

# **Computational Infrastructure for Systems Genetics Analysis**

## **Brian Yandell, UW-Madison**

**high-throughput analysis of systems data  
enable biologists & analysts to share tools**

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**U Groningen:** Jansen,Swertz

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## experimental context

- B6 x BTBR obese mouse cross
  - model for diabetes and obesity
  - 500+ mice from intercross (F2)
  - collaboration with Rosetta/Merck
- genotypes
  - 5K SNP Affymetrix mouse chip
  - care in curating genotypes! (map version, errors, ...)
- phenotypes
  - clinical phenotypes (>100 / mouse)
  - gene expression traits (>40,000 / mouse / tissue)
  - other molecular phenotypes

## how does one filter traits?

- want to reduce to “manageable” set
  - 10/100/1000: depends on needs/tools
  - How many can the biologist handle?
- how can we create such sets?
  - data-driven procedures
    - correlation-based modules
      - Zhang & Horvath 2005 *SAGMB*, Keller et al. 2008 *Genome Res*
      - Li et al. 2006 *Hum Mol Gen*
    - mapping-based focus on genome region
  - function-driven selection with database tools
    - GO, KEGG, etc
    - Incomplete knowledge leads to bias
  - random sample

## why build Web eQTL tools?

- common storage/maintainence of data
  - one well-curated copy
  - central repository
  - reduce errors, ensure analysis on same data
- automate commonly used methods
  - biologist gets immediate feedback
  - statistician can focus on new methods
  - codify standard choices

## how does one build tools?

- no one solution for all situations
- use existing tools wherever possible
  - new tools take time and care to build!
  - downloaded databases must be updated regularly
- human component is key
  - need informatics expertise
  - need continual dialog with biologists
- build bridges (interfaces) between tools
  - Web interface uses PHP
  - commands are created dynamically for R
- continually rethink & redesign organization

## perspectives for building a community where disease data and models are shared

### Benefits of wider access to datasets and models:

- 1- catalyze new insights on disease & methods
- 2- enable deeper comparison of methods & results

### Lessons Learned:

- 1- need quick feedback between biologists & analysts
- 2- involve biologists early in development
- 3- repeated use of pipelines leads to documented learning from experience increased rigor in methods

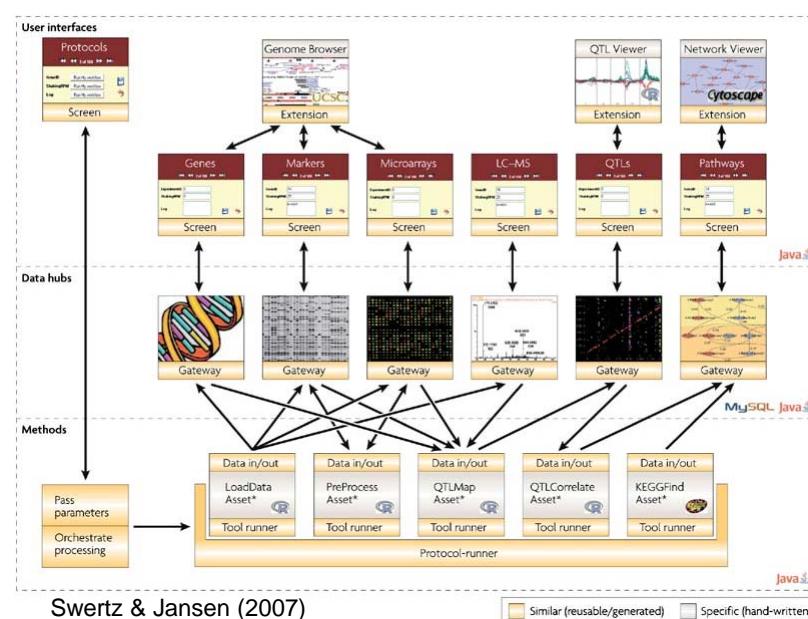
### Challenges Ahead:

- 1- stitching together components as coherent system
- 2- ramping up to ever larger molecular datasets

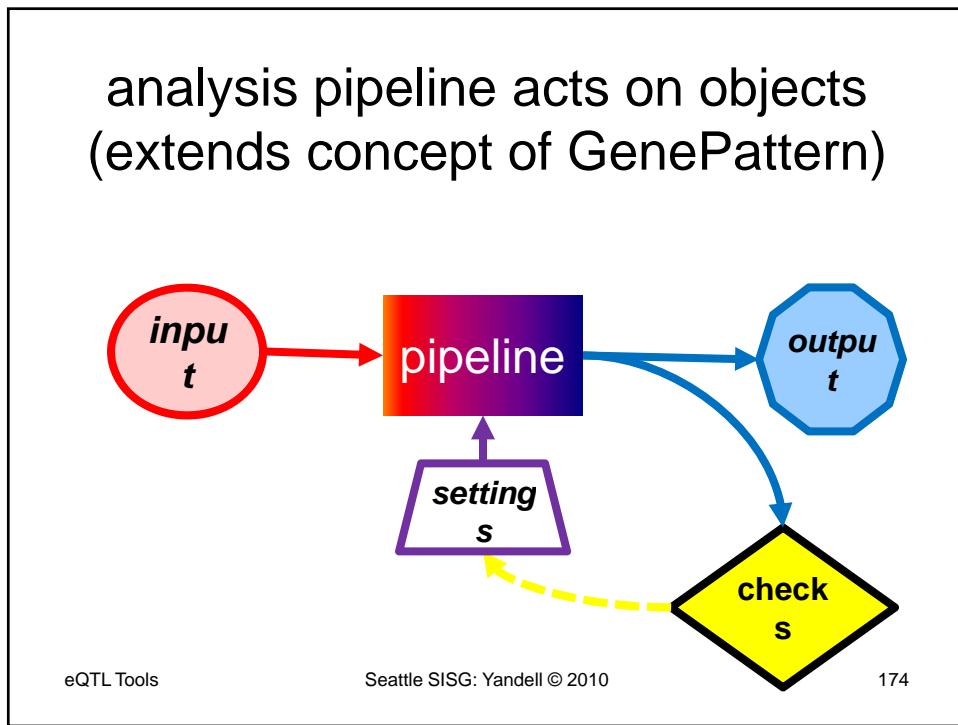
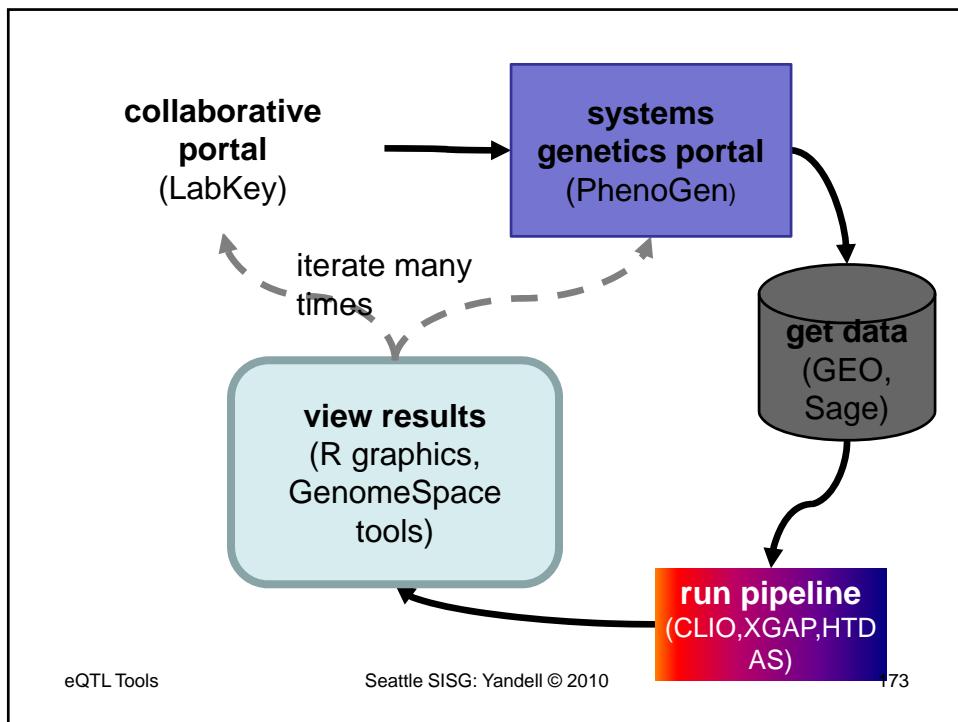
eQTL Tools

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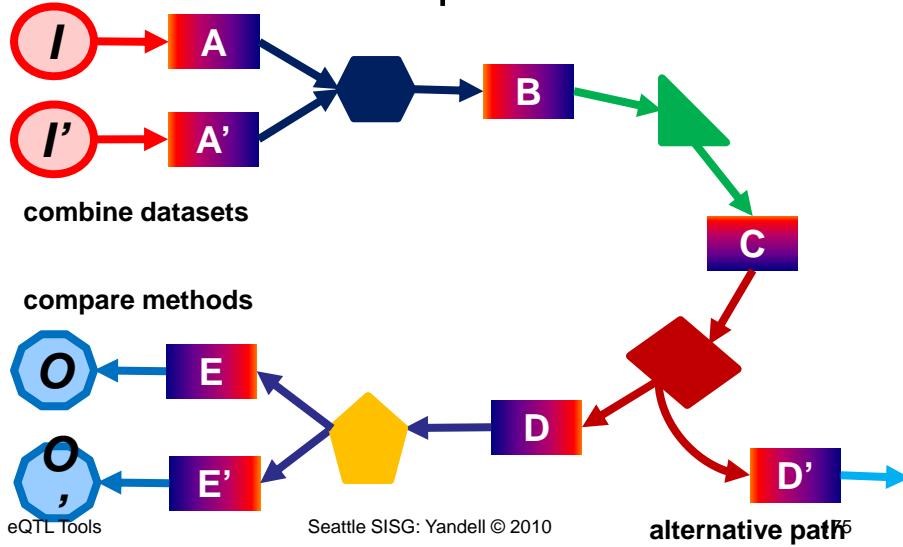
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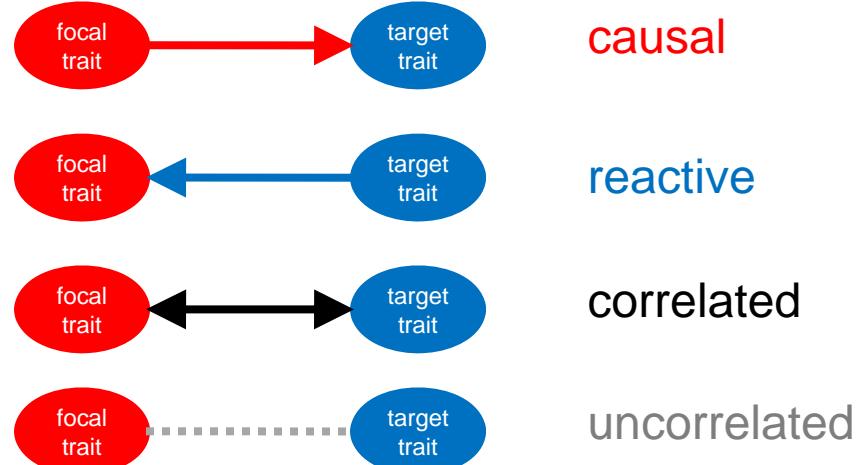
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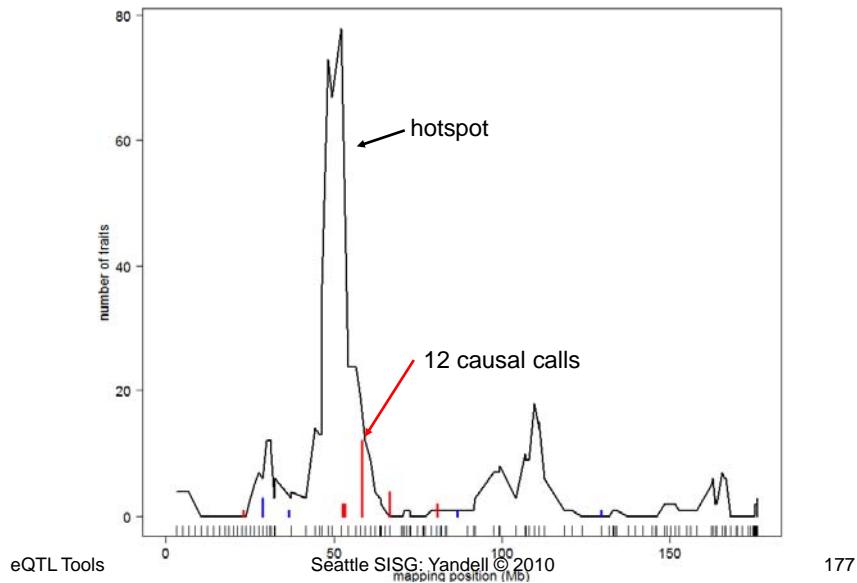
pipeline is composed of many steps



causal model selection choices  
in context of larger, unknown network

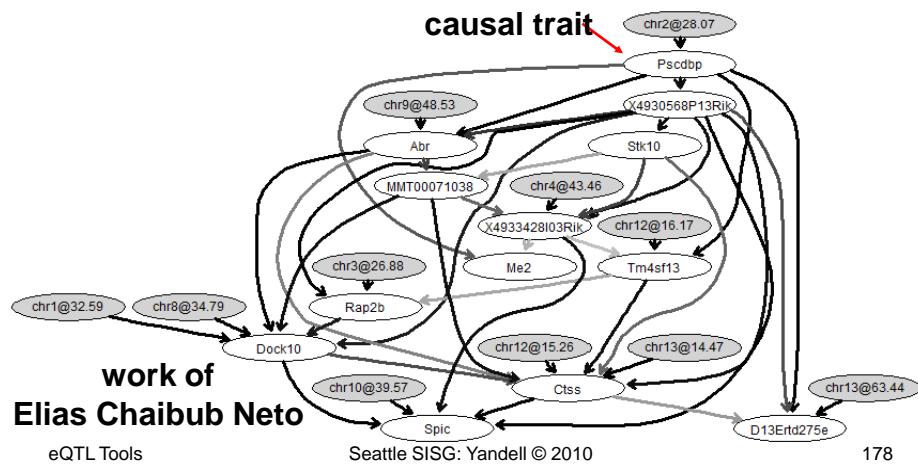


## BxH ApoE-/- chr 2: causal architecture

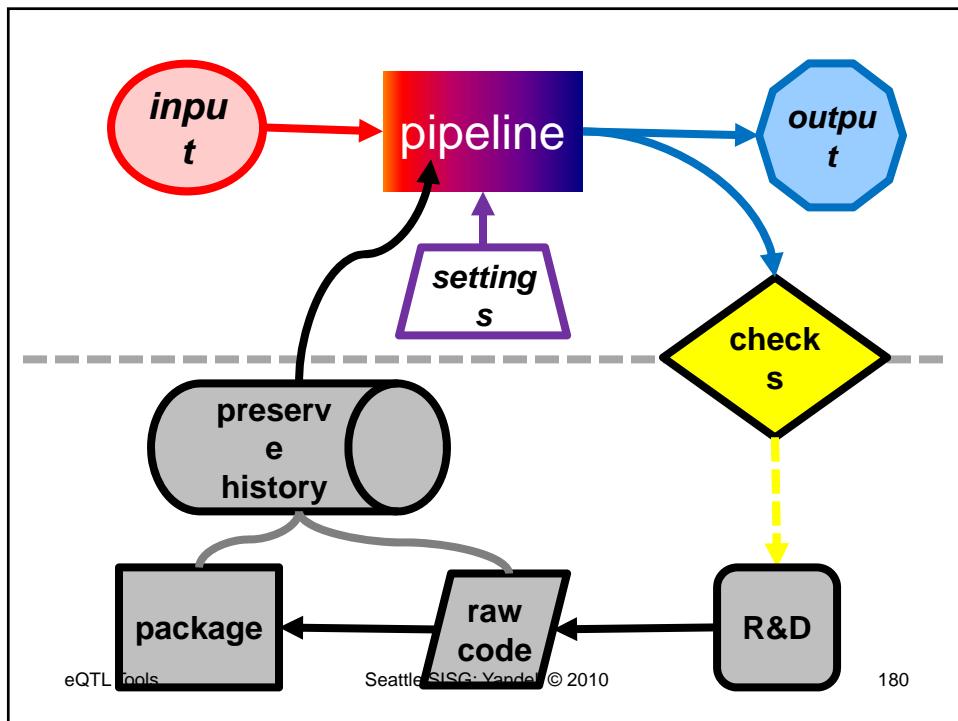
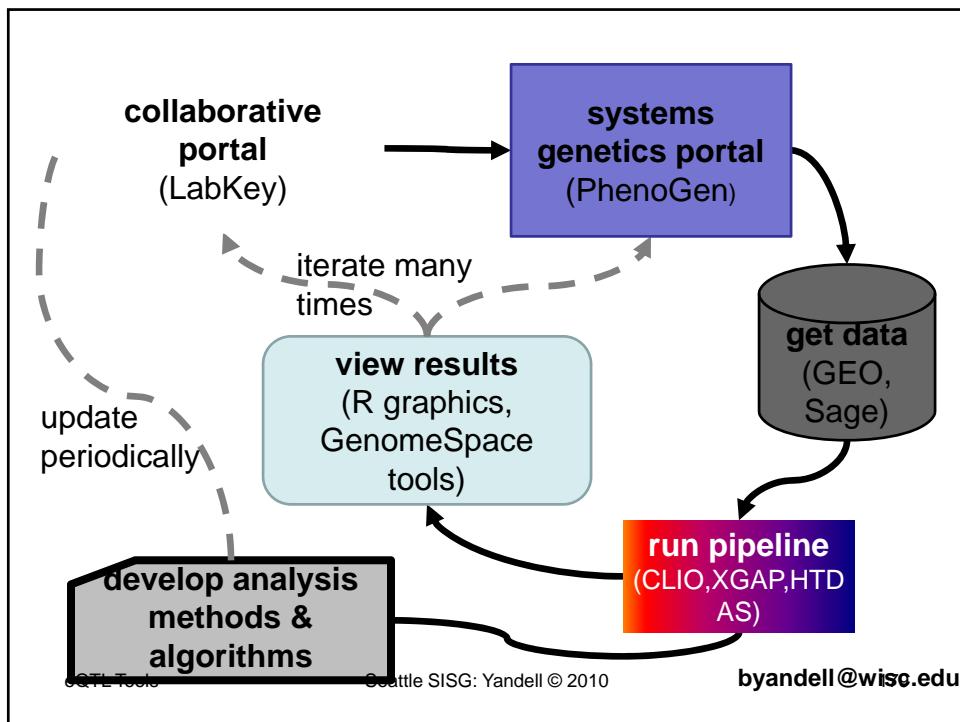


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## BxH ApoE-/- causal network for transcription factor Pscdbp

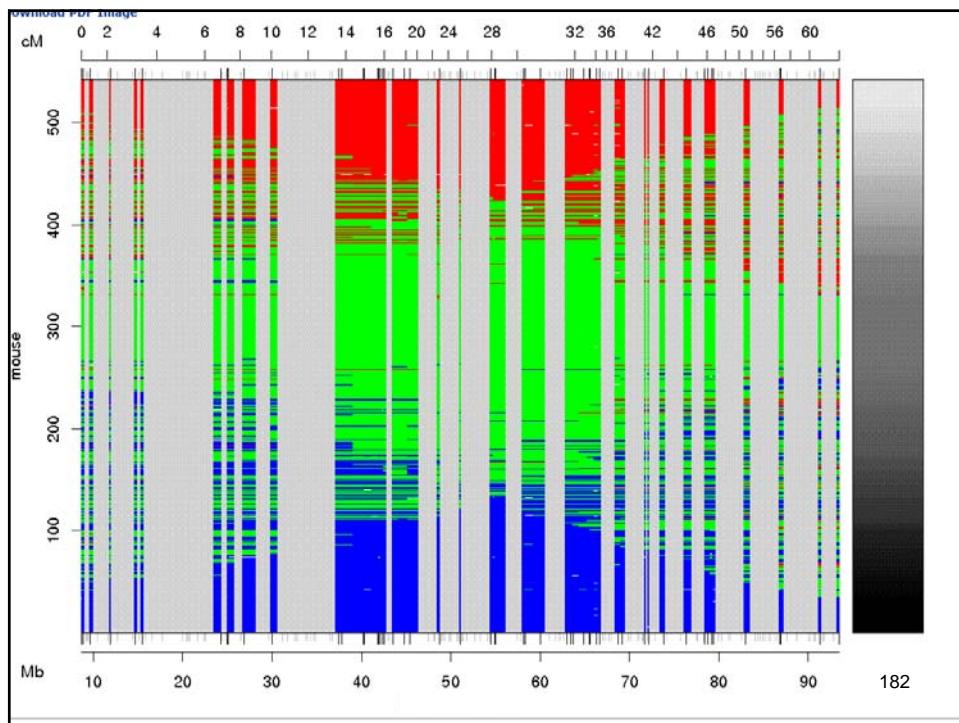
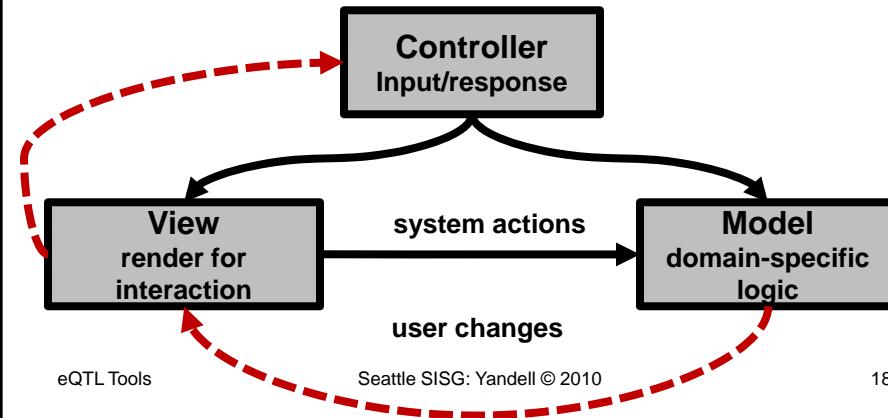


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## Model/View/Controller (MVC) software architecture

- isolate domain logic from input and presentation
- permit independent development, testing, maintenance



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**Chromosomes**

**1-D Genome Scan of B6BTBR07 Clinical Phenotypes and Transcripts**

Data Source:  F2 Raw Data  
 LOD  MOH  PAT (only **Ileot** and **Bter** tissues are available)

Sex:  Both  Male  Female (ignored for LOD of clinical traits)

Clinical Traits:

Genes:  Symbols  a\_gene\_id  a\_substance\_id  accession\_code  Gene Name

Paste list here:  
 (one per row)

Tissues:  Ileot  Liver  Hypo  Adipose

Plot Type:  heat map ( add position)  density histogram (For Raw Data only)  
 Profile scan

Rescale LOD?  Support  Peaks  None

Clustering?  Yes  No

Threshold:  Enter 0 - 1.0

Units:  cM  Mb

Y-Labels:  Symbol  a\_gene\_id  symbola\_gene\_id  none

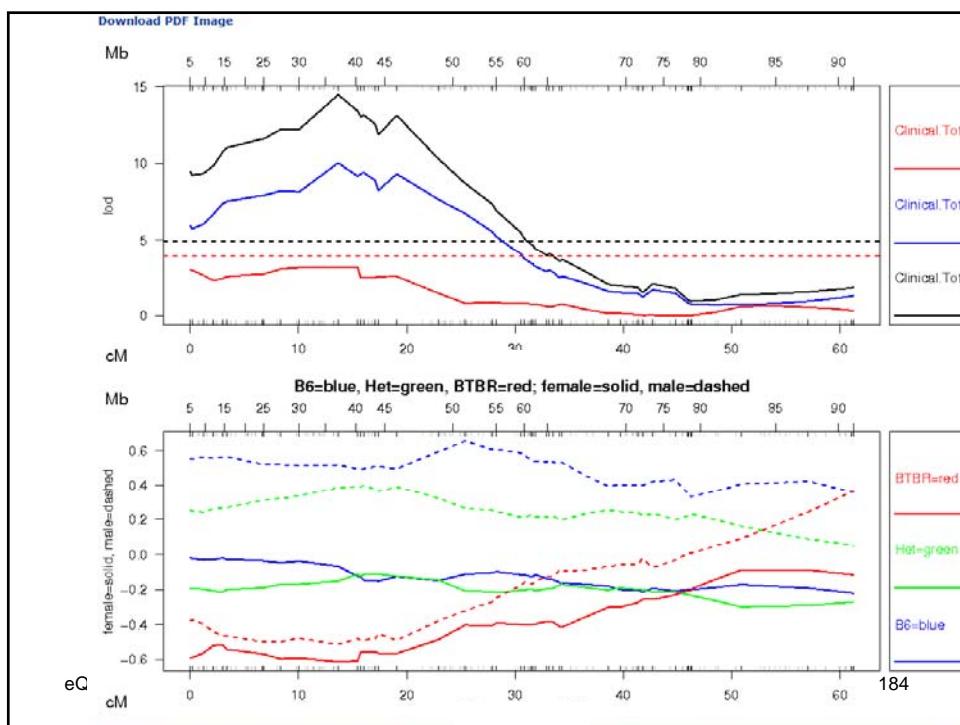
Image Size! Width:  (Inches) Height:  (Inches), Font Size:  Resolution:

Plot Title:  Leave blank to use default title.

I just want to download extracted data and please do NOT perform analysis.

Downloads: MGI\_Coordin... vita.pdf document\_1... document\_1... reporteur.pdf... 001\_reporter... NIHOS.doc... Done 1.940s 1.940s Now: Sunny, 81° F Wed: 85° F Thu: 83° F 4:02 PM

start attie.wisc... Microsoft... xterm



# automated R script

```
library('B6BTBR07')

out <- multtrait(cross.name='B6BTBR07',
  filename = 'scanone_1214952578.csv',
  category = 'islet', chr = c(17),
  threshold.level = 0.05, sex = 'both',)

sink('scanone_1214952578.txt')
print(summary(out))
sink()

bitmap('scanone_1214952578%03d.bmp',
  height = 12, width = 16, res = 72, pointsize = 20)
plot(out, use.cM = TRUE)
dev.off()
```

eQTL Tools

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