

QTL Analysis, Visualization and the Link to Genomes at the SGN Database

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One of the major challenges of the post-genomic world is linking genomic variation to phenotypic variation of complex traits. Quantitative trait loci (QTL) analysis is used to dissect the genetic basis underlying complex traits. At the Sol Genomics Network (SGN) (<http://solgenomics.net>), we are developing web technologies and a database to store raw phenotype and genotype data from QTL studies, perform on-the-fly QTL analysis using R/QTLM statistical software (<http://www.rqtl.org>), and visualize QTL map locations. Users can identify peaks and flanking markers for QTLs of traits of interest. The QTL software fully integrates with other analysis tools at SGN such as the Comparative Map Viewer (<http://solgenomics.net/cview>) and tomato genome browser (<http://solgenomics.net/gbrowse>) and is cross-referenced with relevant datasets at SGN and external databases. For example, using the Comparative Map Viewer, users can compare predicted QTL regions to genetic maps of interest from the same or different Solanaceae species. Using the tomato genome browser, users can also identify corresponding sequences, which can yield candidate genes for a trait of interest. To allow QTL comparisons across studies, traits are mapped to the Solanaceae Phenotypes Ontology (<http://solgenomics.net/tools/ontology>).

Currently, QTL data from three tomato F2 population QTL studies on fruit morphology traits (up to 46 traits per population) is available at the SGN website for viewing.

QTL Data Submission

The screenshot shows a multi-step web interface for submitting QTL data. Step 1: Submit Population Details, including fields for population name, cross, and parent lines. Step 2: Submit the List of Traits, where users select traits from a list. Step 3: Submit the Phenotype Data, where users upload raw data files. Step 4: Submit the Genotype Data, where users upload genotype files. Step 5: Set the Statistical Parameters for the QTL Analysis, where users choose analysis methods and parameters.

Currently, SGN curators upload phenotype and genotype raw data. In the near future, researchers will be able to use the web interfaces to the right to upload their data and set their statistical parameters for the QTL analysis.

Once data is uploaded to the database, a dynamic population page with its description, list of the traits and corresponding descriptive statistics and links to the QTL page is generated. Hereby, we demonstrate the SGN QTL analysis tool and the cross-references to relevant datasets using a QTL identified for fruit area in the *Solanum lycopersicum* cv. Howard German crossed with *S. pimpinellifolium* accession LA1589.

QTL Analysis

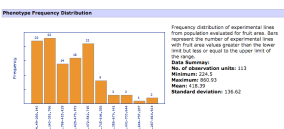
SGN population: QTL Tomato Howard German x LA1589 F2

Population Details

Name: **QTL Tomato Howard German x LA1589 F2**
 Description: **QTL Tomato Howard German**
 Organism: **Tomato**
 Uploaded by: **Esther van der Knaap**

Phenotype Data

Trait	Minimum	Maximum	Average	No. of lines	QTL(s)...
distal angle macro 10%	69.77	172.26	142.52	113	
distal angle macro 15%	61.8	145.58	119.24	113	
fruit area	224.5	860.93	418.39	113	



Clicking the graph icon on a trait of interest (above; eg. fruit area) prompts the on-the-fly QTL analysis and produces the phenotypic data frequency distribution and QTL maps to the left.

Analysis Procedure: QTL Model: single-QTL
 Genome Scan: every 10 Mb
 Resolution: 1 Mb
 LOD Threshold: based on 99% permutation
 Phenotypic Measure: Fruit Area
 Covariate: none

Viewing chr 3 of map: [Linkage group 3 with flanking markers highlighted]

An enlarged view of a fruit area QTL on linkage group 3.

Linkage group 3 with the flanking markers for the fruit area QTL (highlighted).

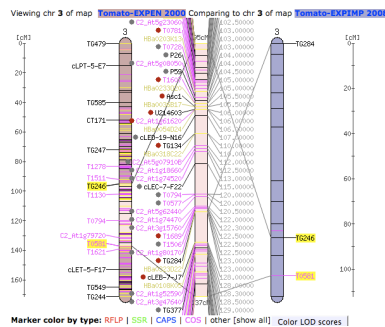
QTL Accessibility

The screenshot shows the SGN website's QTL Accessibility page. It includes a search bar, navigation tabs for Genes, Phenotypes, QTLs/traits, Unigenes, Family, Markers, Genomic Clones, Annotations, ESTs, People, and Images. A search for 'fruit shape' returns results for QTLs like 'QTL Tomato Howard German x LA1589 F2' and 'QTL Tomato Yellow Bluffer x LA1589 F2'.

QTLs can be accessed by: (1) browsing the alphabetically indexed list of traits; (2) searching for a trait using relevant keywords; or (3) browsing the list of QTL populations. At the populations level, all traits evaluated for QTL in the respective population are listed.

Genetic and Genomic Comparative Analysis

Comparative map viewer (<http://solgenomics.net/cview>)



A fruit area QTL (flanked by markers TG246 and T0581) on linkage group 3 of Tomato-EXPIMP 2008 is compared to a region flanked by the same markers in the linkage group 3 of Tomato-EXPEN 2008. The corresponding region on Tomato-EXPEN shows more markers and BAC contigs.

Linking QTLs to the tomato genome sequence

The screenshot shows the tomato genome browser interface. It displays genomic data for a specific region, including gene models, ESTs, and other annotations. The 'fruit area' QTL is highlighted, and the corresponding genomic region is shown.

A search using the flanking markers (eg. TG246) on the tomato genome sequence (<http://solgenomics.net/gbrowse>) annotated by the International Tomato Annotation Group (ITAG) reveals a matching sequence. The matching sequence may be annotated for gene, mRNA, and protein models, ESTs, cDNAs, Unigenes, and experimentally characterized genes.

Cross-references to External Databases

The screenshot shows the EMBL-EBI database search results for the 'fruit area' QTL. It displays the location, coordinates, and sequence of the matching EST, along with links to other databases.

Detailed data on sequence matches to the tomato genome region of interest can also be found on external databases. For example, in the above tomato genome region of our interest, a matching tomato EST is linked to the EMBL-EBI database (<http://www.ebi.ac.uk>) where details of the EST can be retrieved.

Conclusion and Future Developments

QTL identification is an important approach in understanding the genetic basis of complex traits and development of marker assisted selection for faster, more reliable and cheaper improvement of polygenic traits in plants. The SGN QTL analysis tool simplifies QTL detection, retrieval of relevant datasets from other sources and sharing data among the Solanaceae community. Through integration of user data with already existing genetic and genomic maps at SGN, users are able to do comparative analysis, and possibly identify candidate genes and more. In the near future, user-friendly web interfaces to upload QTL data and perform analysis at user-determined statistical parameters will be implemented.

References:
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 Broman KW, Wu H, Sen S, Churchill GA (2003) R/qtl: QTL mapping in experimental crosses. *Bioinformatics*. 19:889-890.
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 Mueller LA, Solow TH, Taylor N, Skwarocki B, Buels R, Binns J, Lin C, Wright MH, Ahrens R, Wang Y, Herbst EV, Kaydor ER, Menda N, Zamir D, Tanksley SD (2008) The Sol Genomics Network: A Comparative Resource for Solanaceae Biology and Beyond. *Plant Physiol*. 158(3):1310-7.

Funding Sources



<http://solgenomics.net>
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SGN Code and Datasets
[ftp://ftp.solgenomics.net](http://ftp.solgenomics.net)