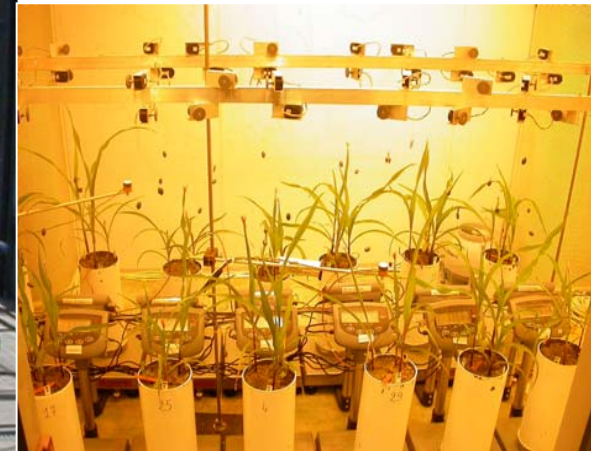


Modelling the GE interaction

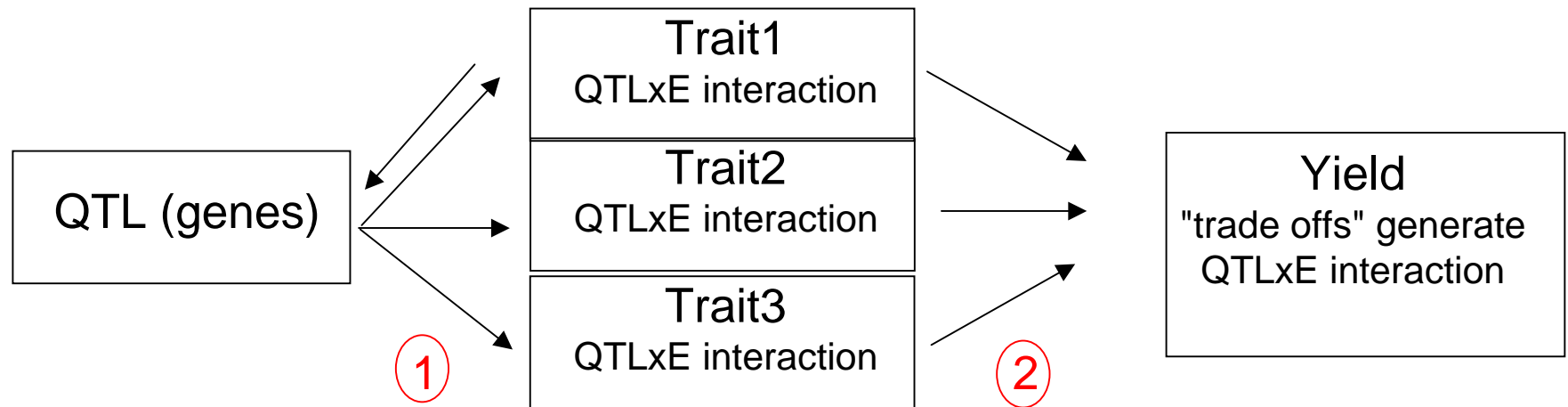
Which models for what ?

C Welker, O. Turc, F. Tardieu



Which model (s) ?

2 types of modelling activities :



2 : C. Messina's and M Cooper's presentations, **1** hypothetical

1 : how to identify QTLs across environments ?

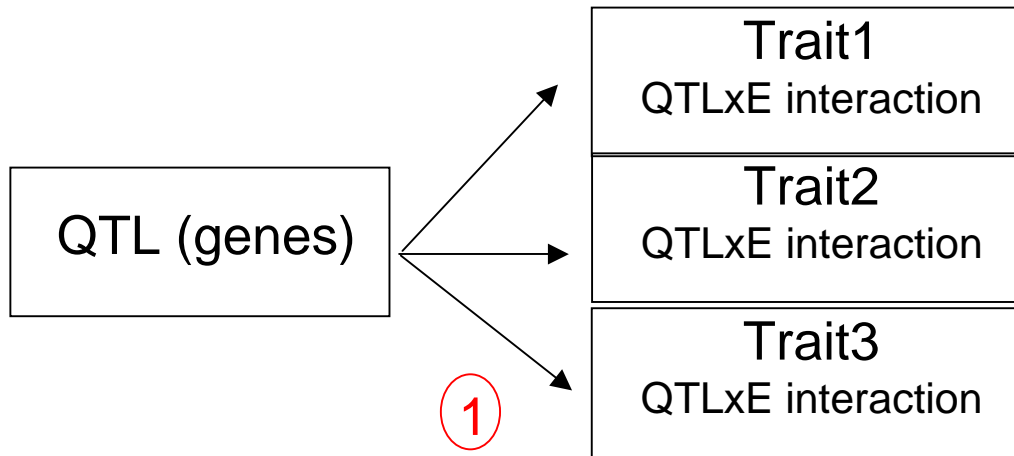
- Network of experiments (Van Eeuwijk et al. 2005)
- Can modelling help, and how ?

GCP project : link **1** and **2** with two different modelling approaches

1 : GCP project 15, my presentation

2 : GCP project WPM, Karine Chenu (weight the importance of QTLs of growth)

Which model (s) ?



Model : express the phenotype in such a way that it encapsulates the GxE

$$\text{Trait} = f(V1, V2, V3, a1, a2, a3)$$

V, environmental variables, a parameters (should not change)

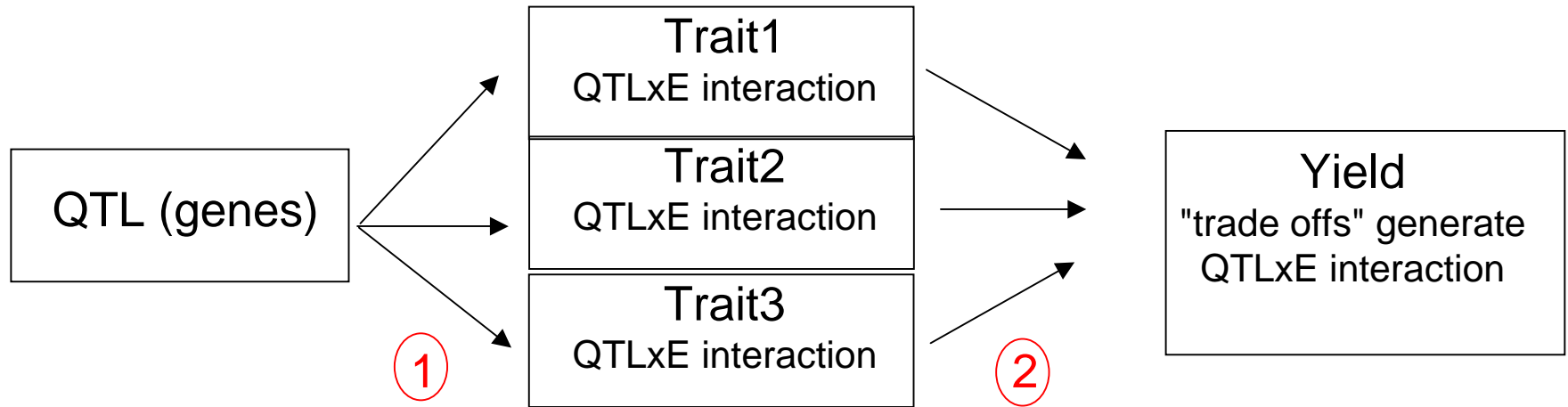
$$\text{Photosynthesis} = f(\text{light}, \text{initial slope}, \text{plateau})$$

genotypic constants

genetic analysis

simulated phenotypes

Which model (s) ?



Can the models in 1 and 2 be the same ?

- Yes : **Fit a "preexisting, conceptual model" on data,**
extract parameters + genetic analysis
(Quillot et al. 2003, Yin et al. 2004, Luquet et al 2006)
- No : **Build "ad hoc" models which fit data with very few parameters**
 - . genetic analysis of parameters
 - . the physiology / genetics come after this analysis
(Reymond et al. 2003, Welcker et al 2007, Sadok et al. 2007)

Which model ?

1. Fit a "pre-existing, conceptual model" on data, extract parameters + genetic analysis
2. Build "ad hoc" models which fit data with very few parameters
 - . genetic analysis of parameters
 - . the physiology / genetics come after this analysis

Do 1 and 2 really differ ?

1 : I believe in my model, I can build genetic analyses on it

2 : I don't, we do not know enough of the mechanisms to build a theory for the genetic variability of responses to environment

Which model ?

1. Fit a "pre-existing, conceptual model" on data, extract parameters + genetic analysis
2. Build "ad hoc" models which fit data with very few parameters
 - . genetic analysis of parameters
 - . the physiology / genetics come after this analysis

Do 1 and 2 really differ ?

1st part :

Our experience with process-driven models

Test candidate mechanisms / equations for leaf growth:

"fill the graveyard of mechanisms"

C availability ? ABA ? Cell wall properties? Hydraulics ?

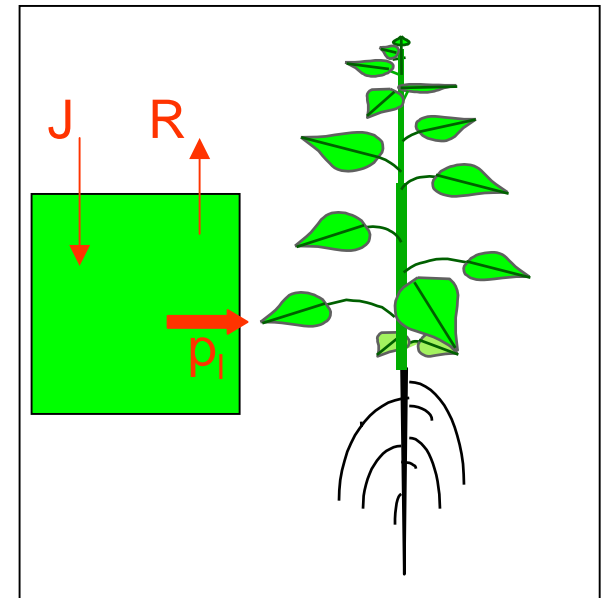
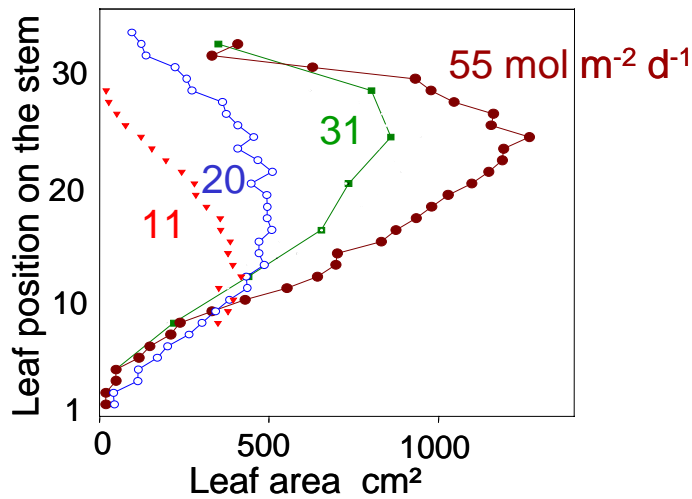
2nd part :

Genetic analysis using an "hypothesis free" model.

Testing candidate mechanisms /equations for leaf growth

A model based on carbon availability ?

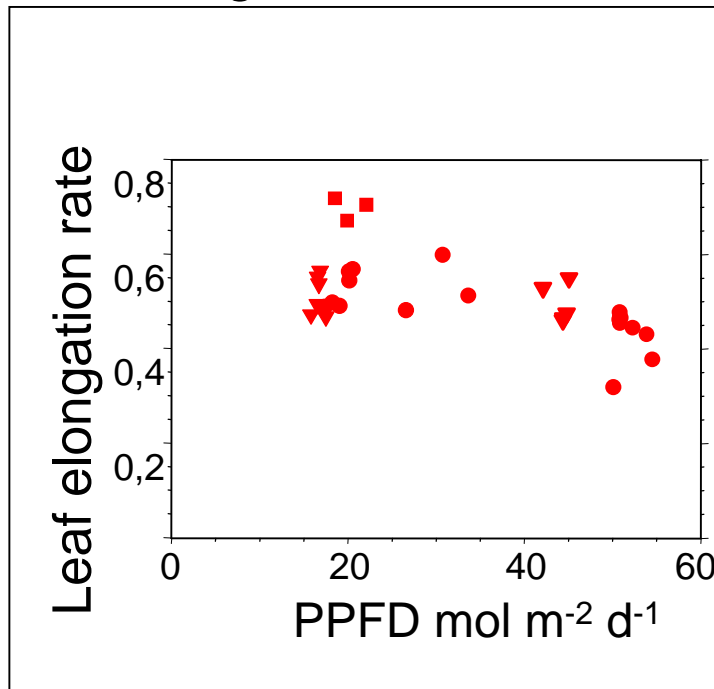
$$\begin{array}{ccccccc} \text{Increase in} & & \text{Carbon} & * & \text{\% C to} & * & \text{Leaf area} \\ \text{leaf area} & = & \text{gain} & & \text{leaves} & & \text{per unit mass C} \\ \\ \Delta A / \Delta t & = & (J - R) & * & p_l & * & \text{SLA} \end{array}$$



Testing candidate mechanisms /equations for leaf growth

Maize (all monocots ?) : No effect of C availability

Does light availability increase the leaf growth rate ?

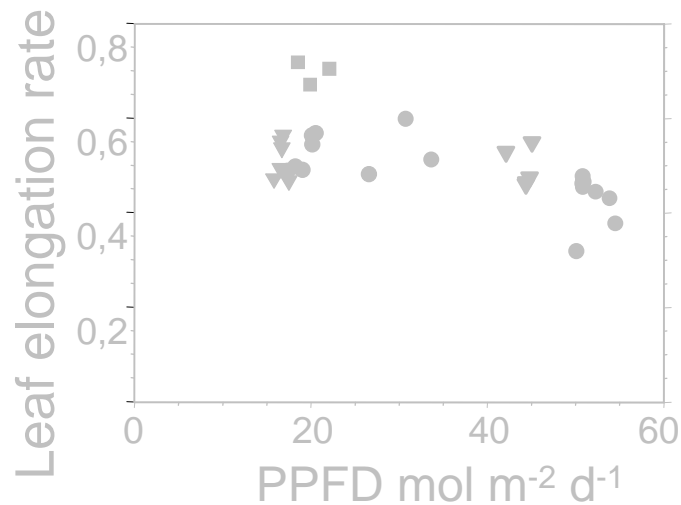


Tardieu et al. 1999

Testing candidate mechanisms/equations for leaf growth

Maize (all monocots) : No effect of C availability

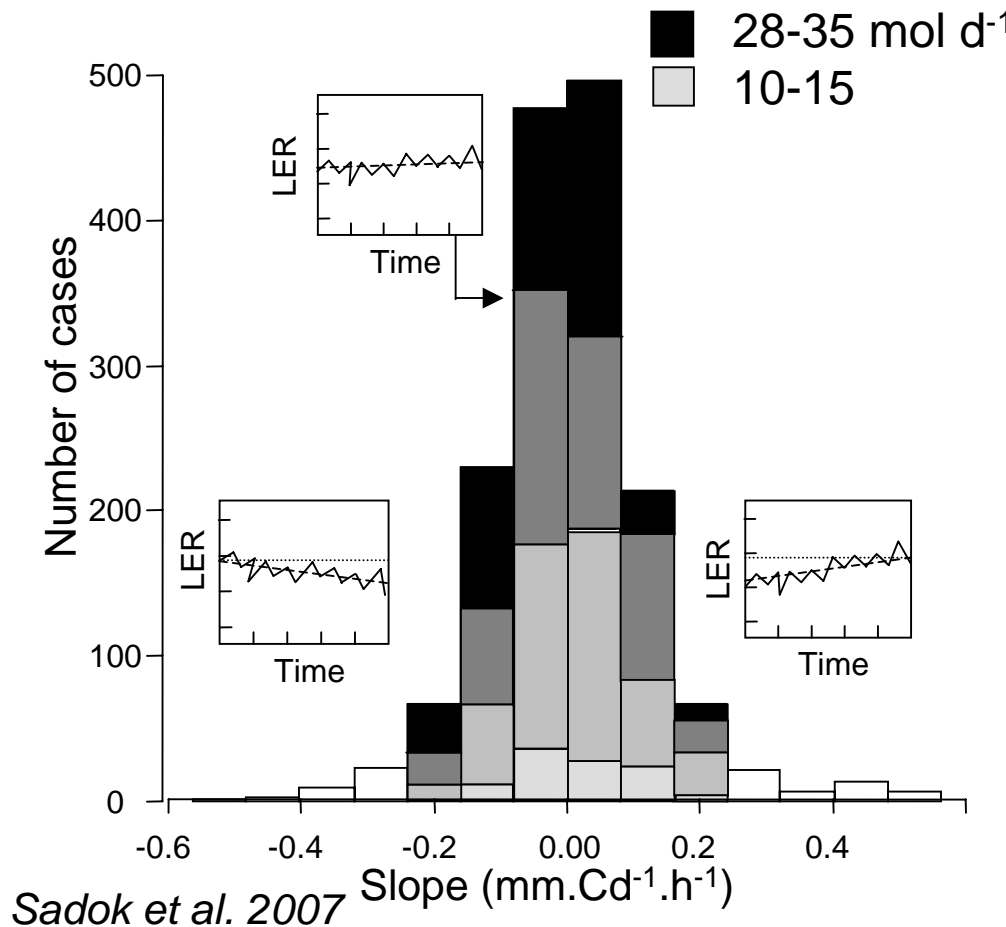
Does light availability increase the leaf growth rate ?



Tardieu et al. 1999

A decline during the night if light is not sufficient ?

A GxE interaction ?



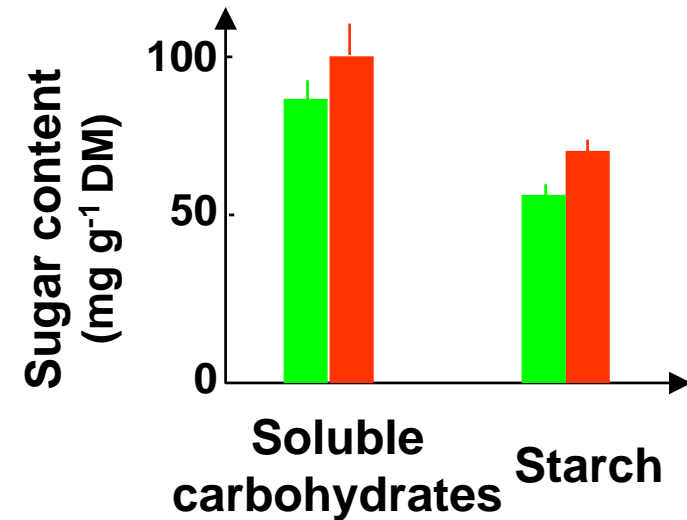
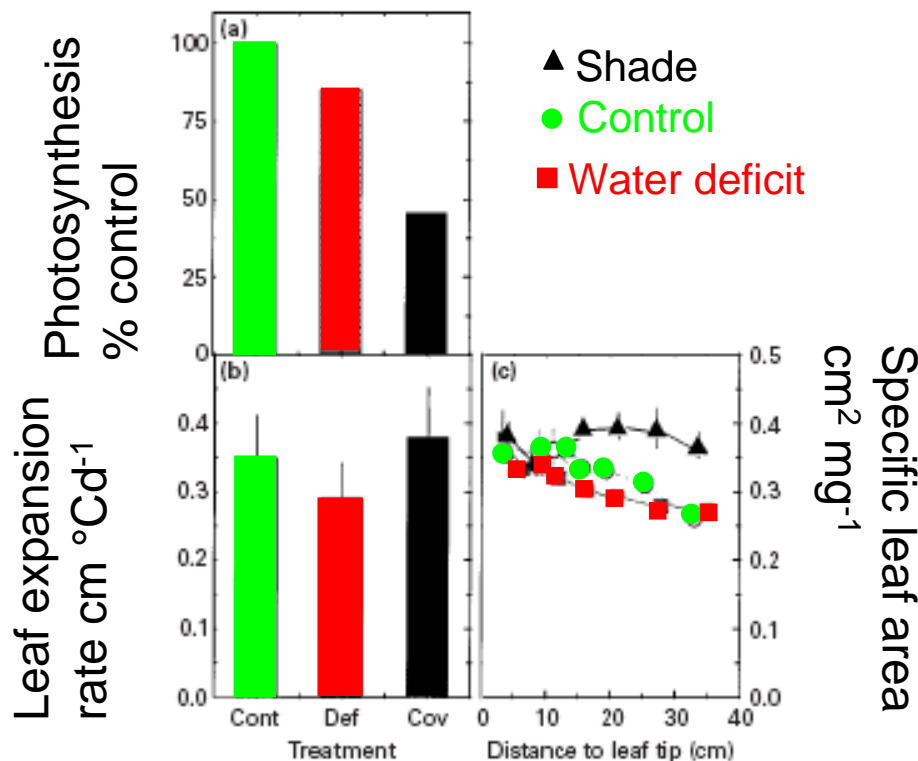
Sadok et al. 2007

Testing candidate mechanisms/equations for leaf growth

Maize (all monocots) : No effect of C availability

Adjusted on specific leaf area and sugar content.

Leaves "heavier" in deficit, "lighter in shade"

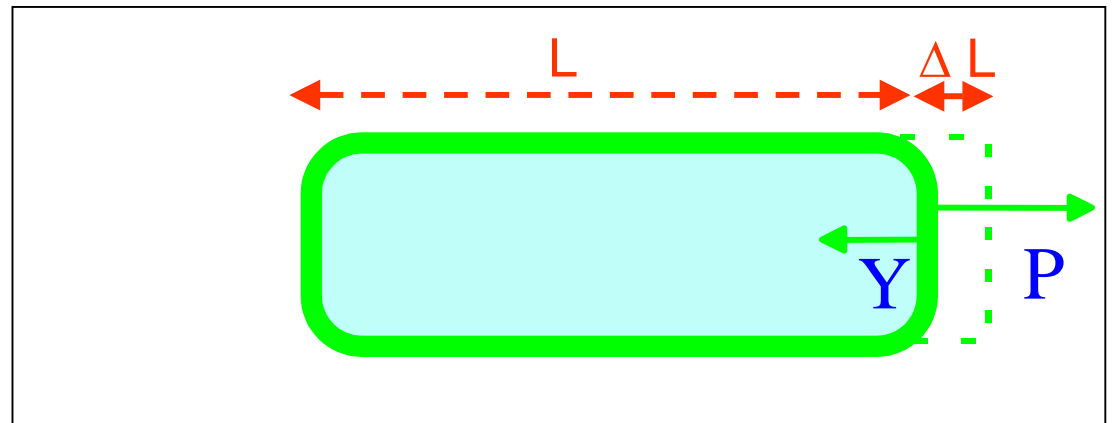


Testing candidate mechanisms/equations for leaf growth

Cell wall extensibility ?

$$\begin{array}{l} \text{Increase in} \\ \text{leaf area (rel)} \end{array} = \begin{array}{l} \text{Tissue} \\ \text{extensibility} \end{array} * \begin{array}{l} \text{Turgor} \\ \text{- threshold turgor} \end{array}$$
$$\Delta A / A \Delta t = \phi * (P - Y)$$

expansins : family of genes which facilitate wall expansion
"molecular grease"
Cosgrove 2005

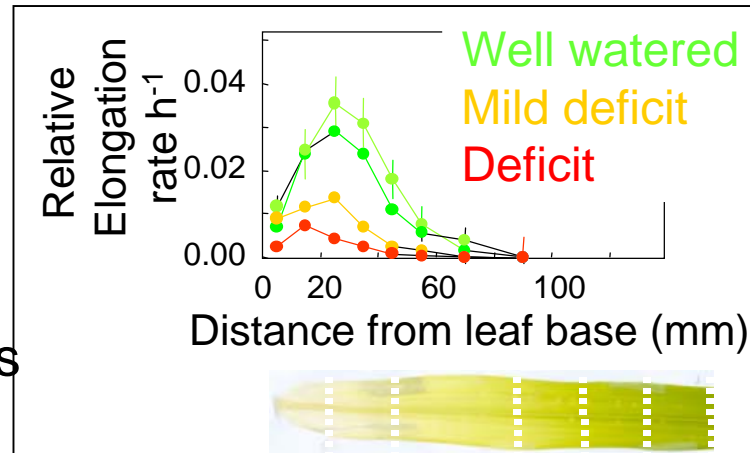


Testing candidate mechanisms/equations for leaf growth

Expansins ?

Do expansins account for the changes in elongation rate with water deficit ?

33 expansins
19 expressed in growth zones
5 good candidates



Testing candidate mechanisms/equations for leaf growth

Expansins ?

3 expansins account for differences in growth rate due to water deficit

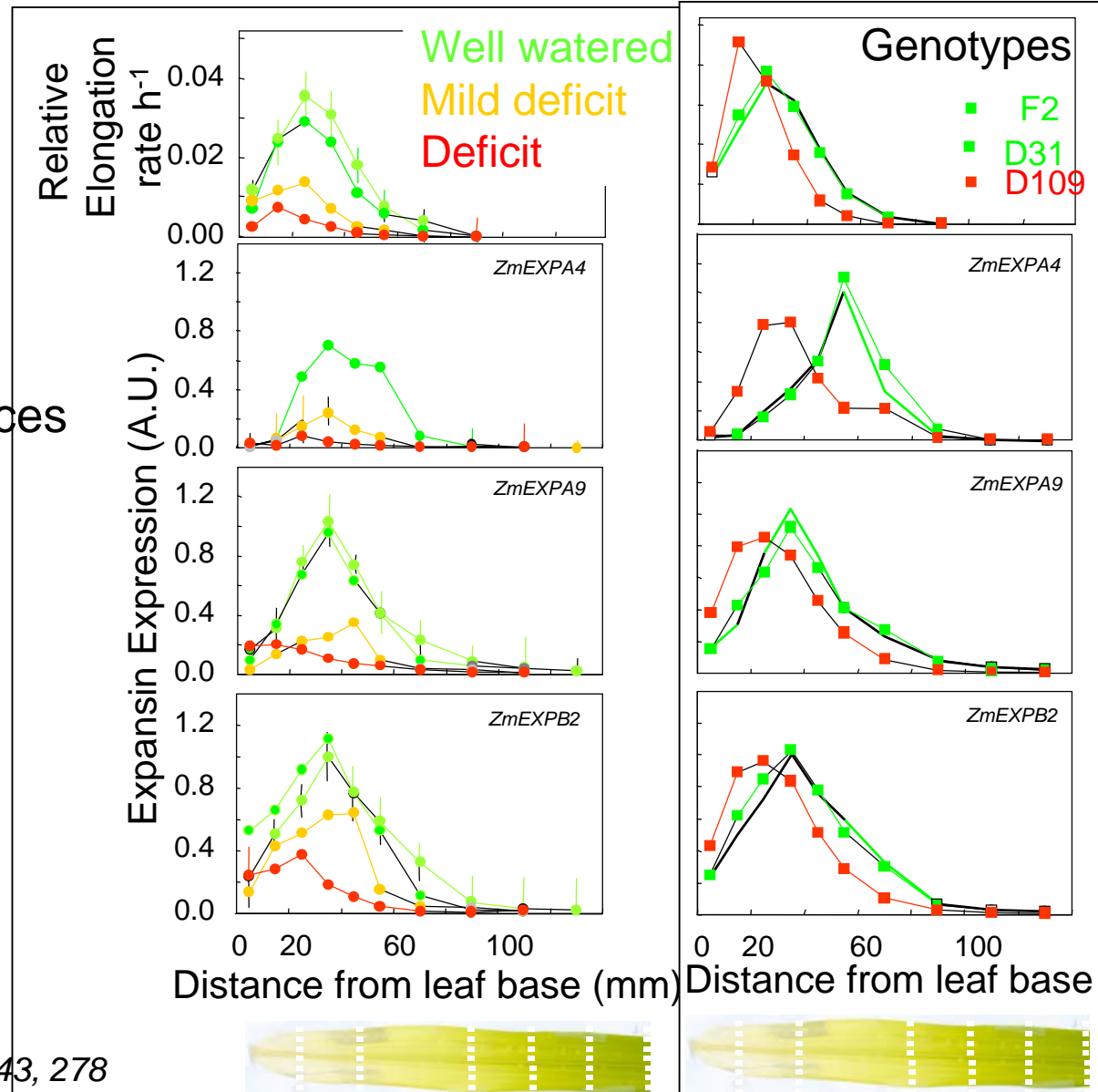
... and for genotypic differences

... and for leaf aging...

Causes ?

Consequences ?

Who follows who ?



Testing candidate mechanisms/equations for leaf growth

$$\text{ABA ?} \quad \Delta A / A \Delta t = a [\text{ABA}]_{\text{xyl}} + \text{hydraulic effect}$$

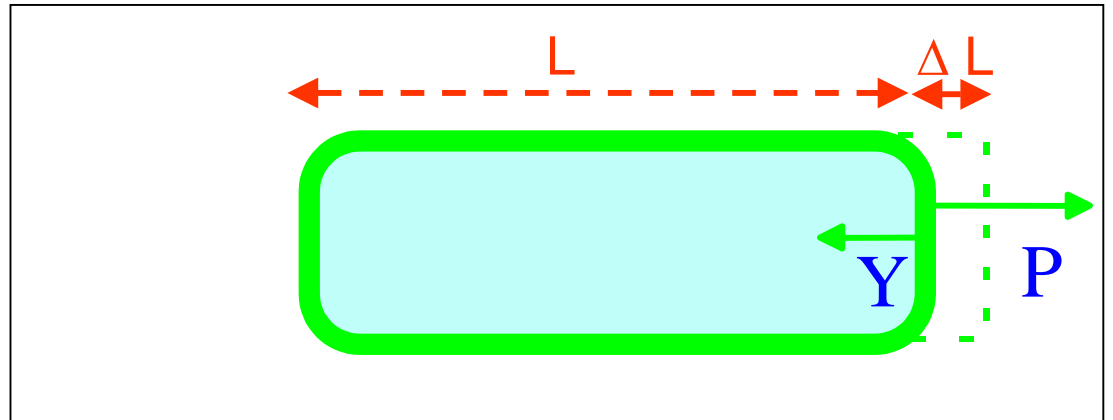
Over/under expressors of the NCED gene

"raw phenotype" : no effect on leaf growth (Voisin et al. 2006 PCE)

Testing candidate mechanisms/equations for leaf growth

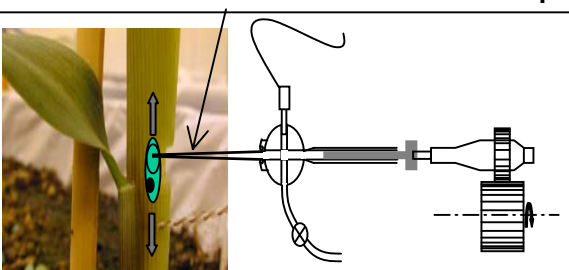
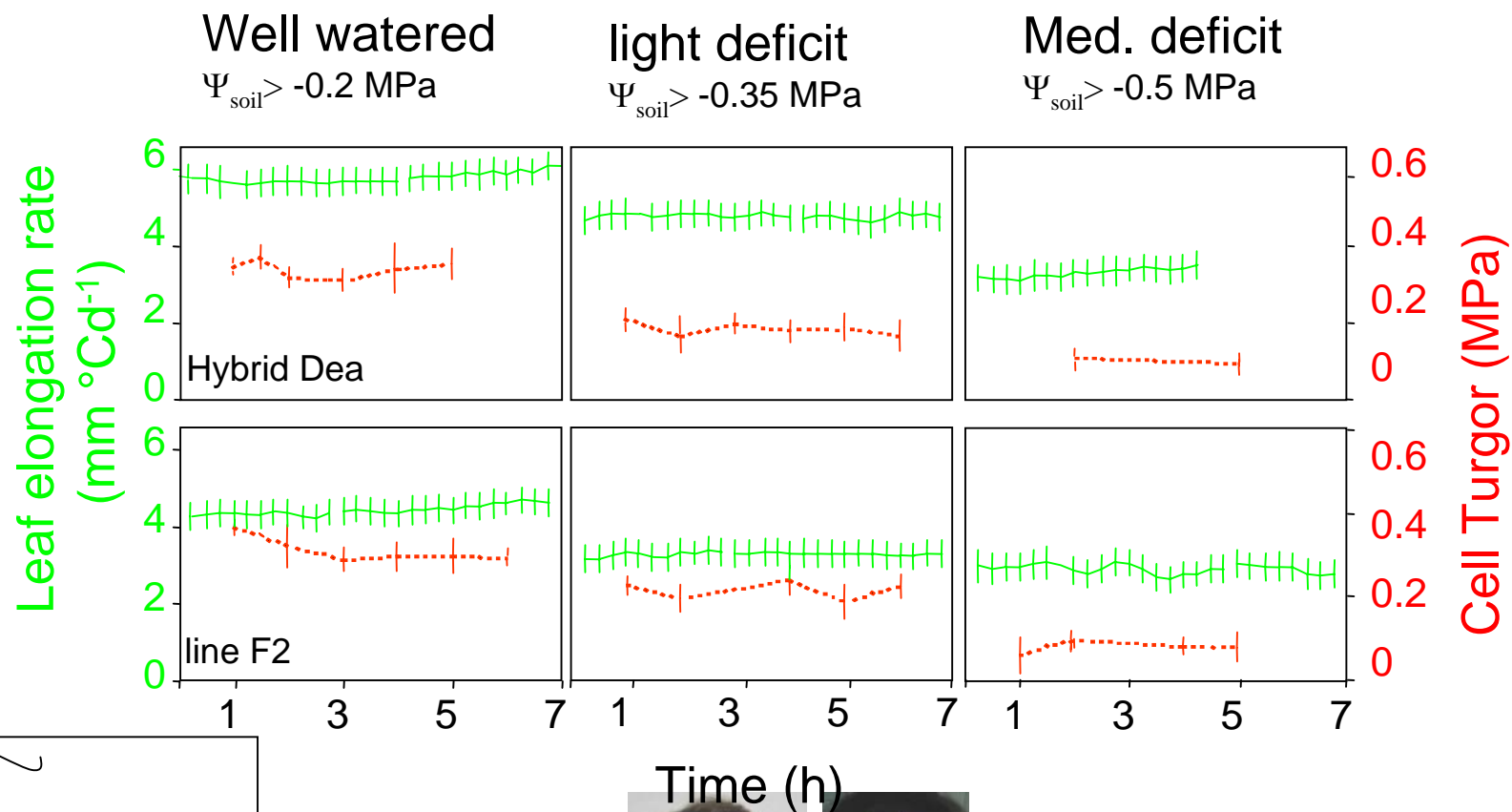
Hydraulics ?

$$\begin{array}{l} \text{Increase in} \\ \text{leaf area (rel)} \end{array} = \begin{array}{l} \text{Tissue} \\ \text{extensibility} \end{array} * \begin{array}{l} \text{Turgor} \\ \text{- threshold turgor} \end{array}$$
$$\Delta A / A \Delta t = \phi * (P - Y)$$



Testing candidate mechanisms/equations for leaf growth

Hydraulics : Changes in elongation rate accounted for by turgor



Bou chabke, Tardieu Simonneau

Testing candidate mechanisms/equations for leaf growth

1. Fit a "pre-existing, conceptual model" on data, extract parameters + genetic analysis
2. Build "ad hoc" models which fit data with very few parameters
 - . genetic analysis of parameters
 - . the physiology / genetics come after this analysis

- A big graveyard of models and hypotheses which would account for genetic variability of responses of leaf growth

Although each hypothesis could generate a reasonable model

C availability, ABA, cell wall properties via expansins, cell division rate

- Hydraulics seem to resist... a dynamic model but too many parameters for genetics

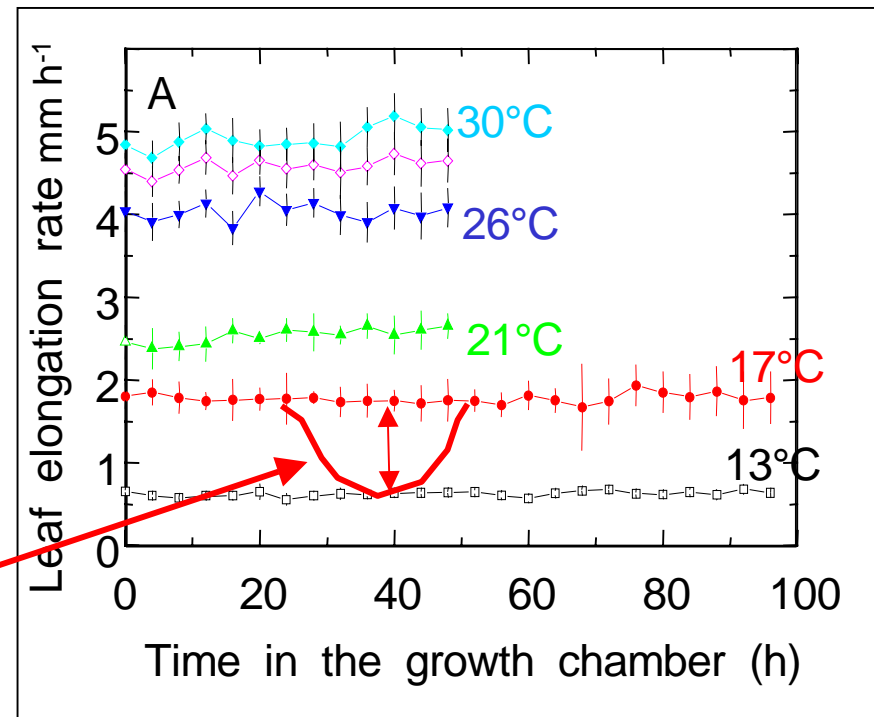
***A simpler, "hypothesis free" model for genetics :
identify "identity card" of genotypes : stable characteristics***

A "phenotypic" model of growth

Monocots : possibility to follow with a 15 minutes definition :

- leaf expansion rate
- transpiration
- micrometeorological conditions

Elongation rate is stable
in stable environmental conditions
Ben Haj Salah and Tardieu 1995 Plant Phy



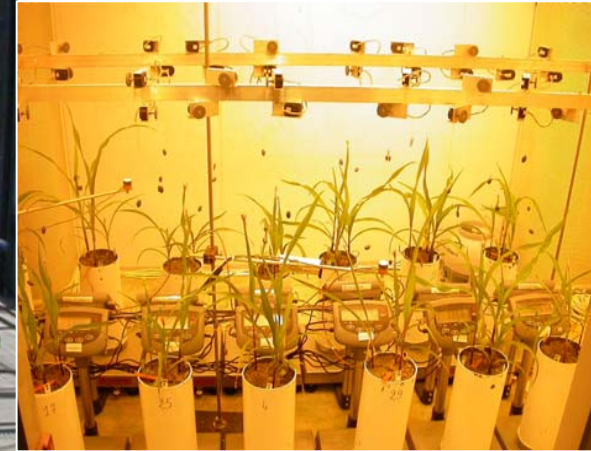
The effect of environmental conditions can be assessed by the difference observed value - expected value at the same temperature

A "phenotypic" model of growth

Phenotyping platform



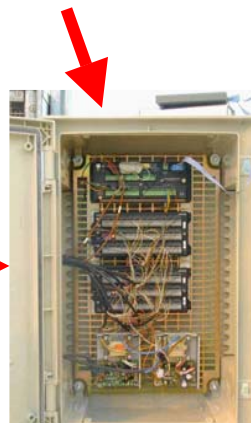
380 plants



40 plants

meristem
temperature

Soil water status
transpiration rate



data logger

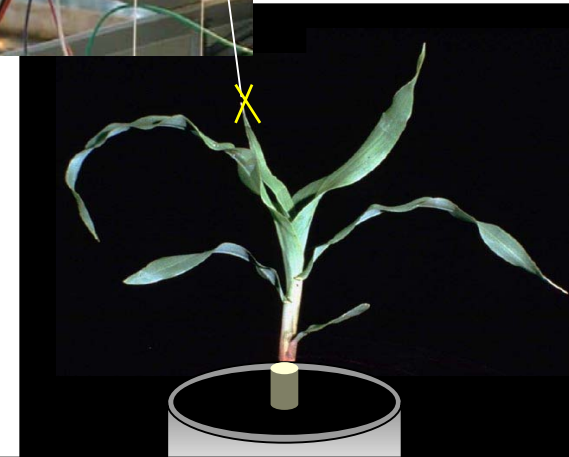
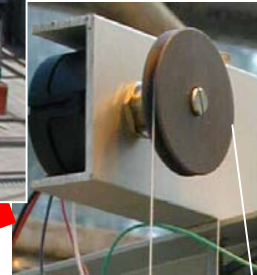


evaporative
demand

light

A "phenotypic" model of growth

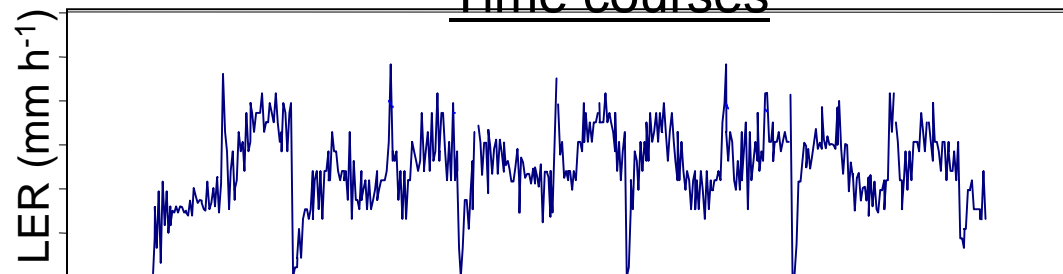
Phenotyping platform



Data loggers



Time courses



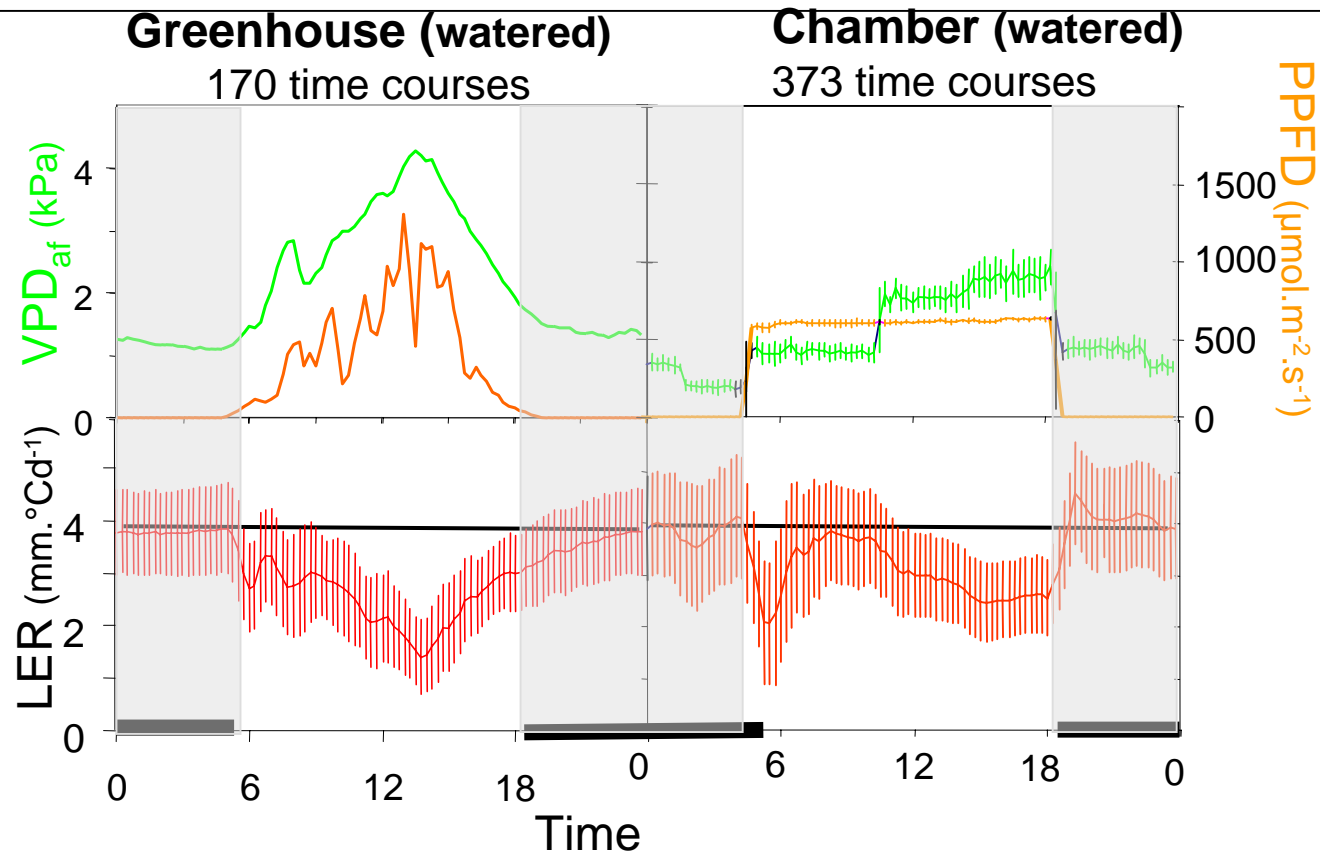
Data base
1000s of time courses :
growth + env conditions
+ transpiration + phenology.



A "phenotypic" model of growth

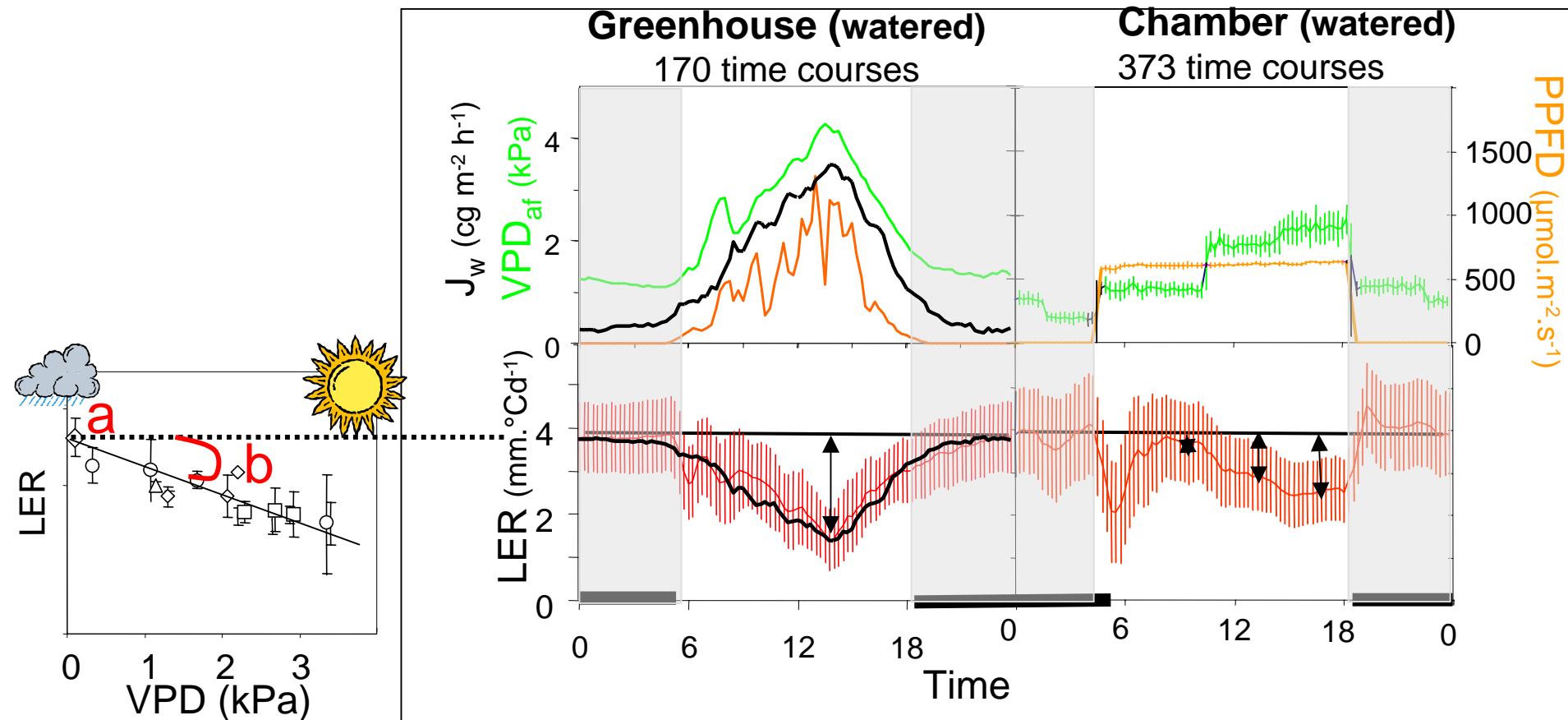
- Rates per unit thermal time : stable with time during the night

$$dL/dt_t = a \quad \rightarrow$$



A "phenotypic" model of growth

- Rates per unit thermal time : stable with time during the night
- Rates (day) decrease with evaporative demand, rapid transitions
- Elongation rate follows transpiration rate ($LER_{th} = a - b J_w$)



A "phenotypic" model of growth

apparently accounted by the superposition of two kinetics :

"Rapid"
Alternation due to
evaporative demand "hydraulic"

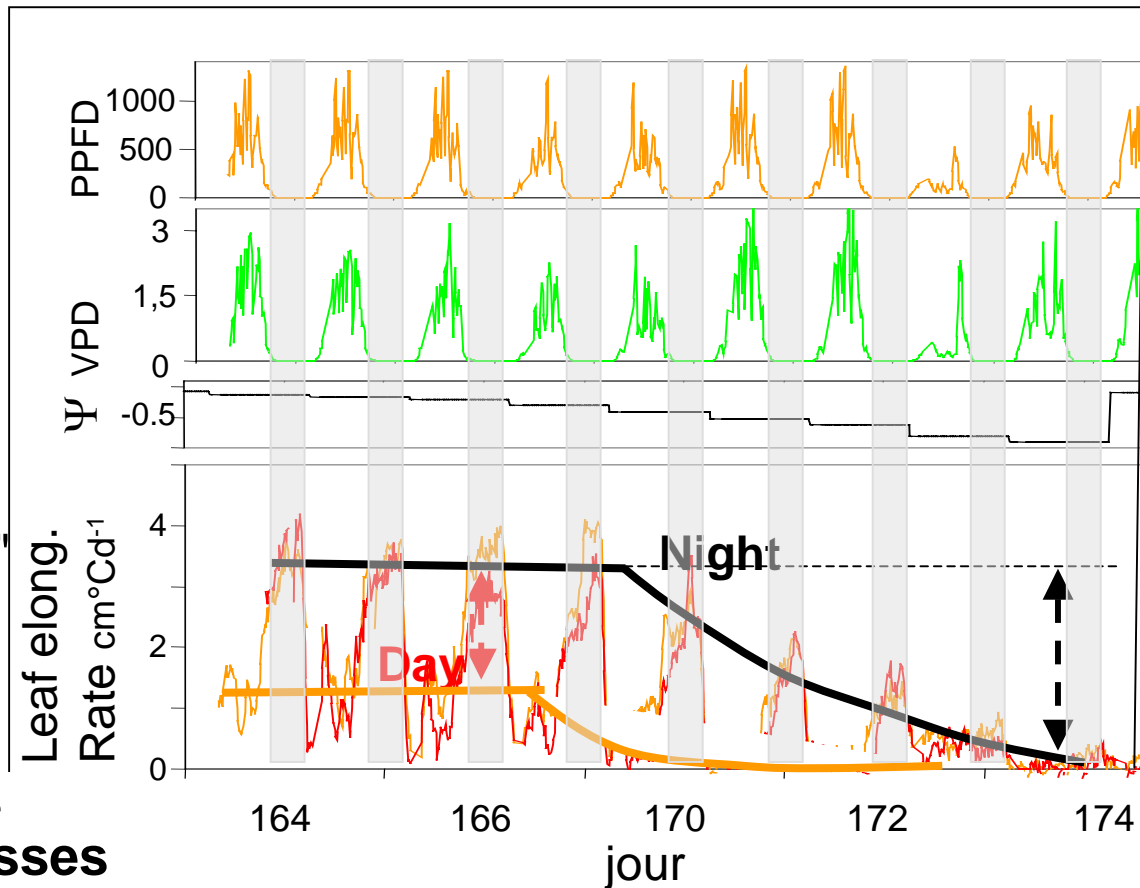
$$dl/dt = (T-T_0)(a-bVPD_{la})$$

"Slow"
Decline of night values
"cell walls, cell cycle, message"

$$dl/dt = (T-T_0)(a-c \Psi)$$

**Time course modelled by the
sum of slow and rapid processes**

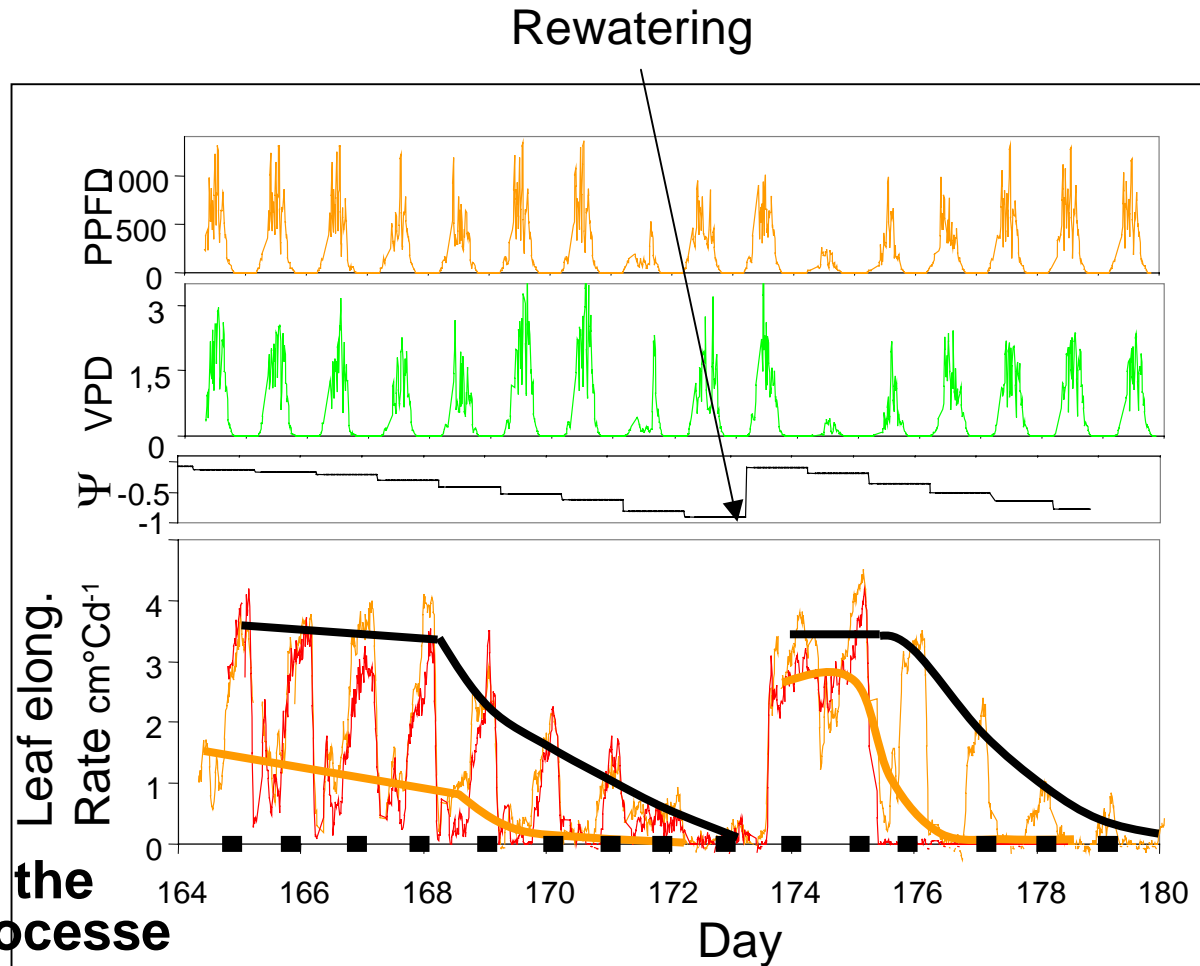
$$dl/dt = (T-T_0)(a-bVPD_{la} -c \Psi)$$



Leaf elongation rate for a 10-d period
with water deficit

A "phenotypic" model of growth

full recovery in 1 h !



Time course modelled by the sum of slow and rapid processes

$$dl/dt = (T - T_0)(a - bVPD_{fa} - c\Psi)$$

A "phenotypic" model of growth

- Rates (day) decrease with evaporative demand, rapid transitions
- Effect of soil water deficit : superposition of two kinetics ?

$$dl/dt = (T - T_0) (a - b \text{ VPD}_{la} - c \Psi)$$

intrinsic growth rate
of the genotype

sensitivity to
evapor. demand
"rapid, hydraulic"

sensitivity to
soil water deficit
"slow, messages"

Genetic analysis of model parameters

$$dI/dt = (T-T_0)(a - b \text{VPD}_{la} - c \Psi)$$

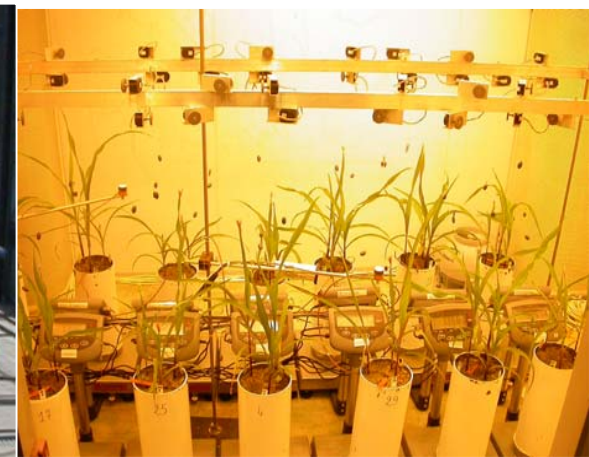
intrinsic growth rate
of the genotype

sensitivity to
evapor. demand

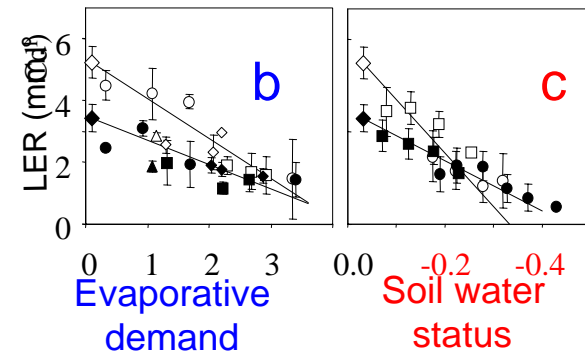
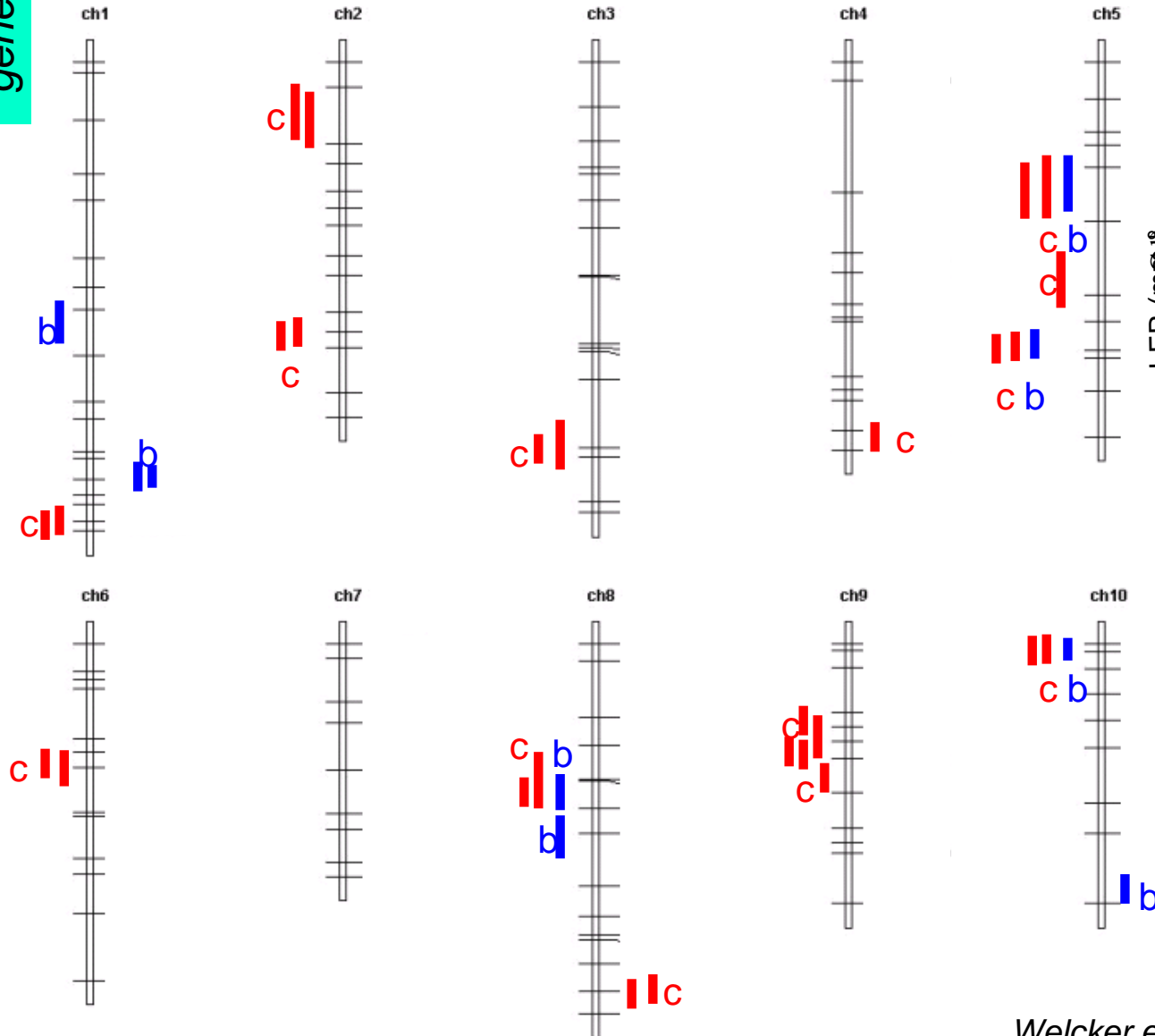
sensitivity to
soil water deficit

3 mapping populations :

- European F-2 x Io (tolerant) 6 experiments Field / greenhouse
- European F-2 x F252 4 experiments greenhouse / growth chamber
- Tropical P1 (tolerant) x P2 6 experiments greenhouse / growth chamber



QTLs of responses tend to be common for evaporative demand (b) and soil water status (c)

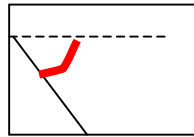


Pop. P1xP2
(tropical)
2 years
greenhouse +
chamber
 $h^2 = 0.7 - 0.8$

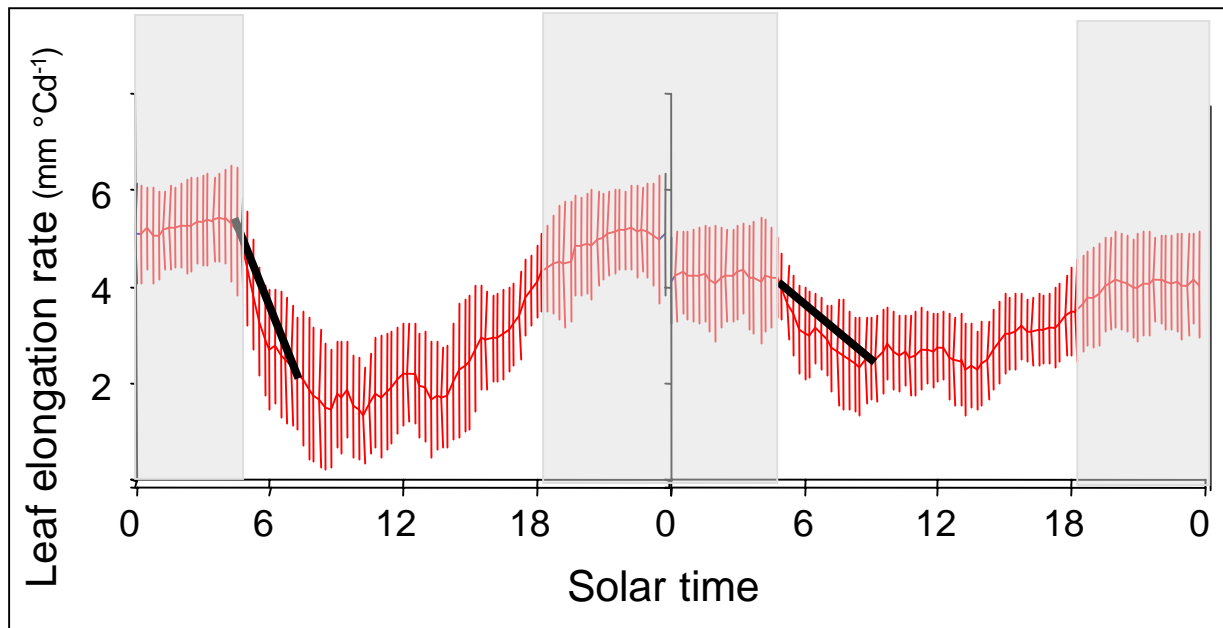
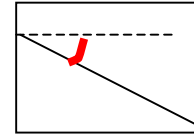
QTLs of responses to evaporative demand affect the rate of morning decrease in elongation rate

Alleles for response to evaporative demand :

Steep
(60 time courses)



Flat
(59 time courses)



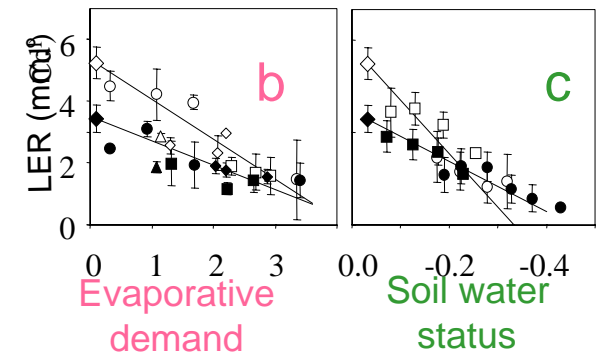
W. Sadok)

Common QTLs in 3 mapping populations : 7 "hot" zones

7 loci tested in 3 populations of insertion lines :

- CML 444 in F252
- Gaspé in B73 (Tuberosa)
- Biogemma lines

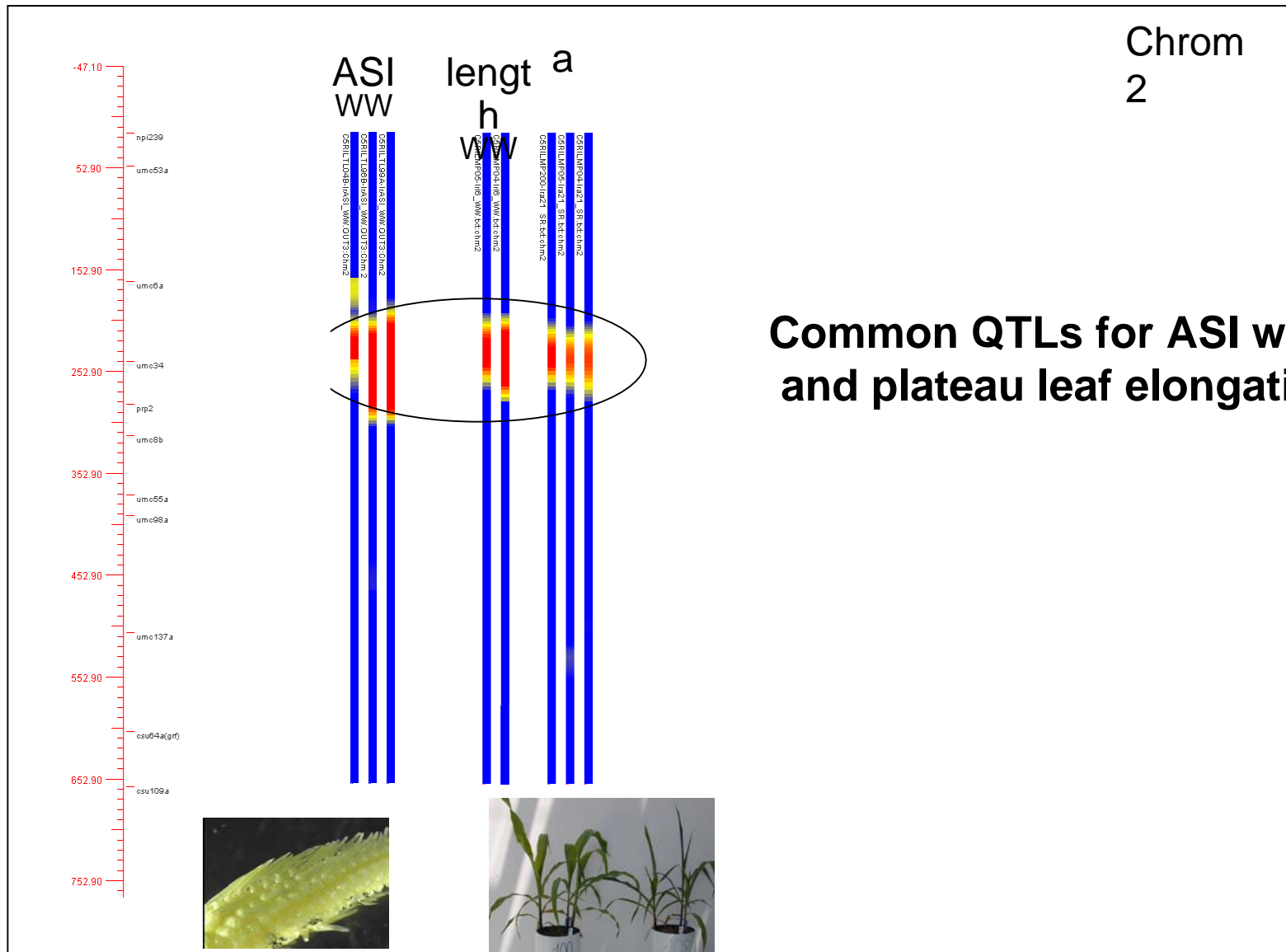
QTL	why?	evaporative demand	water deficit
<i>slr1</i>	b	*	*
<i>slr2</i>	c		*
<i>slr3</i>	b	* *	*
<i>slr4</i>	b,c	*	* * *
<i>slr5</i>	b,c	*	*
<i>slr6</i>	b,c	*	*
<i>slr7</i>	c	*	*



C. Welcker

- Zones are now reasonably sure
- Allelic effect are common to evaporative demand and soil water status.

Applicable to silks ?



Chrom
2

**Common QTLs for ASI well water
and plateau leaf elongation rate**

ASI : 3 experiments
in the field

Leaves :
model parameters

*Welcker et al. 2007
J. Exp Bot*

1 Modelling the GxE interaction : "mechanistic" or "phenotypic" models ?

We should look for mechanistic BUT

- we are not sure of mechanisms (best bets change...)*
- if parameters are analysed genetically, should be independent and of reduced number...*

"Phenotypic" models more efficient and allow a posteriori mechanistic analyses

Need more phenotyping effort :

"identity card" with phenotyping platforms

2 Rapid responses and hydraulic processes predominant ?

3 How does it translate to whole plant and yield (Karine)

Model of maize leaf elongation rate

C. Welcker

M. Reymond

Ph. Naudin

B. Boussuge

W. Sadok

N. Hilgert (Montpellier)

QTL analysis

The same +

A Charcosset

(INRA-Le Moulon)

JM Ribaut (Cimmyt)

Hydraulics

O. Bouchabke

Th Simonneau

C. Ehlert

Ch Maurel (Montpellier)

ABA and growth

E. Redondo (Biogemma)

F. Chaumont (Louvain)

B. Parent

Silk elongation rate

O. Turc

A. Fuad-Hassan

Whole plant modelling

K. Chenu

G. Hammer U. Queensland

S. Chapman CSIRO

