

# Introduction to **GWAS**

## Common Data Types and Formats

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# Genotyping and Sequencing

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 PSEUDOBSCURA*<sup>1</sup>

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Received March 30, 1966

<sup>1</sup> The work reported here was supported in part by grants from the National Science Foundation (GB 3013) and the Public Health Service (5M-13206).

Genetics 84: 517-524 August 1968.



*D. pseudoobscura* (F)

582

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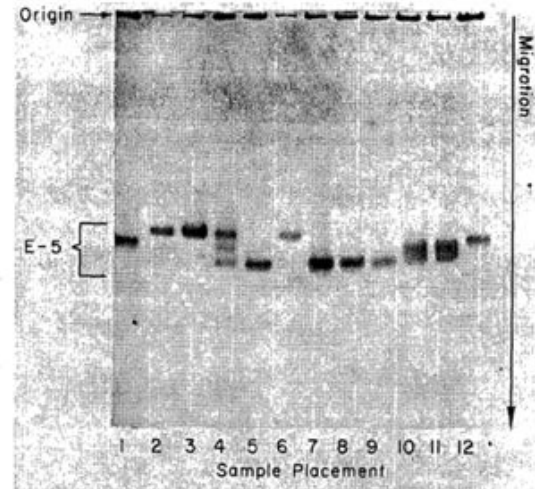
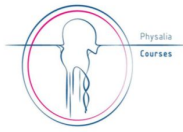


FIGURE 1.—Gel illustrating sample placement and typical results of strain analysis for Esterase-5. The first and the last samples were derived from the standard reference strain (E-5<sup>1.00</sup>), while positions 2 through 6 were obtained from five individuals of one strain and positions 7 through 11 are from five individuals of a second strain. Positions 2, 3, and 6 contain Esterase-5<sup>95</sup>, position 5 contains Esterase-5<sup>1.12</sup>, and position 4 contains Esterase-5<sup>95</sup>, Esterase-5<sup>1.12</sup>, and a site of activity between them. Positions 7, 8, and 9 contain Esterase-5<sup>1.12</sup> and positions 10 and 11 contain Esterase-5<sup>1.00</sup> and Esterase-5<sup>1.12</sup>. 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)



*Euphytica* (2005) 142: 169–196  
DOI: 10.1007/s10681-005-1681-5

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

B.C.Y. Collard<sup>1,4,\*</sup>, M.Z.Z. Jahufer<sup>2</sup>, J.B. Brouwer<sup>3</sup> & E.C.K. Pang<sup>1</sup>

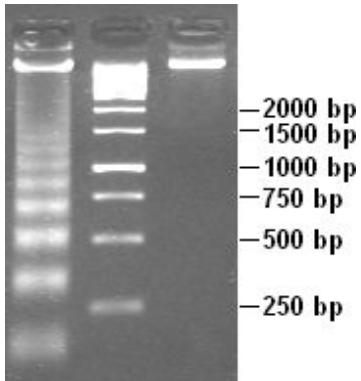
<sup>1</sup>*Department of Biotechnology and Environmental Biology, RMIT University, P.O. Box 71, Bundoora, Victoria 3083, Australia;* <sup>2</sup>*AgResearch Ltd., Grasslands Research Centre, Tennent Drive, Private Bag 11008, Palmerston North, New Zealand;* <sup>3</sup>*P.O. Box 910, Horsham, Victoria, Australia 3402;* <sup>4</sup>*Present address: Plant Breeding, Genetics and Biotechnology Division, International Rice Research Institute (IRRI), DAPO Box 7777, Metro Manila, Philippines;* (\*author for correspondence: e-mail: [bcycollard@hotmail.com](mailto:bcycollard@hotmail.com))

Received 11 July 2004; accepted 2 February 2005

# Genotyping Systems

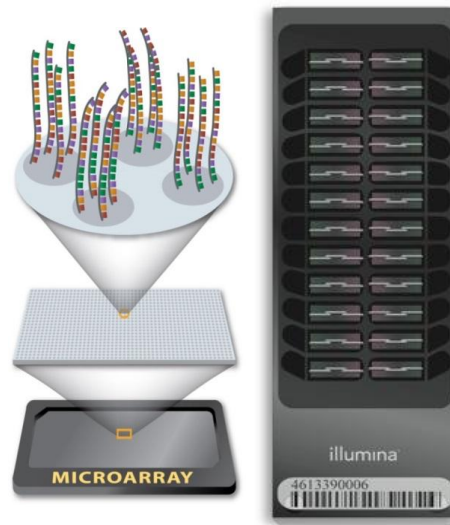
## Marker gel

(a few markers)



## SNP array (or GBS)

(100s -1,000,000s )



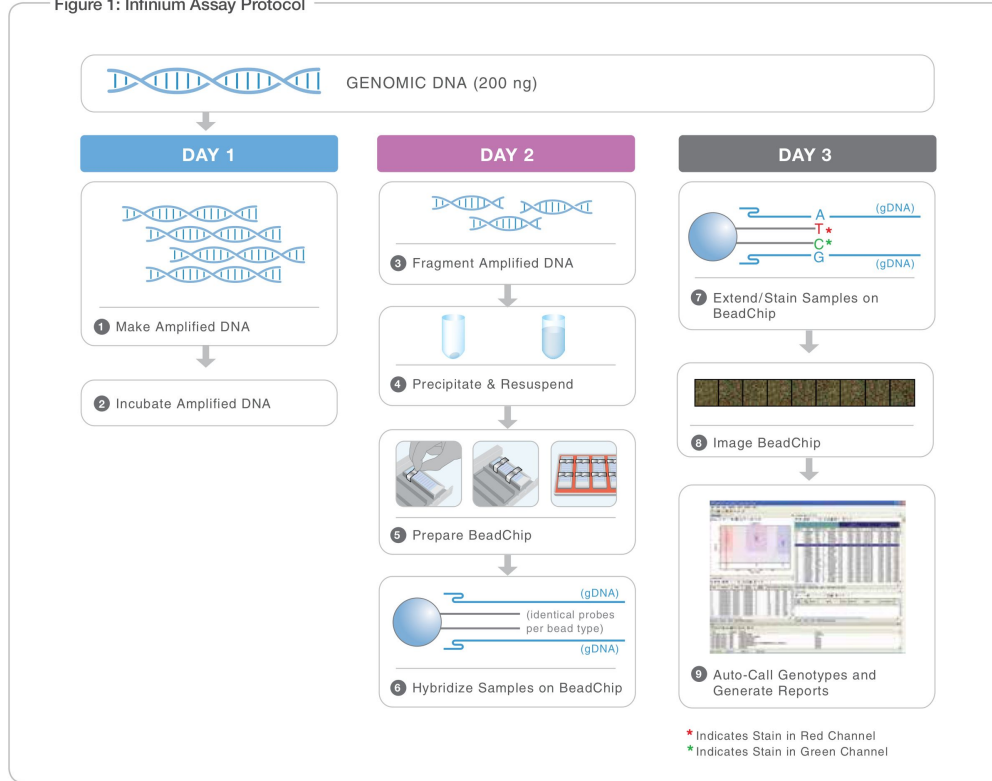
## Genome sequencer

(1,000,000s +)

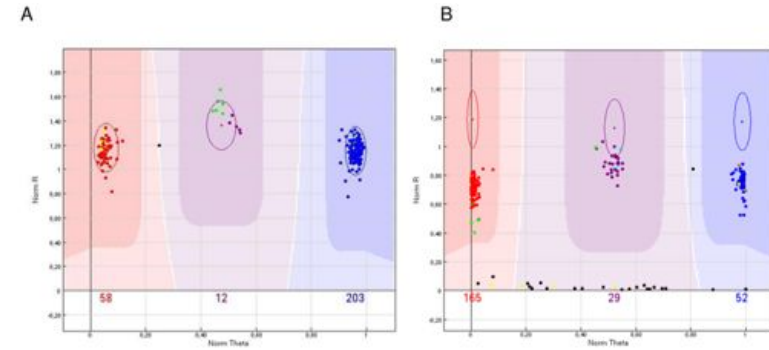


# SNP array genotyping

Figure 1: Infinium Assay Protocol

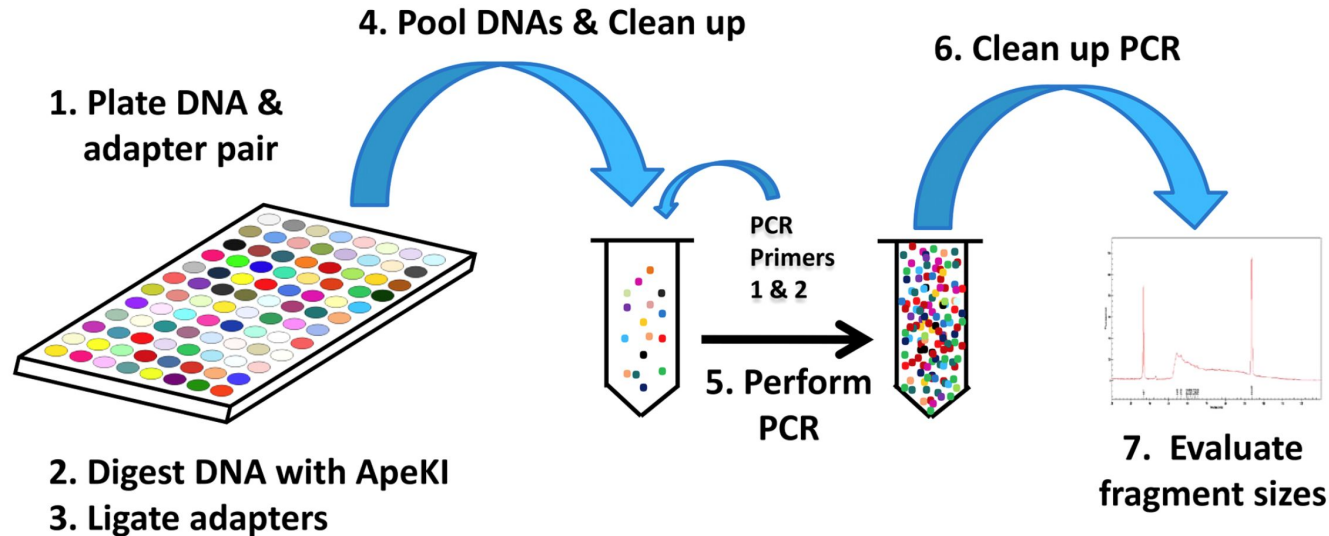


Genotype calling  
3 genotypes: AA, AG, GG





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



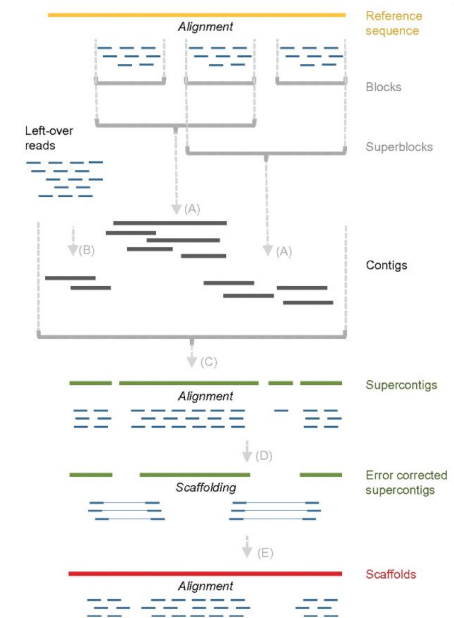
doi: <https://doi.org/10.1371/journal.pone.0019379.g002>



# The Next Generation Sequencing Revolution



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

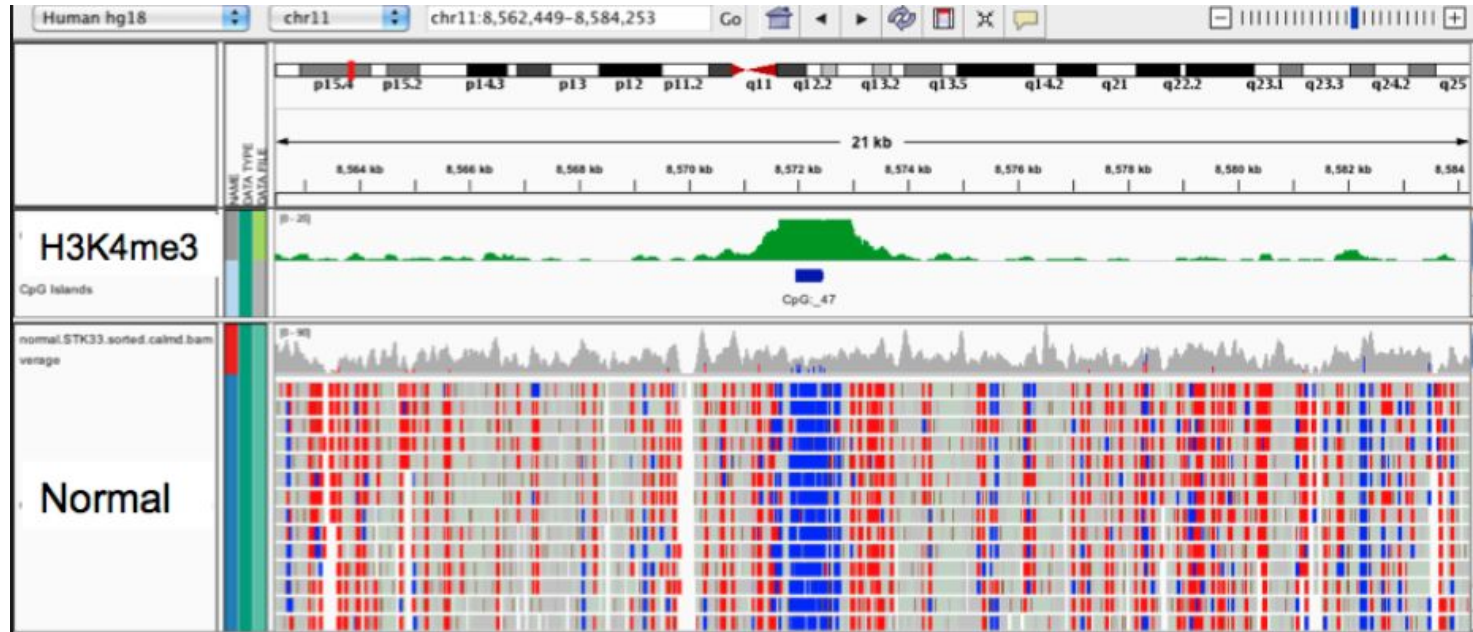


Assembly!



# The Next Generation Sequencing Revolution

Millions of polymorphisms in the genome sequences...



# Genotyping formats

# Two major genotyping formats (but there are many...)

**Plink format**      ped/map files

<https://www.cog-genomics.org/plink2/>

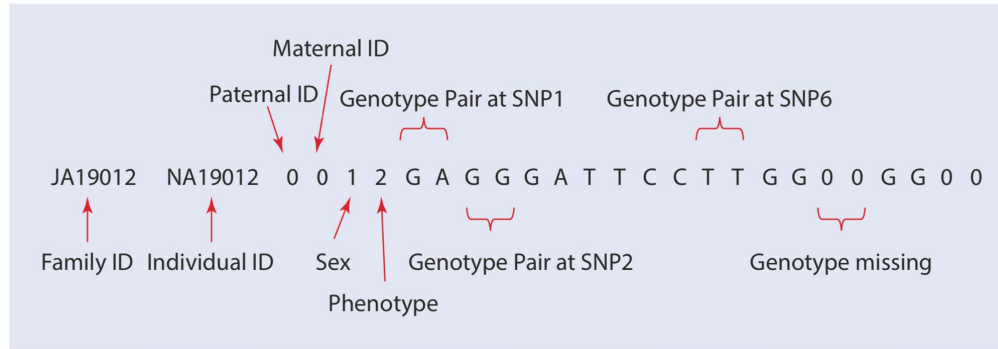
**Variant calling format**      vcf files

<https://www.internationalgenome.org/wiki/Analysis/vcf4.0/>

<https://vcftools.github.io/index.html>



# PLINK - the .ped file



Column 1 = Family ID  
 Column 2 = Individual ID  
 Column 3 = Paternal ID (zero for missing)  
 Column 4 = Maternal ID (zero for missing)  
 Column 5 = Sex  
 Column 6 = Phenotype (1=unaffected, 2=affected, and 0=missing)  
 Column 7, 8 = genotype pair of the first SNP1 (zero for missing)  
 Column 9, 10 = genotype pair of the second SNP2 (zero for means missing)  
 ...  
 Column 457393, 457394 = genotype pair of the last SNP228694

Kim J.H. (2019) GWAS Data Analysis. In: Genome Data Analysis. Learning Materials in Biosciences. Springer, Singapore

## PLINK - the .map file

[illegible]

Column 1 = chromosome number  
Column 2 = SNP ID  
Column 3 = Genetic Distance (morgans)  
Column 4 = physical base-pair position (bp)

Kim J.H. (2019) GWAS Data Analysis. In: Genome Data Analysis. Learning Materials in Biosciences. Springer, Singapore





# Variant calling format - the .vcf file

## Data info

```
##fileformat=VCFv4.3
##fileDate=20090805
##source=myImputationProgramV3.1
##reference=file:///seq/references/1000GenomesPilot-NCBI36.fasta
##contig=<ID=20,length=62435964,assembly=B36,md5=f126cdf8a6e0c7f379d618ff66beb2da,species="Homo sapiens",taxonomy=x>
##phasing=partial
##INFO=<ID=NS,Number=1,Type=Integer,Description="Number of Samples With Data">
##INFO=<ID=DP,Number=1,Type=Integer,Description="Total Depth">
##INFO=<ID=AF,Number=A,Type=Float,Description="Allele Frequency">
##INFO=<ID=AA,Number=1,Type=String,Description="Ancestral Allele">
##INFO=<ID=DB,Number=0,Type=Flag,Description="dbSNP membership, build 129">
##INFO=<ID=H2,Number=0,Type=Flag,Description="HapMap2 membership">
##FILTER=<ID=q10,Description="Quality below 10">
##FILTER=<ID=s50,Description="Less than 50% of samples have data">
##FORMAT=<ID=GT,Number=1,Type=String,Description="Genotype">
##FORMAT=<ID=GQ,Number=1,Type=Integer,Description="Genotype Quality">
##FORMAT=<ID=DP,Number=1,Type=Integer,Description="Read Depth">
##FORMAT=<ID=HQ,Number=2,Type=Integer,Description="Haplotype Quality">
#CHROM POS ID REF ALT QUAL FILTER INFO FORMAT NA00001 NA00002 NA00003
20 14370 rs6054257 G A 29 PASS NS=3;DP=14;AF=0.5;DB;H2 GT:CQ:DP:HQ 0/0:48:1:51,51 1/0:48:8:51,51 1/1:43:5:...
20 17330 . T A 3 q10 NS=3;DP=11;AF=0.017 GT:CQ:DP:HQ 0/0:49:3:58,50 0/1:3:5:65,3 0/0:41:3
20 1110696 rs6040355 A G,T 67 PASS NS=2;DP=10;AF=0.333,0.667;AA=T;DB GT:CQ:DP:HQ 1/2:21:6:23,27 2/1:2:0:18,2 2/2:35:4
20 1230237 . T . 47 PASS NS=3;DP=13;AA=T GT:CQ:DP:HQ 0/0:54:7:56,60 0/0:48:4:51,51 0/0:61:2
20 1234567 microsat1 CTC G,CTCT 50 PASS NS=3;DP=9;AA=G GT:CQ:DP 0/1:35:4 0/2:17:2 1/1:40:3
```

**CHROM** → chromosome/contig

**POS** → position on chr/contig

**ID** → SNP name/ID

**REF** → reference genome allele

**ALT** → alternative allele ( . / 1 or more)

**QUAL** → Phred scaled quality

-10log10 (call in Alt is wrong)

E.g. 1/10 chance of mistake → 10

**FILTER** ☐ quality filter (q10 → quality < 10)

**INFO** ☐ further information

0/1 is not the same as 0|1 !! (unphased / phased)

