

Simulating experimental designs to compare and select methods based on linkage disequilibrium (LD) and linkage analysis (LDLA) for studying osteochondrosis in horses.

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60th Annual EAAP Meeting - Session 19 - Abstract 4564, 2009
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Outline

- 1 Introduction
 - Problem
 - Objectives
- 2 Materials & Methods
 - Choice of simulations
 - Choice of methods
 - Tools used
- 3 Results
 - What about regression ?
 - And the other methods...
- 4 Discussion & On going



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 - To Identify the genes underlying the affection of osteochondrosis.
 - To Obtain case/control data on 600 French trotters.
 - Half-sib design with approximately 100 sires.

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 - It was difficult to get horses healthy and affected for each sire.
 - At the middle of the program, we got some fathers with only 1 offspring and others with a lot of offsprings.
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 - We got also more sires than expected.
- Questions about this program :
 - Should we add new sire families or should we increase the size of offsprings in those families with 1 offspring ?
 - Are the associations (LD) and LDLA methods robust for these designs ?

Objectives

Definitions :

- Population structure : Historical structure of the population, can be with low or high inbreeding.
- Design : Recent structure of the population, here we talk about half-sib designs.

We will run simulations with the following objectives :

- Given a population structure, are LD/LDLA methods robust under different designs ?
- How do methods deal with the problem of population structures ?

Outline

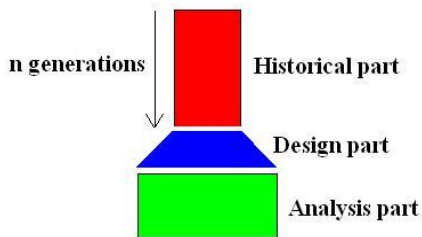
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Simulations

- **Historical part : 2 different scenarios**

- 1 Inbreeding +, LD +.
- 2 Inbreeding -, LD -.



- Number of simulations : 100
- Number of markers : 1000
- Number of QTL : 0
- Chromosome length : 1 Morgan

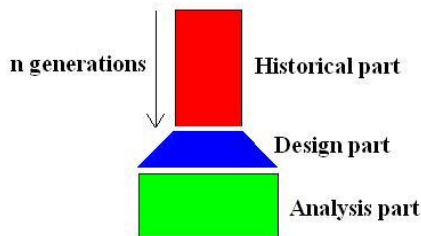
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- **Design part : 3 different scenarios**

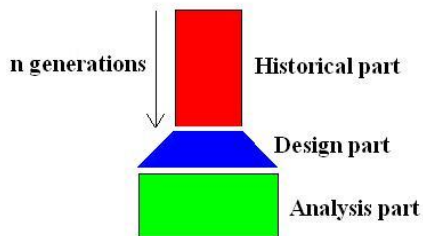
- 1 Design10 : 600 offsprings born to 10 sires.
- 2 Design60 : 600 offsprings born to 60 sires.
- 3 Design600 : 600 offsprings born to 600 sires.



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Simulations

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- **Design part : 3 different scenarios**
 - 1 Design10 : 600 offsprings born to 10 sires.
 - 2 Design60 : 600 offsprings born to 60 sires.
 - 3 Design600 : 600 offsprings born to 600 sires.
- **Analysis part : 4 different methods**



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Choice of methods

We tested 4 different methods (all are single SNP analysis) :

- 1 Simple regression
- 2 PCA analysis (Price & al, Nature, 2006)
- 3 QTDT analysis (Abecasis & al, Am J Hum Genet, 2007)
- 4 GRAMMAR (Aulchenko & al, Genetics, 2007)

Decision rules :

- 1 Classic (5%), number of p-values $< 5\%$
- 2 False Discovery rate (FDR,5%), corrected for multiple tests (Benjamini-Hochberg, J.R. Statist. Soc. 1995).

Tools used for the simulations

- ① **Historical part** : Linkage Disequilibrium with Several Options (LDSO, F.Ytournal 2008)
 - Developed to generate data for QTL mapping.
 - Simulates the history of a single or two populations.
 - Takes into account the evolutionary forces (mutation, selection and bottleneck).
- ② **Design part** : Extension of LDSO to pedigree
 - Genotypes and phenotypes created (historical part) from LDSO are integrated into the founders of the pedigree.
- ③ **Analysis part** : Package GenABEL (R, Y.Aulchenko 2008)
 - Quality check, Genomic relationship matrix, polygenic effect
 - Different methods based on linkage disequilibrium

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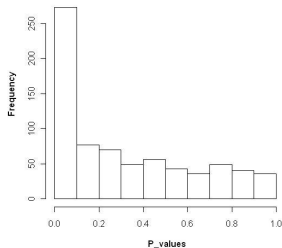


What about regression ?

	Inbreeding +			Inbreeding –		
Number of sires	10	60	600	10	60	600
FDR (%)	7.3	3.1	4.0	1.9	0.1	0.1
Classic (%)	25	–	–	–	–	8

Histogram of Inb+/d10

- Strong effect of population structure.
- Strong effect of population design for a small number of sires (10 vs 60).



And the others methods...

False positives (%)	Inbreeding +, $d10$		Inbreeding -, $d600$	
	FDR	Classic	FDR	Classic
Regression	7.3	25	0.1	8
PCA	5.9	23	0.1	8
GRAMMAR	0	0.9	0	1.8
GRAMMAR + GC	0.1	5	0	5
QTDT	0.02	5	0.002	4.9

- **PCA** : ($\approx$ Regression), number of markers too low to distinguish several groups in the PCA.
- **GRAMMAR** : The distribution of p-values is not uniform and is very conservative.
- **GRAMMAR + GC** : Distribution of p-values appears to follow a uniform law after correcting by Genomic control.
- **QTDT** : Same as GRAMMAR+GC without genomic control.

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Discussion :

- Deviation from p-values distribution of a uniform law appears to be closely related to the occurrence of false positives (the statistical test doesn't follow a χ^2).
- Difficulty of methods to remain robust when there is inbreeding.

On going :

- More simulations with more markers.
- Simulations with QTL(s) to test the power of methods.

Acknowledgements

GENEQUIN funders :



GENEQUIN partners :



Thank you for your attention !

