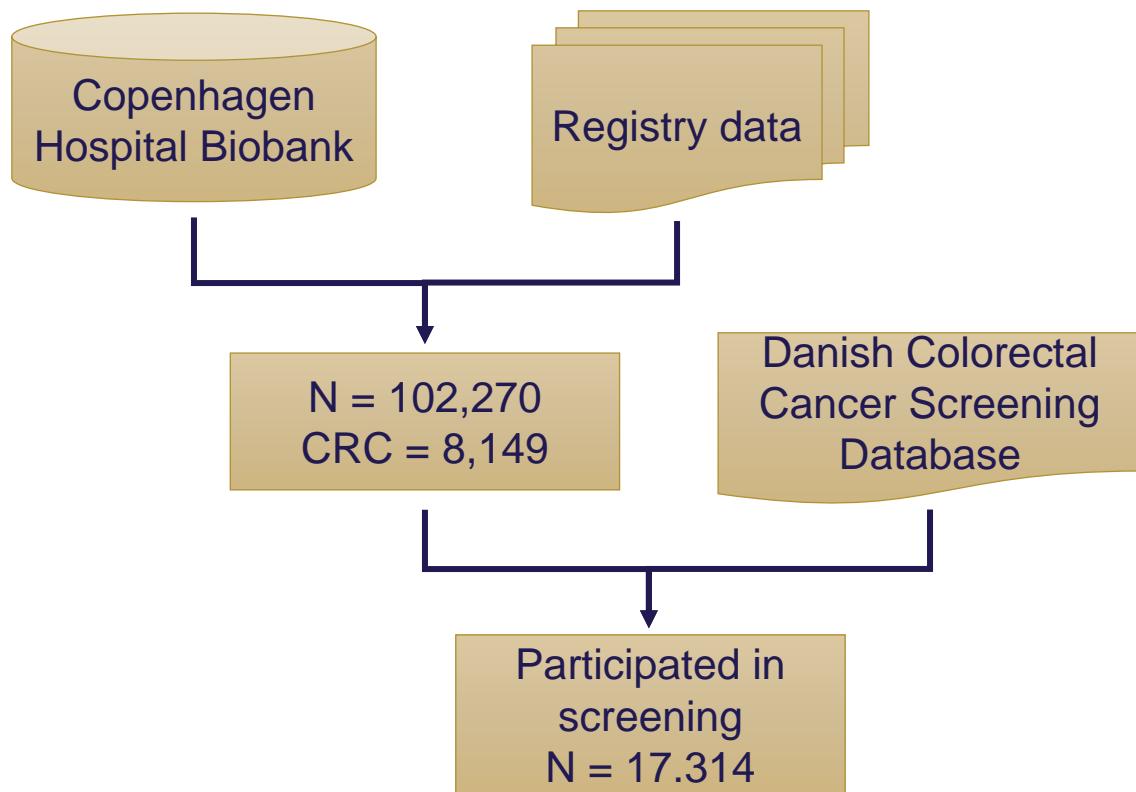
# Preliminary results



# Preliminary results

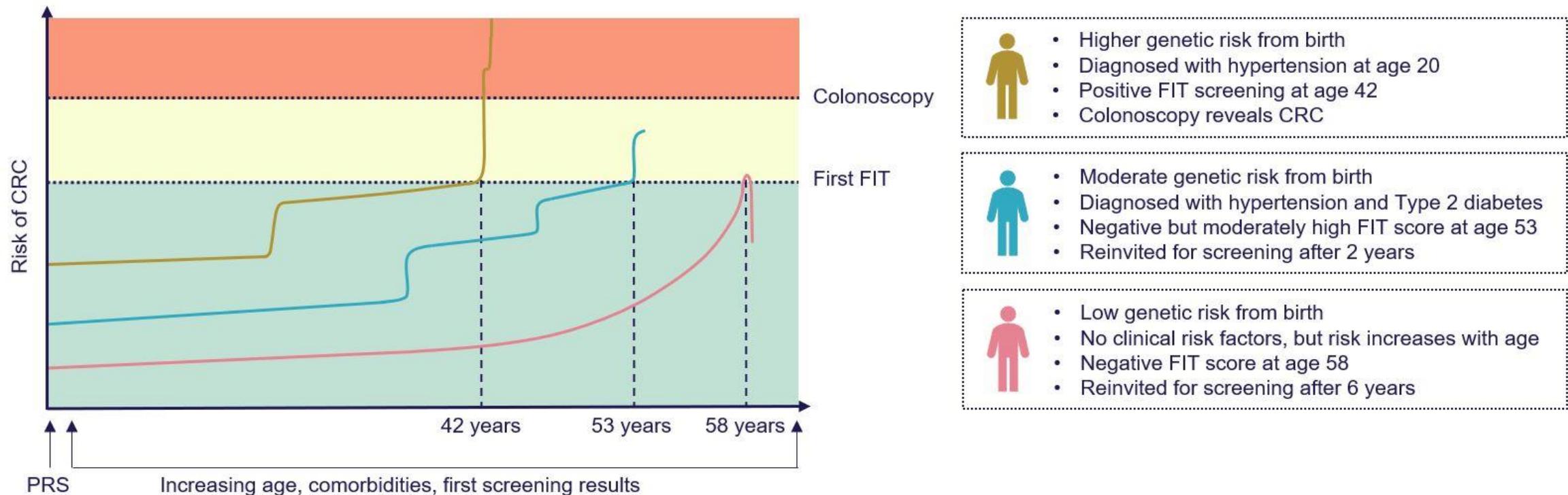


# Preliminary results



# Dynamic risk prediction

- Using a unique Danish dataset including genetics and comprehensive registry data, we will develop and assess a personalized risk-based screening strategy to identify individuals at high risk across age groups



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What is your opinion on personal screening?



A photograph of a group of people dancing in a dimly lit room. The scene is bathed in warm, yellowish light from a large, low-angle source, possibly a projector or a lamp. The舞者 are silhouetted against this bright background, their forms dark and fluid. Some are in dynamic poses, like a man in the foreground with one leg kicked high and arms outstretched, while others are more relaxed, holding hands or moving gracefully. The background is a plain, light-colored wall, and the overall atmosphere is intimate and energetic.

## Exercise 2-6