# Mapping the genes underlying phenotypic variation

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#### **Tomato shape**



Lycopericon esculentum

Lycopersicon esculentum cv. Yellow Pear

(Ku et al., 1999; Liu et al., 2002)

### **QTL** mapping



#### Quantitative measure of the phenotype

Measure of 2 indexes L/D and Dmin/Dmax for 10 fruits per plant L/D : L= length, D = diameter at equator Dmin/Dmax



#### 82 molecular markers on the 12 tomato chromosomes



#### One major locus near marker TG645



#### Two main files

#### Markers file

-start	
-Chromosome	1
CF5475	0.4
CF5573	24.7
СТ7895	41.0
СТ8903	59.0
CF5613	67.7
СТ7892	76.0
СТ890	89.0
СТ233	39.0
Telomere	50.0
-Chromosome	2
-Chromosome CF5671	2 0
CF5671	0
CF5671 CF5675	0 10.4
CF5671 CF5675 CF5673	0 10.4 34.7
CF5671 CF5675 CF5673 CT789	0 10.4 34.7 41.0
CF5671 CF5675 CF5673 CT789 CT890	0 10.4 34.7 41.0 89.0

#### Genotypes and phenotype(s) file

-start :	indi	vio	dua	als	5 I	naı	cke	ers	5				
Ind_1 0	0 1	1	0	0	0	0	0	1	2	2	2	2	
Ind_2 0	0 0	1	0	1	0	0	1	1	1	1	0	0	
Ind_3 2	2 2	2	2	1	0	1	1	1	1	0	0	0	
Ind_4 0	1 0	0	0	0	1	1	1	2	2	1	1	1	
Ind_5 0	1 0	0	0	0	1	1	1	1	2	2	2	2	
Ind_6 1	1 1	1	1	1	1	1	1	0	0	0	0	0	
Ind_7 1							1	n	n	1	1	1	
Ind_8 2	2 2	1	1	1	1	0	1	1	1	1	1	0	
Ind_9 1									1				
Ind_1 0	2 2	1	1	1	1	1	0	0	0	1	1	2	
-stop in	ndiv	idı	la	ls	ma	ar}	دeı	2S					
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-start			dua	als	5 t	ra	ait	S	1	L	ove	erD	named
Ind_1													
Ind_2	3.0												
Ind_3	4.0												
_	7.0												
—	6.5												
_	5.0												
_	3.5												
Ind_8	6.0	)											

# Simple linear regression for each marker

L/D of individual i = a + b.xi +  $\varepsilon$ xi = 0 if Le/Le, = 1 if Le/Lp, = 2 if Lp/Lp a,b = best fit parameters (least square regression)  $\varepsilon$  assumed to have a normal distribution

Test Ho: b = 0 versus H1: b = estimated b

#### Likelihood ratio test statistic

$$\begin{split} D &= -2(\ln(\text{likelihood for null model}) - \ln(\text{likelihood for alternative model})) \\ &= -2\ln\left(\frac{\text{likelihood for null model}}{\text{likelihood for alternative model}}\right). \end{split}$$

The probability distribution of the test statistic can be approximated by a chi-square distribution with (df1 – df2) degrees of freedom, where df1 and df2 are the degrees of freedom of models 1 and 2 respectively

# **Interval mapping**

L/D of individual i = a + b.xi + e

xi = indicator variable specifying the probabilities of an individual being in different genotypes for the tested position, constructed by flanking makers xi = 0 if Le/Le, = 1 if Le/Lp, = 2 if Lp/Lp

a,b = best fit parameters (maximum likelihood)

Test Ho: b=0 versus H1: b=estimated b



# Interval mapping

L/D of individual i = a + b.xi + e

xi = indicator variable specifying the probabilities of an individual being in different genotypes for the tested position, constructed by flanking makers xi = 0 if Le/Le, = 1 if Le/Lp, = 2 if Lp/Lp

a,b = best fit parameters (maximum likelihood)

Test Ho: b=0 versus H1: b=estimated b

# **Composite Interval mapping**

L/D of individual i = a + b.xi + c.xi + e

xi = indicator variable specifying the probabilities of an individual being in different genotypes for the tested position, constructed by flanking makers xi = 0 if Le/Le, = 1 if Le/Lp, = 2 if Lp/Lp

yi = 0 if Le/Le, = 1 if Le/Lp, = 2 if Lp/Lp at marker y

LOD score

L/D of individual i = a + b.xi + e

Test Ho: b = 0 versus H1: b = estimated b

Lo = pr (data | no QTL) – phenotypes assumed to follow a normal distribution L1 = pr (data | QTL at tested position)

$$LOD = -\log\frac{L_0}{L_1}$$

### Significance threshold

10,000 permutations of phenotype/genotype data

- $\rightarrow\,$  random distribution of LOD scores
  - $\rightarrow$  1% or 5% significance threshold



#### One major locus near marker TG645







Sequencing of the region in the 2 tomato varieties

1 SNP (single nucleotide polymorphism) et 1 indel (insertion-deletion) of 2bp in non-coding regions

*L. esculentum* cv. Yellow Pear



1 SNP in *ORF6* : G496T, stop codon stop, truncated protein with last 75 amino acids missing

Hypothesis: the causing gene is *ORF6* = *OVATE* 

### The causing gene is OVATE/ORF6

Same mutation in 3 other pear tomato varieties

Complementation of the mutation by transgenesis



OVATE = protein with NLS (nuclear localization signal), unknown function, expressed in developing fruits

### **Evolution of morphology** in threespine sticklebacks



#### Paxton Lake, Canada

#### Gasterosteus aculeatus

(Peichel et al., 2001; Shapiro et al, 2004; Chan et al. 2010)

Marine fishes with robust pelvis = ancestral

Freshwater fishes with reduced pelvic structures = derived, independently at least 20 times

- limited calcium availability
- absence of gape-limited predatory fishes
- predation by grasping insects



#### Last glacier retreat = 10 000 – 20 000 years ago

# **QTL** mapping



(Shapiro et al., 2004)

# Several independent deletions in the cis-regulatory region of *Pitx1*

Region sequenced in two lake populations: a 2-kb deletion in one and a 757-bp deletion in the other one

SNP genotyping in 13 populations with reduced pelvis and in 21 populations with complete pelvis



# Test of *Pitx1* cisregulatory regions





# Rescue of a pelvis in freshwater individuals





## *Pitx1* is in a fragile DNA region



Control = artificial chromosome without test region

(Xie et al., 2019)



14.21: Courtesy of Mike Shapiro and David Kingsley.

### **Evolution of extra bristles**

Interspecific change in *D. quadrilineata* 

D. melanogaster D. quadrilineata

Intraspecific change in *D. melanogaster* 



Marcellini and Simpson 2005, Gilbert et al. 2005

## Finding genetic rules on bristle evolution



Randsholt and Santamaria 2008



color, type, orientation shape and size presence/absence

CRE mutations in *achaete-scute* 

Aristotle, Historia animalium, book I, 2, 300BC

Stern and Orgogozo 2009

## **Bristle development**









#### scute cis-regulatory elements are "master switches"







Simpson 2007



Gómez-Skarmeta 2003

## Extra bristles in D. quadrilineata





# Extra bristles in *D. quadrilineata* correlate with larger *scute* expression domain

#### In situ hybridization



# Test for a cis-regulatory change (1)

# *D.melanogaster* transgenics









# Test for a cis-regulatory change (2)

*D.melanogaster* transgenics









## Alignment of the DC region



## Genetic evolution is partly predictable





Stern and Orgogozo 2009 Science

### Extra bristles in *D. melanogaster*-Marrakech

correlate with larger scute expression domain



Gibert et al 2005

# Extra bristles in *D. melanogaster*-Marrakech due to mutation(s) in *poils-au-dos*



Gibert et al 2005
### Short-term evolution...



### ...versus long-term evolution



D. melanogaster

D. quadrilineata



cis-regulatory mutation change in the thorax only

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(Marcellini et al. 2006)
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# Methods to identify the genes and the mutations responsible for phenotypic evolution

# Various methods

<u>Genetic</u> which chromosome (ex: autosomal versus sex) QTL mapping Genetic association studies Complementation tests

<u>General biology</u> General knowledge of the genes involved in the phenotype Similarity with a known phenotype Correlation with a change in gene expression level/pattern

#### Final test of protein activity

in vitro in *E. coli*, by transgenesis in the studied species or the closest model organism (ex: *beta-defensin* of dogs tested in mouse)

#### Final test of cis-regulatory regions

- with reporter constructs, transgenesis, comparison of both regions
- comparison of allele expression levels in hybrids (pyrosequencing)

### Two types of approaches



no a priori, fewer bias long and tedious rarely ends with identification of the gene Based on an a priori idea can be fast and efficient

only with strains/species which produce fertile hybrids

will only find known genes

In both cases, genes with small effect are more difficult to identify

# Linkage Mapping

Crosses in the lab

# Association Mapping

Past crosses in natural populations



## Genome-wide association study (GWAS)



Manhattan plot depicting several strongly associated risk loci. Each dot represents a SNP, with the X-axis showing genomic location and Y-axis showing association level.

Wikipedia

# **GWAS typically identify common alleles**



Allele Frequency

# Methodology of a case-control GWA study



The allele count of each measured SNP is evaluated, in this case with a chi-squared test, to identify variants associated with the trait in question.

Wikipedia

# **Regional association plot**



Association to LDL-cholesterol levels.

The haploblock structure is visualized with colour scale and the association level is given by the left Y-axis.

The dot representing the rs73015013 SNP (in the topmiddle) has a high Y-axis location because this SNP explains some of the variation in LDL-cholesterol.

Wikipedia

#### THREE APPROACHES to FIND the GOLDEN LOCI of EVOLUTION



#### **FORWARD GENETICS**

*From traits to genes* Little Ascertainment Bias, but Micro-Evolution only

Courtier-Orgogozo et al. 2020 NAR

**REVERSE GENETICS** From genes to traits Experimental Evidence

3 categories, each with biases



#### **Candidate Gene**

Experimental
Principle

Example

Ascertainment Bias on Locus Identification

**Molecular Type Bias** 

**Trait Type Bias** 

#### Taxonomic Breadth

Reverse Genetics: looking for sequence differences and trait effects based on previous studies of a given gene

> 66 cases of color variation associated to *MC1R* coding mutations in vertebrates

#### High

Favors identification of **coding mutations** Favors traits with small

molecular targets, large-effect size

Large



### Linkage Mapping

Forward Genetics: trait mapping in hybrids obtained from laboratory crosses, using recombination over a few generations

F2 crosses between melanic and amelanic phenotypes in cavefish : identification of *MC1R* and *Oca2* alleles in distinct cave populations

Low to Intermediate (depending on resolution / cross size)

Little molecular bias

Amenable to dissection of complex traits with small-effect size (large crosses, multiparental families)

**Narrow**, limited to interfertile lineages (populations or sister species)



#### **Association Mapping**

Forward Genetics: statistical SNP/character state

association in large cohorts, using recombination over many generations

GWAS of human pigmentation (skin, hair, eyes): identification and confirmation of causal variants at >15 genes including *Oca2* p.His615Arg in Eastern Asia

#### Low

Can miss structural variants (short read genotyping)

Most common approach for complex traits with small-effect size

Very narrow, limited to polymorphic or intermixing populations

# **QTL Mapping**

4 steps: crosses, genotyping, phenotyping, statistical analysis

# Crosses

Backcross with one line Backcross in both directions F2

Crosses for several generations Introgression lines Recombinant Inbred Lines

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Always try to maximize the number of recombination events

# Markers

yes-no PCR PCR length polymorphism Pyrosequencing Probe hybridization Microarray RADseq High-throughput sequencing

How many markers?

### theory

# practice



