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Map-Reduce programming model for QTL applications

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Introduction

The motivation for this work is the computational challenges involved in identifying **multiple QTL in an experimental cross**. In a linear regression model for detection of quantitative trait loci, the LOD score can be computed as $LOD = n/2 \log_{10}(RSS_0/RSS)$ [1]. In this definition, LOD is linearly related to the $log_{10}(RSS)$, the logarithm of the residual sum of squared errors. Finding one or multiple interacting QTLs in the genome is then a matter of finding a point maximizing the LOD, or minimizing the RSS.

In optimization problems, knowledge of the optimization landscape

n×m Permutations

Data										
T264	D10M44	D1M3	D1M75	D1M215	D1M309	D1M218	D1M451	D1M504	D1M113	D1M355
	1	1	1	1	1	1	1	1	1	1
	0	0.99675	24.84773	40.41361	49.99468	52.8002	70.11204	70.80642	80.62324	81.39623
118.317	В	В	В	н	н	н	В	В	Н	Н
264	-	В	В	В	Н	н	Н	Н	Н	Н
194.917	-	Н	н	Н	Н	н	Н	н	В	В
264	В	В	н	н	Н	н	В	В	В	В
145.417	Н	Н	н	Н	В	н	Н	Н	Н	Н
177.233	Н	Н	В	В	В	В	В	В	В	В
264	н	н	н	н	Α	Α	Α	Α	Н	Н
76.667	Н	н	н	Н	Α	Α	Α	Α	Н	Н
90.75	Α	Α	н	В	В	В	Н	н	Н	Н
76.167	В	В	н	Н	Α	Α	Α	Α	Α	Α
104.083	Α	Н	н	Н	Н	н	Н	Н	Н	Н
194.5	Α	Α	н	Н	Н	н	Н	Н	Н	Н
75.917	Α	Α	Н	Н	Н	н	В	В	В	В
75.833	н	Н	Α	Α	Α	Α	Α	Α	Α	Α
90.25	Α	Α	н	Н	Н	Н	Н	Н	Н	Н

can be used to improve the search procedure. For this problem, we present another log transformation of the *RSS* as the objective function in the optimization. This **alternative objective function** is simple to handle and makes the ideal peak shape around a QTL linear with a known slope, when plotted on a linkage map. This new objective function increases the **performance** and the **accuracy** of the **PruneDIRECT** search algorithm in finding multiple QTL.

The aim is to explore **Map-Reduce** programming model for permutation testing of QTL positions. Map-Reduce is well known model for managing several independent tasks of an application which makes it a good candidate for permutation testing.

According to the preliminary studies, we are hopeful that Map-Reduce model will be helpful in finding more than three QTL.



The R statistical software is widely used by the biologist and statisticians community. In order to make a familiar environment settings for the biologists, we have chosen the **R-Hadoop** framework that allows the transparent use of Hadoop within the R programming environment.

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