# Manual of QTXnetwork

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# **1** Introduction on QTX

QTXNetwork (Figure 1.1) is GPU-based computation software for linkage and association analyses of epistasis and environment interaction of complex traits. It contains four functional modules (Figure 1.2): quantitative trait locus (QTL) for linkage analysis, quantitative trait SNP (QTS) for genome-wide association analysis, quantitative trait transcript/protein/metabolite (QTT/P/M) for transcriptome/proteome/metabolome association analysis, and GMDR for data filtering which will be further used in Genome-Wide Association Studies (GWAS). By using the massive parallel nature of multi-GPUs, this mapping tool can perform association analyses on large-scale omics data for complex traits.



Fig 1.1: The main window of the QTXNetwork

Create new project.					
Project Type:	QTL	QTS			
	QTTPM	GMDR			
Project Name:	QTS2				
houses, these asse by user or generate es under root HOME If an empty NAME is e this project under	ts include copies of s 1 by algorithm, plus s iolder. specified, a tempora a desired name.	source files(e.g. *.map, *.pre) eith ome configuration files. A project ry auto name will be given, you ca	er selected folder resid in later mov		
		Accept Ca	ancel		

Fig 1.2: The popup window for creating new project for QTL, QTS, QTT/P/M or GMDR

# 2 User Manual for QTL 2.1 Introduction on QTL

QTL is one module of the software QTXNetwork for mapping quantitative trait loci (QTL) with epistasis effects and QTL by environment (QE) interaction effects in DH, RI, BC1, BC<sub>2</sub>, F<sub>2</sub>, IF<sub>2</sub> and BxFy populations, and for graphical presentation of QTL mapping results. The software is developed based on the MCIM (Mixed-model based Composite Interval Mapping) method, and programmed by C++ programming language.

# 2.2 Running QTL

### 2.2.1 Creating a project for QTL

The QTL program, kept in the folder ~/exe/QTL under the QTXNetwork, can be run directly in "command window" or in "explore window". In default, you can run it via the shell program (QTXNetwork). To run the QTL, you first need running the QTXNetwork for creating a new project for the QTL by clicking the button  $\clubsuit$  in the main window of the QTXNetwork (Fig 2.1), a window for creating new project will be popped up (Fig 2.2). After selecting module type "QTL" and specifying project name, click the "Accept" button (Fig 2.2), a QTL project will be listed in the left pane named Navigator (Fig 2.3).



Fig 2.1: The main window of the QTXNetwork

🍾 Create new pro	ject.	×			
Create Project					
Project Type:	QTL	QTS			
	QTTPM	GMDR			
Project Name:	Test				
Project NAME decid houses, these asse by user or generate es under root HOME if an empty NAME is e this project under	es the name of the proj ets include copies of so d by algorithm, plus sor E folder. specified, a temporary a desired name.	ject folder in which all assets of the project surce files(e.g. *.map, *.pre) either selected me configuration files. A project folder resid auto name will be given, you can later mov			
		Accept 🔀 Cancel			

Fig 2.2: The popup window for creating new project for QTL

🗞 QIX-Network	
Root Help File Exec Plot	
Navigator ×	
🐼 test	
	LOG ×
	at java.awt.EventDispatchThread.pumpEventsForHierarchy at java.awt.EventDispatchThread.pumpEvents(Unknown Sou at java.awt.EventDispatchThread.pumpEvents(Unknown Sou
	at java. awt. EventDispatchThread.rum(Unknown Source)

Fig 2.3: The window of QTXNetwork for performing QTL

# 2.2.2 Deleting QTL project

Select the QTL project to delete in the Navigator pane, and then click the fast button =

# 2.2.3 Specifying data file

In a QTL project window, a button in the for "locate resource files" will occur in the toolbar, you can locate and import data files (a marker linkage map file and a data file which contains observations of the markers and the traits under studied for all individuals for QTL mapping in the popup window after clicking the button. In this panel, there are three sections to set input or output files. The first is the Genetic map section, which contains information about the marker linkage map, such as the number of chromosomes, number and order of markers on each of the chromosomes, flanking marker distances, etc. The second is the Input data section, and you need input data files, which integrated the observations of marker and the trait studied into one file. The third is the "Output report" section, where the output file name can be inputted.



Fig 2.4: The window for inputting data files and output file

### 2.2.4 Starting QTL

For example, suppose you open a QTL projected named "test", and also specify the data files for this project. The sample data files are the map file (~\sample\ QTL\SimF2.map), the data file (~\sample\QTL\SimF2.txt), and the report file (~\sample\QTL\simF2.pre), respectively, then, the main window for the QTL project will exhibits as the Fig 2.5.

Finally, you can click the button (Fig 2.5) to start the QTL analysis if all default algorithm parameters are used. You can adjust QTL algorithm configuration before running, detailed information refer to the chapter 3.3.



Fig 2.5: The window of QTXNetwork after creating or opening a QTL project

### 2.3 Data file format and running configuration of QTL

### 2.3.1 Format of marker linkage map file

This file contains information about the marker linkage map, such as the number of chromosomes, number and order of markers on each of the chromosomes, flanking marker distances, etc. It consists of general description and map body.

General Description: This part is in the front of map file. A typical general description looks like:

DistanceUnit cM

\_Chromosomes 4

\_MarkerNumbers 6 4 7 9

There are a total of four possible items for general description. They can be in any order. Each item in general description is a key word followed by certain specification(s). Each key string must be started with an underline "\_", and there should not be any list separator (white space or table) within the key string. The specification(s) must be separated from the key word by at least one list separator, and there must also be at least one list separator between any two neighboring specifications if two or more

specifications are included for the item. A key string and its specification(s) must be placed in the same line. Both key strings and specification (s) (if characters) are not case insensitive.

**\_\_\_\_\_DistanceUnit** specifies the unit of genetic distances used in the map file. The specification string "cM" stands for centi-Morgan and "M" stands for Morgan.

**\_Chromosomes** is for specifying the total number of chromosomes or linkage groups involved in the map file.

\_MarkerNumbers is for specifying the number of markers on each of the chromosomes. The order of the numbers must be consistent with that for genetic-distance columns in the map body.

**Map Body:** This part starts from key string \*MapBegin\* and ends at key string \*MapEnd\*. A typical map body looks like:

\*MapBegin\*

Marker#	Ch1	Ch2	Ch3	Ch4
1	0.00	0.00	0.00	0.00
2	9.84	11.26	7.45	9.85
3	10.22	8.69	9.10	10.93
4	8.25	9.87	10.66	10.70
5	9.79		10.16	10.10
6	7.47		8.34	11.30
7			11.21	9.30
8				7.23
9				11.78

\*MapEnd\*

The strings (Marker#, Ch1, Ch2, Ch3, Ch4) in the second row show the contents of the columns below them. The Marker# column (first column) is for the order of all markers on each chromosome; the maximum order is equal to the number of markers on the chromosome that has the most markers among all the chromosomes. The Ch1 column (second column) to Ch4 column (last column) each represents a chromosome or linkage group, and contains genetic distances between adjacent markers on the chromosome. Specifically, the genetic distance for the first marker on each chromosome must be set to zero as the start point of the linkage map for the chromosome; the distance for the second marker is between the first and the second markers; the distance for the third marker is between the second and the third markers, and so on. The order of Ch1 column (second column) to Ch4 (last column) must be consistent with that for the numbers following the key string \_MarkerNumbers.

#### 2.3.2 Format of data file

The data file contains information on population type, number of genotypes sampled from the population, number of observations, observations for both markers and quantitative traits, etc. It is composed of four parts: general description, marker data body, trait data body, and some comment lines.

**General description:** This part is for specifying the basic features of the data file, and is usually put in the front of the data file. Like in the map file, each item in general description is a key character string followed by certain specification(s). Each key string must be started with an underline "\_", and no white space is allowed within it. There are eight possible items for general description. They can be arranged in any order. A typical description for a data file looks like:

\_Population DH

\_Genotypes 200

Observations 400

Environments Yes

Replications No

TraitNumber 1

TotalMarker 64

\_MarkerCode P1=1 P2=2 F1=3 F1P1=4 F1P2=5

**Population** specifies the population type used. Some commonly used populations are listed as follows:

**RI population** — derived from a cross between two pure-line parents. The specification word for RI population can be RI or RIL.

**BC population** — derived from crossing F1 with one of the inbred parents. The specification words for BC1 and BC2 populations are B1 and B2, respectively.

F2 population – derived from selfing or sib-mating F1 that is made by crossing two inbred lines.

**Immortalized F2 (IF2) population** — derived from randomly mating among individuals from DH or RI population (See Ref: Hua JP, Xing YZ, Xu CG, Sun XL, Yu SB and Zhang QF (2002) Genetic dissection of an elite rice hybrid revealed that heterozygotes are not always advantageous for performance. Genetics 162: 1885–1895). The specification word IF2DH is for IF2 population derived from DH population, and IF2RI for that from RI population.

**BxFy Population** – derived from F1 backcrossing to one of the inbred parents or selfing for several generations. In each generation, selfing, backcrossing or creating double-haploid is permitted. There are several examples shown as the following figure:

$P1 \times P2$	$P1 \times P2$	$P1 \times P2$	$P1 \times P2$	
F1	$P1 \times F1$	$F1 \times P2$	$F1 \times P2$	
$\otimes$				ংশ
F2	$P1 \times B1$	$P1 \times B2$	$P1 \times B2$	
$ \otimes$				
F3	$P1 \times B1B1$	<i>B2B</i> 1	<i>B</i> 2 <i>B</i> 1	
$ \otimes$		$ \otimes$	double-ha	aploid
F4	B1B1B1	B2B1F	B2B1D	

\_Genotypes specifies the total number of genotypes sampled from the mapping population.

\_Observations specifies the total number of observations for each trait studied.

**\_Environments** specifies the status of experimental design for environments. If the experiment is conducted in multiple environments, write the specification word Yes after the key word \_Environments, otherwise write No.

**\_\_\_\_\_Replications** specifies the status of experimental design for replications or blocks. If the experiment is conducted with replications or blocks, write the specification word Yes after the keyword \_\_\_\_\_\_Replications, otherwise write No.

\_TraitNumber specifies the total number of traits included in the data file.

**\_\_\_\_\_TotalMarker** specifies the total number of the markers included in the data file. This number must be equal to the summation of the numbers for MarkerNumbers in the map file.

**\_MarkerCode** defines a marker coding scheme. There are five possible strings for the specifications. Each of the strings looks like an equation, but no white space is allowed within the string. On the left side of the equation symbol is the marker phenotype specification:

P1: Marker phenotype being the same as that of P1;

P2: Marker phenotype being the same as that of P2;

F1: Marker phenotype being the same as that of F1;

F1P1: Marker phenotype that is not P2 type (P1 dominant or undistinguishable between P1 type and F1 type);

F1P2: Marker phenotype that is not P1 type (P2 dominant or undistinguishable between P2 type and F1 type).

On the right side of the equation symbol is the code for the marker type. The marker code should always be a single character (a number or a letter). The symbol dot "." is used to represent missing marker data or trait value. It is not necessary to specify codes for all possible marker types except for F2 population. For example, if your marker data were collected from a DH population, only the specifications for P1 and P2 types are enough.

**Marker data body:** This part is embraced by two key strings \*MarkerBegin\* and \*MarkerEnd\*. The order of the marker data for different marker loci must be consistent with the order of markers on each chromosome determined in the map file. Since electronic table software usually has a limit on the number of columns in spreadsheet, we provide two types of arrangements for marker data.

#### Type I:

### \*MarkerBegin\*

#Ind	M	<u>x1</u>	Mk2	Mk3	Mk4	Mk5	Mke	6 Mk7	Mk8	Mk9	;
1		1	1	1	2	2	2	2	1	1	;
2		1	1		1	1	2	2	2	2	;
3		2		2	1	1	1	1	2	2	;
	••	r	2	r	2		1	1		1	;
09		2 1	ے 1	2	2	ว	1 2	1	1	1	,
*Marker	rEnd*	1	1	2	2	Z	2	2	1	1	,
Type II:											
*Marker	rBegin	*									
#Mk	1	2	3	4	5	48	49	50	88	89	90
Mk1	1	1	1	2	1	2	2	1	1	2	1
Mk2	1	1	1		2	1	2	1	1	2	1
Mk3	1		1	2	2	1	2	2	1	2	2
Mk4	2	1	1	1	1	1	2	2	1	2	2
Mk5	2	1		1	1	1	1	1	2		2
Mk6	2	2	2	1	1	1	1	1	2	1	2
Mk7	2	2	2	1	1	2	1	1	2	1	1
Mk8	2	2	2	1	2	2	1	2	1		1
Mk9	1	2	2	2	2	2	2	2	2	1	1
*Marker	rEnd*										

**Trait data body:** This part is between two key strings \*TraitBegin\* and \*TraitEnd\*. The data source includes the environment (if available), the replication (if available) and the ID name of subjects, as well as the observations obtained for traits studied. The second row includes the indicator strings and the names of the traits. The number of source strings depends on the experimental design. If both environments and replications are taken, a maximum of three strings must be inputted: the first string for

environment (Env#), the second string for replication (Rep#) and the third string for subject (Geno#). You can use whatever strings to express the sources because they are just used to indicate what the numbers are in the columns below them. If the experiment is conducted without environmental factor or replications, the corresponding column must be removed. And also, a semicolon ";" is required at the end of each observation data row. The following is an example for the trait data body.

	-					
Env#	Rep#	Geno#	Trait_1	Trait_2	Trait_3	;
1	1	1	2.44	7.4	10.04	;
1	1	2	2.4	4.32	8.55	;
•••••						
1	1	90	3.54	8.19	10.74	;
1	2	1	3.17	6.91	11.86	;
1	2	2	1.9	4.31	11.36	;
•••••						
1	2	90	3.22	10.54	11.48	;
2	1	1	5.74	12.78	11.27	;
2	1	2	7.65	7.02	11.96	;
•••••						
2	1	90	6.58	13.92	9.94	;
2	2	1	6.01	10.22	9.95	;
2	2	2	6.22	11.99	7.81	;
•••••						
2	2	90	7.98	13.21	12.03	;
*TraitE	End*					

\*TraitBegin\*

#### 2.3.3 QTL algorithm and configuration

Before conducting QTL, we need setting the QTL algorithm configuration. Suppose a new QTL project is created or a QTL project is opened in main window of the QTXNetwork, click the QTL project in the Navigator panel (Fig 2.5) to set the algorithm configuration, then activate the command item "Config" under the "Exec" software menu (Fig 2.6), a panel will be popped up for setting configuration (Fig 2.7, Fig 2.8, Fig 2.9, Fig 2.10).

Root Help File Exec Plot	
Navigator × Hait N T D	
Est KAW MAF	
A RAW TXT	
hà chu	
L06 ×	
at java.awt.EventDispatchThread, pumpOneEventForFilters(Unknown Source)	-
at java. swt.EventDispatchThread.pumpEventsForFilter(Unknown Source)	
at javawww.eventDispatchTaread.pumpEventsForHierarchy(Unknown Source) at java.axt EventDispatchTaread.numpEvents([Uhynown]	
at java. swt. EventDispatchTaread, pumpFvents (Unknown Source)	
at java.awt.EventDispatchThread.run(Unknown Source)	
Not enough information to generate tables and charts.	1
4	

Fig 2.6: Executing QTL under the "Exec" of the menu

	-	×				
QTL Algo	QTL Algorithm Configuration					
General Genome Scan Si	gnificanc	e level Output				
Map Epistasis		☑ High-order Epistasis				
2D genome scan						
Permutation Time:	1,000 ÷	·				
Gibbs sample size: 20	0,000 ÷	·				
Superior genotype prediction	on					
		Acce 🗶 Canc				

Fig 2.7: General algorithm configuration for QTL

**Map Epistasis** – Choose this option to detect both single-locus effect QTL and epistasis, otherwise to detect QTL with single-locus effects only.

**High Order Epistasis** – We define the additive × dominance (AD), dominance × additive (DA) and dominance × dominance (DD) as the high order epistaiss. This option is only available for setting  $F_2$  population. Choose this option to detect QTL with additive (A) and dominance (D) effects, and also epistasis with AA, AD, DA and DD effects, otherwise to detect epistasis with only AA effect.

**2D Genome Scan** – Choose this option to detect epistasis QTLs with or without single-locus effects.

Otherwise the program will only detect the epistasis interaction among QTLs with single-locus effects.

**Permutation Time** – Set the permutation time to conduct permutation test on significance of QTL effects.

**Gibbs sample size** – Set this value to predict QTL effects by Monte Carlo Markov Chain method, otherwise by mixed linear model approach.

**Superior Genotype Prediction** – Choose this option to predict superior genotypes based on QTL effects (Ref. Yang J and Zhu J. (2005). Predicting superior genotypes in multiple environments based on QTL effects. Theoretical and Applied Genetics, 110: 1268-1274.)

	×					
QTL Algorithm Configuration						
General Genome Scan Significance level Output						
Candidate interval selection:	0.05 ÷					
Putative QTL detection:	0.05 ÷					
Filtration window size(cM):	10 -					
	Acce X Canc					

Fig 2.8: Genome scan configuration for QTL

Candidate Interval Selection – The experimental-wise type I error for candidate interval selection.

Putative QTL Detection – The experimental-wise type I error for putative QTL detection.

**Filtration window size (cM)** – Define a window to distinguish two adjacent test statistic peaks whether they are two QTL or not.

	×							
QTL Algorithm Configuration								
General Genome Scan Significance level Output								
Testing window size(cM):	10 -							
Walk speed(cM):	1 -							
QTL Effects:	0.05 -							
	Acce X Canc							

Fig 2.9: Significance level configuration for QTL

**Testing window size (cM)** – Define a window adjacent to the testing interval (one for each direction). When scan the genome for putative QTL, no marker will be selected as cofactor within the testing window.

Walk speed (cM) — The space between two adjacent test point, when testing for putative QTL along the genome.

**QTL effects** – The significance level for QTL effects.

	×						
QTL Algorithm Configuration							
Show all peaks							
Output precision:	4						
	La construction de la constructi						
	Acce X Canc						

Fig 2.10: Output configuration for QTL

**Show all peaks** – Choose this option to show all the markers in the linkage group, otherwise only show the markers near QTL.

Output precision – The maximum number of decimal places to display value in the output.

# 2.4 Saving and understanding pictures and reports

### 2.4.1 Saving pictures

After finishing analysis of QTL, we can save figures in png or eps format by executing the "Export GG" for GxG plot under the "Plot" menu (Fig 2.11).



Fig 2.11: Saving picture by using "Plot" menu

## 2.4.2 Understanding the symbols in figure

For the GxG plot of QTL (Fig 2.12), there are different color circles, squares and lines in plot, which denote different type genetic effects of QTL (Fig 2.13).



Fig 2.12: The GG plot of QTL

Graphic	Line (Enisterie)	Shape (QTL)				
meta system	Line (Epistasis)	Circle	Square			
Ded	with only epistatic	• with only additive	with only dominance			
Red	main effect (I)	effect (A)	effct (D)			
	with only epistasis $\times$	🕈 with only additive ×	with only dominance ×			
Green	environment interaction effect	environment interaction	environment interaction			
	(IE)	effect (AE)	effect (DE)			
Blue	with both I and IE	🔶 with both A and AE	with both D and DE			
Dark	Not available	• with no additive	■ with no dominance			
		related effect	related effect			

Fig 2.13: The genetic indications for different symbols, lines, colors in GG plot

# 2.4.3 Understanding text report

In order to understand each item in report file, we firstly define symbols or variables in the report file, and then explain the report file using the Fig 2.14-2.20 coming from the F2 simulation data which can be found in the sample folder (~\Sample\QTL\SimF2.pre) of the QTXNetwork.

A (or a), D (or d), AE (or ae), DE (or de): denote additive effect, dominance effect, additiveenvironment interaction effect, dominance-environment interaction effect, respectively;

AA (or aa), AD (or ad), DA (or da), DD (or dd), AAE (or aae), ADE (or ade), DAE (or dae), DDE (or dde): denote additive-additive epistasis effect, additive-dominance epistasis effect, dominance-additive epistasis effect, and their interaction effects with environments, respectively;

**I**, **IE**: denote summation of different types of epistasis effects and environment interaction effects, respectively;

AE*i* (or ae*i*), DE*i* (or de*i*), AAE*i* (or aae*i*), ADE*i* (or ade*i*), DAE*i* (or dae*i*), DDE*i* (dde*i*) denote the i-th environment-specific genetic component effects of QTLs, respectively.

In the Fig 2.14, V(e), V(P) denote the residual variance and the phenotypic variance, respectively,  $h^{2}(X)$  denote the proportion of phenotypic variance contributed to the genetic effects of X, respectively, where X stand for one genetic component effect or summation of some genetic component effects, such as,  $h^{2}(A+D)$  is the proportion of phenotypic variance contributed to additive and dominance effects of detected QTLs.

For the Fig 2.15, the first column is the serial number of each detected significant QTL, the second is the flanking markers of QTL, the third is the distance between QTL and the first marker of the relevant chromosome, the fourth is the support interval of QTL position, the succeeding 3 columns are predicted genetic effects, standard error and significance probability value, respectively. The Fig 2.16 presents the proportions of phenotypic variance explained by the genetic component effects of detected QTLs in the Fig 2.15.

The Fig 2.17 and the Fig 2.18 provide each epistasis effects, epistasis-environment interaction effects of detected paired QTLs (the i-th QTL, j-th QTL), and proportion of phenotypic variance explained by these epistasis effects, respectively.

The Fig 2.19 provides predicted genotypic values based on genetic effects of detected QTLs for several designed genotypes.

 $\mathbf{Q}\mathbf{Q}$ : denoting the individual with homozygote alleles for all loci as in  $P_1$ ;

**qq**: denoting the individual with homozygote alleles for all detect loci as in  $P_2$ ;

**F1**: denoting the individual with heterozygote alleles for all detected loci as in  $F_1$  of  $P1 \times P2$ ;

**SuperiorLine(+)**: denoting predicted pure line with the highest genotypic value;

**SuperiorLine**(-): denoting predicted pure line with the lowest genotypic value;

**SuperiorHybrid(+)**: denoting predicted highest genotypic value;

**SuperiorHybrid(**-): denoting predicted lowest genotypic value;

**G**: designing genotype based on general genetic effects of QTLs;

G+GEi: designing genotype based on general and i-th environment specific genetic effects of QTLs;

For the Fig 2.20,

**GSL(+/-)** denotes designed general superior line with higher/lower trait performance;

SL(+/-)i denotes designed superior line with higher/lower trait performance in i-th environment;

**GSH(+/-)** denotes designed general superior hybrid with higher/lower trait performance;

SH(+/-)i denotes designed environment specific hybrid with higher/lower trait performance in i-th environment.

phenotypic variance: 64.3907 Total Heritability: 0.7534 ) \_variance\_components ( population mean: 100.0234 h^2(A+D) h^2(AE+DE) h^2(I) h^2(IE) V(e)/V(P) 0.4414 0.1181 0.1425 0.0313 0.2466 h^2(A) h^2(D) h^2(I) h^2(A+AA) h^2(AE) h^2(DE) h^2(IE) h^2(AE+AAE) 0.3105 0.1310 0.1425 0.3614 0.0602 0.0579 0.0313 0.0803

#### Fig 2.14: Variance components and heritability ascribed different genetic components

Fig 2.15: Mapping result ascribed to single QTL effects

\_1D\_heritability QTL h<sup>2</sup>(a) h^2(d) h^2(ae) h^2(ae1) h^2(ae2) h^2(de) h^2(de1) h^2(de2) 0.1681 0.0261 0.0137 1-3 0.0726 0.0124 0.0380 0.0177 0.0203 2-4 0.1423 0.0055 ----0.0199 0.0102 0.0098 ----3-6 0.0529 0.0341 0.0172 ----0.0168 ------------

Fig 2.16: Heritability ascribed to single QTL effects

\_2D\_effect (OTLj intenalj position jrangej OTLj intenalj position jrangej AA SE P-Value AD SE P-Value DA SE P-Value AD SE P-Value AAE1 SE P-Value ADE1 SE P-Value ADE2 h 3 IKK03-IKK04 23.0 20.0-25.0 18 IKK08-IKK09 70.0 67.0-73.0 2.3253 0.4361 9.8201e-008 2.5103 0.6199 5.155e-005 1.4559 0.6407 2.3108e-002 4.9151 0.9391 1.5176e-007 -1.8547 0.5989 5.731e-003 1.6644 0.5989 5.455e-003 h3 mK03-MKV 230 20.250 24 mK15HK16 350 32.0-380 1.0728 0.4323 1.310e-002 — — 1.4525 0.6738 3.112e-002 — — 2.4779 0.6075 5.843e-005-2.2451 0.6015 1.900e-004 — — — 1\*8 INK08-INK19 70.0 670-73.0 36 INK28-INK29 53.0 49.0-56.0 -2.5607 0.3975 1.202e-010 1.9508 0.6203 1.633e-003 -3.9986 0.5933 1.628e-011 -3.0935 0.9031 6.153e-004 -1.4504 0.5437 7.642e-003 1.4770 0.5437 6.601e-003 --

Fig 2.17: Epistatic effects ascribed to paired QTLs

\_2D\_heritability QTL\_i QTL\_i h/2(aa) h/2(da) h/2(da) h/2(da) h/2(dae) h/2(aae1) h/2(aae2) h/2(aae2) h/2(ade) h/2(ade1) h/2(ade2) h/2(dae1) h/2(dae2) h/2(dae1) h/2(dde2) h/2(dde1) h/2(dde2) h/2(dde1) h/2(dde2) h/2(dde2) h/2(dde2) h/2(dde1) h/2(dde2) h/2(dde2) h/2(dde2) h/2(dde2) h/2(dde2) h/2(dde2) h/2(dde1) h/2(dde2) h/2(dde1) h/2(dde2) h/2(dde2) h/2(dde2) h/2(dde1) h/2(dde2) h/2( 1-3 1-8 0.0210 0.0122 0.0041 0.0234 0.0053 0.0027 0.0027 -- -- 0.0061 0.0030 0.0031 -- --1-3 2-4 0.0045 --- 0.0041 --- 0.0106 0.0057 0.0049 ------ ------1-8 3-6 0.0255 0.0074 0.0310 0.0093 0.0042 0.0020 0.0021 --- ------ -- -- 0.0051 0.0024 0.0026

Fig 2.18: Heritability ascribed to epistatic effects of paired QTLs

\_genotype\_value Entry G G+GE1 G+GE2 1.9718 -1.4549 -0.7330 P1 0.2579 P2 2.8852 6.6775 
 P2
 2.8852
 0.67

 SuperiorLine(+)
 9.2504

 SuperiorLine(-)
 -13.3343

 F1
 0.1767
 -1.68

 SuperiorHybrid(+)
 12.1589

 SuperiorHybrid(-)
 -17.4036
 13.2865 22.8634 -10.3189 -17.4592 -1.6882 2.0890 22.8634 -14.<u>4</u>994 13.5513 -20.5071

Fig 2.19: Genotypic values based on predicted effects of QTL for designed genotypes

_supe	erior_g	enotype	÷	т										
QTL	GSL	.(+) GS	GL(-)	SL(+)1	SL(+)2	SL(-)	1 SL(	(-)2 G	SH(+)	GSH(-)	SH(+)	)1 SH(+)2	SH(-)1	SH(-)2
1-3	QQ	qq	qq	QQ	qq	qq	Qq	qq	qq	QQ	qq	qq		
2-4	qq	QQ	qq	qq	QQ	QQ	qq	QQ	qq	qq	QQ	QQ		
3-6	qq	QQ	QQ	qq	qq	QQ	qq	Qq	QQ	Qq	Qq	Qq		
1-8	QQ	QQ	qq	QQ	qq	QQ	Qq	Qq	qq	QQ	Qq	Qq		

Fig 2.20: The superior and inferior genotypes designed for general environment or specific

environment

# **3 User manual for QTS 3.1 Introduction on QTS**

QTS is one module of the software QTXNetwork for mapping SNP loci associated with genetic variation of quantitative traits of analyzed population. This module was developed based on the framework of the QTLNetwork (Bioinformatics, 23: 1527-1536; Bioinformatics, 24(5):721-723). The mixed linear model approach combining with Markov Chain Monte Carlo (MCMC) method were employed to perform association analysis between quantitative traits and SNP loci, predict and test genetic effects ascribed to significant SNP locus. Parallel computing base on Graphics Processing Unit (GPU) has been used in some key time-costive subroutines. The QTS can be run on Window or Mac operation system with or without GPU hardware.

# **3.2Running QTS**

### 3.2.1 Creating a project for QTS

The QTS program, kept in the folder ./exe/QTS under the QTXNetwork, can be run directly in "command window" or in "explore window". In default, we run it via the shell program (QTXNetwork). To run the QTS, we first need running the QTXNetwork for creating a new project for the QTS by clicking the button in the main window of the QTXNetwork (Fig 3.1), a window for creating new project will be popped up (Fig 3.2). After selecting module type "QTS" and specifying project name, click the "Accept" button (Fig 3.2), a QTS project will be listed in the left pane named Navigator (Fig 3.3).



Fig 3.1: The main window of the QTXNetwork

🍆 Create new pro	ject.		×			
	Create	e Project				
Project Type:	QTL	QTS				
	QTTPM	GMDR				
Project Name:	QTS2					
Project Name: OTS2 Project NAME decides the name of the project folder in which all assets of the project houses, these assets include copies of source files(e.g. *.map, *.pre) either selected by user or generated by algorithm, plus some configuration files. A project folder resid es under root HOME folder. If an empty NAME is specified, a temporary auto name will be given, you can later mov e this project under a desired name.						
	(	Accept	Cancel			

Fig 3.2: The popup window for creating new project for QTS

Root Help File Exec Plot	
Navigator ×	
and test	
at java.awt.EventDispatchihread.pumpEventSforHier at java.awt.EventDispatchThread.pumpEvents(Unknow	m Sou
at java. awt. EventDispatchThread. pumpEvents (Unknow	m Sou
at jawa.awt.EventDispatchThread.run(Unknown Source	se)

Fig 3.3: The window of QTXNetwork for performing QTS

# 3.2.2 Deleting QTS project

Select the QTS project to delete in the Navigator pane, and then click the fast button 📟

### 3.2.3 Specifying data file

In a QTS project window, a button for "locate and import source file" will occur in the toolbar, we can locate and import data files (genotype data file and phenotype data file for QTS in the popup window after clicking the button for this panel, there are three sections to set input or output files (Fig 3.4). The first is the Genetic map section, which will be used when Genetic linkage map is available. Generally, genetic map is not required for association mapping. The second is the Input data section, if the genotype data and phenotype are saved in one file, we need selecting "Use TXT file" option, otherwise, selecting "Use GNO+PNO files" to input genotype data and phenotype files, individually. The third is the "Output report" section, where the output file name can be inputted.

Locate Resource Files	×
Locate Reso	ource Files
Genetic map	
MAP:	
🗂 Input data	
GNO:	
PNO:	
🔾 Use TXT file	Use GNO+PNO files
Output report	
OUT:	
<ul> <li>Use PRE files</li> </ul>	Use LOC+INT files
graphical charts and rearranged tables are bas If you want to perform QTS algorithm to search input data must be supplied, either one single A PRE report will be generated on completion of created. If you only want to view charts and tables upon o	ed on this file. meaningful SNPs, one of two type of TXT file or a pair of GNO and PNO files. If the searching and charts will be existing QTS output, just supply the PRE
report tile. You can supply input data(either TXT or GNO+F to view charts and tables based on the report, v perform new search based on the input, probat from last time. You can optionally supply SNP distance informa	'NO) and output report(PRE) all together vhile at the same time enabling you to oly with different parameters and setting ation(MAP) to affect generated charts.
You can supply none and just close this dialog, time	, you can supply source files at any later
	Accept Cancel

Fig 3.4: The window for inputting data files and output file

#### 3.2.4 Starting QTS

For example, suppose we open a QTS projected named "test", and also specify the data files for this project. The sample data files are the genotype data file (~\sample\QTS\SimF2\_600.gen), the phenotype data file (~\sample\QTS\SimF2\_600.phe), and the report file (~\sample\QTS\SimF2\_600.pre), respectively, then, the main window for the QTS project will exhibits as the Fig 3.5.



Fig 3.5: The window of QTXNetwork after creating or opening a QTS project

Finally, we can click the button (Fig 3.5) to start the QTS analysis if all default algorithm parameters are used. We can adjust QTS algorithmn configuration before running, detailed information refer to the chapter 3.3.2.

### **3.3Data file format and running configuration of QTS**

### 3.3.1 Data format

For performing analyses with QTS, two source data files are required: a genotype data file, or together with a marker linkage map file (not requisite) and a phenotype data file. The linkage map file contains information about the order and genetic distances of all observed markers on the chromosomes or linkage groups. The genotype data file contains marker information for each genotype; the phenotype data file contains observation values of traits under study for all individuals. We provide some sample files for briefly demonstrating the format of source data files for QTS in the sub-directory (~\Sample\QTS) where QTXNetwork has been installed. The genotype data file with extension name of ".Phe" for QTS can be directly used by QTS.

The genotype data can be organized in two different formats which are summarized in Table 3.1 and 3.2. For the first one (Table 3.1), the first line consists of the keyword "#Ind" and molecular marker

names, the first column is for the ID or name of individual subjects. In the second format, the first line consists of the keyword "#Mk" and ID name of individual subjects, the first column is for the ID or name of molecular markers. The other data are the codes of different genotype in each molecular marker locus for all individuals; these codes should be defined in phenotype data file corresponding this genotype data file. It should be noted that the the "I" in "#Ind" and the "M" in "Mk" should be as capital letter, the others are small letters.

#Ind	MK1	MK2	MK3	MK4	MK5	 MKm
1	Н	Н	А	А	А	 А
2	Н	В	Н	В	В	 Н
3	А	А	Н	Н	Н	 В
n	А	А	А	А	А	 Н

Table 3.1: The first type of genotype data format

Table 3.2: The second type of genotype data format

#Mk	1	2	3	4	5	 n
MK1	Н	Н	А	А	А	 В
MK2	Н	В	А	А	А	 В
MK3	А	Н	Н	А	А	 В
MK4	А	В	Н	А	А	 В
MK5	А	В	Н	А	А	 Н
						 v
MK7	А	Н	В	А	Н	 Н

**General description:** This part is for specifying the basic features of the phenotype data file, and is usually put in front of the data file. Like in the map file, each item in general description is a key character string followed by certain specifications. Each key string must be started with an underline "\_", and no white space is allowed within it. There are nine possible items for general description. They can be arranged in any order. A typical description for a phenotype data file looks like:

- \_Population F2
- \_Genotypes 200
- \_Observations 600
- \_Environments Yes
- \_Replications No

\_TraitNumber 1

\_Chromosomes 3 Chr1 Chr2 Chr3

\_TotalMarker 165 50 50 65

\_MarkerCode P1=A P2=B F1=H F1P1=C F1P2=D

**Population** specifies the population type used. Some commonly used populations are listed as follows:

**RI population** – inbreeding lines derived from a cross between two pure-line parents. The specification word for the inbreeding population can be RI or DH.

**F2** population – random matting population or selfing population of  $F_1$  hybrid crossing by inbred lines.

\_Genotypes specifies the total number of unique subjects used in the mapping population.

**Observations** specifies the total number of observations for each trait studied.

**\_Environments** specifies the status of experimental design for environments. If the experiment is conducted in multiple environments, write the specification word "Yes" after the key word \_Environments, otherwise write "No".

**\_Replications** specifies the status of experimental design for replications or blocks. If the experiment is conducted with replications or blocks, write the specification word "Yes" after the keyword \_Replications, otherwise write "No".

\_TraitNumber specifies the total number of traits included in the phenotype data file.

\_Chromosomes specifies the chromosome number and the names in marker file. If all molecular markers are regarded as lying in one chromosome, thus, the values after this keyword are "1" and "Chr1".

**\_TotalMarker** specifies the total number of the markers included in the marker data file and the number of markers in each chromosome. The first number must be equal to the summation of all the markers.

**\_MarkerCode** defines a marker coding scheme. There are five possible strings for the specifications. Each of the strings looks like an equation, but no white space is allowed within the string. On the left side of the equation symbol is the marker phenotype specification:

P1: Markers of two alleles being the same as that of P<sub>1</sub> or major allele;

P2: Markers of two alleles being the same as that of P<sub>2</sub> or minor allele;

F1: Markers of two alleles being the same as that of F<sub>1</sub>;

F1P1: Markers of two alleles undistinguishable between P1 type and F1 type;

F1P2: Markers of two alleles undistinguishable between P2 type and F1 type.

**Trait data body:** This part is between two key strings \*TraitBegin\* and \*TraitEnd\*. The data source includes the environment (if available), the replication (if available) and the ID name of subjects, as well as the observations obtained for traits studied. The following is an example for the trait data body.

\*TraitBegin\*

Env#	Rep#	Geno#	Trait_1	Trait_2	Trait_3	;
1	1	1	2.44	7.4	10.04	;
1	1	2	2.4	4.32	8.55	;
•••••						

1	1	90	3.54	8.19	10.74	;
1	2	1	3.17	6.91	11.86	;
1	2	2	1.9	4.31	11.36	;
•••••						
1	2	90	3.22	10.54	11.48	;
2	1	1	5.74	12.78	11.27	;
2	1	2	7.65	7.02	11.96	;
•••••						
2	1	90	6.58	13.92	9.94	;
2	2	1	6.01	10.22	9.95	;
2	2	2	6.22	11.99	7.81	;
•••••						
2	2	90	7.98	13.21	12.03	;
*Trait	End*					

The second row includes the indicator strings and the names of the traits. The number of source strings depends on the experimental design. If both environments and replications are taken, a maximum of three strings must be inputted: the first string for environment (Env#), the second string for replication (Rep#) and the third string for subject (Geno#). You can use whatever strings to express the sources because they are just used to indicate what the numbers are in the columns below them. If the experiment is conducted without environmental factor or replications, the corresponding column must be removed. And also, a semicolon ";" is required at the end of each observation data row.

#### 3.3.2 QTS algorithm and configuration

Before conducting QTS, we first need setting the QTS algorithm configuration. Suppose a new QTS project is created or a QTS project is opened in main window of the QTXNetwork, click the QTS project in the Navigator panel (Fig 3.5) to set the algorithm configuration, then activate the command item "Config" under the "Exec" software menu (Fig 3.6), a panel will be popped up for setting configuration (Fig 3.7, Fig 3.8).

North State	- 🗆 ×
Root Help File Exec Plot	
Image: Second	a Sou Sou

Fig 3.6: Executing QTS under the "Exec" of the menu

	× Configuration
QTS Algorium	Configuration
	☑ High-order Epistasis
🗹 2D genome scan	
Permutation Time: 1.000 ᆍ	0
Gibbs sample size: 20.000 😭	0
✓ Superior genotype prediction	
	Accept Cancel

Fig 3.7: General algorithm configuration for QTS

**Map Epistasis** – Choose this option to detect both single-locus effect QTS and epistasis, otherwise to detect QTS with single-locus effects only.

×

**High Order Epistasis** – We define the additive  $\times$  dominance (AD), dominance  $\times$  additive (DA) and dominance  $\times$  dominance (DD) as the high order epistaiss. This option is only available for setting F2 population. Choose this option to detect QTL with additive (A) and dominance (D) effects, and also epistasis with AA, AD, DA and DD effects, otherwise to detect epistasis with only AA effect.

**Do 2D Genome Scan** – Choose this option to detect epistasis QTSs among markers with single-locus effects and also without single-locus effects. Otherwise the program will only detect the epistasis interaction QTSs among markers with single-locus effects.

**Permutation Time** – Set the permutation time to conduct permutation test on significance of QTS effects. **Gibs sample size** – Set this value to predict QTS effects by Monte Carlo Markov Chain method, otherwise by mixed linear model approach.

**Superior Genotype Prediction** – Choose this option to predict superior genotypes based on QTS effects (Ref. Yang J and Zhu J. (2005). Predicting Superior Genotypes in Multiple Environments Based on QTL Effects. Theoretical and Applied Genetics, 110: 1268-1274.)

	X
QTS Algorithm	Configuration
General Genome Scan	
Candidate interval selection:	0.05 🛊
Putative QTS detection:	0.05
QTS Significance Threshhold:	0.05 🖶
	Accept Cancel

Fig 3.8: Genome scan configuration for QTS

Candidate Interval Selection – The experimental-wise type I error for candidate interval selection.
 Putative QTS Detection – The experimental-wise type I error for putative QTS detection.
 QTL Effects – The significant level for QTS effects.

## 3.4 Saving and understanding pictures and report

### 3.4.1 Saving pictures

After finishing analysis of QTS, we can save figures in png or eps format by executing the "Export GG" for GxG plot or "Export GE" for GxE plot under the "Plot" menu (Fig 3.9).



Fig 3.9: Saving picture by using "Plot" menu

### 3.4.2 Understanding the symbols in figure

For the GxG plot of QTS (Fig 3.10), there are different color circles, squares and lines in plot, which denote different type genetic effects of QTS; detailed definition is presented in the Fig 3.11.



Fig 3.10: The GG plot of QTS

Graphic	Line (Enisteric)	Shape (QTL)									
meta system	Line (Epistasis)	Circle	Square								
Dad	with only epistatic	• with only additive	with only dominance								
Keu	main effect (I)	effect (A)	effet (D)								
	$\cdots$ with only epistasis $\times$	🕈 with only additive ×	with only dominance ×								
Green	environment interaction effect	environment interaction	environment interaction								
	(IE)	effect (AE)	effect (DE)								
Blue	with both I and IE	🔶 with both A and AE	with both D and DE								
Dault	Not available	• with no additive	■ with no dominance								
Dark	inot available	related effect	related effect								

Fig 3.11: The genetic indications for different symbols, lines, colors in GG plot

In the GxE plot of QTS (Fig 3.12), the X-axis are additive (A), dominance (D), and epistasis (AA, AD, DA, DD) effects ascribed to detected QTSs, the Y-axis is the values of effects, the pink rectangle bars stand for genetic main effects, the green line (with one integer n on top) denote the n-th environment-specific effect.



Fig 3.12: The GE plot of QTS

#### 3.4.3 Understanding text report

In order to understand each item in report file, we firstly define symbols or variables in the report file, then explain the report file using the Fig 3.13-3.19 coming from the F2 simulation data which can be found in the sample folder (~\Sample\QTS\SimF2\_y600.pre) of the QTXNetwork.

A (or a), D (or d), AE (or ae), DE (or de): denote additive effect, dominance effect, additiveenvironment interaction effect, dominance-environment interaction effect, respectively;

AA (or aa), AD (or ad), DA (or da), DD (or dd), AAE (or aae), ADE (or ade), DAE (or dae), DDE (or dde): denote additive-additive epistasis effect, additive-dominance epistasis effect, dominance-additive epistasis effect, and their interaction effects with environments, respectively;

**I**, **IE**: denote summation of different types of epistasis effects and environment interaction effects, respectively;

AE*i* (or ae*i*), DE*i* (or de*i*), AAE*i* (or aae*i*), ADE*i* (or ade*i*), DAE*i* (or dae*i*), DDE*i* (dde*i*) denote the *i*-th environment-specific genetic component effects of SNPs, respectively.

In the Fig 3.13, V(e), V(P) denote the residual variance and the phenotypic variance, respectively,  $h^{2}(X)$  denote the proportion of phenotypic variance contributed to the genetic effects of X, respectively, where X stand for one genetic component effect or summation of some genetic component effects, such as,  $h^{2}(A+D)$  is the proportion of phenotypic variance contributed to additive and dominance effects of detected QTSs.

For the Fig 3.14, the first column is the serial number of each detected significant SNP, the second is the SNP ID, the succeeding 3 columns are predicted genetic effects, standard error and significance probability value, respectively. The Fig 3.15 presents the proportions of phenotypic variance explained by the genetic component effects of detected QTSs in the Fig 3.14.

The Fig 3.16 and the Fig 3.17 provide each epistasis effects, epistasis-environment interaction effects of detected paired QTSs (the i-th SNP, j-th SNP), and proportion of phenotypic variance explained by these epistasis effects, respectively.

The Fig 3.18 provides predicted genotypic values based on genetic effects of detected QTSs for several designed genotypes.

**QQ**: denoting the individual with homozygote alleles for all loci as in  $P_1$ ;

 $\mathbf{qq}$ : denoting the individual with homozygote alleles for all detect loci as in  $P_2$ ;

F1: denoting the individual with heterozygote alleles for all detected loci as in  $F_1$  of  $P_1 \times P_2$ ;

SuperiorLine (+): denoting predicted pure line with the highest genotypic value;

**SuperiorLine** (–): denoting predicted pure line with the lowest genotypic value;

**SuperiorHybrid** (+): denoting predicted F<sub>1</sub> with the highest genotypic value;

**SuperiorHybrid** (–): denoting predicted F<sub>1</sub> with the lowest genotypic value;

G: designing genotype based on general genetic effects of QTS;

**G+GE***i*: designing genotype based on general and *i*-th environment specific genetic effects of QTSs; For the Fig 3.19,

GSL(+/-) denotes designed general superior line with higher/lower trait performance;

SL(+/-)i denotes designed superior line with higher/lower trait performance in i-th environment;

GSH(+/-) denotes designed general superior hybrid with higher/lower trait performance;

SH(+/-)i denotes designed environment specific hybrid with higher/lower trait performance in *i*-th environment.

_variance_	components ( popui	lation mean:	100.5358	phenotypic varia	ance: 144.3982	Total Heritab	oility: 0.7678 )
ĥ^2(A+D) −	h^2(AE+DE)	h^2(I)	h^2(IE)	V(e)/V(P)			
0.1046	0.0732	0.4624	0.0638	0.2322			
h^2(A)	h^2(D)	h^2(I)	h^2(A+AA)	h^2(AE)	h^2(DE)	h^2(IE)	h^2(AE+AAE)
0.0556	0.0490	0.4624	0.0625	0.0662	0.0070	0.0638	0.1301

Fig 3.13: Variance components and heritability ascribed different genetic components

_1D_eff QTL	ect SNPID	Å	SE	P-Value	D	SE	P-Value	AE1	SE	P-Value	AE2	SE	P-Value
1-5	MK 5	1.3339	0.3171	2.599e-005									
1-41	MK41	-0.9428	0.3171	2.947e-003	-0.9452	0.4465	3.429e-002	1.3273	0.5384	1.370e-002			
2-22	MK72	1.6001	0.3291	1.173e-006				1.3725	0.5567	1.369e-002	1.9603	0.5567	4.302e-004
3-2	MK102				1.5494	0.4465	5.215e-004	2.2231	0.5795	1.253e-004			
3-34	MK134	-1.6728	0.3501	1.783e-006	-1.3635	0.4465	2.264e-003						
3-42	MK142				-1.3860	0.4465	1.912e-003				1.0535	0.5135	4.020e-002
Fig	3.14: M	apping re	sult asc	ribed to	single	SNP ef	fects						

_1D_heritab	bility									
QTL	h^2(a)	h^2(d)	h^2(ae)	h^2(ae1)	h^2(ae2)	h^2(ae3)	h^2(de)	h^2(de1)	h^2(de2)	h^2(de3)
1-5	0.0123		0.0042			0.0126				
1-41	0.0062	0.0062	0.0159	0.0122		0.0354				
2-22	0.0177		0.0132	0.0130	0.0266					
3-2		0.0166	0.0245	0.0342		0.0391				
3-34	0.0194	0.0129								
3-42		0.0133	0.0085		0.0077	0.0177	0.0070	0.0209		

Fig 3.15: Heritability ascribed to single QTS effects

_2D_effec	t																	
QTL_i	SMPID_i	QTL_j	SMPID_j	λA	SE	P-Value	AD	SE	P-Value	DA	SE	P-Value	DD	SE	P-Value	AAE1	SE	P-Val
1-5	MK5	3-2	MK102				1.4571	0.6033	1.574e-002	-1.8711	0.6458	3.769e-003	-2.7097	0.9053	2.763e-003	1.6820	0.7558	2.606
1-41	MK41	3-34	MX134				-1.2162	0.6033	4.382e-002				-3, 1859	0.9053	4.337e-004			
2-22	MX72	3-34	MX134				2.6623	0.6240	1.993e-005				4.2525	0.9053	2.652e-006			
3-7	MX107	3-42	WK142							-2.0709	0.5976	5. 304e-004						
3-34	MX134	3-38	MX138	1.0000	0.4552	2.806e-002												
3-34	MX134	3-42	WK142										3.4220	0.9053	1.572e-004			

Fig 3.16: Epistatic effects ascribed to paired QTSs

_2D_herit	ability													
QTLi	QTLj	h*2(aa)	h°2(ad)	h^2(da)	h^2(dd)	h°2(aae)	h^2(aae1)	h^2 (aae2)	h*2(aae3)	h°2(ade)	h^2(ade1)	h^2 (ade2)	h°2(ade3)	h^2(dae)
1-5	3-2		0.0147	0,0242	0,0509	0.0197	0.0196		0.0395					
1-41	3-34		0,0102		0, 0703	0.0041			0.0124					
2-22	3-34		0, 0491		0, 1252	0.0400		0, 1201						
3-7	3-42			0,0297										
3-34	3-38	0, 0069												
3-34	3-42				0.0811									

Fig 3.17: Heritability of epistatic effects ascribed to paired QTSs

_genotype_value				
Entry	G	G+GE1	G+GE2	G+GE3
QQ -	3.3551	10.8276	10.5327	-0.4795
qq	1.6795	-0.6937	2.8295	7.6159
SuperiorLine(+)	7.3701	14.1733	11.2021	8.5127
SuperiorLine(-)	-4.3354	-8.1927	-11.5130	-11.7067
F1	-0.6279	-1.4955	-0.6279	-0.6279
SuperiorHybrid(+)	11.1090	14.1733	14.9409	13.9984
, SuperiorHybrid(-)	-10.1362	-13.7103	-13.1500	-16.0966
v				

Fig 3.18: Genotypic values based on predicted effects of QTS for designed genotypes

_superior	_genotype															
QTL	GSL (+)	GSL (-)	SL (+) 1	SL (+) 2	SL (+) 3	SL (-) 1	SL (-) 2	SL (-) 3	GSH(+)	GSH(-)	SH(+)1	SH(+)2	SH(+)3	SH(-)1	SH(-)2	SH(-)3
1-5	ର୍ଦ୍	qq	ର୍ଦ୍	ର୍ଦ୍	ଢ୍ଢ	ଭ୍ୟ	qq	qq	ର୍ଦ୍	qq	QQ	QQ	ଭ୍ଭ	ର୍ଦ୍	qq	qq
1-41	qq	ଭ୍ଭ	ହହ	qq	qq	qq	ଭ୍ଭ	ଭ୍ଭ	Qq	Qq	ଭ୍ଭ	Qq	qq	Qq	Qq	QQ
2-22	ହହ	qq	ହହ	ଭ୍ଭ	ଢ୍ଢ	qq	qq	qq	ଭ୍ଭ	qq	ଭ୍ଭ	ଭ୍ୟ	ଭ୍ଭ	qq	qq	Qq
3-2	ହହ	qq	ହହ	ଭ୍ଭ	ଭ୍ଭ	qq	qq	ଭ୍ଭ	Qq							
3-34	qq	ଭ୍ଭ	qq	ଭ୍ଭ	ଢ୍ଢ	ଢ୍ଢ	QQ	ଭ୍ଭ	qq	Qq	qq	ର୍ଦ୍	ଭ୍ଭ	Qq	Qq	ଭ୍ଭ
3-42	ଢ୍ଢ	qq	ଢ୍ଢ	ଭ୍ଭ	qq	qq	qq	ଭ୍ଭ	ଭ୍ଭ	qq	ଭ୍ଭ	ଭ୍ୟ	qq	Qq	qq	Qq
3-7	QQ/qq	QQ/qq	QQ/qq	QQ/qq	QQ/qq	QQ/qq	QQ/qq	QQ/qq	QQ/qq	QQ/qq	QQ/qq	QQ/qq	Qq	ALL	QQ/qq	ALL
3-38	qq	qq	qq	QQ	QQ	qq	qq	qq	qq	Qq/qq	qq	QQ	QQ	Qq/qq	Qq/qq	qq

Fig 3.19: The superior and inferior genotypes designed for general environment or specific environment

# 4 User manual for QTT/P/M 4.1 Introduction on QTT/P/M

QTT/P/M is one module of the software QTXNetwork for association mapping genetic variation of quantitative trait transcripts (QTT), quantitative trait proteins (QTP), and quantitative trait metabolites (QTM) with phenotypic variation. The mixed linear model approach combining with Markov Chain Monte Carlo (MCMC) method are employed to perform association analysis, and to predict and test genetic effects of significant QTTs, QTPs, and QTMs. Parallel computing base on Graphics Processing Unit (GPU) is used in some key time-costive subroutines. The QTT/P/M can also be run on Windows or Mac operation system with or without GPU hardware.

# 4.2Running QTT/P/M

### 4.2.1 Creating a project for QTT/P/M

The QTT/P/M program, kept in the folder ~/exe/QTT under the QTXNetwork, can be run directly in "command window" or in "explore window". In default, we run it via the shell program (QTXNetwork). To run the QTT/P/M, we first need running the QTXNetwork for creating a new project for the QTT/P/M by clicking the button in the main window of the QTXNetwork (Fig 4.1), a window for creating new project will be popped up (Fig 4.2). After selecting module type "QTTPM" and specifying project name, click the "Accept" button (Fig 4.2), a QTT/P/M project will be listed in the left pane named Navigator (Fig 4.3).



Fig 4.1: The main window of the QTXNetwork

🍆 Create new pro	oject.	×
	Create I	Project
Project Type	QTL	QTS
	QTTPM	GMDR
Project Name	test	
Project NAME decid houses, these assi by user or generate es under root HOMI If an empty NAME is e this project under	les the name of the proje ets include copies of sou d by algorithm, plus som E folder. s specified, a temporary a a desired name.	ict folder in which all assets of the project irce files(e.g. *.map, *.pre) either selected ie configuration files. A project folder resid auto name will be given, you can later mov
		Accept Cancel

Fig 4.2: The popup window for creating new project for QTT/P/M

<b>QIX-Hetwork</b>	
Root Help File Exec Plot	
Navigator ×	
Test	LOG × at java.avt.EventDispatchThread.pumpEventsForHierarch[4] at java.avt.EventDispatchThread.pumpEvents(Unknown Sou at java.avt.EventDispatchThread.pumpEvents(Unknown Sou at java.avt.EventDispatchThread.run(Unknown Source)

Fig 4.3: The window of QTXNetwork for performing QTT/P/M

### 4.2.2 Deleting QTT/P/M project

Select the QTT/P/M project to delete in the Navigator pane, and then click the fast button

#### 4.2.3 Specifying data file

In a QTT/P/M project window, a button for "locate and import source file" will occur in the toolbar, we can locate and import data files (genotype data file and phenotype data file for QTT/P/M in the popup window after clicking the button for files). In this panel (Fig 4.4), there are three sections to set input or output files. Since there is no need for loading genetic map in association mapping for QTT/P/M, only data of genotypes and phenotypes are required for loading. If the genotype data and phenotype are saved in one file, we need selecting "Use TXT file" option, otherwise, selecting "Use GNO+PNO files" to input data files of genotypes and phenotypes, individually. The third is the "Output report" section, where the output file name can be inputted.

Locate Resource Files	×						
Locate Resource Files							
-Genetic map							
MAP:	🧭						
Cinput data							
GNO:							
PNO:							
🔘 Use TXT file	Use GNO+PNO files						
Output report							
OUT:							
<ul> <li>Use PRE files</li> </ul>	Use LOC+INT files						
Interactions among these over s, and estimate graphical charts and rearranged tables are ba- lf you want to perform QTS algorithm to search input data must be supplied, either one single A PRE report will be generated on completion created.	or enectron each interaction. Further sed on this file. meaningful SNPs, one of two type of TXT file or a pair of GNO and PNO files. of the searching and charts will be						
report file.	existing GTS output, just supply the PRE						
You can supply input data(either TXT or GNO+I to view charts and tables based on the report, v perform new search based on the input, proba from last time. You can optionally supply SNP distance inform	PNO) and output report(PRE) all together while at the same time enabling you to bly with different parameters and setting vation(MAP) to affect generated charts.						
You can supply none and just close this dialog time	i, you can supply source files at any later						
(	Accept Cancel						

Fig 4.4: The window for inputting data files and output file

### 4.2.4 Starting QTT/P/M

For example, suppose we open a QTT projected named "test", and also specify the data files for this project. The sample data files are the genotype data file (~\sample\QTT\SampleQTT.gen), the phenotype data file (~\sample\QTT\SampleQTT.gen), the phenotype data file (~\sample\QTT\SampleQTT.pre), and the report file (~\sample\QTT\SampleQTT.pre), respectively, then, the main window for the QTT project will exhibits as the Fig 4.5.



Fig 4.5: The window of QTXNetwork after creating or opening a QTT/P/M project

Finally, we can click the button (Fig 4.5) to start the QTT analysis if all default algorithm parameters are used. We can adjust QTT algorithmn configuration before running, detailed information refer to the chapter 4.3.2.

# 4.3 Data file format and running configuration of QTT/P/M

### 4.3.1 Data format

For performing analyses with QTT/P/M, two source data files are required: a genotype data file and a phenotype data file. The genotype data file contains expression variation for each genotype of all the subjects, and the phenotype data file contains observation values of traits under study for all subjects. Some sample files for briefly demonstrating the format of source data files for QTT/P/M in the subdirectory (~\Sample\QTT) where QTXNetwork has been installed. The genotype data file with extension name of ".Gen" and phenotype data files with extension name of ".Phe" for QTT can be directly used by QTT/P/M.

The genotype data can be organized in two different formats, which are summarized in Table 4.1 and 4.2. For the first one (Table 4.1), the first line consists of the keyword "#Ind" and molecular names, the first column is for the ID or name of individual subjects. In the second format, the first line consists of the

keyword "#Mk" and ID name of individual subjects, the first column is for the ID or name of molecules. The other data are the codes of different genotype in each molecular locus for all subjects. These codes need to be defined in phenotype data file corresponding this genotype data file.

#Ind	MK1	MK2	MK3	MK4	MK5	 MKm
1	0.19	1.37	0	0	0.68	 0.04
2	0.21	1.5	0	0	0.84	 0.02
3	0.04	0.71	0	0.64	0	 0.03
n	0.05	1.07	0.04	0	1.07	 0.05

#Mk	1	2	3	4	5	••••	n
MK1	0.19	0.21	0.04	0.04	0.11		0.05
MK2	1.37	1.5	0.71	0.93	1.14		1.07
MK3	0	0	0	0	0.02		0.04
MK4	0	0	0.64	0.74	0		0
MK5	0.68	0.84	0	0	1.86		1.07
MKm	0.04	0.02	0.03	0.03	0.03		0.05

Table 4.2: The second type of genotype data format

Table 4.1: The first type of genotype data format

**General description:** This part is for specifying the basic features of the phenotype data file, and is usually put in front of the data file. Each key string must be started with an underline "\_", and no white space is allowed within it. There are seven possible items for general description. They can be arranged in any order. A typical description for a phenotype data file looks like:

\_Population EXP

\_Observations 33

\_Chromosomes 1 Chr1

\_TotalTranscript 119 119

\_TraitNumber 6

\_Environments No

\_Replications Yes

**\_Population** specifies the population type used. In QTT/P/M mapping, the genotype values are quantitative, so we define the population type as "EXP".

\_Observations specifies the total number of observations for each trait studied.

**\_Environments** specifies the status of experimental design for environments. After the key word \_Environments, write the specification word "Yes" for having multiple environments or, "No" for only one environment. **\_Replications** specifies the status of experimental design for replications or blocks. If the experiment is conducted with replications or blocks, write the specification word "Yes" after the keyword \_Replications, otherwise write "No".

\_TraitNumber specifies the total number of traits included in the phenotype data file.

\_Chromosomes specifies the chromosome number and the names in marker file. In QTT/P/M, all molecular markers are regarded as lying in one chromosome, thus, the values after this keyword are "1" and "Chr1".

**\_TotalTranscript** specifies the total number of the transcripts included in the marker data file and the number of markers in each chromosome. The first number must be equal to the summation of all the markers.

**Trait data body:** This part is between two key strings \*TraitBegin\* and \*TraitEnd\*. The data source includes the environment (if available), the replication (if available) and the ID name of subjects, as well as the observations obtained for traits studied. The following is an example for the trait data body. \*TraitBegin\*

Env#	Rep#	Geno#	Trait_1	Trait_2	Trait_3	;
1	1	1	2.44	7.4	10.04	;
1	1	2	2.4	4.32	8.55	;
•••••						
1	1	90	3.54	8.19	10.74	;
1	2	1	3.17	6.91	11.86	;
1	2	2	1.9	4.31	11.36	;
•••••						
1	2	90	3.22	10.54	11.48	;
2	1	1	5.74	12.78	11.27	;
2	1	2	7.65	7.02	11.96	;
•••••						
2	1	90	6.58	13.92	9.94	;
2	2	1	6.01	10.22	9.95	;
2	2	2	6.22	11.99	7.81	;
•••••						
2	2	90	7.98	13.21	12.03	;

\*TraitEnd\*

The second row includes the indicator strings and the names of the traits. The number of source strings depends on the experimental design. If both environments and replications are taken, a maximum of three strings must be included: the first string for environment (Env#), the second string for replication (Rep#)

and the third string for subject (Ind#). You can use whatever strings to express the sources because they are just used to indicate the conents in the columns below them. If the experiment is conducted without environmental factor or replications, the corresponding column must be removed. And also, a semicolon ";" is required at the end of each observation data row.

### 4.3.2 QTT/P/M algorithm and configuration

Before conducting QTT/P/M, we first need setting the QTT/P/M algorithm configuration. Suppose a new QTT project is created or a QTT project is opened in main window of the QTXNetwork, click the QTT project in the Navigator panel (Fig 4.5) to set the algorithm configuration, then activate the command item "Config" under the "Exec" software menu (Fig 4.6), a panel will be popped up for setting configuration (Fig 4.7, Fig 4.8).



Fig 4.6: Executing QTT/P/M under the "Exec" of the menu

	×
QTT/P/M Algorith	nm Configuration
General x-Ome Scan	
Mapping Order: 3 🖨	
Permutation Time: 1.000 🖨	
Gibbs sample size: 20.000 🖨	· · · · · · · · · · · · · · · · · · ·
Superior x-Ome prediction	
L	
	Accept Cancel

Fig 4.7: General algorithm configuration for QTT/P/M

**Mapping Order** – Set the mapping order to decide mapping with or without two-locus or three-locus epistasis. "1" denotes that the program only detects single-locus effect QTT/P/M; "2" denotes that the program detects both single-locus effect QTT/P/M and two-locus epistasis; "3" denotes that the program not only detects single-locus and two-locus effect, but also three-locus epistasis.

**Permutation Time** – Set the permutation time to conduct permutation test on significance of QTT/P/M effects.

**Gibbs sample size** – Set this value to predict QTT/P/M effects by Monte Carlo Markov Chain method, otherwise by mixed linear model approach.

**Superior x-Ome Prediction** – Choose this option to predict superior genotypes based on QTT/P/M effects (Ref. Yang J and Zhu J. (2005). Predicting Superior Genotypes in Multiple Environments Based on QTL Effects. Theoretical and Applied Genetics, 110: 1268-1274.)

QTT/P/M Algorithm Configuration     General x-Ome Scan							
Candidate interval selection:	0.05 🖨						
Putative QTL detection:	0.05 🛊						
QTX Significance Threshhold:	0.05						
	Accent Cancel						

Fig 4.8: Genome scan configuration for QTT/P/M

Candidate interval selection – The experimental-wise type I error for candidate interval selection. Putative QTL Detection – The experimental-wise type I error for putative QTT/P/M detection. QTX Significant Threshold – The significant level for QTT/P/M effects.

# 4.4 Saving and understanding pictures and report

#### 4.4.1 Saving pictures

After finishing analysis of QTT/P/M, we can save figures in png or eps format by executing the "Export GG" for GxG plot or "Export GE" for GxE plot under the "Plot" menu (Fig 4.9).



Fig 4.9: Saving picture by using "Plot" menu

#### 4.4.2 Understanding the symbols in figure

For the GxG plot of QTT (Fig 4.10), the red circles denote the main effects of detected significant transcripts.



Fig 4.10: The GG plot of QTT

#### 4.4.3 Understanding text report

In order to understand each item in report file, we firstly define symbols or variables in the report file, then explain the report file using the Fig 4.11-4.14 coming from the simulation data which can be found in the sample folder (~\Sample\QTT\SampleQTT.pre) of the QTXNetwork.

Q (or q) and QE (or qe): denote main effect and their interaction effect with environment, respectively;

QQ (or qq) and QQE (or qqe): denote epistasis effect and their interaction effects with environments, respectively;

**QE***i* (or **qe***i*), **QQE***i* (or **qqe***i*) denote the *i*-th environment-specific genetic component effects of transcript, protein or metabolism, respectively.

In the Fig 4.11, V(e), V(P) denote the residual variance and the phenotypic variance, respectively,  $h^{2}(X)$  denote the proportion of phenotypic variance contributed to the genetic effects of X, respectively, where X stand for one genetic component effect or summation of some genetic component effects, such as,  $h^{2}(Q)$  is the proportion of phenotypic variance contributed to main effect of detected QTT/P/M.

```
_variance_components ( population mean: 0.7788 phenotypic variance: 8.3179 Total Heritability: 0.9999 )

h^2(Q) V(e)V(P)

0.9999 0.0001
```

Fig 4.11: Variance components and heritability ascribed different genetic components

For the Fig 4.12, the first column is the serial number of each detected significant QTT/P/M, the second is the QTT/P/M ID, the succeeding 3 columns are predicted genetic effects, standard error and significance probability value, respectively. The Fig 4.13 presents the proportions of phenotypic variance explained by the genetic component effects of detected QTT/P/M in the Fig 4.12.

QTL	interval	T	SE	P-Value
1-30	ST14	-2.8840	0.4539	2.141e-010

Fig 4.12: Mapping result ascribed to single transcript effects

QTL	h^2(t)
1-30	0.9999

Fig 4.13: Heritability ascribed to single transcript effects

The Fig 4.14, the first column is the individual ID, and the second is the predicted individual genotype values based on detected significant transcript.

# 5 User manual for GWAS-GMDR

### 5.1 Introduction on GWAS-GMDR

GWAS-GMDR is a program which implements the GMDR algorithm specifically for analyzing Genome-Wide Association Analysis (GWAS) data. GWAS-GMDR assumes that all the attributes are SNPs, and accelerates the computation speed by the many-core parallel computation technique of Graphics Processing Units (GPU), to overcome the memory and computation burdens of exhaustively searching among millions of SNPs, so that detecting gene-gene interactions become feasible in real GWAS data by GMDR.

### 5.2 Running GWAS-GMDR

#### 5.2.1 Creating a project for GMDR

The GMDR program, kept in the folder ~/exe/MDR under the QTXNetwork, can be run directly in "command window" or in "explore window". In default, you can run it via the shell program (QTXNetwork). To run the GMDR, you first need running the QTXNetwork for creating a new project for the GMDR by clicking the button 🔂 in the main window of the QTXNetwork (Fig 5.1), a window for creating new project will be popped up (Fig 5.2). After selecting module type "GMDR" and specifying project name, click the "Accept" button (Fig 5.2), a GMDR project will be listed in the left pane named Navigator (Fig 5.3).



Fig 5.1: The main window of the QTXNetwork

🔌 Create new project. 🛛 🗙						
	Create	Project				
Project Type:	QTL	QTS				
	QTTPM	GMDR				
Project Name:	test					
Project Type: CTTPM CADR Project Name: est Project NAME decides the name of the project folder in which all assets of the project houses, these assets include copies of source files(e.g. *.map, *.pre) either selected by user or generated by algorithm, plus some configuration files. A project folder resid es under root HOME folder. If an empty NAME is specified, a temporary auto name will be given, you can later mov e this project under a desired name.						
		V Accept	<b>×</b> 0	Cancel		

Fig 5.2: The popup window for creating new project for GMDR



Fig 5.3: The window of QTXNetwork for performing GMDR

# 5.2.2 Deleting GMDR project

Select the GMDR project to delete in the Navigator pane, and then click the fast button 💻

#### 5.2.3 Specifying data file

In a GMDR project window, a button for "locate and import source file" will occur in the toolbar, you can locate and import data files (genotype data file and phenotype data file for GMDR in the popup window after clicking the button ). In this panel, there are three sections to set input or output files (Fig 5.4). The first is the Genetic map section, which will be used when Genetic linkage map is available. Generally, genetic map is not required for association mapping. The second is the Input data section, and you need input data files of genotypes and phenotypes, individually. The third is the "Output report" section, where the output file name can be inputted.



Fig 5.4: The window for inputting data files and output file

#### 5.2.4 Starting GMDR

For example, suppose you open a GMDR projected named "test", and also specify the data files for this project. The sample data files are the genotype data file (~\sample\ MDR\SampleData.gen), the phenotype data file (~\sample\MDR\SampleData.phe), and the report file (~\sample\MDR\SampleData.pre), respectively, then, the main window for the GMDR project will exhibits as the Fig 2.5.

Finally, you can click the button (Fig 5.5) to start the GMDR analysis if all default algorithm parameters are used. You can adjust GMDR algorithmn configuration before running, detailed information refer to the chapter 5.3.2.



Fig 5.5: The window of QTXNetwork after creating or opening a GMDR project

### 5.3 Data file format and running configuration of GMDR

#### 5.3.1 Data format

For performing analyses with GMDR, two source data files are required: a genotype data file and a phenotype data file. The genotype data file contains marker information for each genotype; the phenotype data file contains covariate values and observation values of traits under study for all individuals. Some sample files are provided for briefly demonstrating the format of source data files for GMDR in the subdirectory (~\Sample\MDR) where QTXNetwork has been installed. The genotype data file with extension name of ".Gen" and phenotype data files with extension name of ". Phe" for GMDR can be directly used by GMDR.

The genotype data can be organized in two different formats which are summarized in Table 5.1 and 5.2. For the first one (Table 5.1), the first line consists of the keyword "#Ind" and molecular marker

names, the first column is for the ID or name of individual subjects. In the second format, the first line consists of the keyword "#Mk" and ID name of individual subjects, the first column is for the ID or name of molecular markers. The other data are the codes of different genotype in each molecular marker locus for all individuals;

#Ind	MK1	MK2	MK3	MK4	MK5	 MKm	
1	Н	Н	А	А	А	 А	
2	Н	В	Н	В	В	 Н	
3	А	А	Н	Н	Н	 В	
n	А	А	А	А	А	 Н	

able 5.1: The first type of genotype data format

Note: There are three types of markers: A or 0 for QQ genotype, B or 2 for qq genotype, and H or 1 for Qq genotype.

Table 5.2:	The second	type of	genotype	data	format
		21	0 11		

#Mk	1	2	3	4	5	 n	
MK1	Н	Н	А	А	А	 В	
MK2	Н	В	А	А	А	 В	
MK3	А	Н	Н	А	А	 В	
MKm	А	Н	В	А	Н	 Н	

**General description:** This part is for specifying the basic features of the phenotype data file, and is usually put in front of the data file. Each key string must be started with an underline "\_", and no white space is allowed within it. There are five possible items for general description. They can be arranged in any order. A typical description for a phenotype data file looks like:

_TotalMarkers		100		
_Observations		1800		
_Chromosomes	3	Chr1	Chr3	Chr5
_TotalSnps	100	53	10	37
_Chroniosonies _TotalSnps	5 100	53	10	37

\_TraitNumber 2

\_TotalMarkers: specifies the total number of markers included in the marker data file.

\_Observations: specifies the total number of subjects for each trait studied.

**\_Chromosomes:** specifies the chromosome number and the names in marker file. If all molecular markers are regarded as lying in one chromosome, thus, the values after this keyword are "1" and "Chr1".

**\_TotalSnps:** specifies the total number of the markers included in the marker data file and the number of markers in each chromosome. The first number must be equal to the summation of all the markers.

\_TraitNumber: specifies the total number of traits included in the phenotype data file.

**Trait data body:** This part is betyouen two key strings \*TraitBegin\* and \*TraitEnd\*. The data source includes the covariate values and the ID name of subjects, as well as the phenotype values obtained for traits studied. The following is an example for the trait data body.

#### \*TraitBegin\*

Sex	Age	Height	SubjectId	Trait1	Trait2 ;	
1	72.1	1.74	Subject1	1	37.40640189	;
2	40.5	1.687	Subject2	1	38.286138	;
2	39.4	1.722	Subject3	1	36.91420189	;
2	50.2	1.697	Subject4	1	31.370838	;
1	52.2	1.78	Subject5	1	35.74930189	;
2	39.9	1.687	Subject6	1	35.572038	;
2	72.6	1.713	Subject7	0	22.91250189	;
1	36.2	1.685	Subject8	0	24.341	

. . . . . .

#### \*TraitEnd\*

There is also another phenotype data file format which does not include above key strings. If the file does not include some covariates, the data source only includes the ID name of subjects and the phenotype values obtained for traits studied. The following is an example for the phenotype data file which seems much easier than the previous one.

SubjectId	Trait1	Trait2	;
Subject1	1	37.40640189	;
Subject2	1	38.286138	;
Subject3	1	36.91420189	;
Subject4	1	31.370838	;
Subject5	1	35.74930189	;
Subject6	1	35.572038	;
Subject7	0	22.91250189	;
Subject8	0	24.341	;

. . . . . .

### 5.3.2 GMDR algorithm and configuration

Before conducting GMDR, you first need setting the GMDR algorithm configuration. Suppose a new GMDR project is created or an existed GMDR project is opened in main window of the QTXNetwork, click the GMDR project in the Navigator panel (Fig 5.5) to set the algorithm configuration, then activate the command item "Algorithm Config" under the "Exec" software menu (Fig 5.6), a panel will be popped up for setting configuration (Fig 5.7).



Fig 5.6: Executing GMDR under the "Exec" of the menu

Configure GMDR algorithm.	×
SNP search dimension:	5
Best SNP selection limit:	20
Permutation power:	3
Acce	Canc

Fig 5.7: General algorithm configuration for GMDR

**SNP search dimension** – This option sets the search dimension  $(1 \sim 5)$  and the max dimension is 5.

**Best SNP selection limit** – This option sets the number of best SNP combinations selected in each training set.

**Permutation power** – This option set the number of permutations used in testing stage for each selected SNP combination. If this option is set as *n*, then  $10^n$  permutations will be performed for each SNP combination selected in training stage; otherwise the pre-setting  $10^3 = 1,000$  permutations will be performed for each SNP combination selected in training stage.

### 5.4 Extract results of GMDR for GWAS

After finishing analysis of GMDR, you can extract the result file with GWAS format by executing the "Extract" under the "Exec" menu (Fig 5.6).