

A hierarchical bayesian model for measuring the extent of local adaptation from haplotype data.

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Introduction & Objectives

- The recent advent of high throughput sequencing and genotyping technologies (Next Generation Sequencing, NGS) enables the comparison of patterns of polymorphisms at a very large number of markers, which makes it possible to characterize genomic regions involved in the adaptation of organisms to their environment. Here, we present some recent developments to SelEstim (Vitalis et al. 2014), a hierarchical bayesian model that identifies and measures genomic signatures of selection from gene frequency data.
- we extend the model to analyse multi-allelic markers. Considering haplotype blocks as multi-allelic markers, this allows to account for the information brought by linkage disequilibrium.

SelEstim



Genetic data & Analysis

(1) Unphased Genotype



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	SelEstim analysis based on independent SNPs

(2)Haplotype Phasing (Fastphase, Scheet & Stephens 2006)

Haplotype



Haplotype Population locus frequencies in the specific selection, migrant pool Indicator variable Migration and Drift (Haplotype $\mathbf{O}_{\mathbf{i}}$ under selection) P_{iik} Haplotype frequencies Haplotype Counts n_{iik}

Fig. 2: Directed Acyclic Graph of SelEstim

Fig. 1: Analysis pipeline. Genetic data were simulated from an island model with 8 demes of size N = 1000 and $F_{ST} = 0.1$. Selection (s) is targeting a single position, with one allele selected for in 2 demes and the alternative allele selected for in 2 other demes. Three chromosomes of 5Mb were simulated with a 1cM/Mb recombination rate.

Fig. 4: Mean locus specific selection coefficient

for simulation with weak selection (2Ns = 50)

Results

Locus-specific selection coefficient along the three simulated chromosomes with strong selection (2Ns = 100, see Fig. 3) and weaker selection (2Ns = 50, see Fig. 4). Results are given for analyses with bi-alellic data (top), 3-SNP haplotypes (middle) and local clustering (bottom). The position targeted by selection is indicated with a red arrow.



Fig. 3: Mean locus specific selection coefficient for simulation with strong selection (2Ns = 100)

³⁵ 25



Application example on human data

Fig. 5: SelEstim analysis of HapMap phased data for nine worldwide populations. The analysis was conducted for chromosome 2, with 49,906 SNPs recoded as 3-SNP haplotypes.

Conclusion

Acknowledgements

- Linkage disequilibrium (LD) information brought by haplotype data increases the power to detect genomic regions targeted by selection
- 3-SNP haplotypes seem more efficient to capture LD information than local clustering of haplotypes

Valentin Hivert's PhD is funded by the ERA-Net BiodivERsA project EXOTIC and the French National Institute for Agricultural Research ("Plant Health and Environment" division)

References

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