

COMBINED LINKAGE DISEQUILIBRIUM AND CO-SEGREGATION BASED FINE MAPPING OF QUANTITATIVE TRAIT LOCI

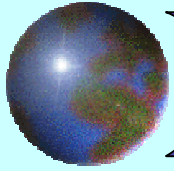
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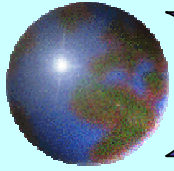
Identity by Descent Method (IBD)

The QTL fine mapping method requires

- ❖ an IBD matrix between QTL effects**
- ❖ to calculate variance comps. and likelihood of the putative QTL.**

This IBD matrix is calculated conditional on

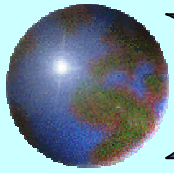
- ❖ the marker information and**
- ❖ the position of the QTL**



Identity by Descent Method (IBD)

In the case of **linkage analysis** mapping,

- ❖ the first (base) generation of marker genotyped animals is assumed to be unrelated.
- ❖ Therefore, IBD regions occur within the marker genotyped data set
- ❖ This sets the base generation further back in time.



Identity by Descent Method (IBD)

However,

❖ **there are IBD probabilities at the putative QTL locus between the first genotyped animals given the information from their marker haplotypes.**

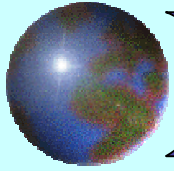
Therefore the pedigree of genotyped animals split into two parts

❖ **The first part, referred to as **the linkage disequilibrium (LD)****

❖ **The second part, referred to as **the co-segregation (CS)****

The fine mapping method combining LD and CS

❖ **provide mapping resolution accurate enough to narrow down the QTL confidence interval to a few cM of the genomic region**



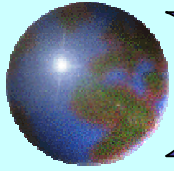
The earlier findings (Grapes et al. submitted)

IBD method for LD fine mapping (M&G 2000) using a haplotype consisting of 1, 2, 4, 6, or 10 markers

- ❖ incorporating 10 markers made IBD insensitive to QTL position**
- ❖ thus decreased the accuracy of the method.**
- ❖ IBD method with 4 or 6 markers gave greatest mapping accuracy.**

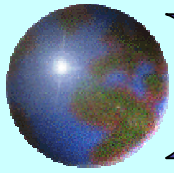
This indicates :

- ❖ an optimum number of markers to include in the haplotype.**



Objectives

- ❖ **to determine the optimum haplotype size for combined LDSC based fine mapping**
- ❖ **to evaluate the impact of different designs with varying numbers of pedigreed generations and QTL effects on optimal haplotype number**



Model under co-segregation

The genotypic value of candidate i , g_i :

$$g_i = v_i^m + v_i^p + u_i$$

and

$$\mathbf{y} = \mathbf{X}\boldsymbol{\beta} + \mathbf{W}\mathbf{v} + \mathbf{Z}\mathbf{u} + \mathbf{e}$$

$$Var(\mathbf{v}) = \Sigma_v \sigma_v^2$$

$$Var(\mathbf{u}) = \Sigma_u \sigma_u^2$$

$$Var(\mathbf{e}) = \mathbf{I} \sigma_e^2$$

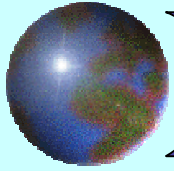
Where

v_i^p and v_i^m = effects of maternal/ paternal alleles at MQTL

u_i = residual polygenic effect

$\mathbf{v}$ = vector of gametic effects at the MQTL,

$\mathbf{u}$ = vector of residual polygenic effects



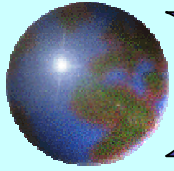
Model for combined LDCS analysis

The MQTL effect is divided between genotypic fixed effect and random effects

$$\mathbf{y} = \mathbf{X}\boldsymbol{\beta} + \mathbf{Z}\mathbf{X}_g\boldsymbol{\alpha} + \mathbf{W}\mathbf{v} + \mathbf{Z}\mathbf{u} + \mathbf{e}$$

Where

$$\begin{aligned} E(\mathbf{g} \mid \mathbf{M}) &= \mathbf{Z}\mathbf{X}_g\boldsymbol{\alpha} = \text{cond. Exp. of } \mathbf{g} \text{ given marker haplotypes } \mathbf{M} \\ \boldsymbol{\alpha} &= \text{MQTL substitution effect} \end{aligned}$$



Comparison of methods

absolute differences between the estimated and true QTL positions for each design from each replicate of a simulation study

$$\left| \hat{\Theta}_i - \Theta \right|$$

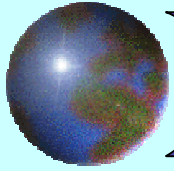
Where

$\hat{\Theta}_i$: the estimated QTL position

Θ : the true QTL position

Bias of position estimates for a given design

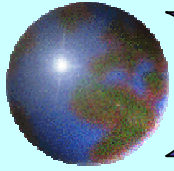
$$\frac{\sum_{i=1}^n \hat{\Theta}_i}{n} - \Theta$$



Identity by Descent Method (IBD)

Pedigree of genotyped animals split into two parts

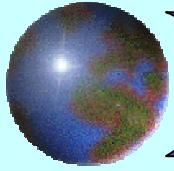
- 1. Linkage disequilibrium part** - develops the population in a historical sense beyond the recorded pedigree.
- 2. Co-segregation part** – describes the population in the last generations with a family structure and phenotypic data.



Part I of the Simulation

Designed to generate t generations of random mating.

- ❖ number of male parent = female parents**
- ❖ alleles are inherited based on Mendelian segregation.**
- ❖ Unique numbers are assigned to QTL alleles in generation 0**
- ❖ In the last generation, QTL allele with frequency closest to 0.5 is chosen and treated as the favorable allele of a biallelic QTL.**



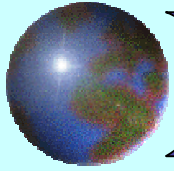
Part I of the Analysis

❖ **Algorithm of M&G (2001) used to compute IBD probabilities between founders conditional on marker haplotypes**

❖ **This requires**

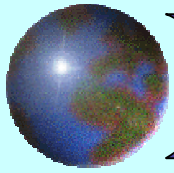
- **number of generations since the base generation, t**
- **effective size of the population, N_e .**

❖ **Similarity of marker haplotypes used to see whether haplotypes are IBD.**



Part II of the Simulation

- ❖ **Designed for particular family structures with recorded data**
- ❖ **5 sires and 25 dams randomly selected in generation t .**
- ❖ **Each male mated with 5 females to produce 8 offspring**
- ❖ **repeated 1, 3 or 5 generations until generation $t+1$, $t+3$ or $t+5$.**
- ❖ **descendents in $(t+1) - (t+5)$ given genotypic/phenotypic records**
- ❖ **pedigree is only known for these animals**
- ❖ **animals from these generations used for fine mapping.**



Part II of the Simulation

❖ Phenotypic values for single trait simulated as

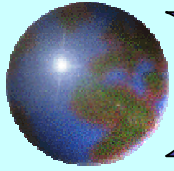
$$y = \mu + v + u + e$$

$\swarrow \quad \uparrow \quad \nwarrow$
 $N(0, \sigma_v^2) \quad N(0, \sigma_u^2) \quad N(0, \sigma_e^2)$

❖ Number of QTL loci = 1

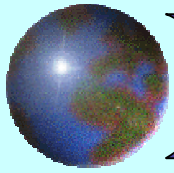
❖ Number of unlinked polygenic loci = 50

Case	σ_v^2	σ_u^2	σ_e^2
I	30	30	40
II	2.5	22.5	75



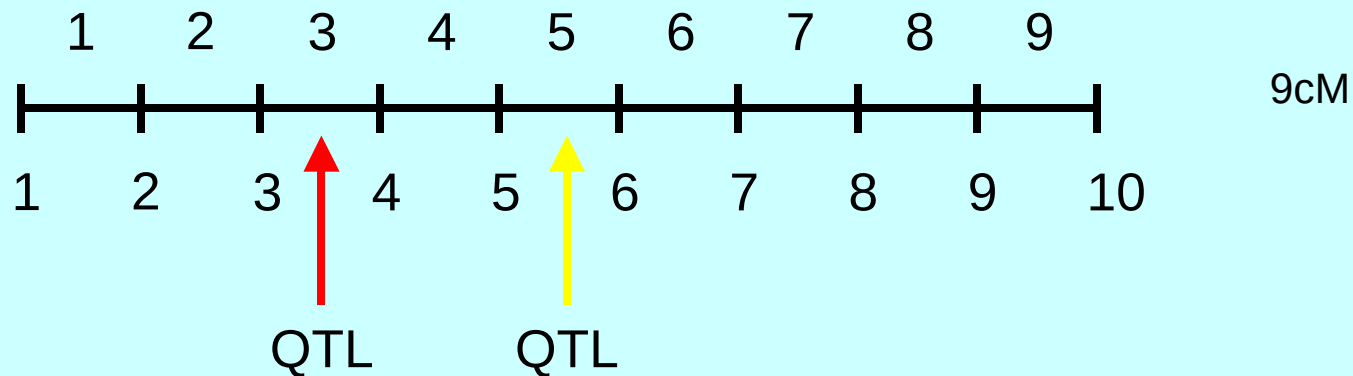
Part II of the Simulation

- ❖ Marker genotypes and phases available for animals in generations t to $t+1$, $t+3$ or $t+5$
- ❖ IBD probabilities for $t+1$ through $t+5$ calculated recursively based on conditional **segregation probabilities** given marker info.
 - ❖ estimated by MCMC
 - ❖ depend on the haplotype size.



Part I-II of the Simulation

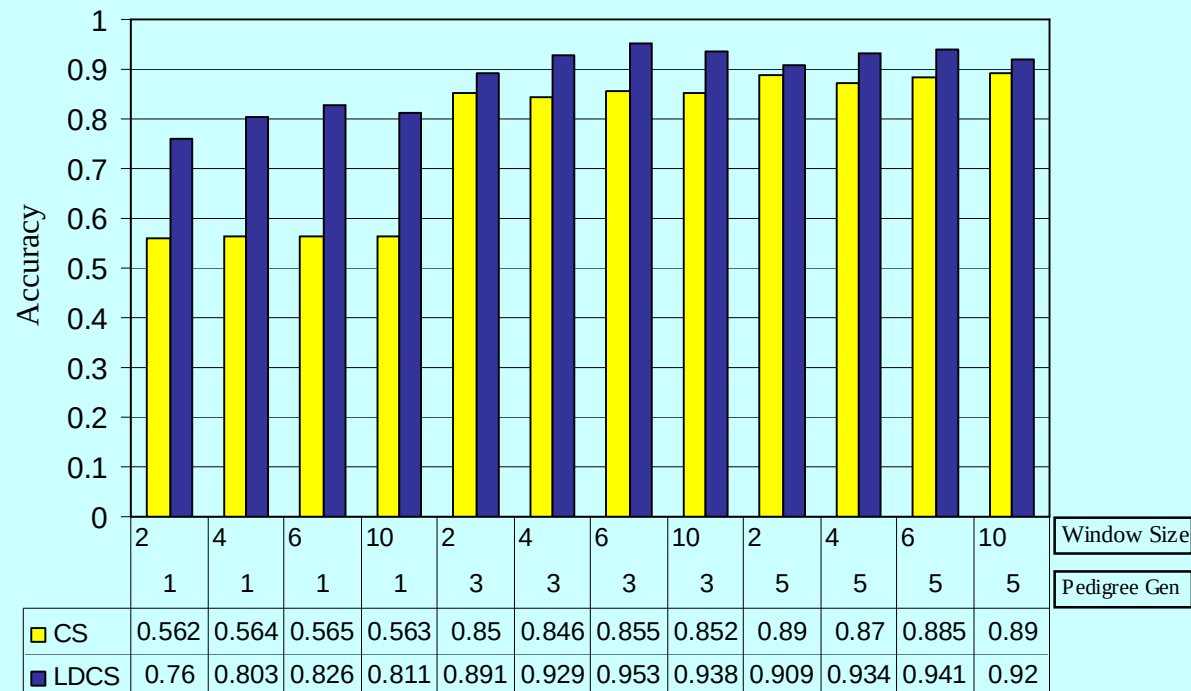
- ❖ Number of generations $t=100$ and
- ❖ Effective population size $N_e=100$
- ❖ Previous linkage analysis mapped QTL to 9 cM region
- ❖ 10 bi-allelic markers at 1 cM interval
- ❖ QTL centered between markers 3 and 4 or between 5 and 6,



- ❖ Haplotypes of 2, 4, 6 or 10 markers used as sliding window
- ❖ Number of replicates $> 1,000$

Results : Efficient designs for fine mapping

Proportion of replicates positioning QTL <3cM from true location

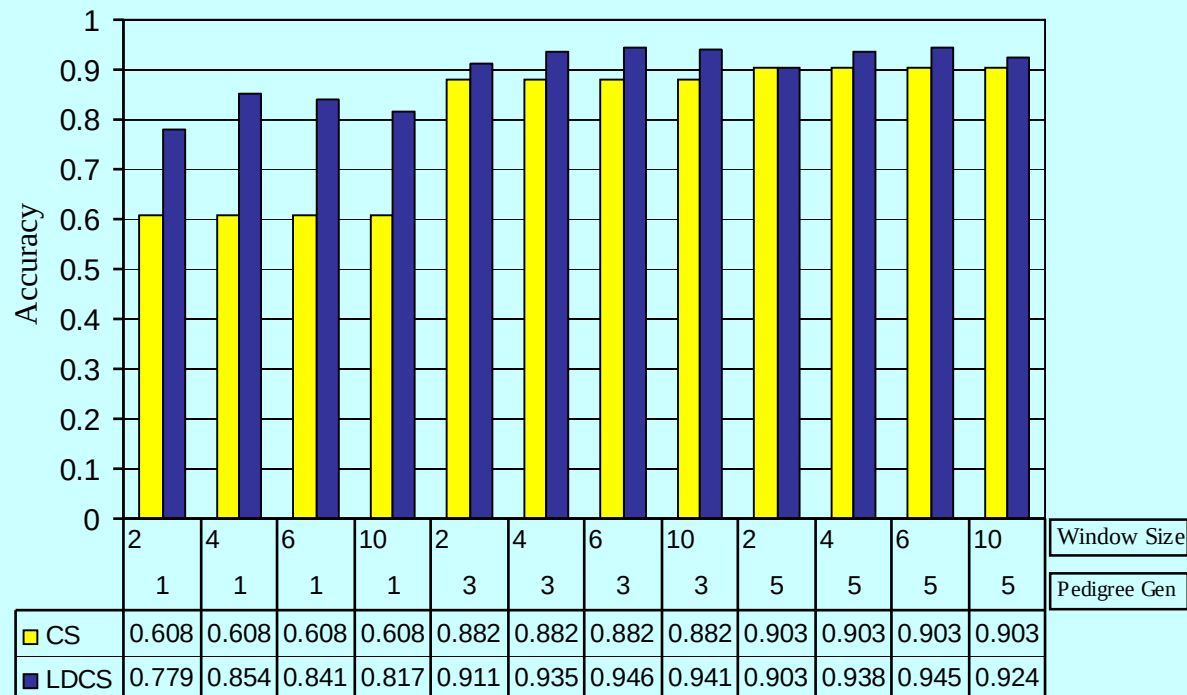


$$\sigma_v^2=30, \sigma_u^2=30, \sigma_e^2=40$$

$$5M < \text{QTL} < 6M$$

Results : Efficient designs for fine mapping

Proportion of replicates positioning QTL <3cM from true location

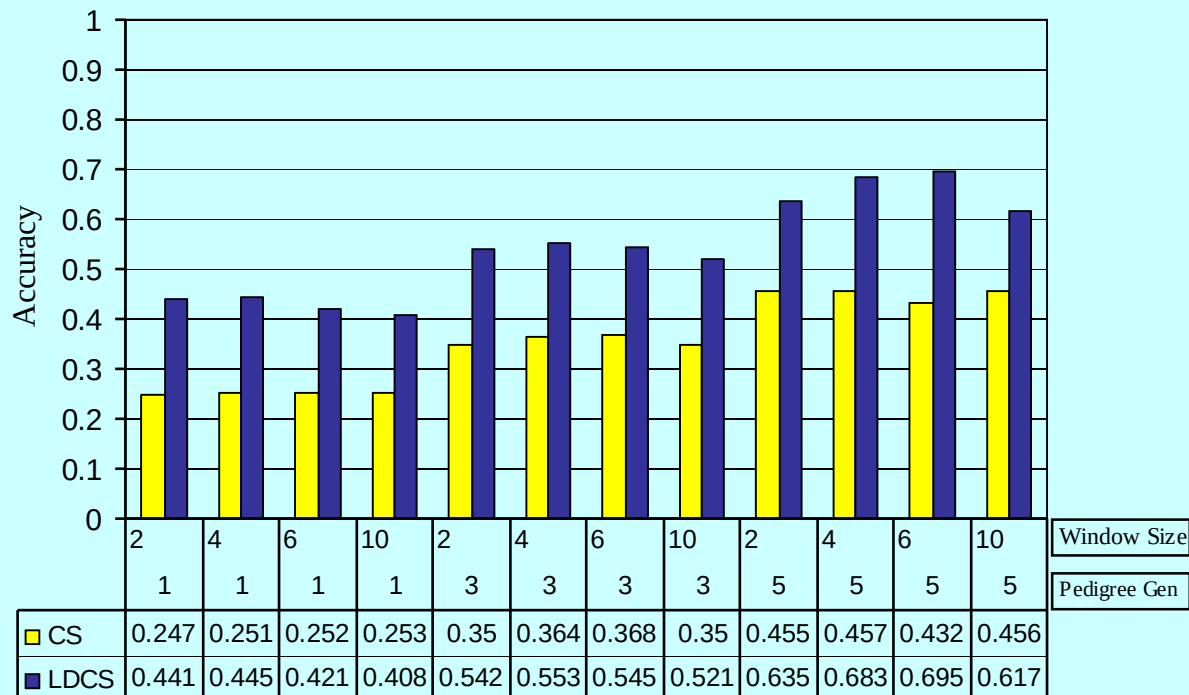


$$\sigma_v^2=30, \sigma_u^2=30, \sigma_e^2=40$$

$$3M < \text{QTL} < 4M$$

Results : Efficient designs for fine mapping

Proportion of replicates positioning QTL <3cM from true location



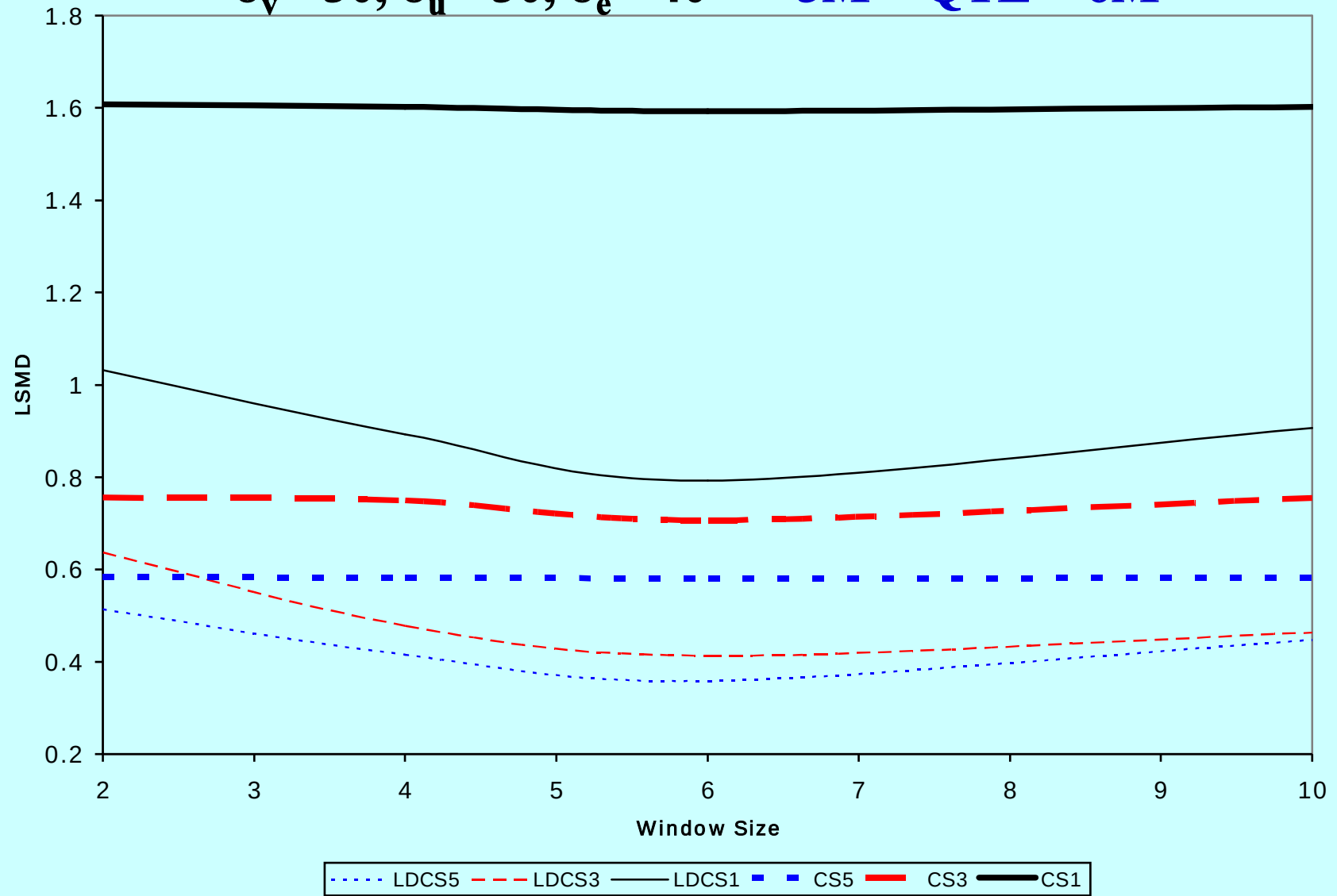
$$\sigma_v^2=2.5, \sigma_u^2=22.5, \sigma_e^2=40$$

$$5M < \text{QTL} < 6M$$

Results : Least squares mean absolute differences

$$\sigma_v^2=30, \sigma_u^2=30, \sigma_e^2=40$$

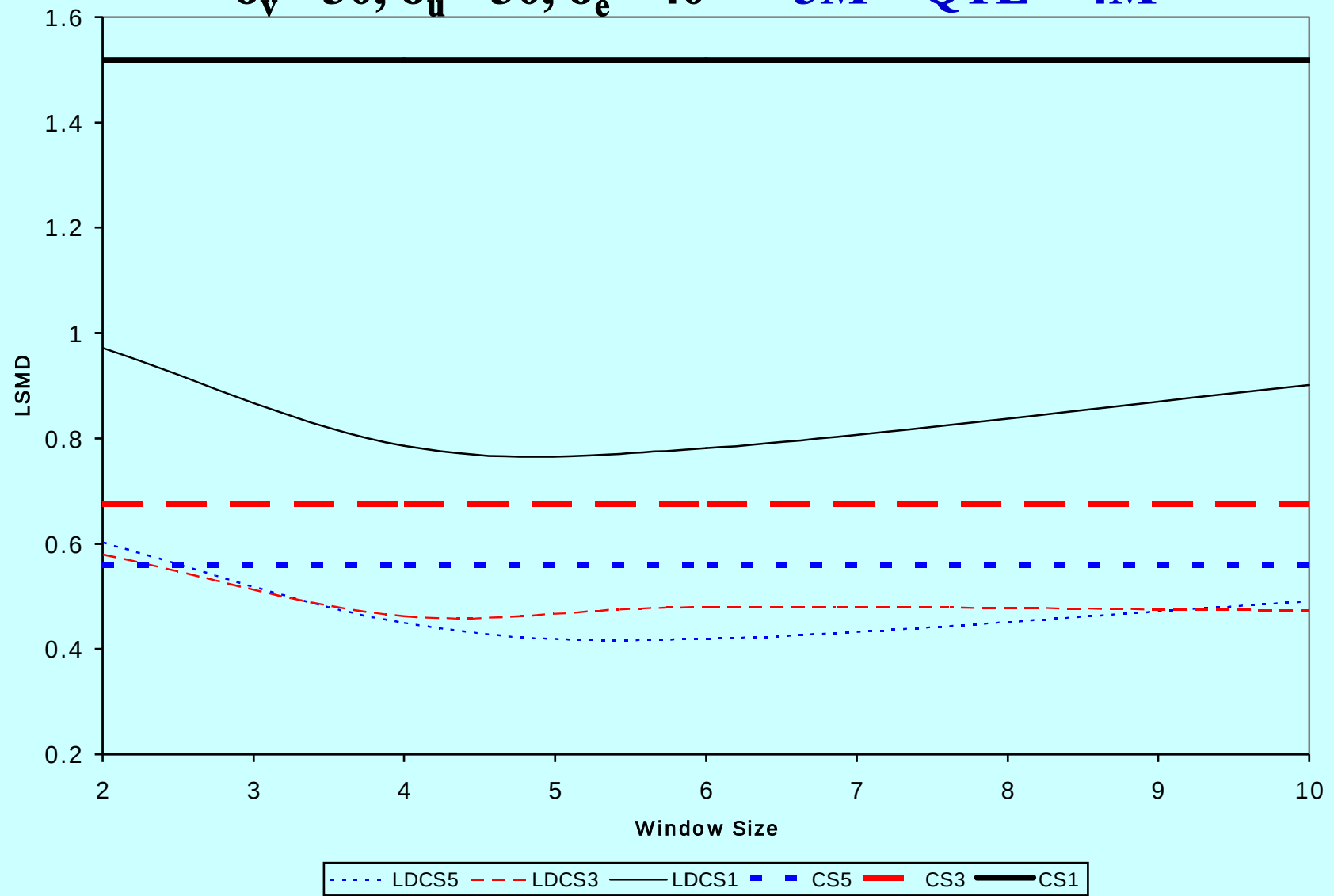
$$5M < QTL < 6M$$



Results : Least squares mean absolute differences

$$\sigma_v^2=30, \sigma_u^2=30, \sigma_e^2=40$$

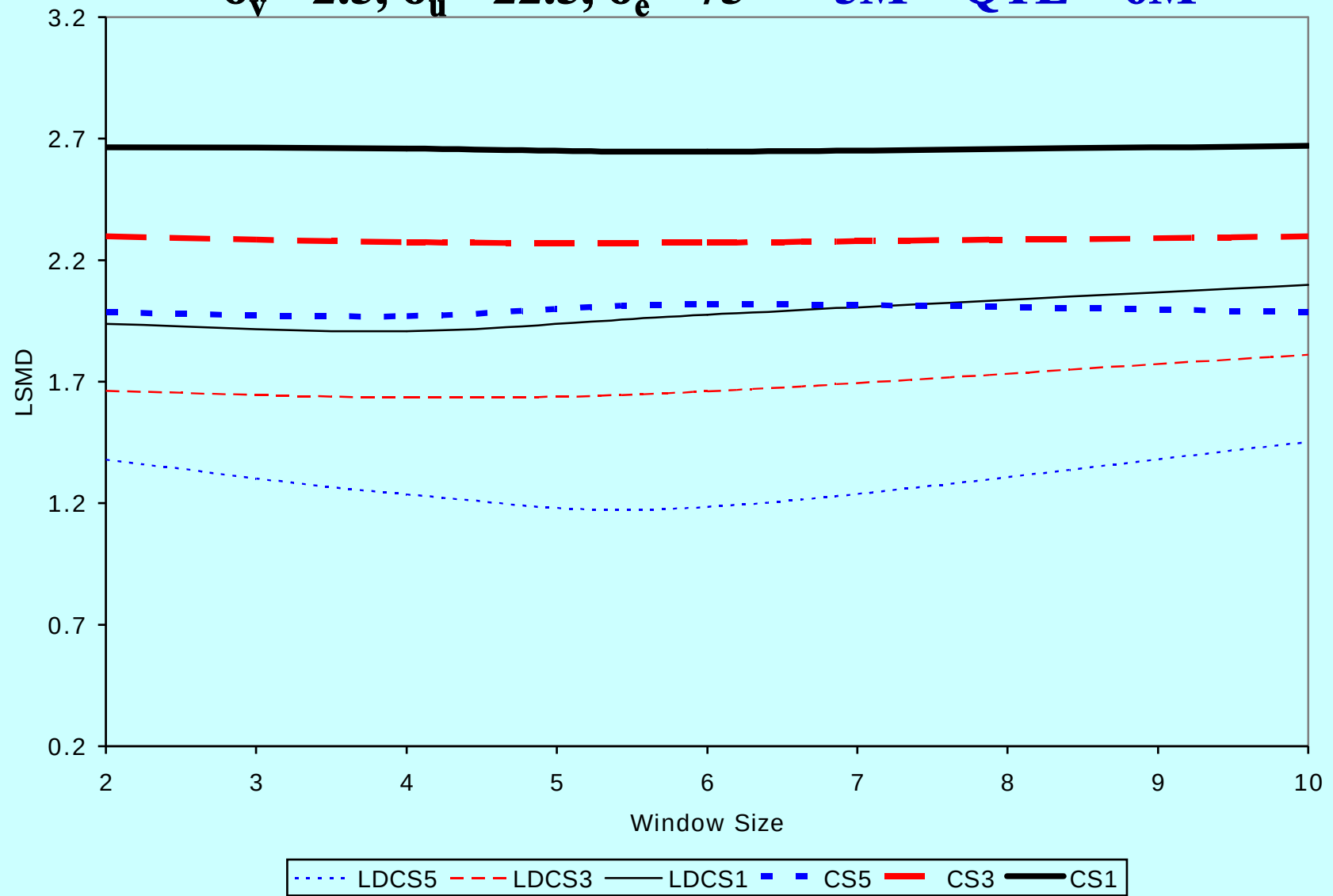
$$3M < QTL < 4M$$



Results : Least squares mean absolute differences

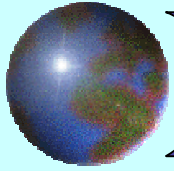
$$\sigma_v^2=2.5, \sigma_u^2=22.5, \sigma_e^2=75$$

$$5M < QTL < 6M$$



Results : Optimal haplotype size

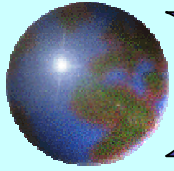
		Type of	Pedigreed Generations		
Position of QTL		mapping	1	3	5
			$\sigma_v^2 = 30, \sigma_v^2 = 30, \sigma_v^2 = 40$		
halfway between markers 5 and 6	D1(a)	CS	6.68	6.21	5.16
		LDCS	6.82	7.18	6.58
halfway between markers 3 and 4	D1(b)	CS	-	-	-
		LDCS	6.32	7.25	6.72
			$\sigma_v^2 = 2.5, \sigma_v^2 = 22.5, \sigma_v^2 = 75$		
halfway between markers 5 and 6	D2	CS	5.87	5.95	6.92
		LDCS	3.14	4.11	5.69



When the IBD method is used for fine mapping using LDCS,

❖ it appears preferable to fit a smaller haplotype instead of all available markers.

❖ A haplotype size of 4-6 markers was optimal for the experimental designs and parameter sets simulated here.



Thanks...

PIC/Sygen

Monsanto Co.

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