U.S. DEPARTMENT OF HEALTH AND HUMAN SERVICES

National Institutes of Health

## **STUDY DESIGN**

## Facilitating Collaboration in Genome-Wide Association Studies

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#### General Strategy for Prostate & Breast Cancer GWAS



# Considerations in Whole Genome Scans in Cancer

- Extent of Coverage of Genome
- Primary Scan
  - Adequate Size
  - Trade-off with effect
  - Study Design

**Replication Strategy** 

- Power calculations for how many stages
- Joint vs consecutive analysis (Skol Nat Genet 2006)
- Study Design

# Estimated number of SNPs in the human genome as a function of their minor allele frequency



Adapted from Reich et al. Nat Genet (2003)

### **DESIGN ISSUES**

- Study Size
- Chance

## Bias

#### 2-Stage WGS Strategy

Power as a function of MAF and sample sizes typed in the first stage



#### **Disease model**

- Prevalence 1%
- Single susceptibility SNP with a linkage disequilibrium  $r^2 = 0.8$  with 1 genotyped SNP
- Dominant transmission
- Genotype relative risk : 1.5

#### Study design

# Cases = # Controls
# Cases in stage 1 : as indicated
# SNPs in stage 1 : 500,000
# Cases in stage 2 : 2,000
# SNPs in stage 2 : 25,000
Significance level 0.00002

Note: Significance level = 0.00002 => 10 false positives

### A quick note on 'ideal' power

- r<sup>2</sup> represents the statistical correlation between two loci
- It is a useful measure for association between susceptibility loci and SNPs
- Suppose SNP1 is involved in disease susceptibility and we genotype cases and controls at a nearby site SNP2
- To achieve the same power to detect associations at SNP2 as we would have at SNP1, sample size must increase by a factor of 1/r<sup>2</sup>

| r <sup>2</sup> | Additional<br>Samples Required |
|----------------|--------------------------------|
| 0.50           | 100%                           |
| 0.64           | 56%                            |
| 0.70           | 43%                            |
| 0.80           | 25%                            |
| 0.90           | 11%                            |
| 0.95           | 5%                             |
| 1.00           | 0%                             |

#### **Power of the first two phases of CGEMS** Point wise significance 10<sup>-7</sup>; "genome wide" significance 0.05



Skol et al. Nat Genet (2006)



# Power of genome wide screen as a function of the number of retained false positive



#### Model :

One susceptibility allele : MAF = 0.1 , Odds Ratio = 1.4 LD of typed marker with susceptibility marker :  $r^2 = 0.8$  Number of cases/control pairs : 1,200 Number of markers types : 500,000

### **Design Considerations**

- Disease:
  - Incident
  - Prevalent
- Type:
  - Cohort
  - Case-control
    - Population-based
    - Hospital-based
- Quality:
  - Diagnosis (phenotype)
  - Study base
  - Biases

BIAS

#### Lung Cancer Risk and CYP2D6\*

|                          | Study 1            | Study 2          | Study 3         |  |
|--------------------------|--------------------|------------------|-----------------|--|
| Relative Risk            | 15. 6 (4.8 – 55.9) | 6.1 (2.2 – 17.1) | 0.6 (0.3 – 1.2) |  |
| Epidemiologic<br>Quality | Low                | Intermediate     | High            |  |
| (% participation)        | (?)                | (26%)            | (80%)           |  |

\* Risk of homozygous extensive metabolizers compared to homozygous poor metabolizers.

#### General Strategy for Prostate & Breast Cancer GWAS



### **Results: Overall**

|                           |          |                        |                                       |                        | BPC3                                  |
|---------------------------|----------|------------------------|---------------------------------------|------------------------|---------------------------------------|
| Cohort                    | Genotype | Cases / Controls       | OR (99%CI)                            | P-value                |                                       |
| All                       | CC       | 5,566 / 6,666          | Ref.                                  | 4.00x10 <sup>-19</sup> | 0000/0000                             |
| (p <sub>het</sub> =0.483) | AC       | 2,064 / 1,842          | 1.33 (1.20-1.46)                      |                        | 8000/8000                             |
|                           | AA       | 279/175                | 1.87 (1.44-2.42)                      |                        |                                       |
| ACS                       | СС       | 871 / 955              | Ref.                                  | 2 63x10 <sup>-5</sup>  | · · · · · · · · · · · · · · · · · · · |
|                           | AC       | 238 / 166              | 1.56 (1.17-2.08)                      | 2.00010                | 0                                     |
|                           | AA       | 21/9                   | 2.61 (0.92-7.37)                      |                        |                                       |
|                           |          |                        | · · · · · · · · · · · · · · · · · · · |                        | ↔ ↔                                   |
| ATBC                      | CC       | 606 / 623              | Ref.                                  | 0.012                  | ♦                                     |
|                           | AC       | 312 / 260              | 1.23 (0.95-1.60)                      |                        |                                       |
|                           | AA       | 45 / 25                | 1.81 (0.94-3.51)                      |                        | 0                                     |
|                           |          |                        | _ /                                   |                        | d                                     |
| EPIC                      | CC       | 551 / 869              | Ref.                                  | 0.258                  | _                                     |
|                           | AC       | 169 / 233              | 1.17 (0.87-1.58)                      |                        |                                       |
|                           | AA       | 12/12                  | 1.57 (0.53-4.59)                      |                        |                                       |
| HDES                      | CC       | 195 / 515              | Rof                                   | $2 62 \times 10^{-3}$  |                                       |
| 11110                     | 40       | 493 / 343<br>157 / 114 | 1 53 (1 07-2 19)                      | 3.03210                |                                       |
|                           |          | 11/6                   | 2.09 (0.56-7.80)                      |                        | o <b>≣</b> <u>e</u>                   |
|                           | 700      | 1170                   | 2.00 (0.00 7.00)                      |                        | ~                                     |
| MEC                       | CC       | 1,426 / 1,565          | Ref.                                  | 2.58x10 <sup>-7</sup>  |                                       |
|                           | AC       | 728 / 614              | 1.32 (1.11-1.58)                      |                        | 4 <b>4</b>                            |
|                           | AA       | 146 / 88               | 1.89 (1.30-2.75)                      |                        | 0 <b>-</b>                            |
| PHS                       | CC       | 801 / 1.123            | Ref.                                  | 0.013                  | _                                     |
| -                         | AC       | 200 / 220              | 1.27 (0.96-1.69)                      |                        | _9- <b>_</b> -~                       |
|                           | AA       | 21 / 15                | 2.06 (0.83-5.12)                      |                        | ·                                     |
| PLCO                      | CC       | 816 / 986              | Ref.                                  | 0.014                  | 0                                     |
|                           | AC       | 260 / 235              | 1.33 (1.02-1.72)                      |                        | 0                                     |
|                           | AA       | 23 / 20                | 1.39 (0.63-3.10)                      |                        |                                       |
|                           |          |                        | · · · · · ·                           |                        |                                       |
|                           |          |                        |                                       | 0                      | 2 4 6 8                               |
|                           |          |                        |                                       |                        |                                       |

Odds Ratio

Schumacher FR et al., Cancer Res. 2007 Apr 1;67(7):2951-6.



## **GWAS: What is Working**

- Very large studies
- Replication, replication, replication (planned and coordinated)
- Rigorous, high-quality design, conduct, analysis
  - Genomics
  - Epidemiology
  - Statistics
  - Informatics
- Data sharing
- Accomplished Through Consortia

### COMPROMISES?

- Numbers
  - Initial vs. subsequent stages of scan
  - Replication studies
- Quality
- Examples:
  - AMD
  - Cambridge breast cancer
  - PanScan
- Strategies for what to relax and in what order is complicated



**Complement Factor H Gene and Macular** 

Science. 2005 April 15; 308:385

# First Stage: 390 cases / 364 controls 267,000 SNPs

# Second Stage: 4000 cases / 4000 controls 12,700 SNPs

Third Stage: 22,000 cases / 22,000 controls 30 SNPs

### Breast Cancer Association Consortium



"In this issue, four investigative teams ...have sought to replicate the findings from a GWA study of PD by Maraganore et al. Taken together these four studies appear to provide substantial evidence that none of the SNPs originally featured as potential PD loci are convincingly replicated and that all may be false positives."

| # of cases |     | # of SNPs |
|------------|-----|-----------|
| Tier 1     | 443 | 198,000   |
| Tier 2     | 332 | 1800      |

"We identified 11 SNPs that were associated with PD (P<.01) in both tier 1 and tier 2 samples and had the same direction of effect." (Maraganore et al)

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### COMPROMISES?

#### • Yes, BUT

Strategies for what to relax and in what order is complicated