

# Opportunities in plant breeding: from the integration of genomics to the participation of farmers

Paul Gepts  
Plant Sciences  
University of California, Davis

**Morrison Lecture**  
**Annual Meeting, American Society for Horticultural Sciences**  
**Palm Desert, July 23, 2013**

## Acknowledgments

- **UC Davis:**
  - Gepts group: James Kami, Jose Vicente dos Santos, Shelby Repinski, Adriana Navarro Gomez, Tamara Miller, Sarah Dohle, Margaret Worthington,
  - Bioinformatics Core (Genome Center): Dawei Lin, Joe Fass, Nikhil Joshi, Jose Boveda, Zhi-wei Lu, Monica Britton
- **UC Santa Barbara:**
  - Daniela Soleri
- **CICY, Mérida, Mexico:** Daniel Zizumbo-Villarreal, Patricia Colunga GarcíaMarín
- **Kirkhouse Trust:**
  - **Tanzania, Uganda, Rwanda, Ethiopia**
  - **UK:** E. Southern, E. Willmore, F. Geoghegan, R. Koebner

- Kirkhouse Trust

Kirkhouse  
Trust

- USDA NIFA BeanCAP



- California Dry Bean Advisory Board and California Crop Improvement Association



- UC MEXUS



## Outline

- 1. The contributions of Benjamin Morrison
- 2. 21<sup>st</sup> century: the new biology and the role of plant breeding
- 3. Current challenges for plant breeding
- 4. Opportunities for plant breeding
  - 4.1 Analytical advance: genomics
  - 4.2 Analytical advance: GIS
  - 4.3 Analytical advance: Phenomics
  - 4.4 Availability of large collections of wild relatives and landraces
  - 4.5 Domestication studies
  - 4.6 Distributed plant breeding
- 5. Conclusion: Integrating multiple threads into one strong strand



## Benjamin Y. Morrison (1891-1966)

B.Y. Morrison was the **first director of USDA's National Arboretum** in Washington D.C. and a pioneer in horticulture.

A scientist, plant breeder, landscape architect, plant explorer, author, and lecturer, Morrison **advanced the science of botany and horticulture** in the United States.

His legacy to the American public includes dozens of new ornamental plants, including the **Glen Dale azaleas**.



## Plant Introduction Activities

### AWARDS FOR EUCALYPTUS INTRODUCTION

Seventeenth Meyer Medal for Distinguished Services in Plant Introduction  
Awarded to Dr. Edmundo Navarro de Andrade of Brazil



B. Morrison

PRESENTATION OF THE MEYER MEDAL

J Hered (1941) 32 (7): 211-214

- "It is believed by many that the most suitable species to use in **replanting** an eroded area are those which grew there formerly and still are found in the **neighboring region**, for certainly what plant would be better fitted than one found growing in the same climate?"
- "Erosion has changed the environment to stark desert conditions as far as the plant is concerned, and it can not regain a foothold. **Much harder** kinds of plants must be the pioneers."
- "They represent essentially plants that will survive **under particularly difficult conditions** and will serve to reestablish the green cover that once was everywhere. .... there is the knowledge that there must be more seed and more seedlings than would be needed under favorable conditions; and harder and tougher strains, for nature is no longer helpful."

Morrison BY (1935) Painting the hills green. The Scientific Monthly 40:173-177

5



## 21<sup>st</sup> Century: The New Biology

## NRC: A New Biology for the 21st Century (2009)

- “the essence of the New Biology is **integration** -- re-integration of the many subdisciplines of biology, and the integration into biology of physicists, chemists, computer scientists, engineers, and mathematicians to create a research community with the capacity to tackle a broad range of scientific and societal problems.”
- “... solving problems in the areas of **food, environment, energy and health ...**”



## NRC: A New Biology for the 21st Century

- “A **genome sequence** provides both a list of parts and a resource for **plant breeding** methods, but does not give the information needed to understand how each gene contributes to the formation and behavior of individual plant cells, how the cells collaborate and communicate to form tissues (such as the vascular system or the epidermis), and how the tissues function together to form the entire plant.”
- “Such **predictive** models, combined with a comprehensive approach to cataloguing and appreciating plant biodiversity and the evolutionary relationships among plants, will allow scientific **plant breeding** of a new type, in which genetic changes can be targeted in a way that will predictably result in novel crops and crops adapted to their conditions of growth.”
- “... recast the principles of **highly successful traditional plant breeding** into a new and accelerated type of plant breeding termed “**genetically informed breeding**.”
- “... application of novel engineering methods to **automatically record the relevant traits of growing plants, ...**”
- “Molecular and cellular biologists, ecologists, evolutionary biologists, and computational and physical scientists will all be needed.”

<http://www.nap.edu/catalog/12764.html>





## Multidisciplinary in plant breeding: Example of the processing tomato harvest at UC Davis



- Plant breeding and agricultural engineering
  - Tomato variety (cv. VF-145) + mechanical tomato harvester
- Tomato: Gordie “Jack” Hanna (1903-1993):
  - suitable for mechanical harvesting; less than round (“square”)
- Harvester: Coby Lorenzen & Steven Sluka, commercialized by Blackwelder, Rio Vista, CA; American Society of Agricultural and Biological Engineers’ 45th historic landmark <http://www.youtube.com/watch?v=Xg1UfcJqTss>
- Large increase in acreage and productivity; increase in labor offsetting initial reduction in menial manual labor



9



## Current Challenges for Plant Breeding

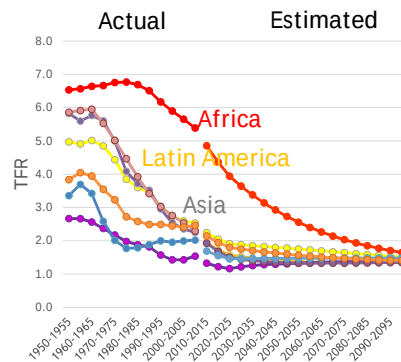
## Availability and Demand for Food are (and will be) in Disequilibrium

- Increase in population levels and affluence leads to increased and changed demand
- Climate change will lead to higher temperatures and unpredictable rainfall distribution
- Increasing demand for agricultural, non-food products

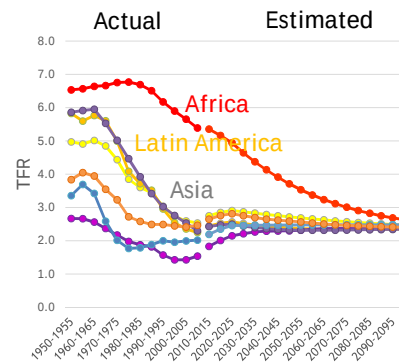


## Population parameters

Total Fertility Ratio (Low fertility option)



Total Fertility Ratio (High fertility option)

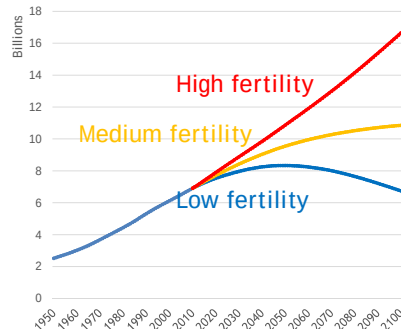


U.N.: World Population Prospects: The 2012 Revision

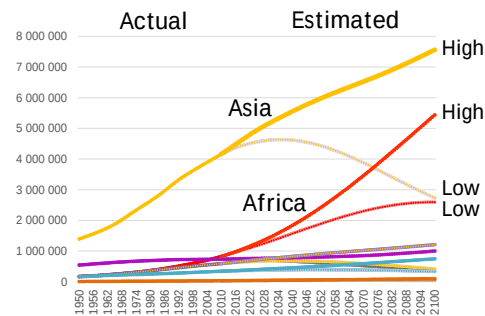


# Population parameters

Total Population



Population by Continents

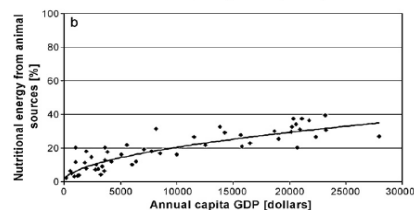
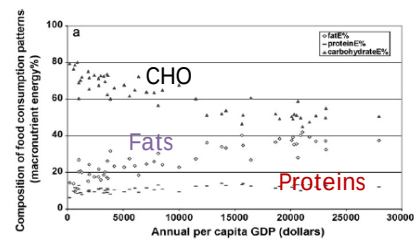
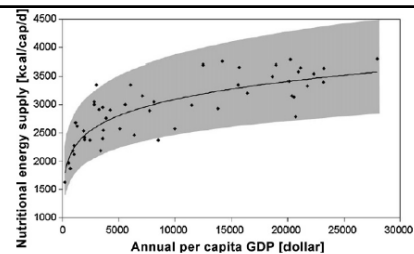


U.N.: World Population Prospects: The 2012 Revision

13

## Increase in Population Affluence & Diet Change (Gerbens-Leenes et al. 2010)

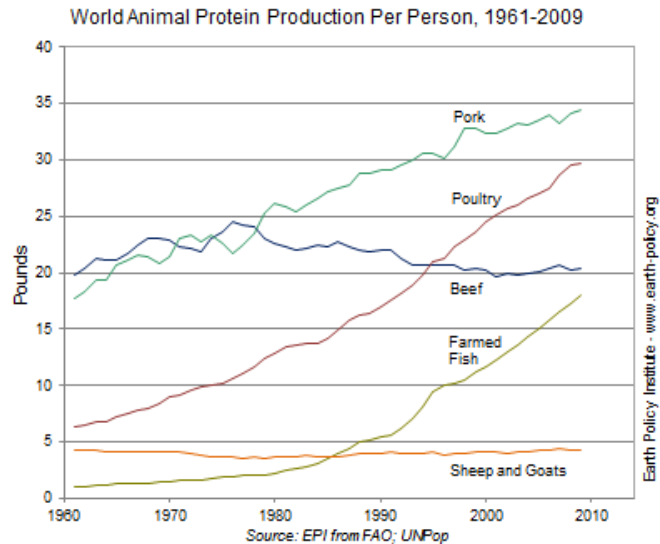
- Transition in low-income countries: low GDP per capita (< \$ 5,000)
- Eventually, change in macro-nutrient content:
  - Protein ~
  - Carbohydrates ↘
  - Fats ↗
- This represents:
  - Increase in animal consumption
  - Larger use in natural resources
- Higher ratio of supply/actual consumption



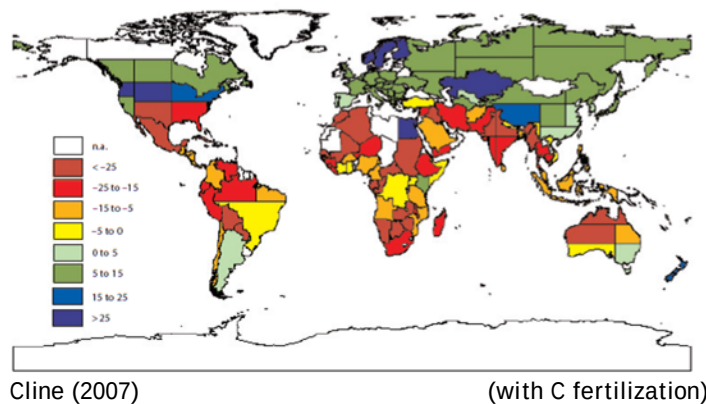
14

## Changing the Demand Side of the Food Equation: Eating less grain-intensive livestock

- Feed conversion efficiency: lbs grain/lb weight gain
  - Beef 7
  - Lamb 5
  - Pork 3.5
  - Poultry > 2
  - Eggs 2
  - Farmed salmon: 1.2-3
  - Tilapia 1.7
- Adopt a Mediterranean diet!
- Eat more legumes!



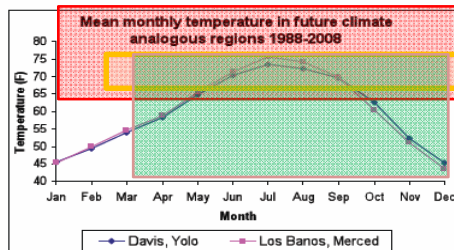
## Climate change & agricultural productivity



**Rule of thumb:** For each 1°C increase in temperature, the farmer can expect 10% reduction in grain production



## Some numbers...



### Optimum temperatures

Hot-season: melon, sweet potato: 64-95°F

Warm-season: tomato, cucumber, peppers, sweet corn: 68-77°F

Cool-season: Lettuce, broccoli, spinach: 41-77°F; legume cover crops

Lesson: Switch crops or crop mixtures

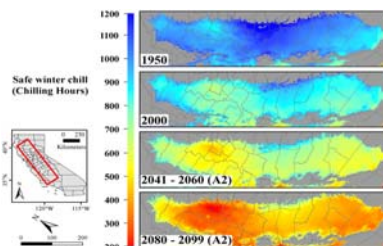
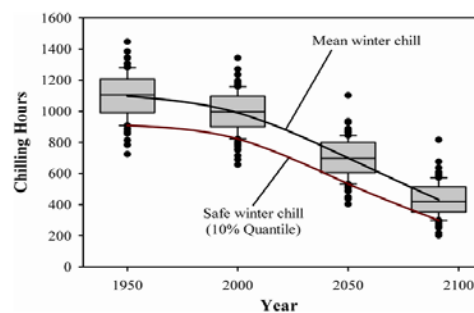
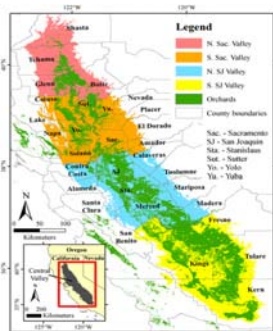
Reproductive development is particularly vulnerable:

- Pollen viability and production: maize: <77°F; rice: <95°F
- Kernel development: maize: <86°F
- Fruit trees: chilling requirement

Jackson et al. 2009

17

## Perennial Crops: Chilling



Lesson: Existing variability for adaptation traits; use it!

Luedeling et al. 2009

18

## Plants for fuels

### ■ Biofuels:

- Plant or animal biomass to produce power or heat
- Concerns about:
  - Depleting stocks of fossil fuels
  - National self-sufficiency and dependence on oil-producing states
  - Air pollution from vehicle exhausts
  - Greenhouse gas emissions

### ■ Alcohol & bio-diesel

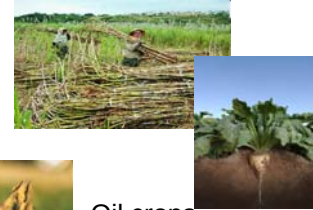
Starch crops



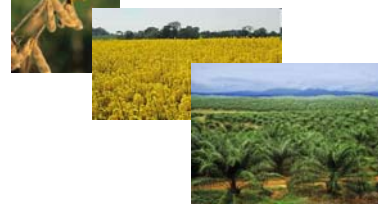
Trees, shrubs



Sugar crops



Oil crops



Forage crops



19

## Plant breeding is fashionable again!

- Plant breeding as a delivery channel for new technologies
- In the U.S.:
  - National Association of Plant Breeders
  - Attracts undergraduate and graduate students
  - Attracted to field experimentation
- Worldwide: e.g., Brazilian Society of Plant Breeding (SBMP)
- IAASTD: International Assessment of Agricultural Science and Technology for Development (<http://www.agassessment.org/>):
  - Plant breeding and Agroecology
  - Socio-economic and policy factors
  - Agriculture as provider of food security, but also economic security, ecosystem services, and landscape values.
  - Equivalent to IPCC for agriculture and development



20



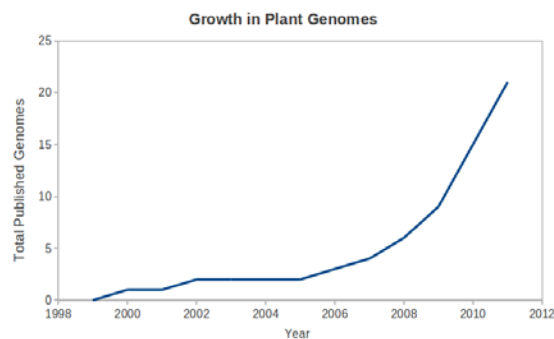
## Opportunities for Plant Breeding

The Future is Here!

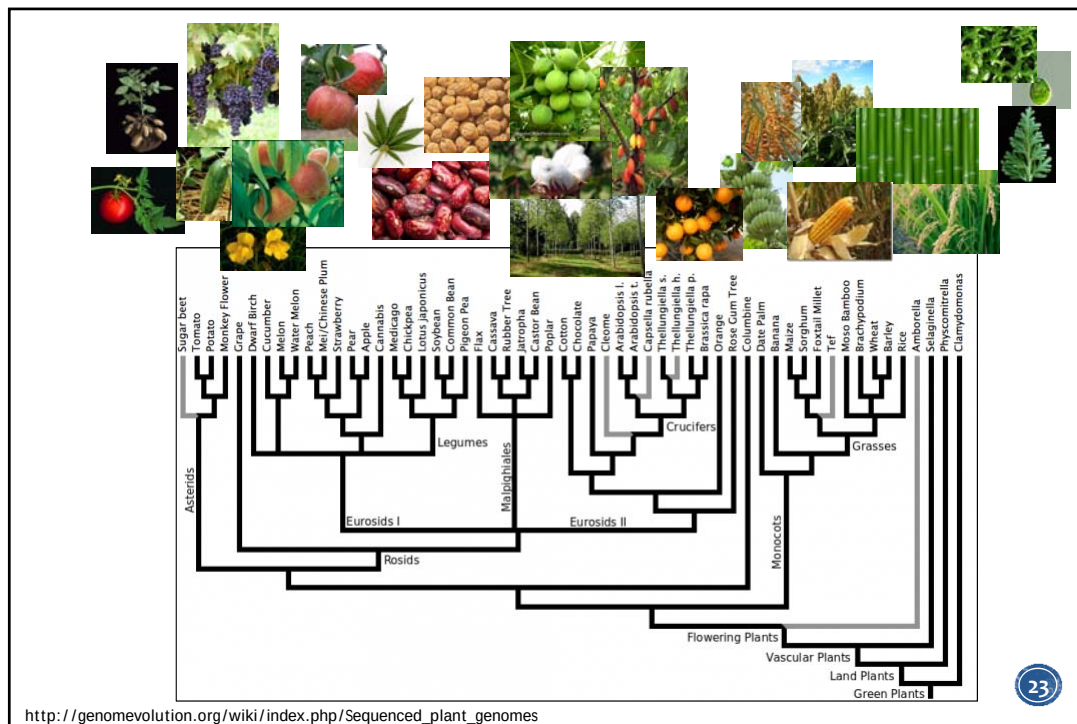
1

### New analytical tools: Genomics

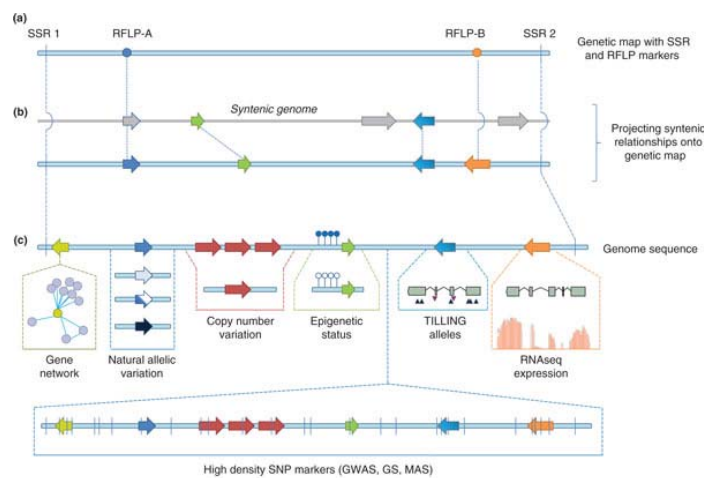
- Genomics: the study of the “entire” genome sequence and “all” genes, RNA products, protein products and metabolites
- Whole-genome sequencing:
  - Sanger sequencing of BAC clones (Arabidopsis, rice) → whole-genome shotgun sequencing + high-density genetic maps & physical maps; paired-end sequences (e.g., BES); longer Illumina reads; etc.
  - Large increase in sequence information
- Expressed Sequence Tags (EST)
- Proteomics & Metabolomics



22



## Whole-genome sequencing & marker development



## What Makes a Good Marker?

➤ Simple

➤ Fast

➤ Robust

➤ Cheap

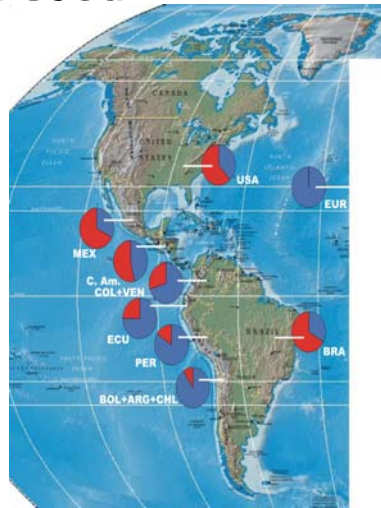
➤ Specific

➤ Co-dominant

➤ Proximity to gene

➤ Coupling

➤ Polymorphic



➤ **BOTTOM LINE:** Markers (DNA sequence) are the limiting factor for Marker-Assisted Selection because of attrition in developing new markers

Contrasting Gene Pools in Common Bean (*P. vulgaris*):

Andean vs. Mesoamerican

Co-evolution with Pathogens

25

**PHASEOLUSGENES**  
Bean Breeder's Molecular Marker Toolbox

[ABOUT/METHODS](#)
[GENOME BROWSER](#)
[CMAP](#)
[DOWNLOAD](#)

## PhaseolusGenes

PhaseolusGenes is a web resource for identifying and exploring markers, quantitative-trait loci (QTL), and simple sequence repeat (SSR) region information for *Phaseolus vulgaris*. Use this database to find marker information and explore them through the associated UCSC Genome Browser and Cmap implementations.

To use PhaseolusGenes, enter a search term to the right or click below for advanced options. You may also enter a sequence to use our online blast tool to blast a sequence against the soybean genome.

### Explore PhaseolusGenes

**Markers**  
Explore data from various traits, as well as searching sequences.

**QTL**  
Search PhaseolusGenes' QTL list by entering traits in the search box to the right. Alternately, you can see an entire list of searchable traits.

**SSR**  
We have a number of confirmed and predicted SSR regions in the database, accessible by searching to the right, or blasting suspected SSR regions against the soybean genome with our Blast Search feature.

[How to use PhaseolusGenes...](#)

### Direct Data Contributors

- Jan Brazolot & Peter Pauls, Bng markers (STS), [Guelph University](#)
- Jim Kelly, SCAR markers, [Michigan State University](#)
- Phil McClean, Samira Mafi Moghaddam, Sujan Mamidi, Juan M. Osorno, Rian Lee (North Dakota State University) and Qijian Song and Perry Cregan, [USDA-ARS, Beltsville](#)
- Phil Miklas & Richard Larsen, SCAR markers, [USDA-ARS, Prosser, WA](#)
- Thiago L. P. O. de Souza, Everaldo Gonçalves de Barros & Maurilio Moreira, SCAR markers, [Universidade Federal de Viçosa, Brasil](#)
- Kangfu Yu, SSR markers, [Agriculture Canada, Greenhouse and Processing Crops Research Centre, Ontario, Canada](#)
- Bodo Raatz, SSR markers, [Centro Internacional de Agricultura Tropical, Cali, Colombia](#)
- Phaseolus Genome Sequencing Project, funded by NIFA: co-directors Scott Jackson ([sjackson@uga.edu](mailto:sjackson@uga.edu)), Jeremy Schmutz ([jschmutz@hudsonalpha.org](mailto:jschmutz@hudsonalpha.org)), and Phil McClean ([Phillip.McClean@ndsu.edu](mailto:Phillip.McClean@ndsu.edu))

### Search markers

Learn to use PhaseolusGenes

Search term:

Search field:

Last search (1 result)

### Blast search

Sequence in simple text

Database:

Method and parameters

[bit.ly/pgenes](http://bit.ly/pgenes) or [phaseolusgenes.bioinformatics.ucdavis.edu](http://phaseolusgenes.bioinformatics.ucdavis.edu)

26



- Polymorphism is crucial:
  - Four-parent cross: need to distinguish source of resistance from all three other parents
  - High level of attrition of markers → the more markers, the better

UCSC Genome Browser on *P. vulgaris* Andean-G19833 Assembly (phaVu11)

move <<< << < > >> >>> zoom in 1.5x 3x 10x base zoom out 1.5x 3x 10x

Chr08:58,188,942-58,888,941 700,000 bp.  go

Scale: 50,000,000 50,400,000 50,800,000 51,200,000 51,600,000 52,000,000 52,400,000 52,800,000 53,200,000

chr08:58,188,942-58,888,941 phaVu11

User Supplied Track

OSU\_INDO\_8\_58\_2153 NDSU\_INDO\_8\_58\_3756 NDSU\_INDO\_8\_58\_5193 NDSU\_INDO\_8\_58\_6694 NDSU\_INDO\_8\_58\_8559

OSU\_INDO\_8\_58\_2267 NDSU\_INDO\_8\_58\_3835 NDSU\_INDO\_8\_58\_6652 NDSU\_INDO\_8\_58\_7328 NDSU\_INDO\_8\_58\_8534

OSU\_INDO\_8\_58\_2349 NDSU\_INDO\_8\_58\_4415 NDSU\_INDO\_8\_58\_6668 NDSU\_INDO\_8\_58\_6676 NDSU\_INDO\_8\_58\_6783

OSU\_INDO\_8\_58\_2446 NDSU\_INDO\_8\_58\_4295 NDSU\_INDO\_8\_58\_6694 NDSU\_INDO\_8\_58\_6668 NDSU\_INDO\_8\_58\_6676

OSU\_INDO\_8\_58\_2555 NDSU\_INDO\_8\_58\_4541 NDSU\_INDO\_8\_58\_6694 NDSU\_INDO\_8\_58\_6668 NDSU\_INDO\_8\_58\_6676

r\_markers\_from\_pg

s\_markers\_from\_pg

u\_markers\_from\_pg

Scan Markers from Phaseus Genes

SSR Markers from Phaseus Genes

STS Markers from Phaseus Genes

14



## Examples of Synteny Utilization & Marker Discovery

Theor Appl Genet  
DOI 10.1007/s00122-010-1496-1

**ORIGINAL PAPER**

**Linkage mapping of the *Phg-1* and *Co-1<sup>d</sup>* genes for resistance to angular leaf spot and anthracnose in the common bean cultivar AND 277**

Maria Cdeste Gonçalves-Vidigal · Anelise S. Cruz · Alexandre Garcia · J. Kami · Pedro S. Vidigal Filho · Lorena L. Sousa · P. McClellan · P. Gepts · M. A. Pastor-Corrales

Theor Appl Genet  
DOI 10.1007/s00122-013-2131-8

**ORIGINAL PAPER**

**Co-segregation analysis and mapping of the anthracnose *Co-10* and angular leaf spot *Phg-ON* disease-resistance genes in the common bean cultivar Ouro Negro**

M. C. Gonçalves-Vidigal · A. S. Cruz · G. F. Lacanallo · P. S. Vidigal Filho · L. L. Sousa · C. M. N. A. Pacheco · P. McClellan · P. Gepts · M. A. Pastor-Corrales

**Genetic Characterization and Molecular Mapping *Pse-2* Gene for Resistance to Halo Blight in Common Bean**

Phillip N. Miklas · Deirdré Fourie, Jennifer Trapp, Richard C. Larsen, Carolina Chavaro, Matthew W. Blair, and Paul Gepts

Journal of Heredity 2013 104(2):277–286  
doi:10.1093/heredity/102  
Advance Access publication December 12, 2012

© The American Genetic Association, 2012. All rights reserved.  
For permissions, please email: journals.permissions@oup.com.

**Identification and Characterization of a Homologue to the *Arabidopsis* *INDEHISCENT* Gene in Common Bean**

TANIA GIOIA, GIUSEPPINA LOGOZZO, JAMES KAPL, PERLUIGI SINGHOLETTI ZEILL AND PAUL GEPTS

Theor Appl Genet (2011) 125:1341–1357  
DOI 10.1007/s00122-011-1671-z

**ORIGINAL PAPER**

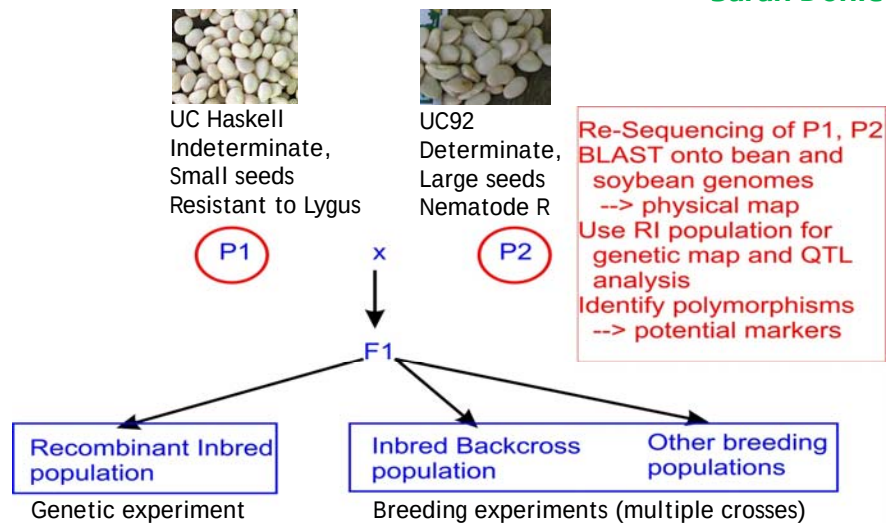
**Nucleotide diversity of a genomic sequence similar to *SHATTERPROOF* (*PvSHPI*) in domesticated and wild common bean (*Phaseolus vulgaris* L.)**

L. Nanni · E. Bitocchi · E. Bellucci · M. Rossi · D. Rau · G. Attene · P. Gepts · R. Papa



## Population-specific Genomics in Plant Breeding & Genotyping by Sequencing: Developing genomic resources for lima bean

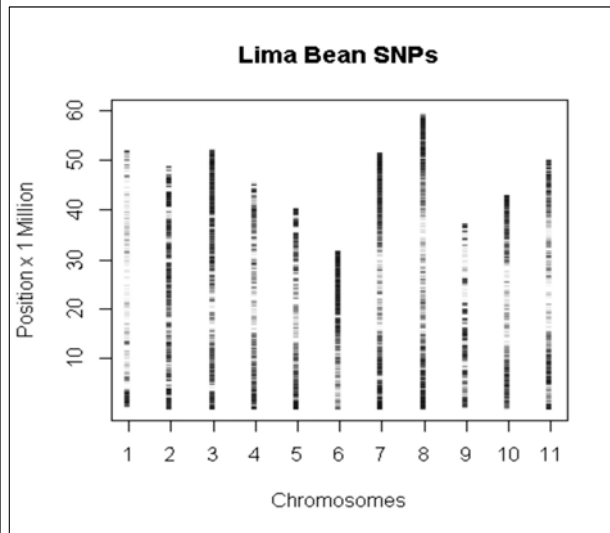
Sarah Dohle



Field Breeding  
Marker-assisted breeding

30

## Mapping of lima bean SNPs through synteny with common bean Sarah Dohle



Distribution of ~ 50,000 lima bean single-base-pair (SNP) markers on the common bean chromosomes. Each horizontal line represents an individual SNP.

Such markers will be used to determine where genes for resistance to Lygus and nematodes are located.

31

2

## New analytical tools: Geographic Information System (GIS)

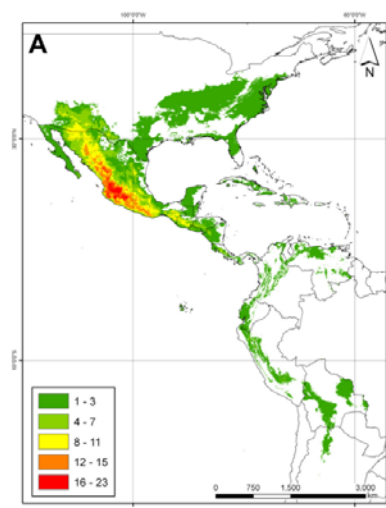
- Wikipedia: “integrates, stores, edits, analyzes, shares, and displays geographic information for informing decision making.”
- Applications to germplasm conservation?

OPEN ACCESS Freely available online

**A Gap Analysis Methodology for Collecting Crop Genepools: A Case Study with *Phaseolus* Beans**

Julián Ramírez-Villegas<sup>1,2</sup>, Colin Khoury<sup>3</sup>, Andy Jarvis<sup>1,3,4</sup>, Daniel Gabriel Debouck<sup>5</sup>, Luigi Guarino<sup>2</sup>

- Spatial and temporal analyses
- Applications to breeding?
  - High-throughput phenotypic evaluations



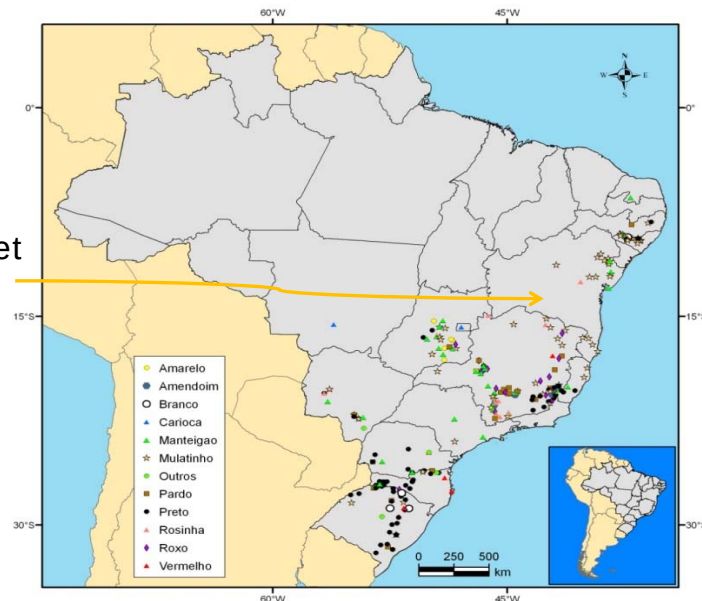
32

## Eco-geographic variation of common bean in Brazil

Marília Burle

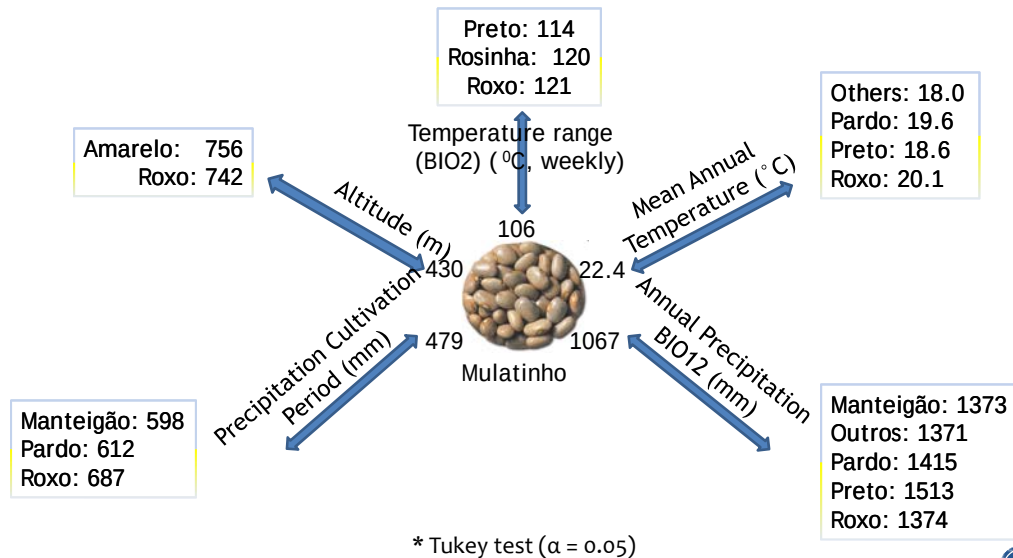
'Mulatinho' market class:

lower altitudes,  
precipitation;  
higher  
temperature



33

## Significant\* Contrasts between Mulatinhos and Other Commercial Types



34

3

## New analytical tools: Phenomics

- **High-throughput** evaluations of phenotypes in **field conditions**
- **Match precision** obtained by DNA sequencing (SNP level) by similar precision at the phenotypic level
- **Limitations** of greenhouse and growth chamber evaluations:
  - Limited air volume precludes flowering & maturation: cannot assess stress tolerance during reproductive growth
  - Limited soil volume: different growth & development, nutrient and water regimes
  - Different solar radiation, wind strength, evaporation rates
- **Field-based phenotyping:**
  - More **accurate** description of trait expression
  - Needs to be **high-throughput**: large populations (100s plots), diurnal cycles (recovery from stresses), multiple traits and tissues simultaneously
  - **Non-destructive**
  - **Close-range sensing**
  - Combine with **wireless sensor network** to monitor environmental conditions
- **Correlate** individual traits with overall performance: yield, phenology

35

## Examples of Types of Analyses

- **Direct measures:**
  - Visible light
  - Near-infrared: water status
  - Infrared: heat/temperature status
  - Multispectral imaging: composition, disease status, etc.
  - Fluorescence: chlorophyll
  - Height profiling (top, sideways)
- **Processed data:**
  - Image analyses
  - Mathematical models of growth and development



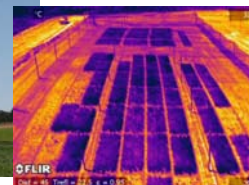
Lemnatec



White &amp; Conley 2013



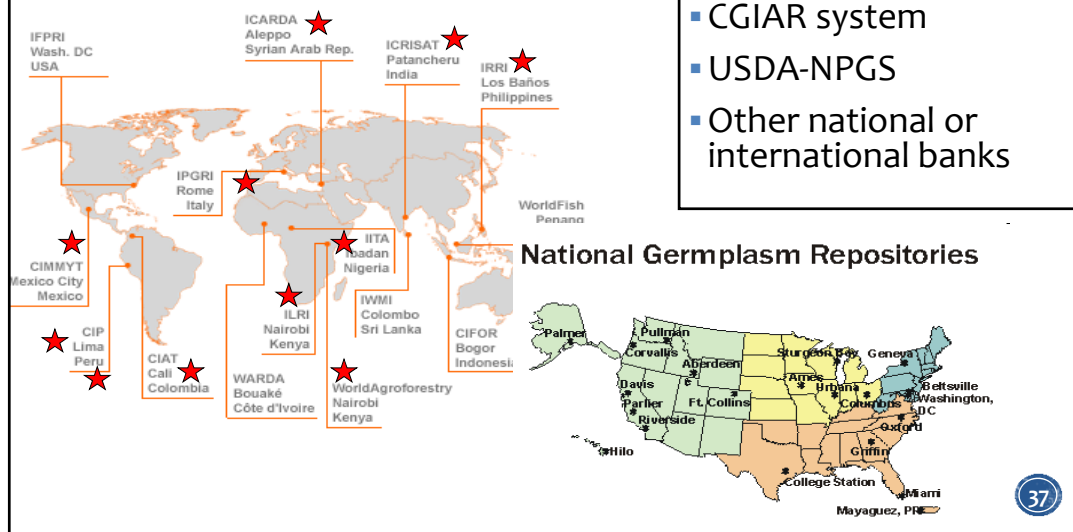
Australian Plant Phenomics Facility



36

4

## Large collections of crop germplasm: *Ex situ* conservation



## McCouch S et al. 2013. Agriculture: feeding the future. Nature 499:23-24



The International Center for Tropical Agriculture in Colombia holds 65,000 crop samples from 141 countries.

### Feeding the future

We must mine the biodiversity in seed banks to help to overcome food shortages, urge Susan McCouch and colleagues.

- Sample of sequence information of ITPGRFA accessions
- Analyze phenotypes of the same accessions and combine data with sequence, crossing progeny, geographical, and ecological data
- Create an informatics infrastructure to link the different data types

38



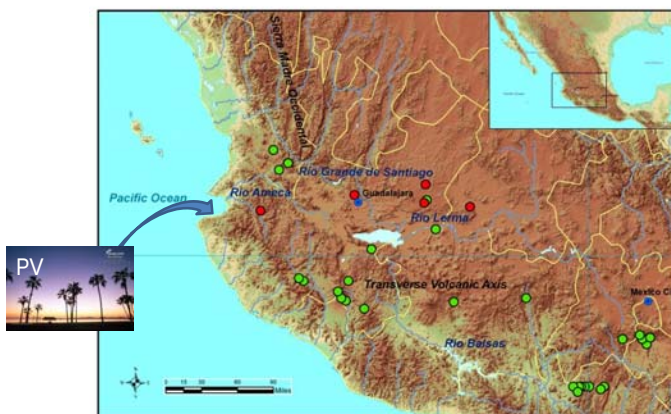
5

## The role of domestication studies



39

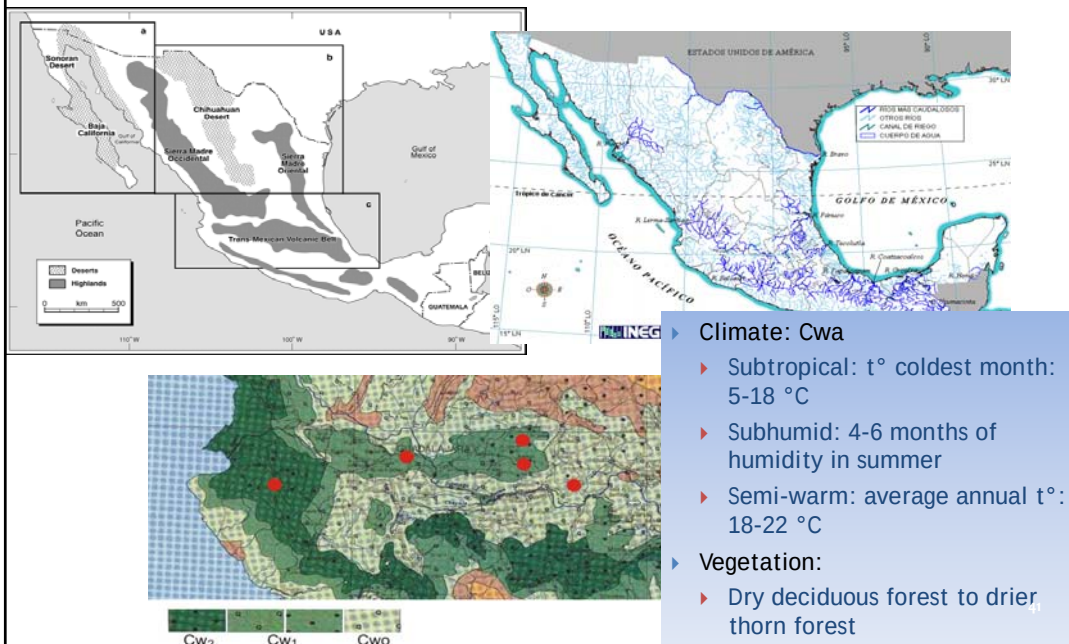
## The Putative Domestication Center of Common Bean in Mexico



M. Kwak, J. Kami & P. Gepts, Crop Sci., 2009

40

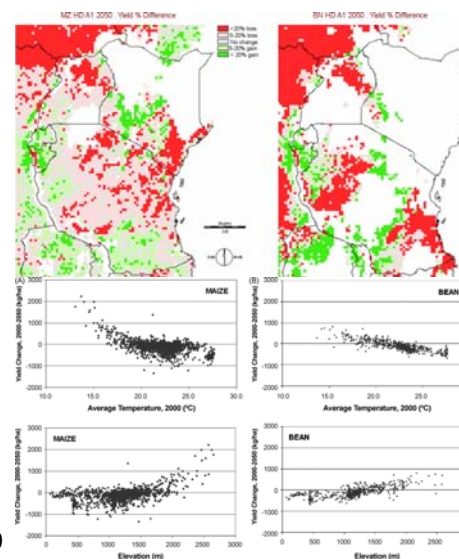
## Why the Lerma-Santiago Basin?



6

## Towards Distributed Breeding: Farmer Participatory Breeding/Selection

- By analogy with distributed computing
- Currently, varietal development is centralized: AES, Seed companies
- Complement with local capabilities?
  - Local adaptation:
    - Broad vs. narrow adaptation
    - Maximize G x E interactions
  - Local consumer needs:
    - Cultural and gender differences
    - Novelties & flexibility
- Deal with future uncertainties of climate change



Thornton et al. 2009

## Integration with Human Effects: Are Farmers Agents of Selection and Gene Flow?

### Selection During and After Harvest



Photos: D. Zizumbo

Payró de la Cruz et al. 2005



## Different Genetic Structure in W & D

Zizumbo-Villarreal et al. 2005

|                | $H$  | $h$       | $G_{ST}$ | $Nm$ |
|----------------|------|-----------|----------|------|
| Wild           | 0.24 | 0.13-0.18 | 0.40     | 0.78 |
| Landraces      | 0.26 | 0.22-0.29 | 0.26     | 1.40 |
| Breeding lines | --   | 0.03-0.06 | --       | --   |

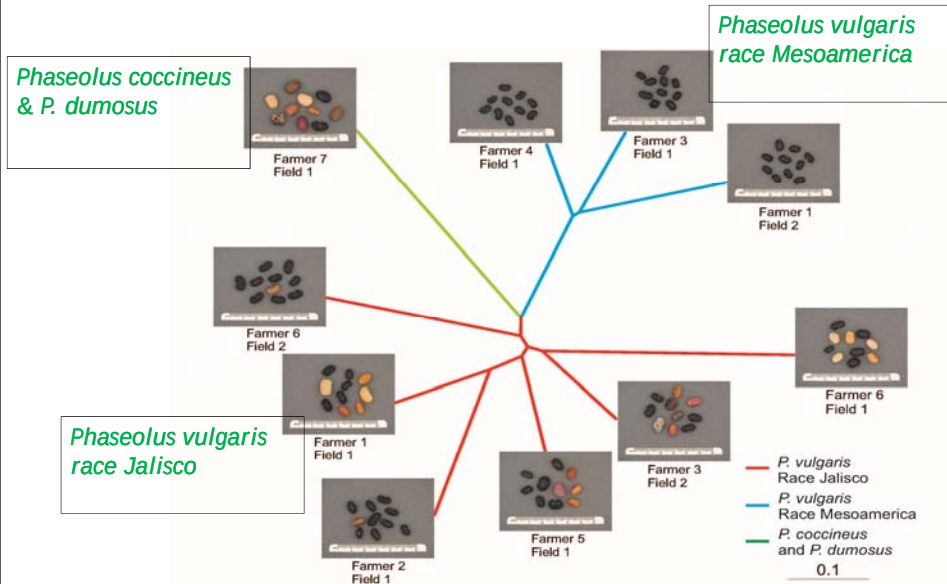
- Wild: less diversity within populations, more among populations compared to Domesticated
- Higher gene flow in Domesticated:
  - Diversity within landraces: outcrosses
  - Seed exchange among farmers







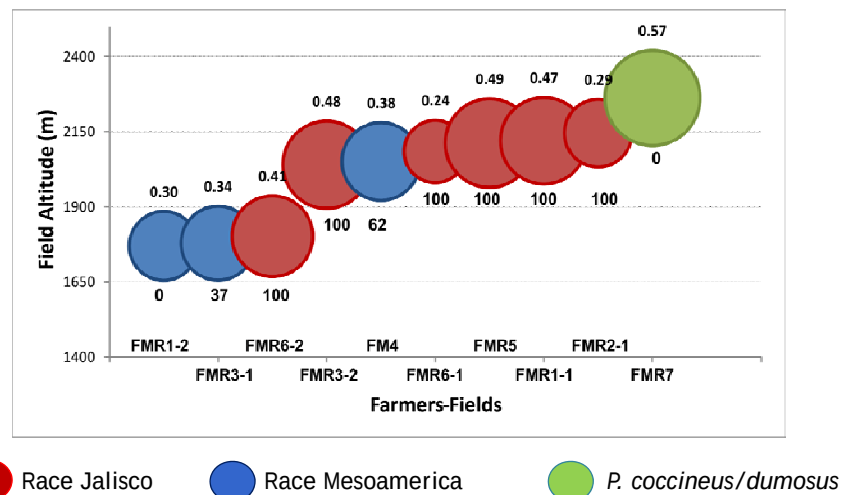
## Three main taxa



M. Worthington, D. Soleri, & P. Gepts, Crop Sci. 2012

47

## Altitude distribution of different beans



M. Worthington, D. Soleri, & P. Gepts, Crop Sci. 2012

48



### Social sciences: Socio-cultural preferences, economic circumstances of households, demographic changes



49

### Conclusion: Integrating multiple threads into one strong strand

- Our food supply is at risk
  - Population
  - Consumption choices
  - Climate change
  - Energy production
- Plant breeding is part of the solution: Multiple threads
  - Adoption of new analytical tools
  - Use of existing collections and domestication studies
  - Different breeding strategies: MAS, distributed breeding
- Modified from B.Y. Morrison: Painting the Hills Green (1935)
  - “... green hills clad with forests or with pastures, but in any case luxuriant and verdant, have become a symbol of happiness and well-being. “

50