

# Introduction to GWAS Genotyping

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# Genotyping

- A very brief overview -

#### The first steps – Biomarkers



#### A MOLECULAR APPROACH TO THE STUDY OF GENIC HETEROZYGOSITY IN NATURAL POPULATIONS. I. THE NUMBER OF ALLELES AT DIFFERENT LOCI IN DROSOPHILA PSEUDOOBSCURA<sup>1</sup>

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#### J. L. HUBBY AND R. C. LEWONTIN

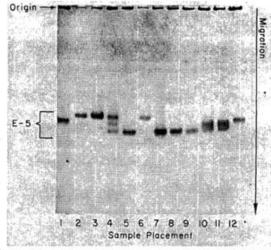


Figure 1.—Gel illustrating sample placement and typical results of strain analysis for Esterise-5. The first and the last samples were derived from the standard reference strain (E-51-00), while positions 2 through 6 were obtained from five individuals of one strain and positions 7 through 11 are from five individuals of a second strain. Positions 2, 3, and 6 contain Esterase-5-9, position 5 contains Esterase-5-1-12, and position 4 contains Esterase-5-9-Esterase-5-1-13 and a site of activity between them. Positions 7, 8, and 9 contain Esterase-5-1-13 and positions 10 and 11 contain Esterase-5-1-0 and Esterase-5-1-12. A site of activity midway between the latter two is barely discernible. In all the figures the direction of migration of the protein is down toward the anode.

#### From few to many markers – Molecular markers (DNA markers)



- arise from different classes of DNA mutations such as substitution mutations (point mutations), rearrangements (insertions or deletions) or errors in replication of tandemly repeated DNA
- are usually located in non-coding regions of DNA
- are practically unlimited in number and are not affected by environmental factors and/or the developmental stage of the plant
- RFLP, AFLP, RAPD, SSR (microsatellites), SNP

#### From few to many markers – Molecular markers (DNA markers)



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## An introduction to markers, quantitative trait loci (QTL) mapping and marker-assisted selection for crop improvement: The basic concepts

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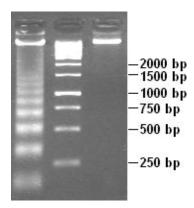


#### **Genotyping Systems**



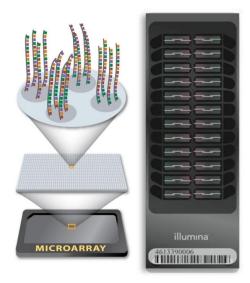
#### Marker gel

(a few markers)



#### SNP array (or GBS)

(100s -1,000,000s)



#### Genome sequencer

(1,000,000s +)

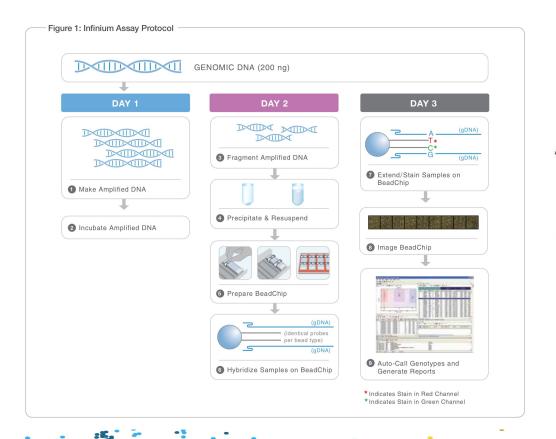




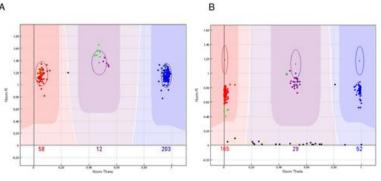


#### SNP array genotyping





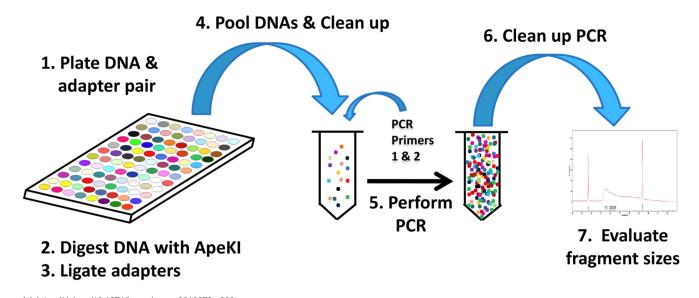
#### Genotype calling 3 genotypes: AA, AG, GG





#### Reduced representation sequencing – Genotyping-by-Sequencing (GBS)

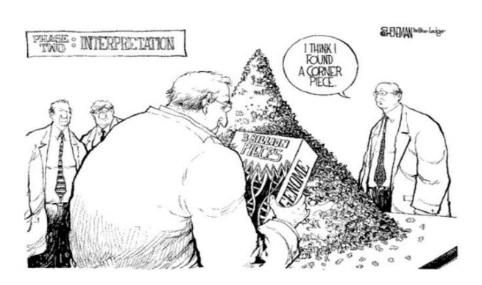




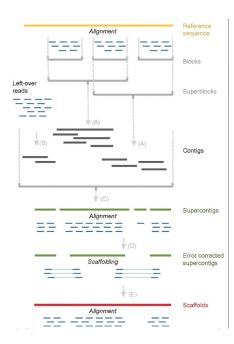
doi: https://doi.org/10.1371/journal.pone.0019379.g002

#### The Next Generation Sequencing Revolution





Hmmm...now the data is here....so what now?



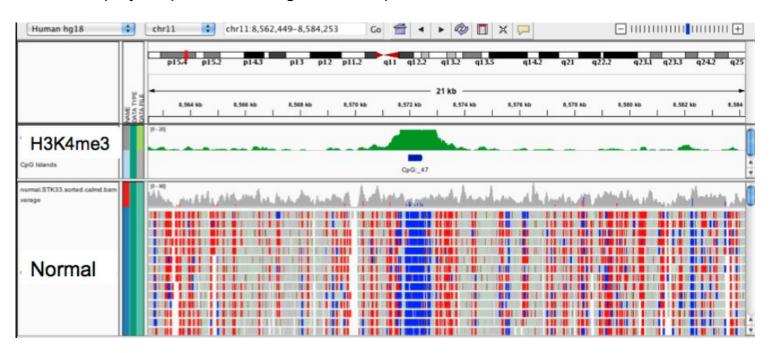
Assembly!



#### The Next Generation Sequencing Revolution



Millions of polymorphisms in the genome sequences...





## The diploid genotype matrix – "additive" effect modeling

