#### R/qtl2

#### high-dimensional data and multi-parent populations

#### Karl Broman

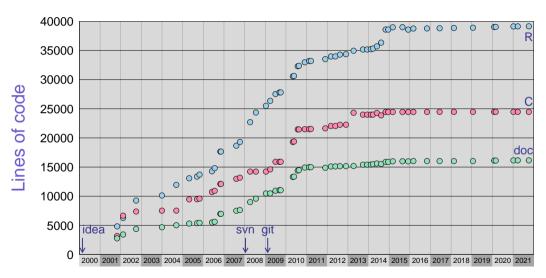
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Slides: kbroman.org/Talk\_DOWorkshop2021



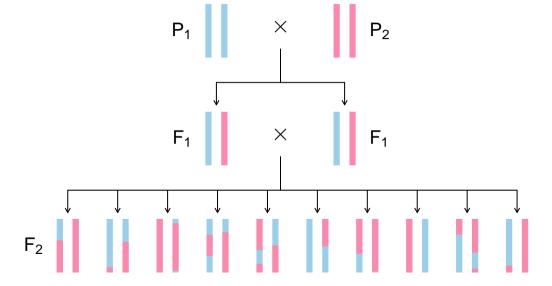
### 21 years of R/qtl

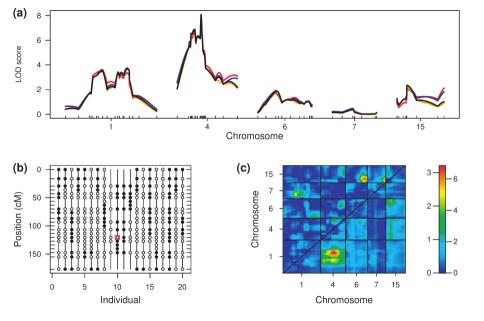


### Why work on software?

- platform for implementing new methods
- makes our own analyses easier
- ▶ to be useful
- ▶ has led to many collaborations

#### Intercross





Broman et al. (2003) doi.org/bsjrwj

### Good things

- efficient handling of missing genotypes
- diagnostics and data visualization
- ▶ fit and exploration of multiple-QTL models
- ▶ quite comprehensive
- quite flexible

### Bad things

- ► some really bloated code
- ▶ hard to maintain
- many inconsistencies in the user interface
- ► largely restricted to two-parent crosses

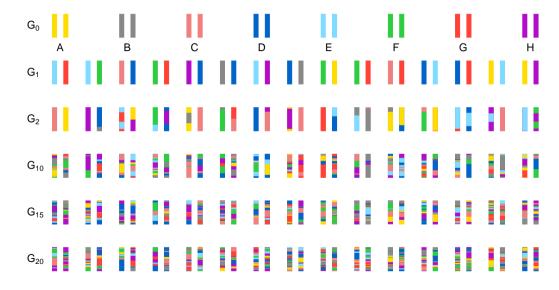
### What's changed in 20 years?

- ▶ Genome sequence
- ► Large crosses
- ▶ Dense SNP genotypes
- ► Gene expression and other -omics data
- ► Multi-parent populations (MPPs)

### Improving precision

- more recombinations
- more individuals
- ▶ more precise phenotype
- ▶ lower-level phenotypes
  - transcripts, proteins, metabolites

#### HS/DO





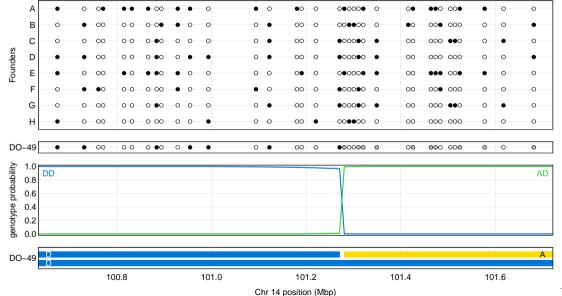
### R/qtl2

- ► High-density genotypes
- ► High-dimensional phenotypes
- ► Multi-parent populations
- ► Linear mixed models

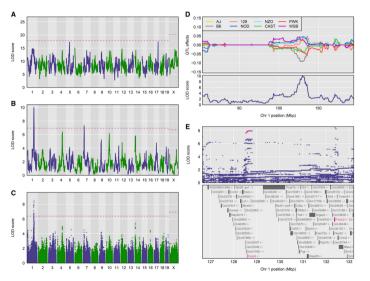
# QTL mapping in MPPs

- ▶ Data diagnostics/cleaning
- ▶ Genome reconstruction
- ▶ QTL analysis
- ► Visualization/exploration of results

#### Genome reconstruction



# QTL mapping in MPPs



### R/qtl2 plans

- ► Handling of GBS-based genotypes
- ► QTL×QTL and QTL×covariate interactions
- ► Multiple causal SNPs within a region

### GWAS vs linkage

► Study design?

Natural population vs experimental cross

▶ Organism?

Human vs mouse

► Analysis method?

SNP alleles vs founder haplotypes

## Fine-mapping a QTL

- ▶ Is there a SNP that accounts for the effect?
- ▶ Or some set of SNPs?
- ► Nature of genes; nature of SNPs within genes?
- ▶ Gene expression pattern that matches QTL effect?
- Gene expression that mediates the QTL effect?
- ► External information: QTL in human or rat?

# Slides: kbroman.org/Talk\_DOWorkshop2021



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