### BIS180L

## Genome-Wide Association Mapping

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## **Association Mapping**

- Goals
  - find genes associated with diseases or other traits
  - assess relative risk based on genotype (personalized medicine)
- Association mapping
  - look at associations at a few loci (you have a priori candidates)
- Genome Wide Association Mapping (GWAS)
  - scan the whole genome for associations
- Takes advantage of historical recombination

## Many GWAS publications

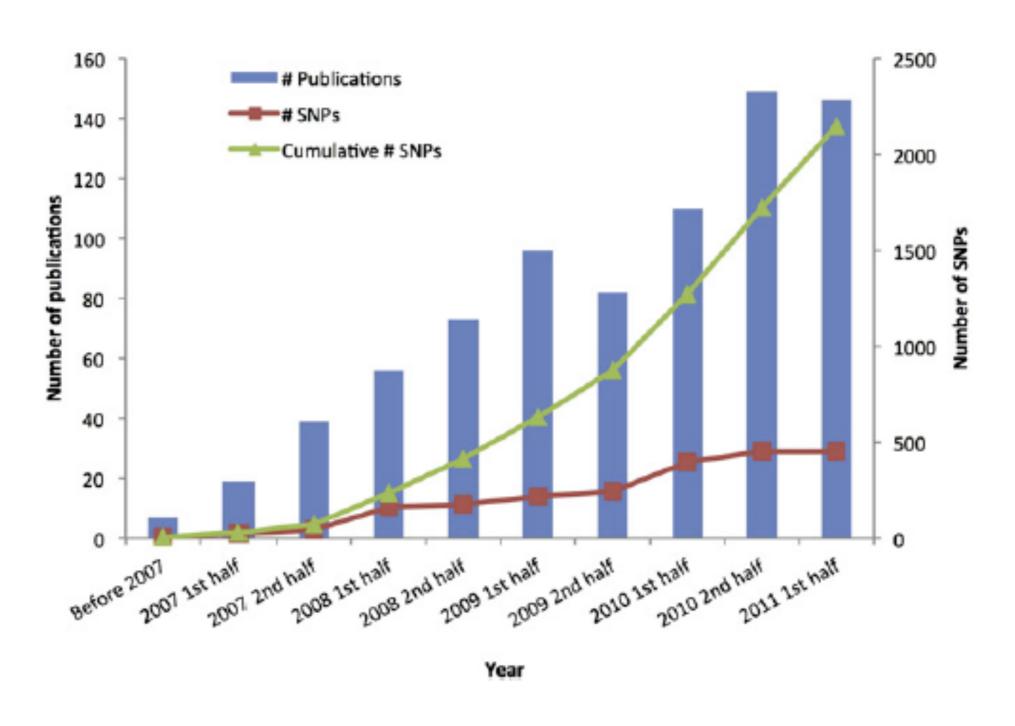


Figure 1. GWAS Discoveries over Time

#### Lecture Outline

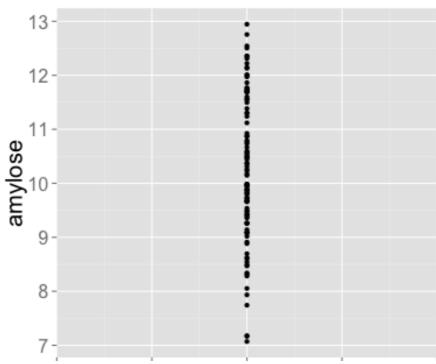
- Association Mapping
- Genome-Wide Association Mapping (GWAS)
- The problem of population structure

### Association Mapping

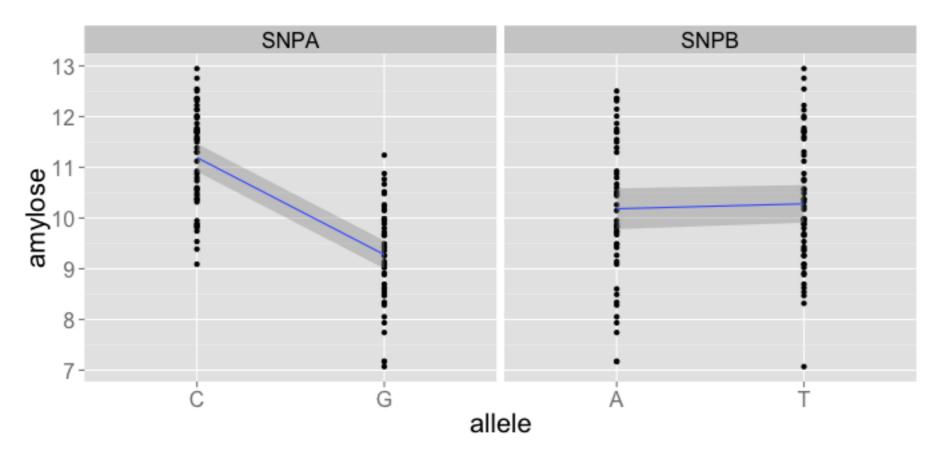
- Trying to find genetic basis for a trait or disease
- Look for statistical association between a SNP allele state and a phenotype

### Association Mapping, simulated example for amylose

Measure amylose in many rice varieties



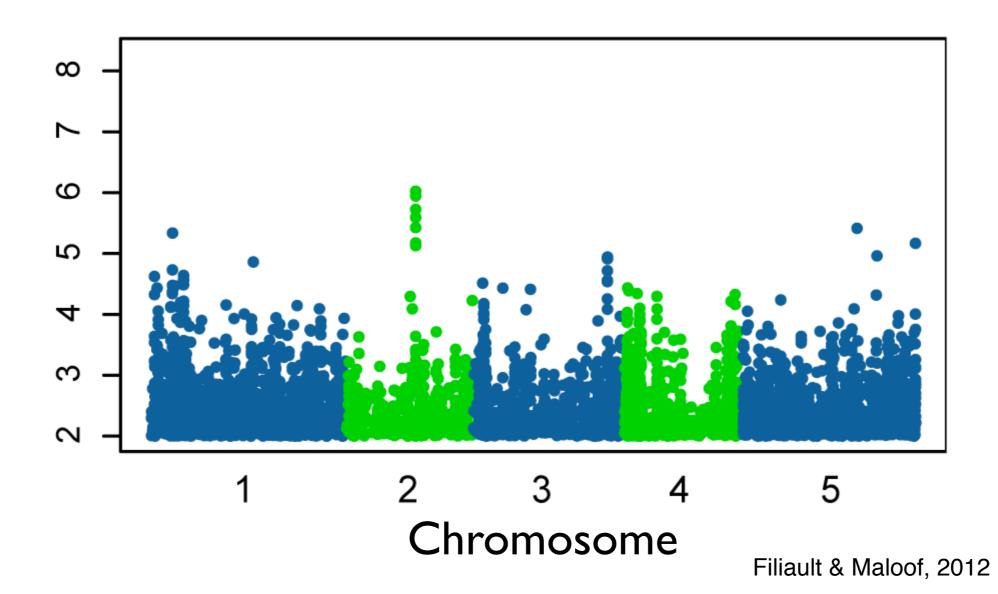
Separate measurements according to SNP allele



• Test for association. Slope not equal to 0 = association.

### Association Mapping vs Genome-Wide Association Mapping

- For GWAS repeat the analysis for SNPs across the whole genome.
- Can plot the results as a manhattan plot:
  - each point is a SNP
  - X-axis is position in the genome. In this case there are 5 chromosomes
  - Y-axis is  $-\log 10(P)$  for association with the trait. Higher values are more significant.

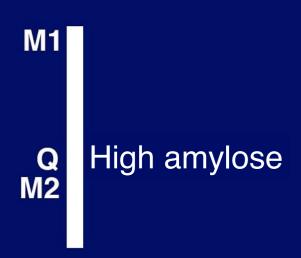


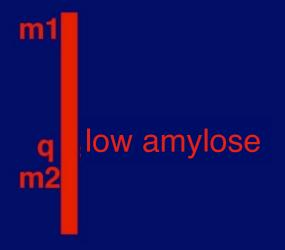
### Association Mapping: historical recombination

- Why might some SNPs be associated with a trait and not others?
- Historical Recombination!

# Association mapping and historical recombination

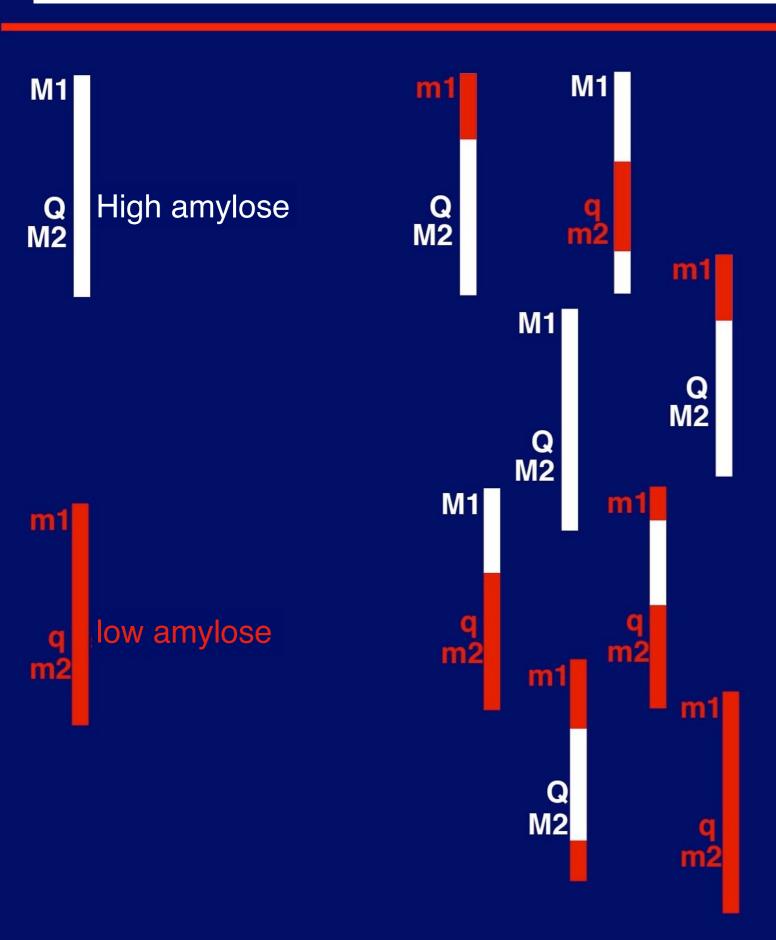






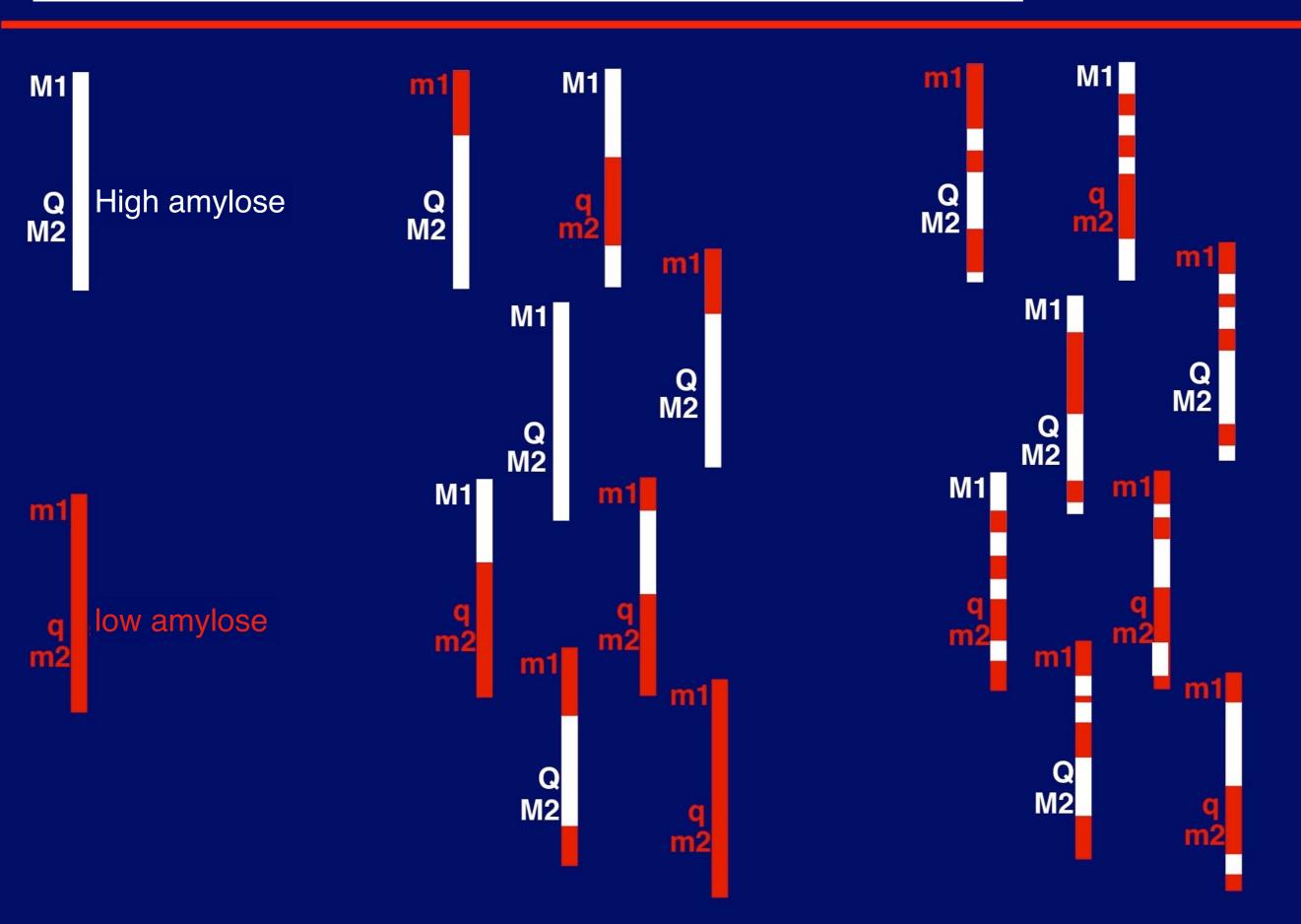
# Association mapping and historical recombination





# Association mapping and historical recombination





## The importance of tagSNPs

Our rice SNP data set has ~44,000 SNPs.

 There are ~500,000 SNPs segregating among the rice varieties.

### Is it hopeless?

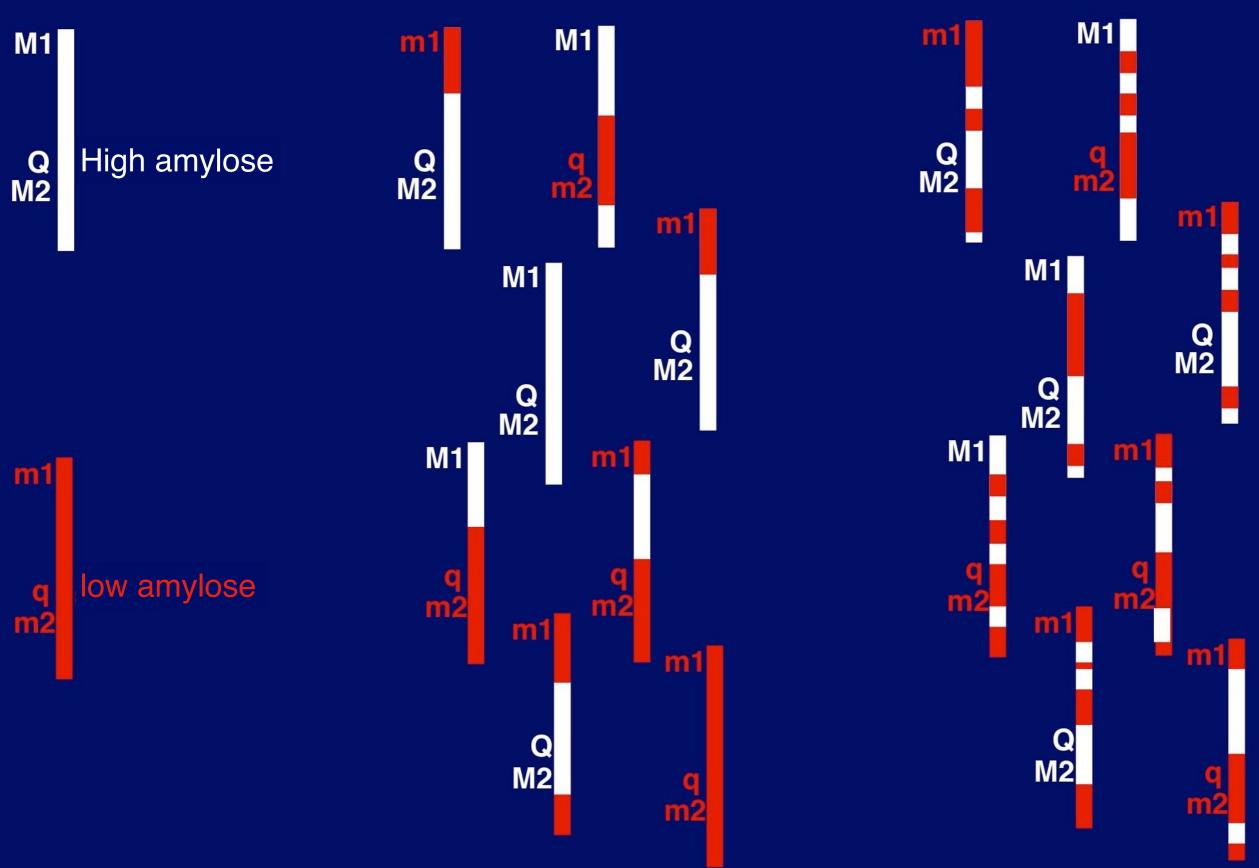
– Do we have less than a 1 in 10 chance of finding an association because we are assaying less than 10% of the SNPs?

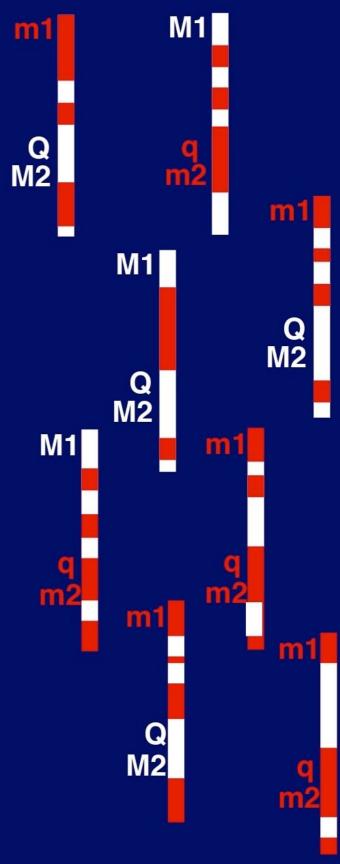
### Not hopeless

 Because of linkage disequilibrium there is a strong correlation among closely linked SNPs

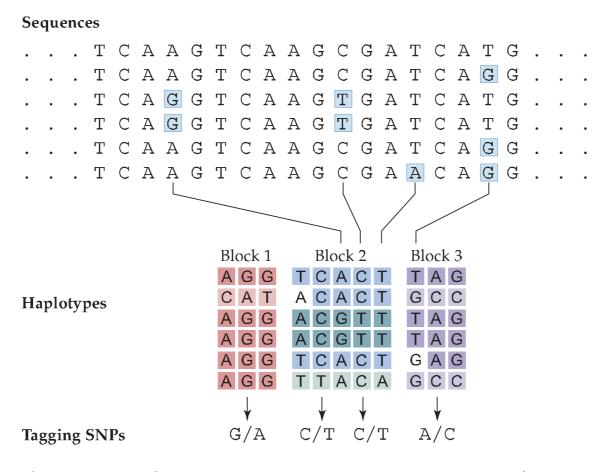
### Not hopeless: SNPs near to one another are correlated...







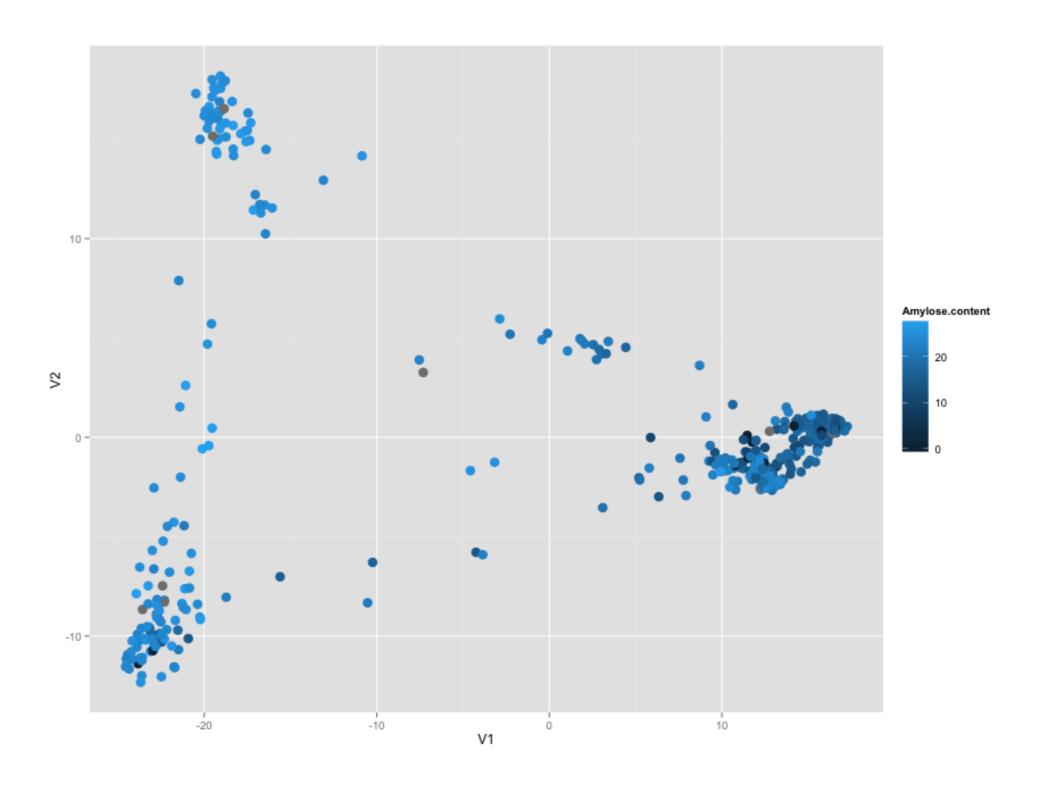
145



**Figure 3.5 Tagging SNPs and haplotype blocks.** Extraction of the polymorphisms from a set of sequences typically reveals a blocklike pattern of haplotypes. In this hypothetical example, Block 1 has two classes of haplotypes, one rare and one common; Block 2 has three classes of haplotypes; and Block 3 has two classes of haplotypes. Note that the boundaries between blocks are relatively sharp. The tagging SNPs can be used to define most of the variation in the sample.

### Population Structure can present a problem for GWAS

• What is the potential problem with a GWAS for amylose content?



### Population structure corrections

- Analyze within each population
- OR
- include structure information in the statistical model.
  - instead of: amylose ~ SNPgenotype
  - use: amylose ~ SNPgenotype + population\_membership
- Often it is best to include BOTH population membership and a kinship matrix (genetic relatedness). We will not use that method today (but checkout GAPIT)