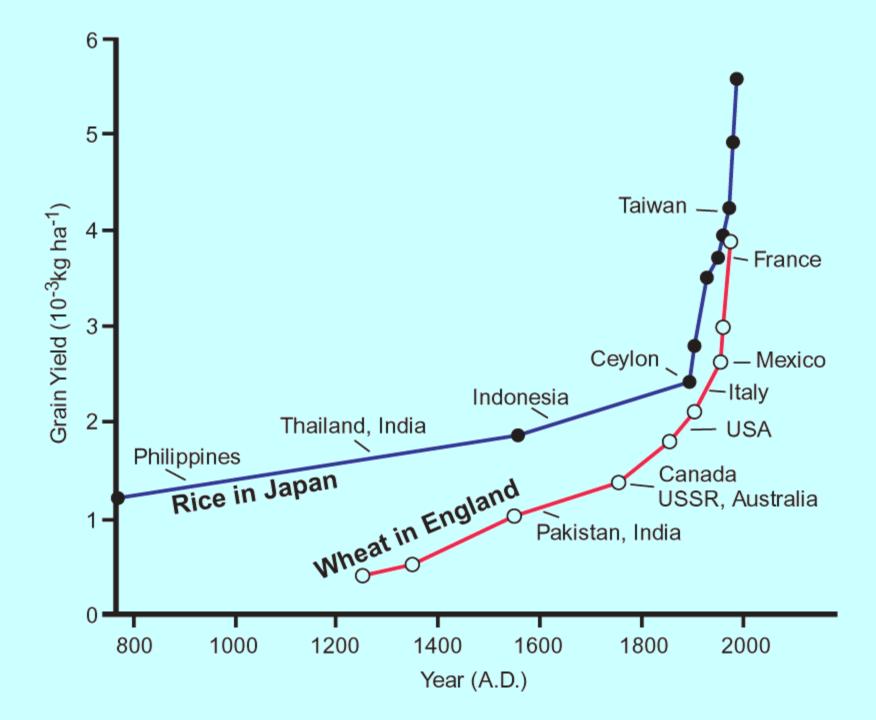
### Sugarcane Biology, Yield, and Potential for Improvement

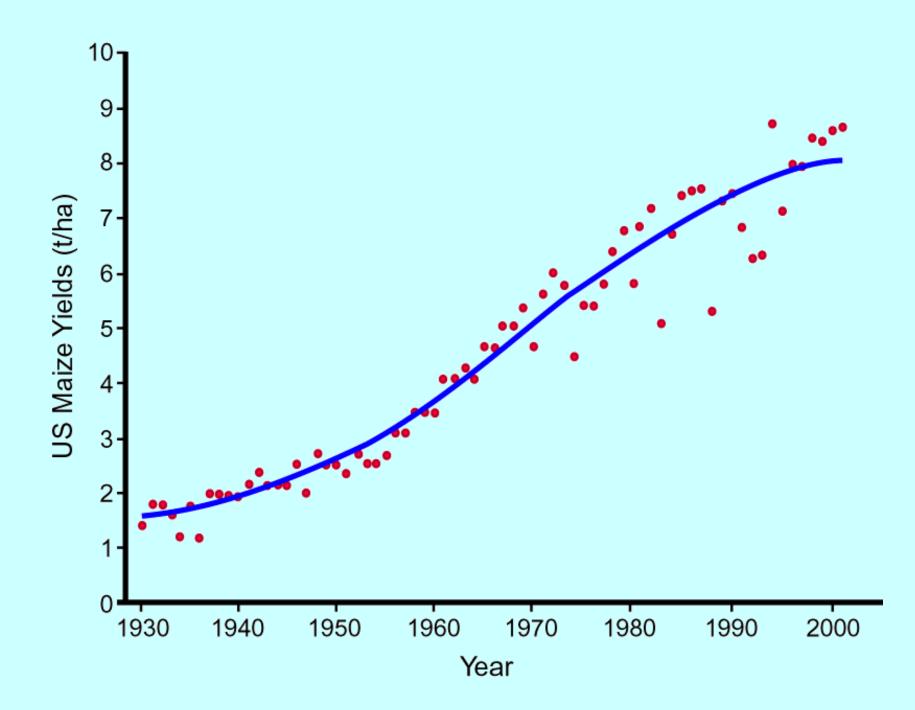
Paul H. Moore

USDA, ARS, US Pacific Basin Agriculture Research Center (retired) Hawaii Agriculture Research Center (current) Kunia, HI USA

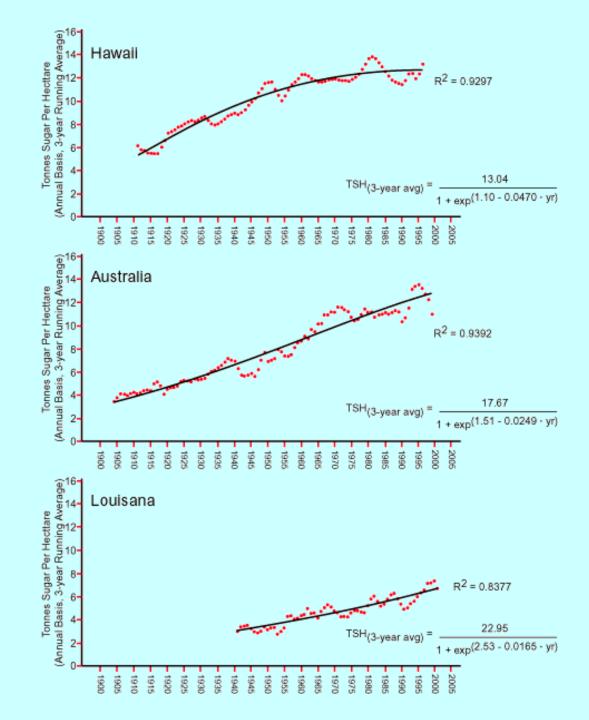
## Outline

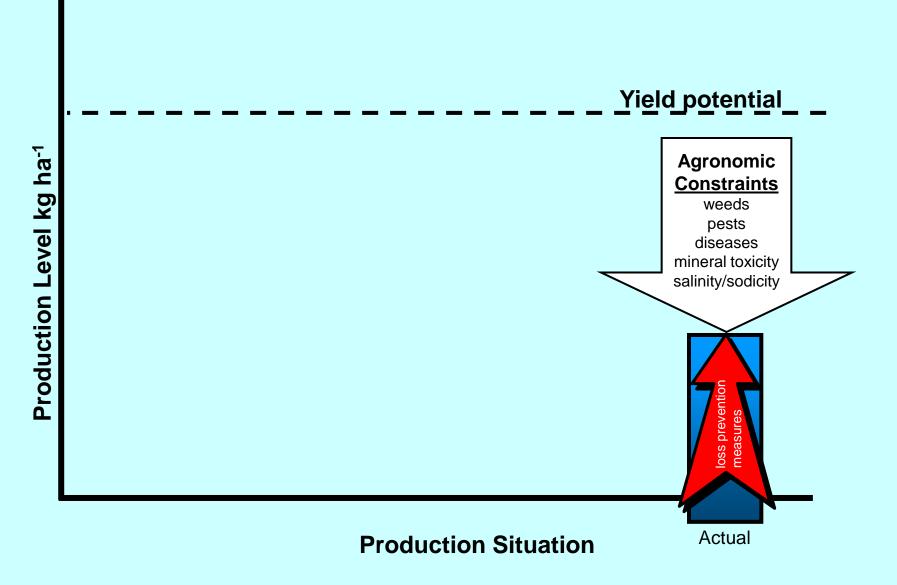
- Crop Yields
- Crop Physiology
- Systems Biology
- Modeling Growth and Production
- Putting it all together: gene-to-phenotype
- Potential Thrusts





#### Tonnes Sugar Per Hectare For Hawaii, Australia, And Louisiana



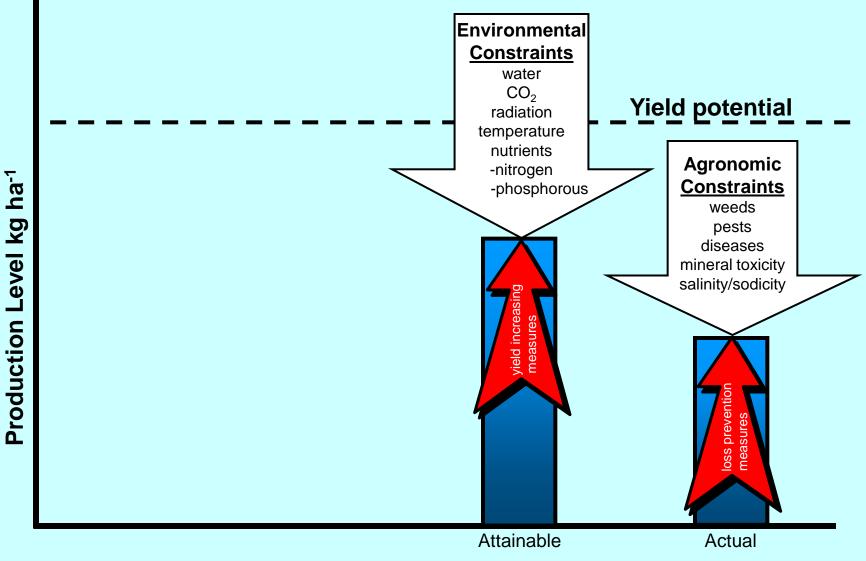


Record yields, average yields, and yield losses due to diseases, insects, and unfavorable physicochemical environments for major U.S. crops.

(Values in kg per ha)

Crop	Record yield	Average yield	Average losses			
			Diseases Insects Unfavorable environment*			
					Weeds	Other
Corn	19,300	4,600	750	691	511	12,700
Wheat	14,500	1,880	336	134	256	11,900
Soybeans	7,390	1,610	269	67	330	5,120
Sorghum	20,100	2,830	314	314	423	16,200
Oats	10,600	1,720	465	107	352	7,960
Barley	11,400	2,050	377	108	280	8,590
Potatoes	94,100	28,300	8,000	5,900	875	50,900
Sugar beets	121,000	42,600	6,700	6,700	3,700	61,300
Mean % of red	cord	21.6	4.1 2.6 2.6 6		69.1	

\* Calculated as: Record yield – (average yield + disease loss + insect loss) Boyer, J.S. **Science** 218:443-448. 1982

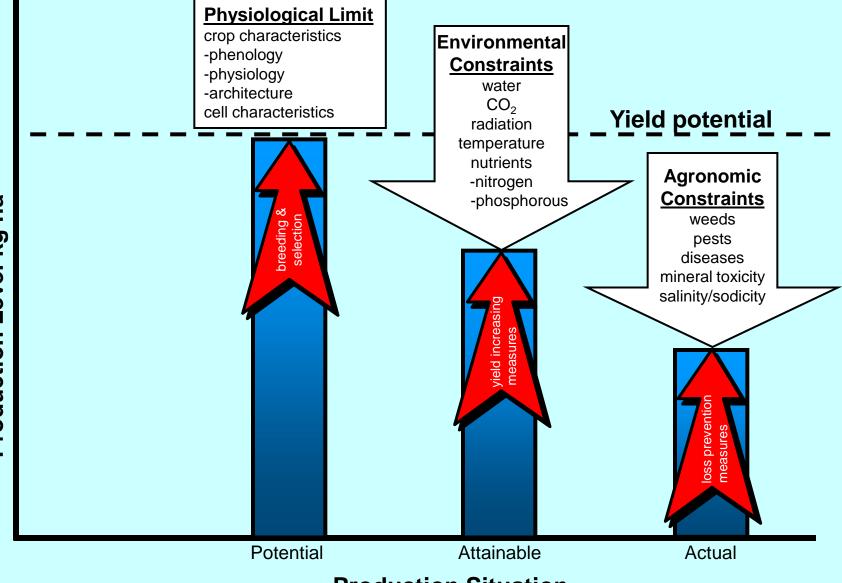


**Production Situation** 

#### Average and maximum sugarcane yields and the equivalent total dry matter production

Type (Australia,	Cane yield	Biomass*		
Colombia, South Africa)	(t ha <sup>-1</sup> yr <sup>-1</sup> )	(t ha <sup>-1</sup> yr <sup>-1</sup> )	(g m <sup>-2</sup> d <sup>-1</sup> )	
Average	84	39	10.7	
Commercial maximum	148	69	18.8	
Experimental maximum	212	98	27.0	

\* Cane yield was converted to biomass dry matter by first calculating stalk dry wt (t cane ha<sup>-1</sup> yr<sup>-1</sup> x 0.30) then add the proportion of trash dry wt [0.65 (stalk dry wt)] as calculated from Thompson 1978 modified from Irvine 1983



**Production Situation** 

## YIELD POTENTIAL (Yp)

 "the yield of a cultivar when grown in environments to which it is adapted, with nutrients and water non-limiting, and with pests, diseases, weeds, lodging and other stresses effectively controlled" (Evans and Fisher 1999)

### • Yp = η·Pn

- **Pn** = the primary production (i.e. the total plant biomass produced over the growing season)
- **n** = the harvest index or efficiency with which biomass is partitioned into the harvested product

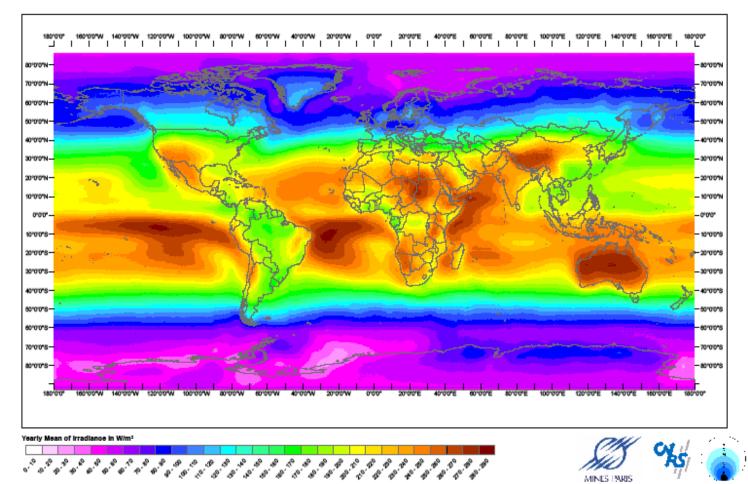
### Primary production (Pn)

•  $Pn = St \cdot \epsilon i \cdot \epsilon c/k$ 

- Where:
- St = annual integral of incident solar radiation (MJ m-2)
- *εi* = efficiency of light capture
- $\varepsilon c = efficiency of conversion of captured light$
- k = energy content of the plant mass (~17.5 MJ kg-1)

Theoretical yield calculations (Monteith 1977)

#### Averaged Solar Radiation 1990-2004

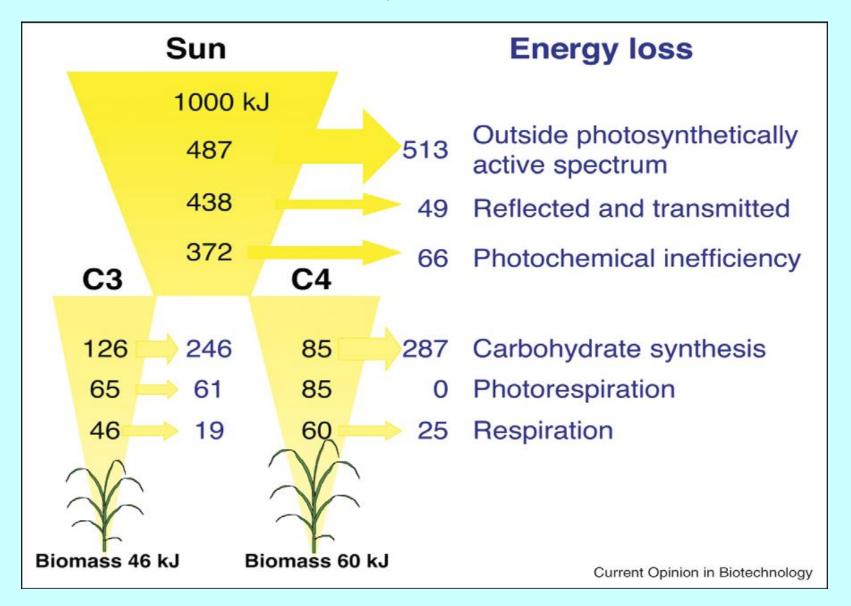


Realized by Michel Albuisson, Mirelle Lefèvre, Lucien Wald. Edited and produced by Thierry Ranchin. Date of production: 23 November 2006. Centre for Energy and Processes, Ecole des Mines de Paris / Armines / CNR8. Copyright Ecole des Mines de Paris / Armines 2006. All rights reserved.

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#### Minimum energy losses in the plant photosynthetic process from light interception to formation of chemical energy stored in the biomass

Zhu et al. Curr Opin Biotech 19:153-159. 2008



### **Theoretical Maximum Yield**

- Annual Mean Daily Irradiance in Sugarcane Production Areas
   230 W m<sup>-2</sup> = 19.872 MJ m<sup>-2</sup> = 198,720 MJ ha<sup>-1</sup> d<sup>-1</sup>
- Theoretical daily energy stored in biomass of C4 plants (.06)
   198,720 MJ ha<sup>-1</sup> (.06) = 11,923 MJ ha<sup>-1</sup> d<sup>-1</sup>
- Energy content of plant mass (~17.5 MJ kg<sup>-1</sup>) carbohydrate biomass (~15.9 MJ kg<sup>-1</sup>)

### **Theoretical Maximum Yield**

- Theoretical biomass produced 11,923 MJ ha<sup>-1</sup> (15.9 MJ kg<sup>-1</sup>) = 749.87kg ha<sup>-1</sup> d<sup>-1</sup>

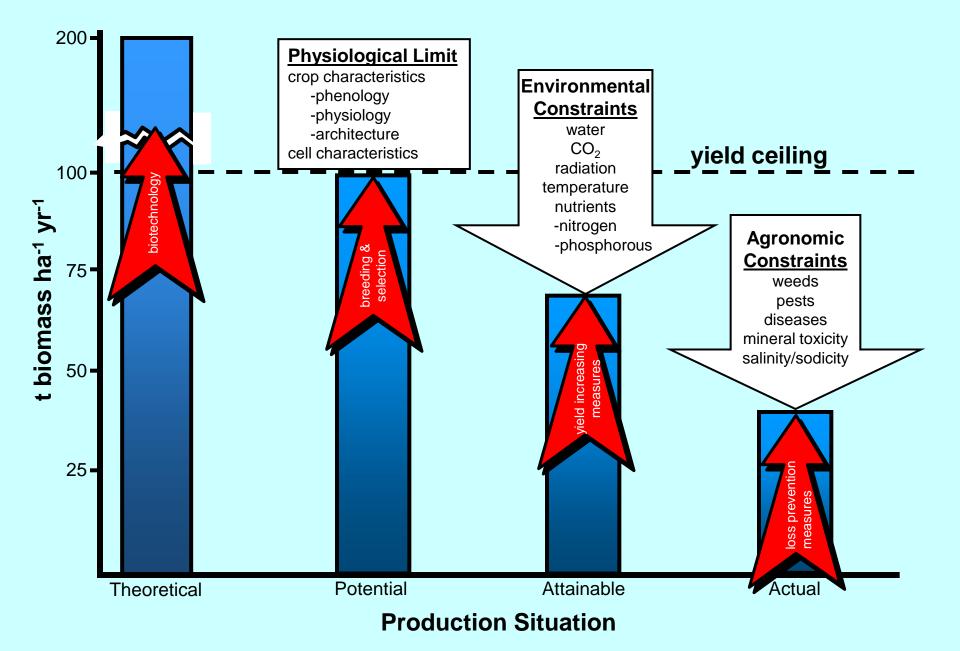
= 0.750 t ha<sup>-1</sup> d<sup>-1</sup> = **273.70 t ha<sup>-1</sup> yr<sup>-1</sup>** 

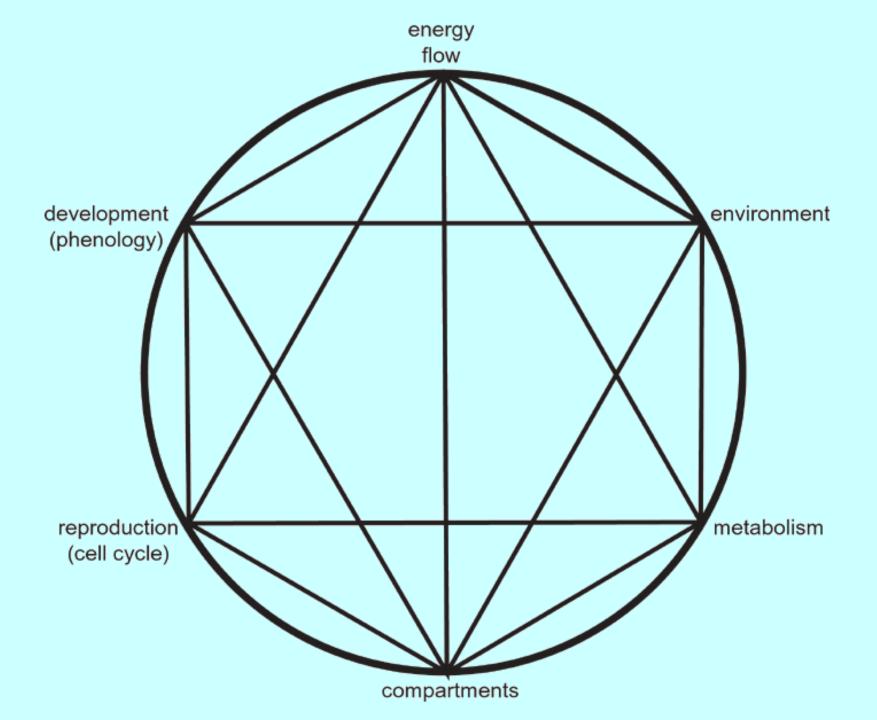
### Yp = η·Pn

**η** = the harvest index = 0.8 0.8 (273.70)=**218.9 t ha**<sup>-1</sup> **yr**<sup>-1</sup>

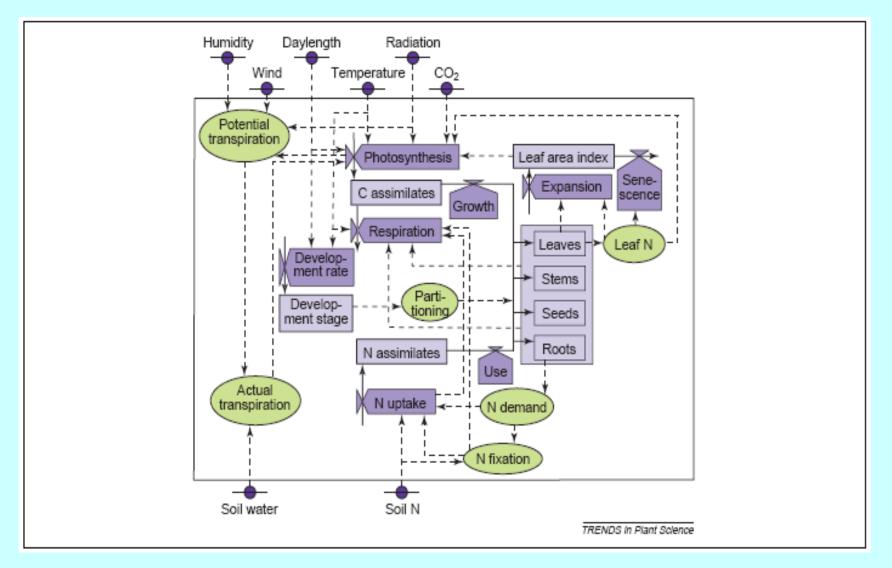
# Average, maximum and theoretical sugarcane yields and total dry matter production

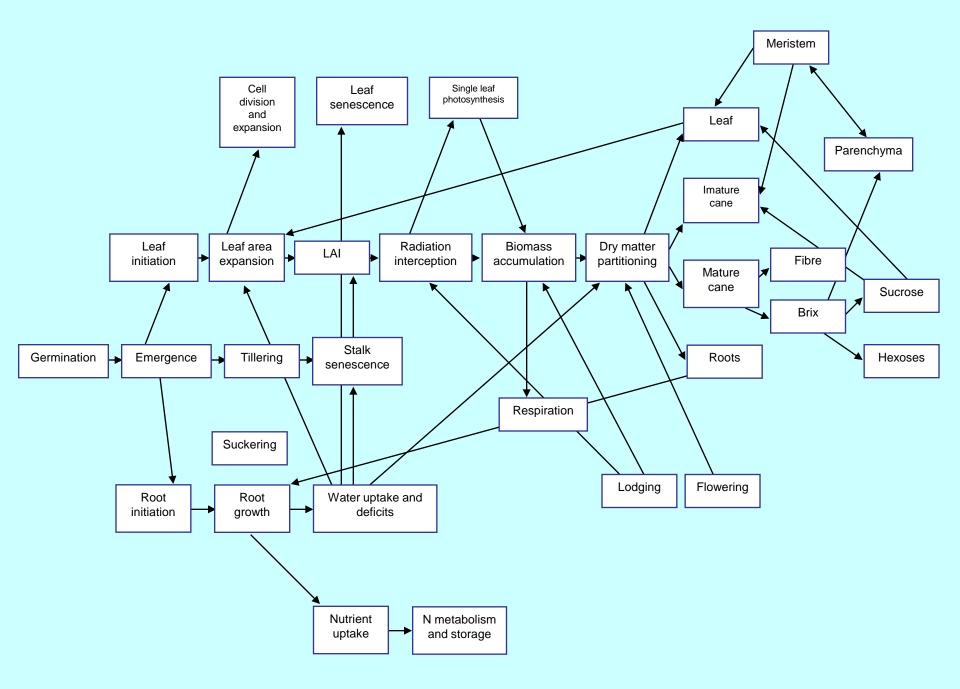
Type (Australia, Colombia, South Africa)	Cane yield	Biomass*			
	(t ha <sup>-1</sup> yr <sup>-1</sup> )	(t ha <sup>-1</sup> yr <sup>-1</sup> )	(g m <sup>-2</sup> d <sup>-1</sup> )		
Average	84	39	10.7		
Commercial maximum	148	69	18.8		
Experimental maximum	212	98	27.0		
Theoretical maximum	472	219	72.4		

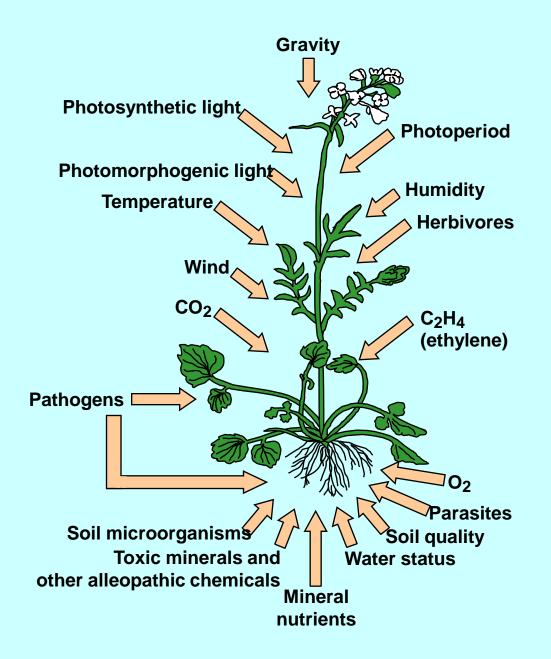




# Conceptual crop physiology model with environmental inputs and state and rate variables

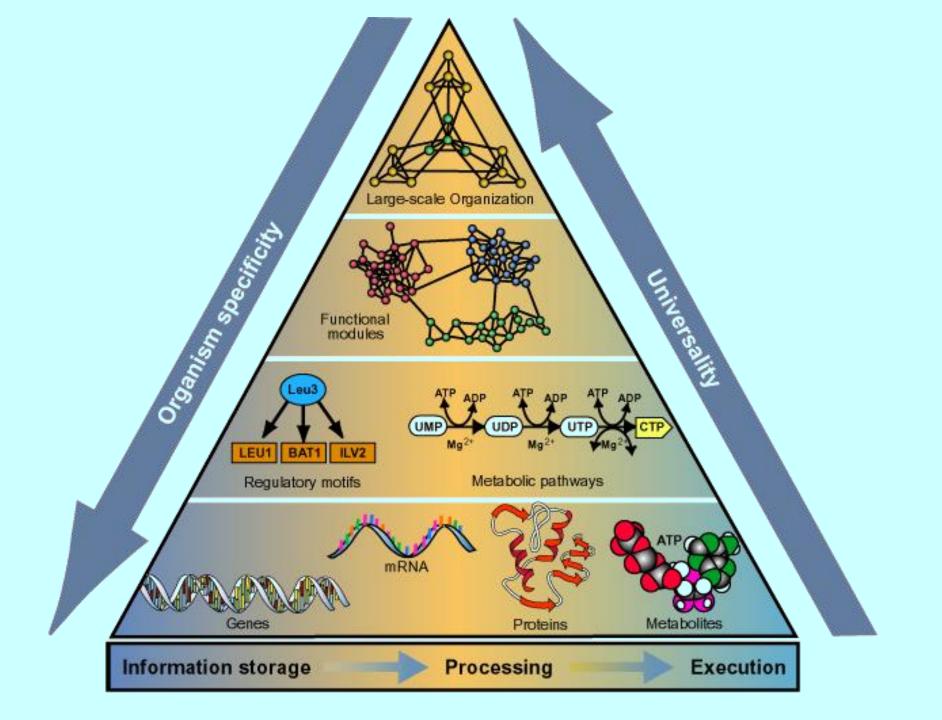






### Systems Biology

 Defined as the study of the interactions of key elements such as DNA, RNA, proteins, and cells with respect to one another and the integration of information through modeling of extensive data sets that are scale free

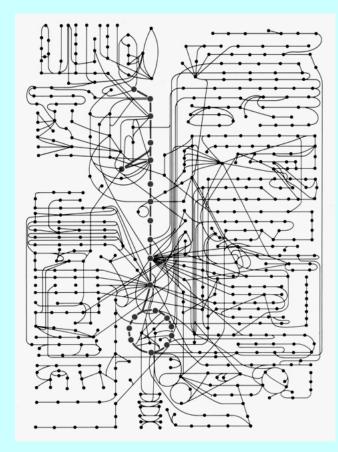


#### Biology in the ERA of ..... <u>'OMICS</u>

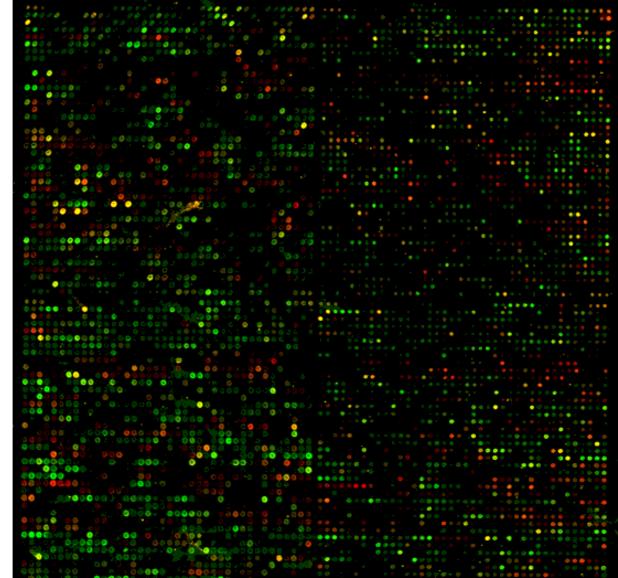
Genomics (DNA)

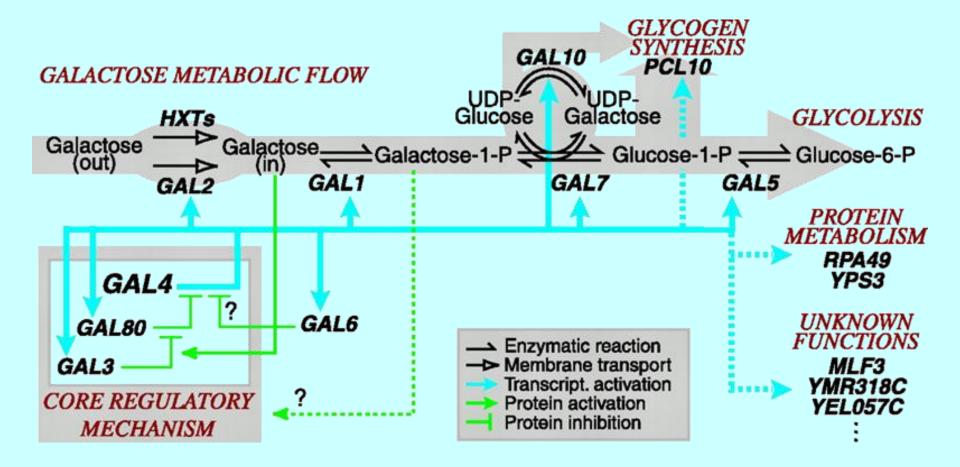
#### Post genomics

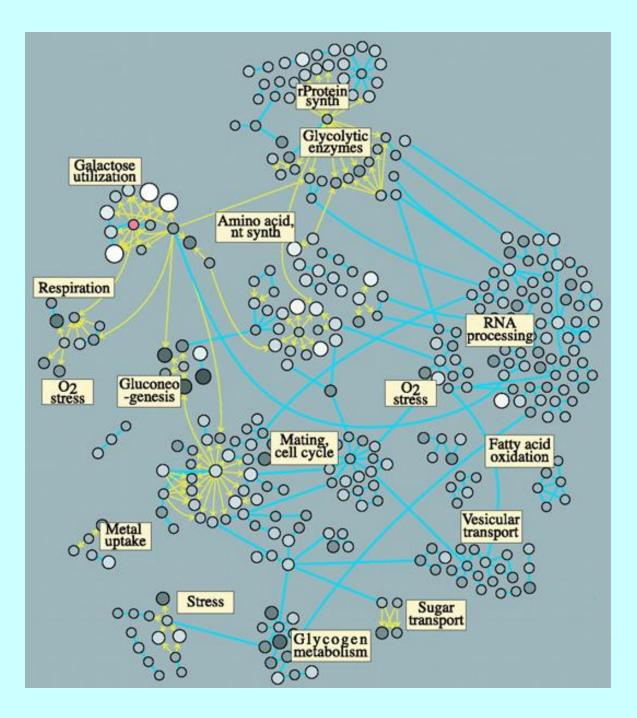
- transcriptomics = gene expression analyses (RNA)
- proteomics = protein analyses (protein)
- metabolomics = (metabolites)



The complete S. cerevisiae genome on a microarray chip hybridised to RNA from cultures in anaerobic and aerobic stationary phase



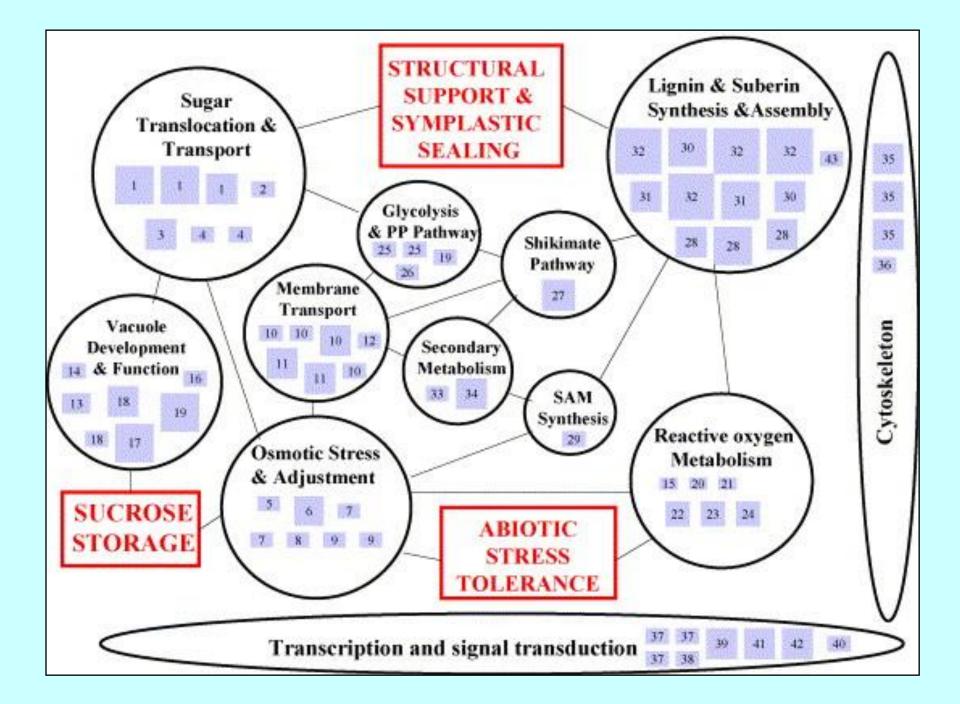




#### Functional grouping and ranking (by abundance in the collections) of maturing cane stem (MCS) and young cane stem (YCS) ESTs

Casu et al. Plant Mol Biol 54:503-517 (2004)

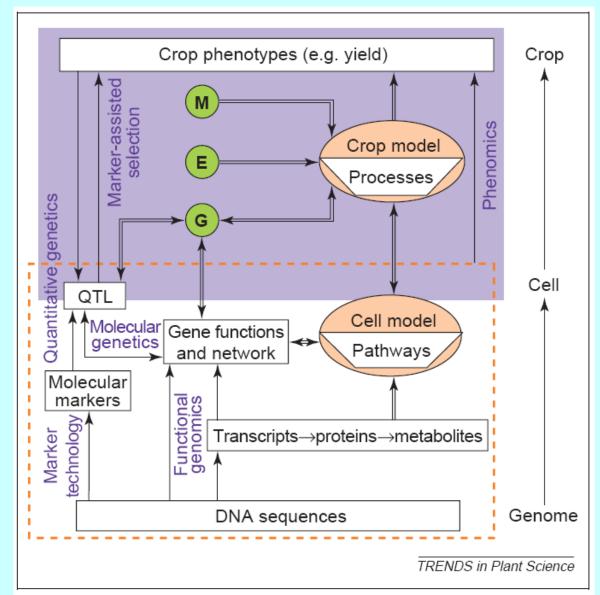
Functional grouping	Number in MCS	% in MC	Rank for MC	Number in YCS	% in YC	Rank for YCS
Protein synthesis and processing	836	22.0	1	175	26.2	1
Primary metabolism	<i>753</i>	19.8	2	109	16.3	2
Gene expression and RNA metabolism	369	9.7	3	54	8.1	4
Signal transduction	336	8.8	4	43	6.4	6
Membrane transport	290	7.6	5	49	7.3	5
<b>Defence</b> /stress-related proteins	238	6.3	6	38	4.6	8
Carbohydrate metabolism	180	4.7	7	27	4.0	9
Fibre biosynthesis and degradation	167	4.4	9	1	0.1	16
Chromatin and DNA metabolism	163	4.3	10	62	9.3	3
Cytoskeleton	95	2.5	11	23	3.4	10
Vesicular trafficking, protein sorting and secretion	91	2.4	12	13	1.9	13
ATP synthesis/electron transport	37	1.0	13	14	2.1	12
Cell wall structure or metabolism	34	0.9	14	15	2.2	11
Cell division cycle	25	0.7	15	3	0.4	15
Secondary and hormone metabolism	17	0.4	16	8	1.2	14
Miscellaneous	174	4.5	8	41	6.1	7



# Model based approach for predicting crop performance

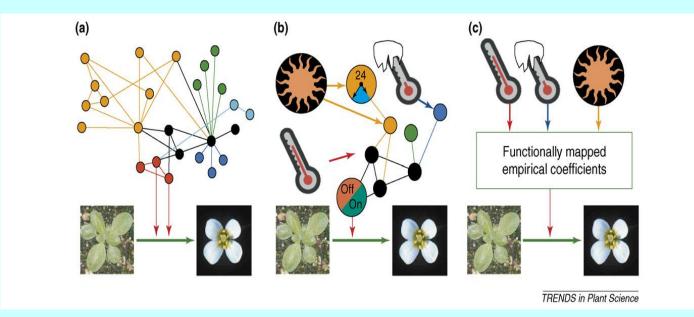
- Create a crop model that predicts complex traits based on relations between elementary processes and environmental variables
- Evaluate capability of model to predict the complex trait across a wide range of GXE combinations
- Identify QTL for model-input traits using a genetic QTL approach
- Develop a QTL-based model by replacing original model input traits with QTL-based inputs
- Validate the QTL-based model across environments

#### Integration of genomics into crop physiology for crop improvement

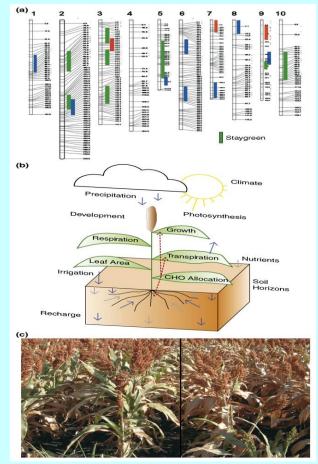


#### Modeling transition to flowering in Arabidopsis

(a) genetic network control
(b) gene network with environmental drivers
(c) empirical photothermal model for prediction



#### Multi-trait gene-to-phenotype modeling



- (a) map of QTLs regulating adaptive traits
  - (b) crop process model
  - (c) contrasting phenotypes

Hammer et al. 2006

#### Flowering, Cane and Sugar Yields in Response to 30 2-hr Light Breaks During Autumn Induction of Flowering

Treatment		Flowering %		Yield		
1 <sup>st</sup> Year	2 <sup>nd</sup> Year	1 <sup>st</sup> Year	2 <sup>nd</sup> Year	Cane (t ha <sup>-1</sup> )	Sugar (t ha <sup>-1</sup> )	
	0	26.0	16 8	20.4	24.2	
0	0	36.2	16.7	304	34.3	
0	+	26.0	0.8	343	36.8	
+	0	0.0	10.3	365	41.8	
+	+	0.3	0.8	349	40.0	
				25.7	3.46	

Ewa test 1951, cv. H37-1933

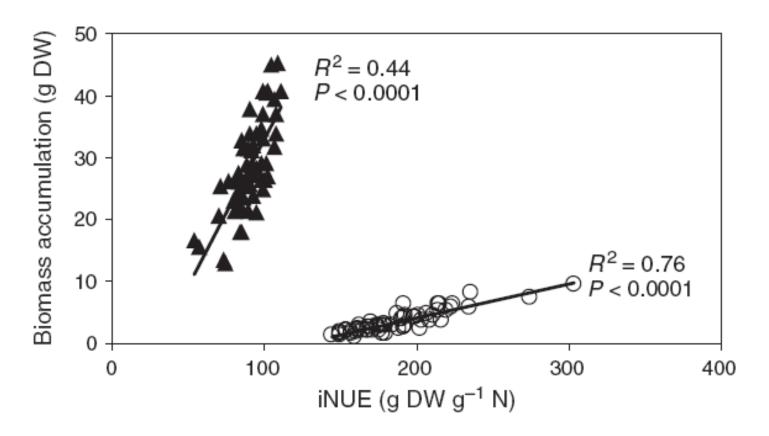
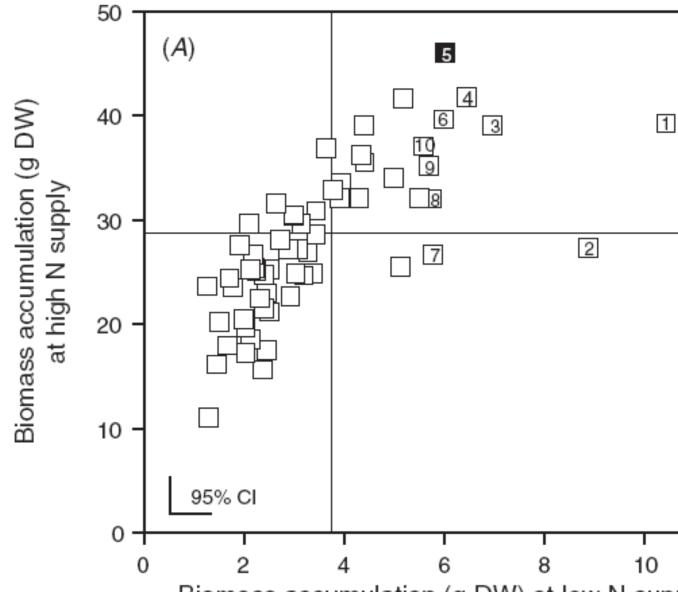


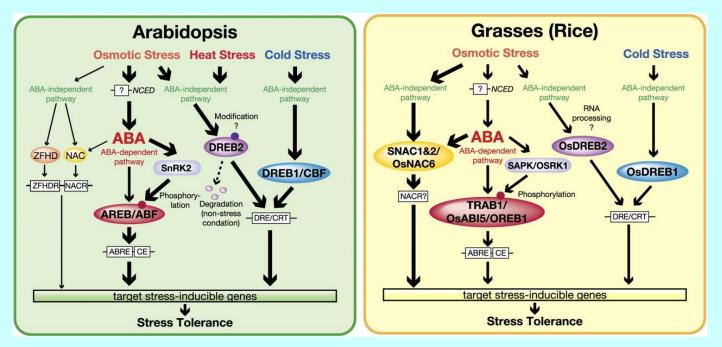
Fig. 3. Relationship between total plant biomass (gDW) and internal nitrogen use efficiency (iNUE, gDW g<sup>-1</sup> N) for 61 genotypes of sugarcane at low (circles) and high (triangles) N supply. Regression equations for relationship between biomass and iNUE are y=0.47x+14.26 (high N supply) and y=0.05x+6.72 (low N supply).



Biomass accumulation (g DW) at low N supply

12

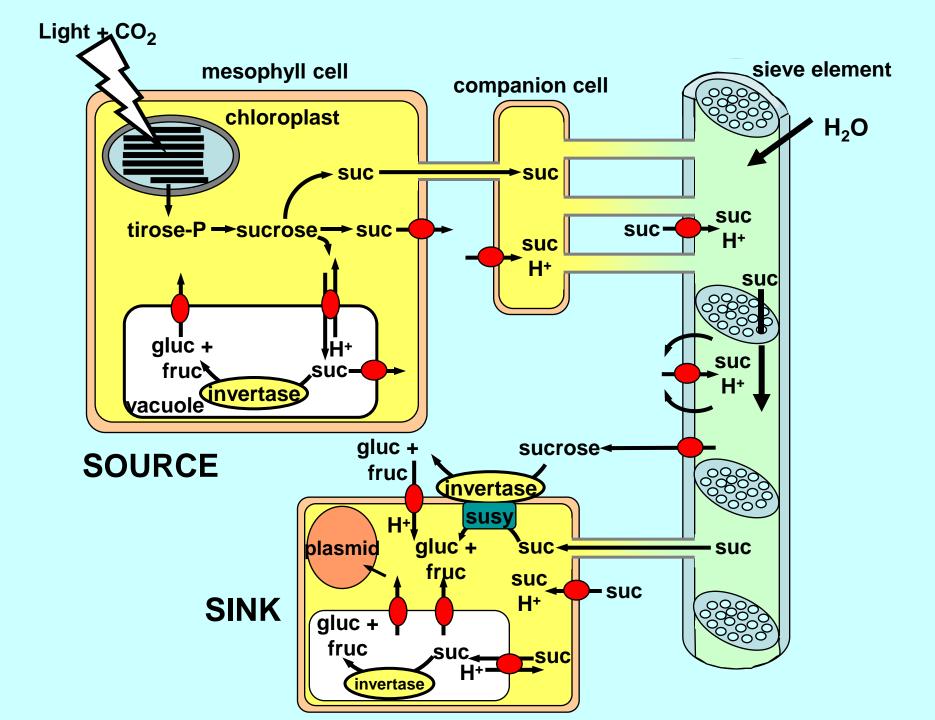
Major transcriptional regulatory networks of cis-acting elements and TFs involved in abiotic stressresponsive gene expression in Arabidopsis and grasses such as rice



Nakashima, K., et al. Plant Physiol. 2009;149:88-95



Copyright ©2009 American Society of Plant Biologists



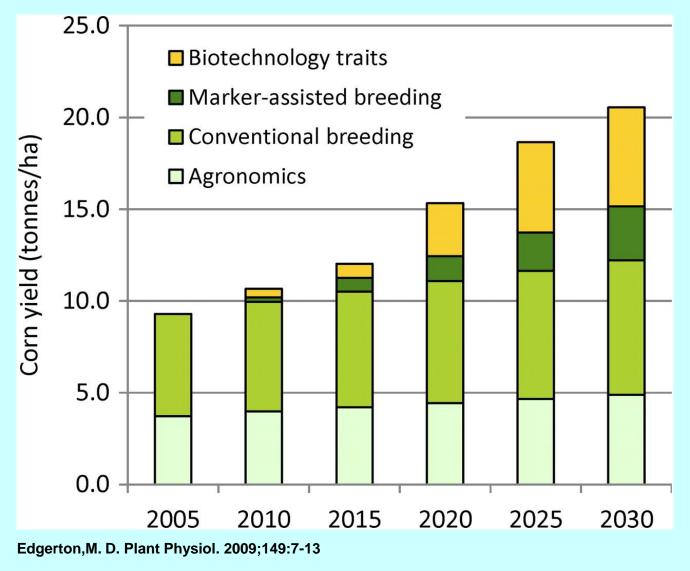
### Conclusions

Sugarcane yields may be increased locally through increasing management inputs and using traditional genetic approaches.

The sugarcane yield ceiling will **<u>not</u>** likely be broken by:

- increasing management inputs (fertilizer, water, pesticides, growth regulators)
- traditional genetic approaches to optimize resistance to pests & diseases, improve sucrose storage, optimize development, etc.

#### Anticipated impact of improvements in agronomics, breeding, and biotechnology on average corn yields in the United States





## Conclusions

(continued)

- The sugarcane yield ceiling <u>will likely</u> be broken by using highthroughput genomic approaches to produce large data sets that can be analyzed with <u>appropriate models</u> in a **Systems Approach** for producing knowledge to:
- produce varieties with improved physiological attributes (e.g. photosynthetic efficiency, carbon partitioning between sucrose and fiber, water use efficiency, N use efficiency, multi-gene pest and pathogen resistance). Improvements that could not be made previously because of the biological <u>system</u> complexity
- provide technologies to growers for optimum management of multigene developmental pathways, e.g. germination, tillering, lodging, flowering, ripening, lodging

#### THE FUTURE LOOKS EXCITING AND THE OUTLOOK BRIGHT