

# Functional SNP in a polygenic disease induced by high-altitude in fattening Angus steers

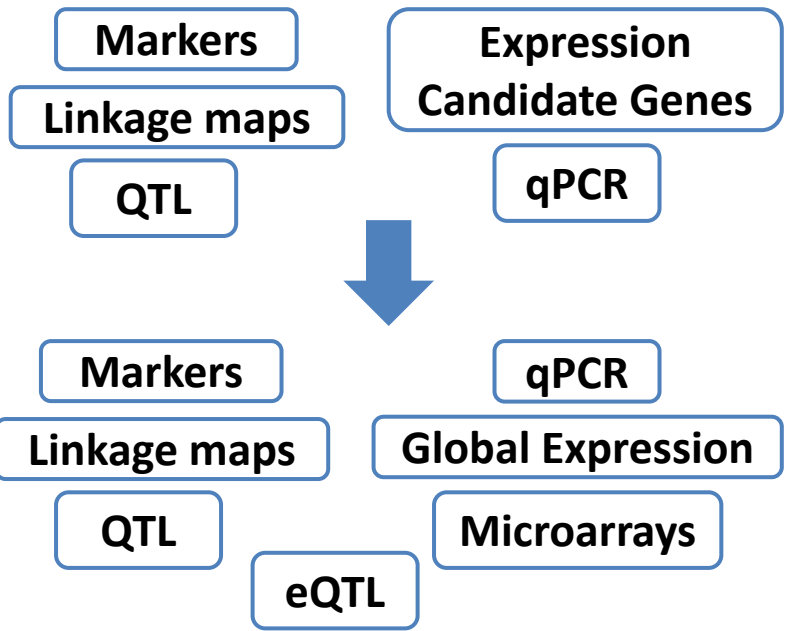
Angela Cánovas

University of Guelph

67<sup>th</sup> Annual meeting EAAP, Belfast August 31<sup>st</sup> 2016



# Single Genes > Genetical Genomics > System Biology



~ 2000 year  
Single genes

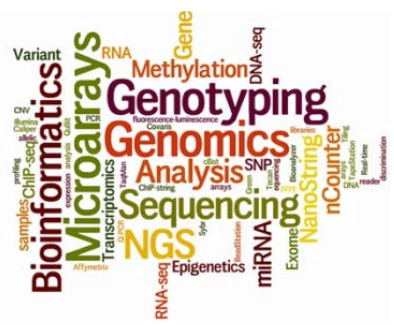
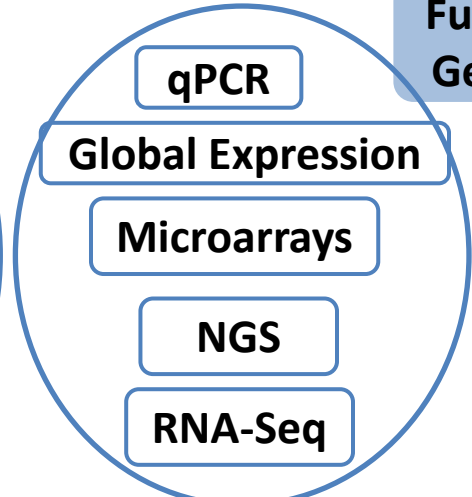
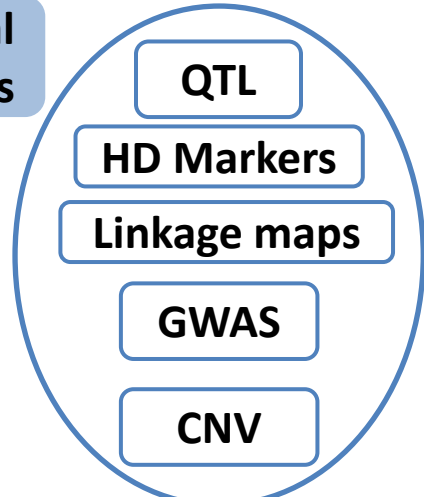
~ 2009 year  
**Genetical Genomics**  
Structural & Functional  
Genomic data



Statistical  
Methodologies

Structural  
Genomics

Functional  
Genomics



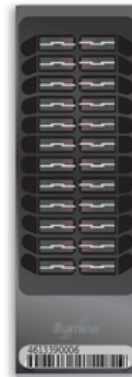
**Present & Future  
Systems Biology**

# How Does Genomics Accelerate Genetic Improvement

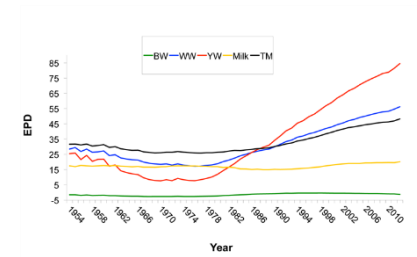
## Why Genomics

### Evolution of DNA Technology and Status of Ruminant Genome Sequence and Tools

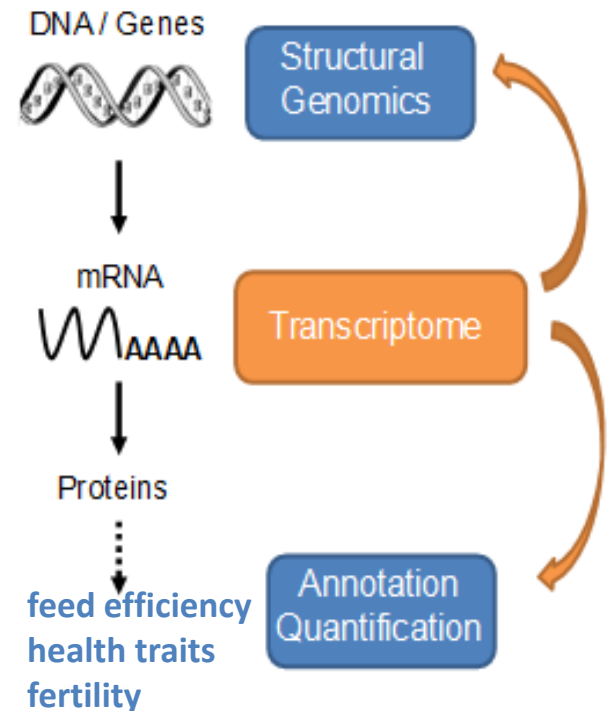
Item	Cow	Sheep	Goat	Yak
Reference genome	✓	✓	✓	✓
Additional animals sequenced	✓	✓		
50K SNP-chip	✓	✓	✓	
HD SNP-Chip	✓			
Other SNP-Chips	✓			



## Genetic Improvement



## RNA-Sequencing

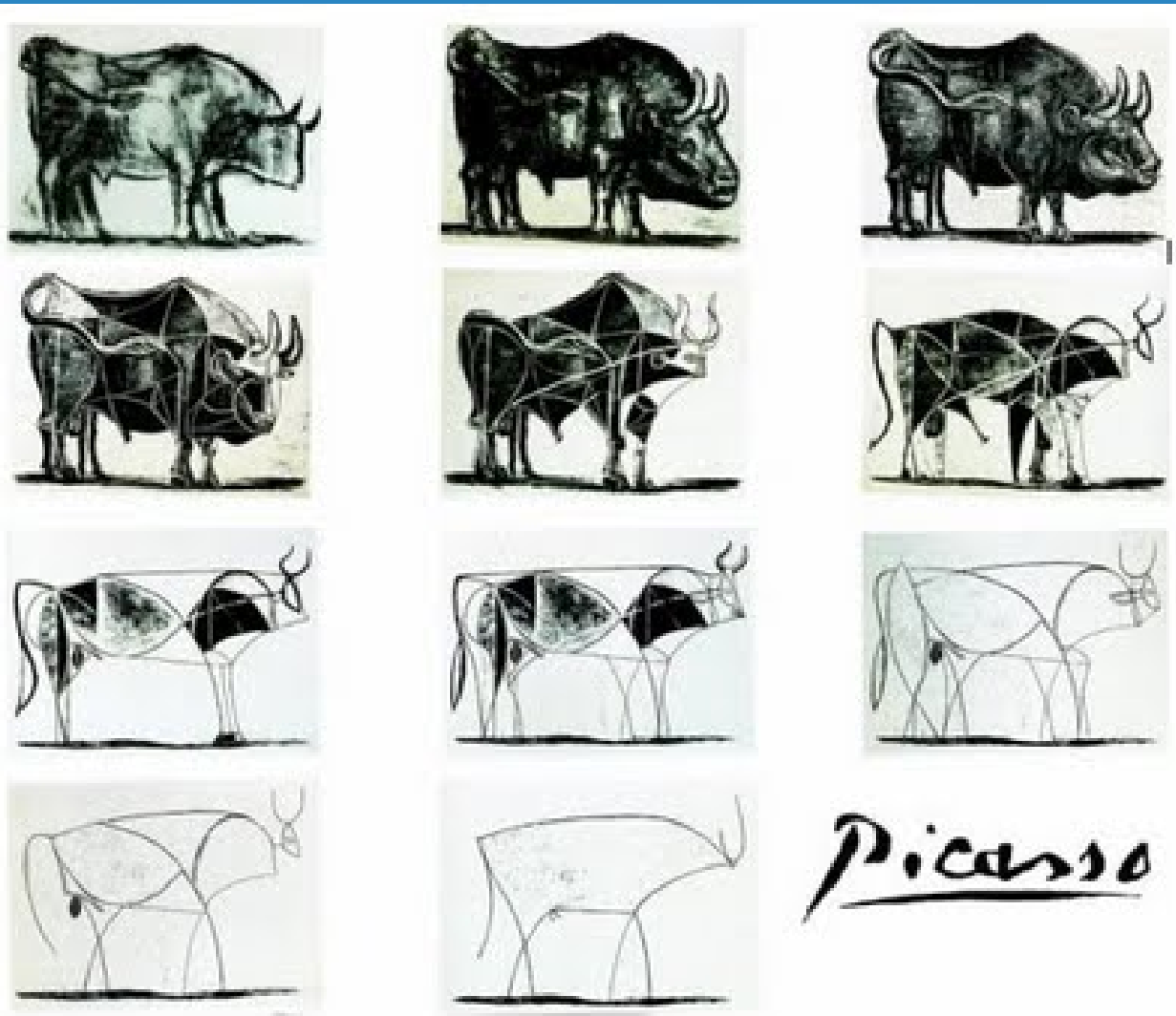


$$\Delta_{BV}/t = \frac{r_{BV, \hat{BV}} i \sigma_{BV}}{L}$$

$\Delta_{BV} \times 2+$

↑ Accuracy of selection

↓ Reducing Generation Interval

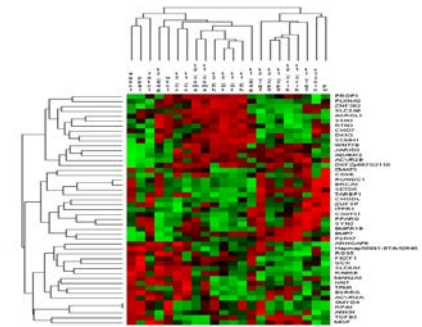


Pablo Picasso, Bull (plates I - XI) 1945

Analogy with Systems Biology where large amount of data could be integrate in order to extract the essential components that describe the biology affecting a complex phenotype

## Beyond differential expression: the quest for causal mutations and effector molecules.

Hudson NJ<sup>1</sup>, Dalrymple BP, Reverter A.



PNAS

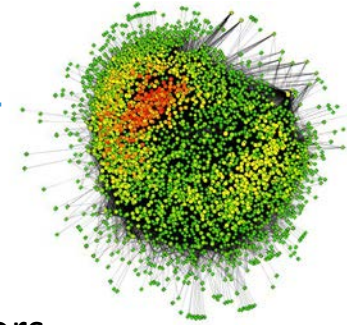
Proceedings of the National Academy of Sciences of the United States of America

Proc Natl Acad Sci U S A. 2010 Aug 3;107(31):13642-7. doi: 10.1073/pnas.1002044107. Epub 2010 Jul 19.

## Association weight matrix for the genetic dissection of puberty in beef cattle.

Fortes MR<sup>1</sup>, Reverter A, Zhang Y, Collis E, Naqaraj SH, Jonsson NN, Prayaga KC, Barris W, Hawken RJ.

- Exploit the power of Multivariate analysis
- Combine the results from GWAS
- With the knowledge of Transcription Regulators
- In a Network Theory framework

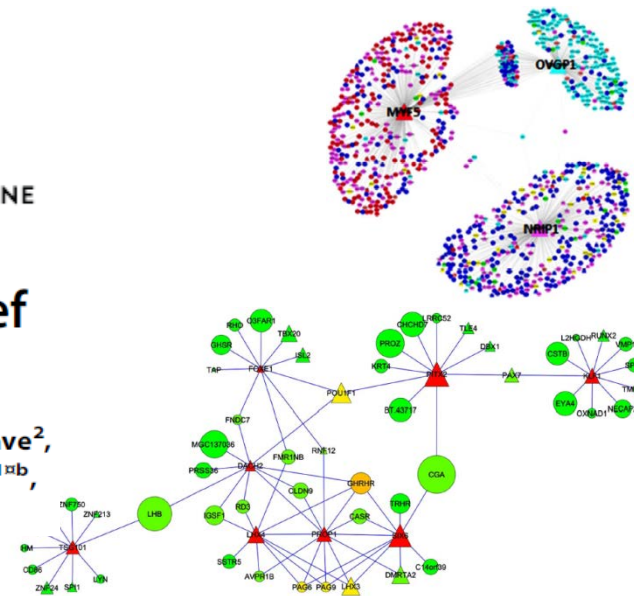


PLoS ONE 9(7): e102551.(2014)

PLOS ONE

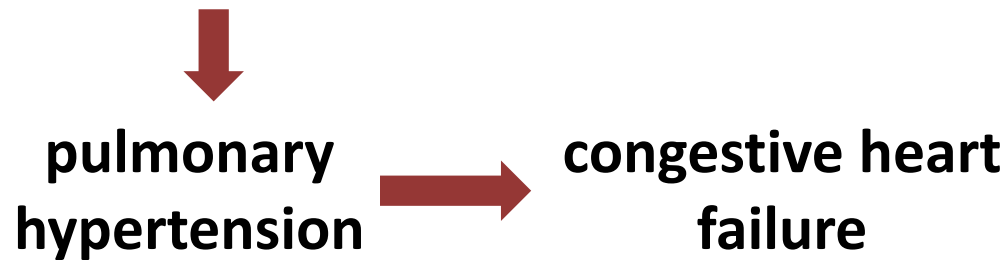
## Multi-Tissue Omics Analyses Reveal Molecular Regulatory Networks for Puberty in Composite Beef Cattle

Angela Cánovas<sup>1</sup>, Antonio Reverter<sup>2</sup>, Kasey L. DeAtley<sup>3</sup><sup>✉</sup>, Ryan L. Ashley<sup>3</sup>, Michelle L. Colgrave<sup>2</sup>, Marina R. S. Fortes<sup>4</sup>, Alma Islas-Trejo<sup>1</sup>, Sigrid Lehnert<sup>2</sup>, Laercio Porto-Neto<sup>2</sup>, Gonzalo Rincón<sup>1</sup><sup>✉</sup>, Gail A. Silver<sup>3</sup>, Warren M. Snelling<sup>5</sup>, Juan F. Medrano<sup>1</sup>, Milton G. Thomas<sup>6</sup><sup>\*</sup>

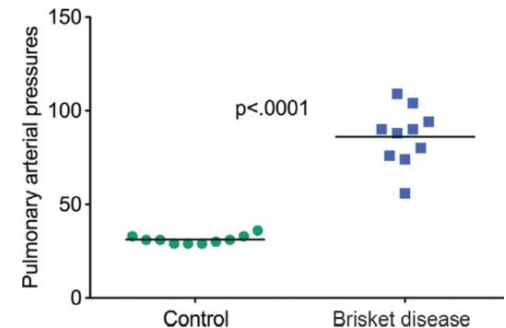


# High-altitude or Brisket disease in beef cattle

- Economically important problem (>1,800 m).
- Associated with vascular inflammation of the pulmonary artery due to hypoxia.



- Heritable disease



# Experimental design

## RNA-Sequencing

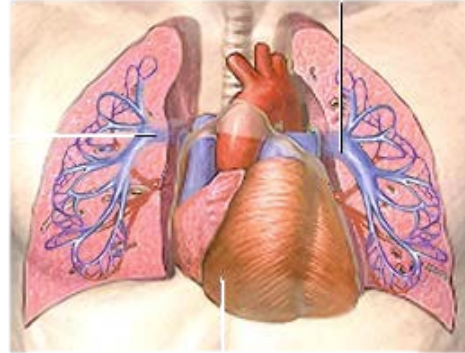
### Experiment 1

Transcriptome from  
cultured bovine  
fibroblast of

## Healthy calves

**Control**  
(n=6)

Normoxic conditions  
1,500 m (5,000 ft)



Transcriptome from  
cultured bovine  
fibroblast of

## Hypertensive calves

**Hypertensive**  
(n=6)

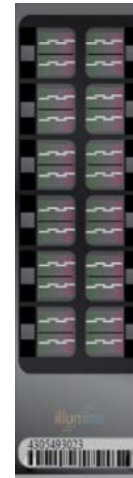
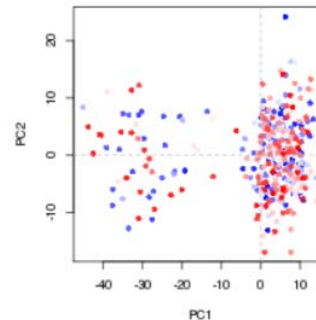
Hypobaric hypoxia  
4,500 m (15,000 ft)  
14 days

### Experiment 2

Transcriptome of  
**LPAP Angus cattle**

**LPAP**  
(n=35)

Right Ventricle  
Left Ventricle  
Pulmonary Artery  
Aorta  
Muscle  
Lung

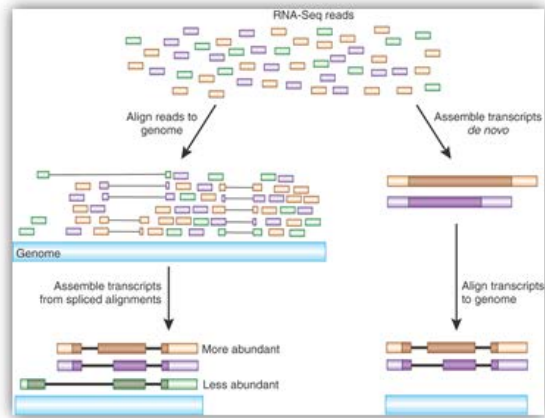
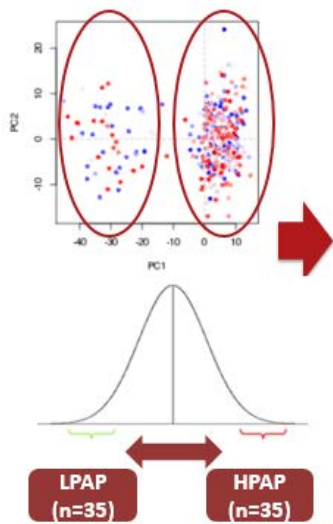


Transcriptome of  
**HPAP Angus cattle**

**HPAP**  
(n=35)

Right Ventricle  
Left Ventricle  
Pulmonary Artery  
Aorta  
Muscle  
Lung

**RNA-Sequencing**



Filters & Quality Control Sequences



Mapping / Alignment  
(paired -end 100 pb)



*Bos taurus* 3.1  
(Release81)



Gene Expression  
Structural Variation

**“Genetical Genomics”**

**Integration of Structural & Functional Genomic data into Systems Biology**

**Splice Variants**



*Large gap mapping*  
*Transcript discovery*  
RNA-Seq análisis



Statistical analysis  
Differential Expression  
**LPAP vs HPAP**



Metabolic Pathways

**SNP Variants**



SNP group specific  
(fixed/segregating)



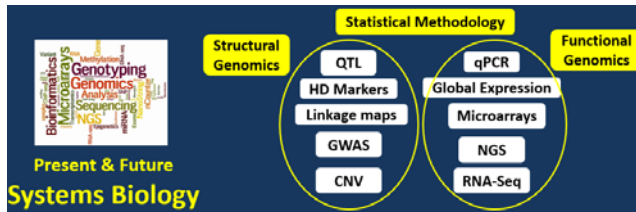
Variant Effect  
Predictor



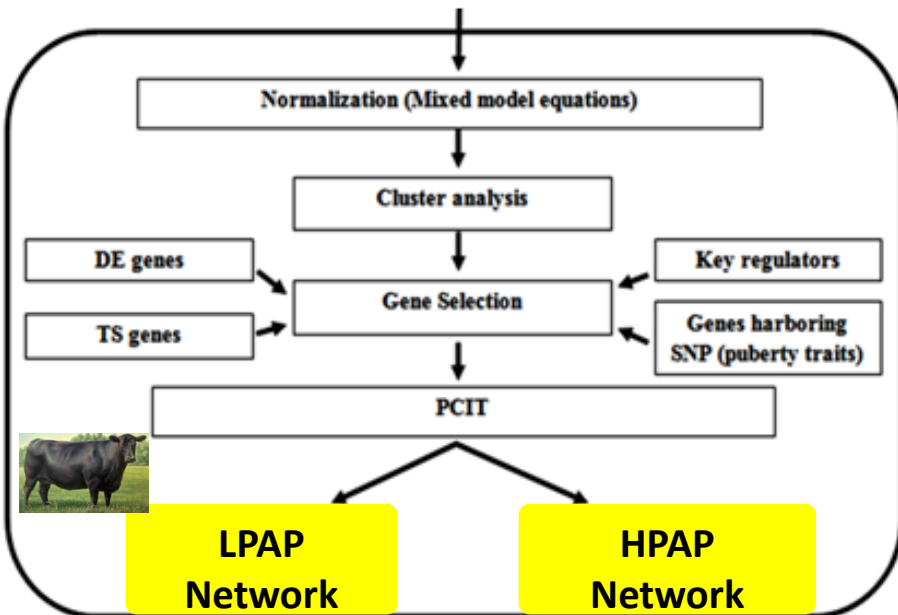
# Transcriptomics and Systems Biology of High Altitude Disease in Angus cattle



Path. Process. Biol. Genes 1 - 2018



## RNA-Sequencing (70 samples)



Differential Expression  
(RNA-Seq)

Expr. Tissue specific  
(RNA-Seq)

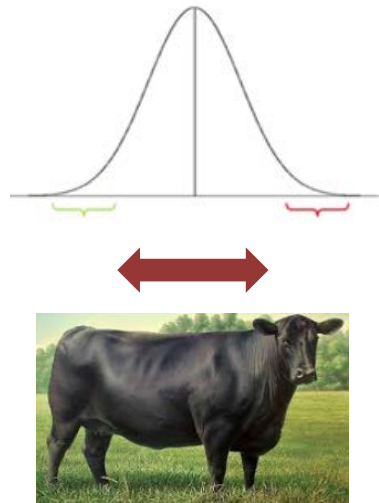
Splice variants  
Differentially expressed  
(RNA-Seq)

Key Regulators - TF

GWAS

SNP Discovery

# Differential Gene Expression (RNA-Seq)



RNA-Seq  
DE analysis

**HEALTHY** vs **HYPERTENSIVE**  
1,012 genes  
( $p < 0.01$ ;  $q < 0.05$ ;  $FC > 2$ )

**LPAP** vs **HPAP**  
( $p < 0.01$ ;  $q < 0.05$ ;  $FC > 2$ )

Cultured  
Fibroblast

Right Ventricle  
Left Ventricle  
Pulmonary Artery  
Aorta  
Muscle  
Lung

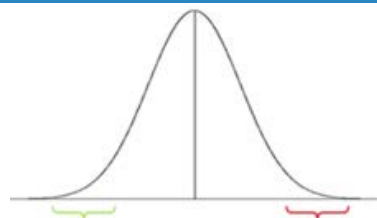
## LPAP vs HPAP

Tissue	DE gene (n)		
	$p < 0.05$	$p < 0.01$	$p < 0.01 + FC > 2$
Right ventricle	7,042	4,663	1,394
Left ventricle	791	158	20
Pulmonary artery	1,619	356	47
Aorta	5,685	2,590	1,173
Muscle	784	155	22
Lung	816	189	46

## HPAP (Healthy) vs HPAP (Sick)

Tissue	DE gene (n)		
	$p < 0.05$	$p < 0.01$	$p < 0.01 + FC > 2$
Right ventricle	358	57	17
Left ventricle	559	107	25
Aorta	964	172	52
Muscle	474	99	40
Lung	372	84	26

# Splice Variants Differential Expression (RNA-Seq)



**HEALTHY** vs **HYPERTENSIVE**

1,115 DE splice variants  
( $p < 0.01$ ;  $q < 0.05$ ;  $FC > 2$ )

**LPAP** vs **HPAP**

( $p < 0.01$ ;  $q < 0.05$ ;  $FC > 2$ )

**Cultured  
Fibroblast**

**Right Ventricle  
Left Ventricle  
Pulmonary Artery  
Aorta  
Muscle  
Lung**

**Splice variants *DE***

**LPAP** vs **HPAP**

( $p < 0.01$ ;  $q < 0.05$ ;  $FC > 2$ )

**ANNOTATED** = 80% DE splice variants

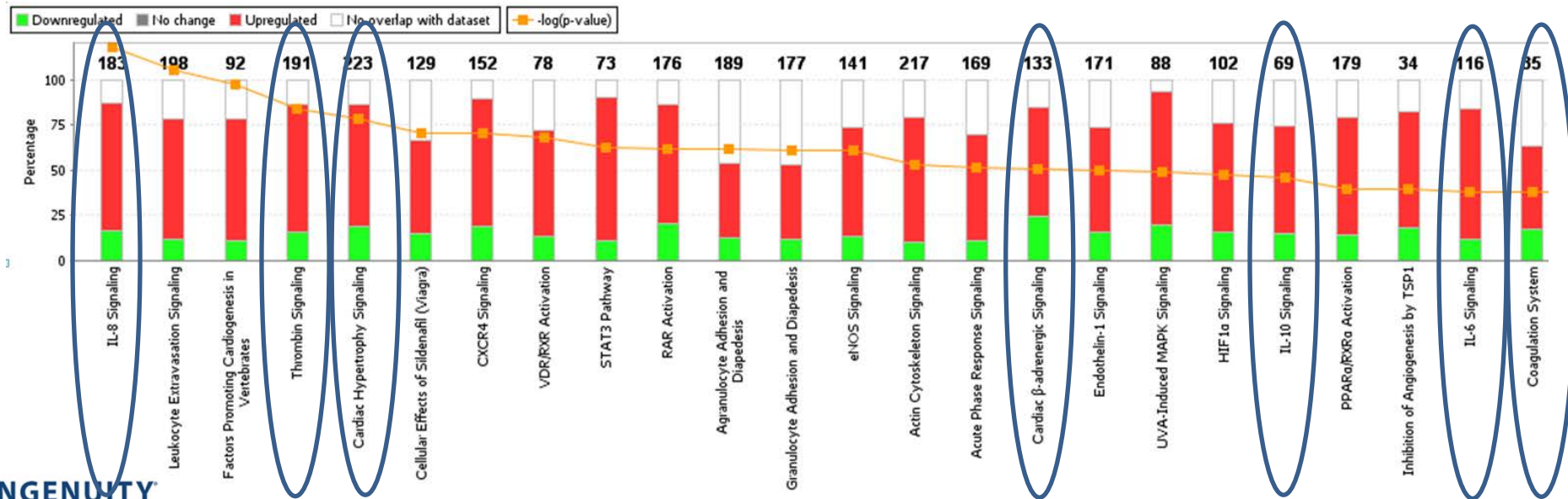
**NOVEL** = 20% DE splice variants

Blast2GO  
IsoSeq PacBio



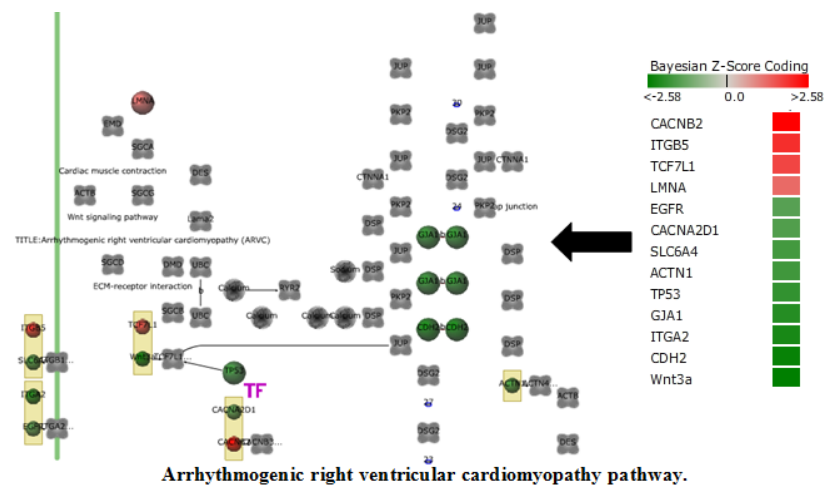
**PACIFIC  
BIOSCIENCES®**

# Metabolic Pathway analysis



INGENUITY  
PATHWAY ANALYSIS

**ASBAMC software**  
Bayesian approach  
Adams et al., 2011



Integrate metabolic pathway analysis to develop testable hypotheses in relation to the regulation of gene networks associated with brisquet disease

# Key Regulators – Transcription Factors

Right Ventricle  
Left Ventricle  
Pulmonary  
Artery  
Aorta  
Muscle  
Lung

## Regulatory Impact Factor metrics

$$\text{RIF1}_r = \frac{1}{n_{\text{DETS}}} \sum_{j=1}^{j=n_{\text{DETS}}} x_j \times d_j \times \text{DC}_{rj}^2$$

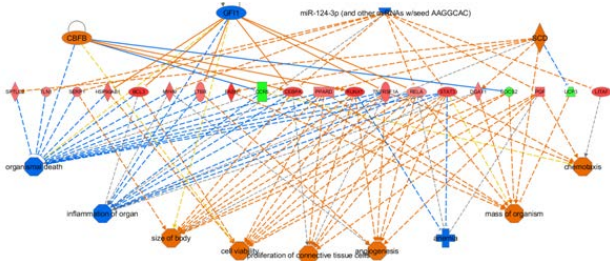
$$\text{RIF2}_r = \frac{1}{n_{\text{DETS}}} \sum_{j=1}^{j=n_{\text{DETS}}} \left[ \left( x_j^{\text{PRE}} \times r_{rj}^{\text{PRE}} \right)^2 - \left( x_j^{\text{POST}} \times r_{rj}^{\text{POST}} \right)^2 \right]$$

Reverter et al., 2008

Canovas et al., 2014

Right  
Ventricle

**101 key regulators** → regulating **705 genes** differentially expressed between LPAP and HPAP steers.



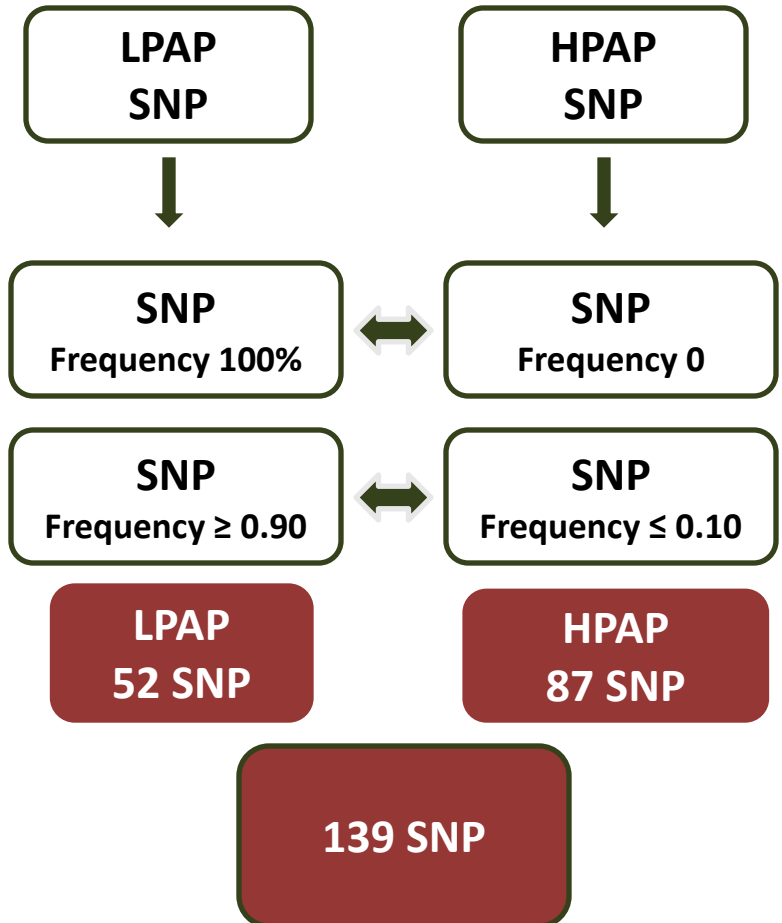
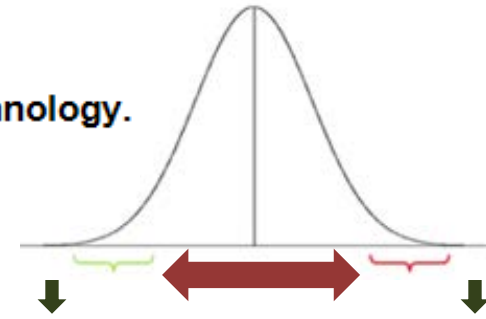
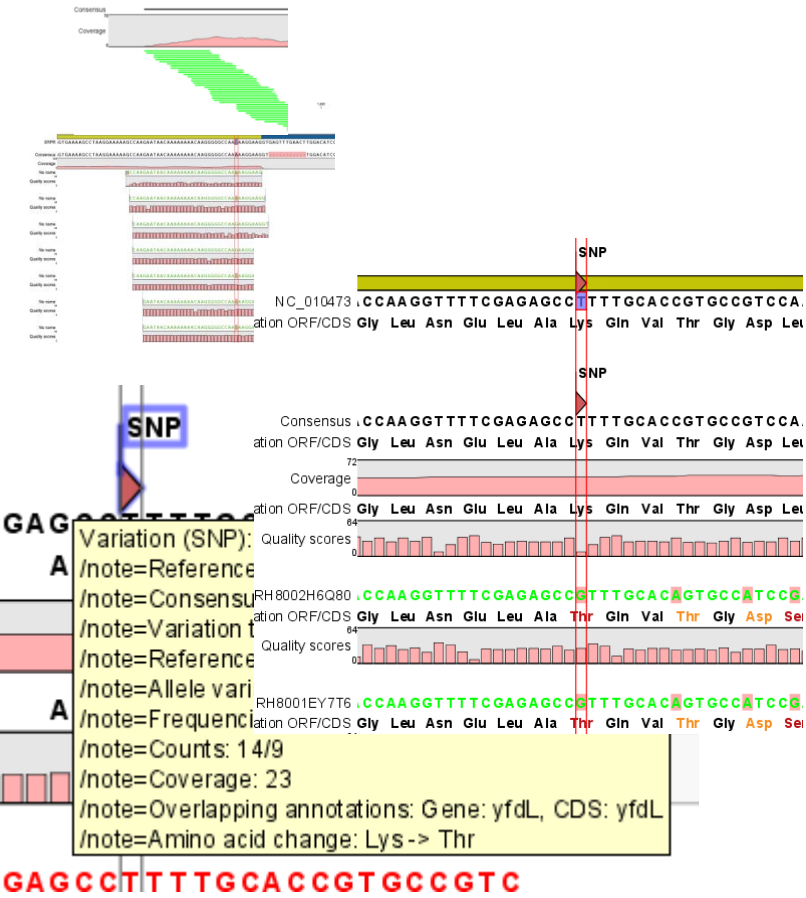
angiogenesis and atherosclerosis  
cardiomyopathy (NFATC1)  
movement of leukocytes and neutrophils (OLR1, PLAUR)  
failure of heart (CTGF)  
hypertrophy of heart ventricle (TREM1, GATA2)  
vascularization (SYVN1)

# SNP Discovery

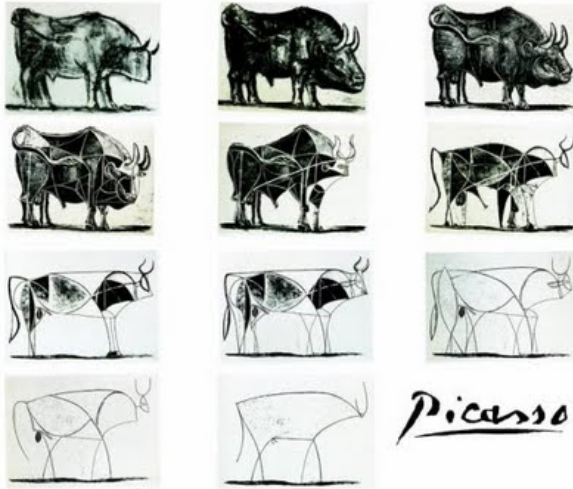
Mamm Genome. 2010 Dec;21(11-12):592-8. doi: 10.1007/s00335-010-9297-z. Epub 2010 Nov 6.

## SNP discovery in the bovine milk transcriptome using RNA-Seq technology.

Cánovas A<sup>1</sup>, Rincon G, Islas-Trejo A, Wickramasinghe S, Medrano JF.



# Transcriptomics and Systems Biology of High Altitude Disease in Angus cattle



Pablo Picasso, Bull (plates I - XI) 1945

Differential Expression (RNA-Seq) ✓

Expr. Tissue specific (RNA-Seq) ✓

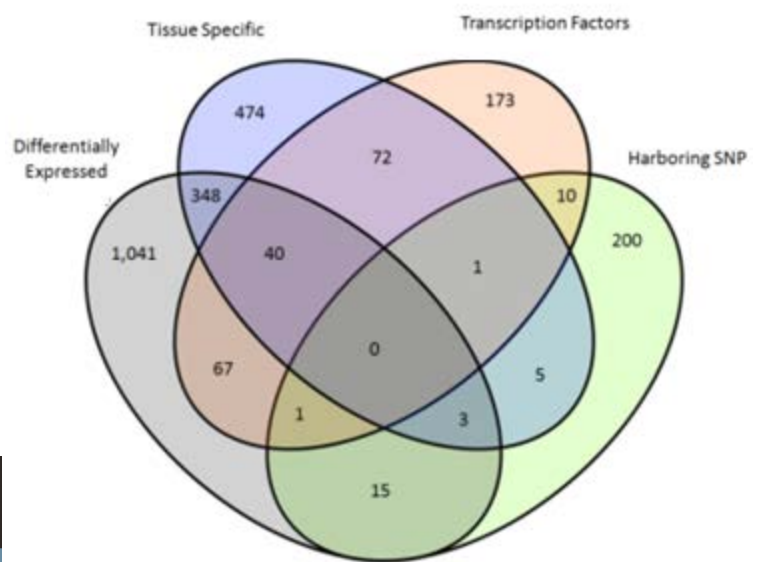
Splicing variants  
Differentially expressed  
(RNA-Seq) ✓

Key Regulators – TF ✓

SNP Discovery ✓

Gene Networks ✓

GWAS ✓



**139 SNP  
Located in 36 Genes**

# Other works

nature  
genetics

## A genetic mechanism for Tibetan high-altitude adaptation

Felipe R Lorenzo<sup>1,19</sup>, Chad Huff<sup>2,3,19</sup>, Mikko Myllymäki<sup>4,19</sup>, Benjamin Olenchock<sup>5</sup>, Sabina Swierczek<sup>1</sup>, Tsewang Tashi<sup>1</sup>, Victor Gordeuk<sup>6</sup>, Tana Wuren<sup>7</sup>, Ge Ri-Li<sup>7</sup>, Donald A McClain<sup>1</sup>, Tahsin M Khan<sup>8</sup>, Parvaiz A Koul<sup>9</sup>, Prasenjit Guchhait<sup>10</sup>, Mohamed E Salama<sup>11,12</sup>, Jinchuan Xing<sup>2,13</sup>, Gregg L Semenza<sup>14</sup>, Ella Liberzon<sup>15,16</sup>, Andrew Wilson<sup>17</sup>, Tatum S Simonson<sup>2,18</sup>, Lynn B Jorde<sup>2</sup>, William G Kaelin Jr<sup>15,16</sup>, Peppi Koivunen<sup>4,20</sup> & Josef T Prchal<sup>1,2,20</sup>

 PLOS ONE

## Genomic Scan Reveals Loci under Altitude Adaptation in Tibetan and Dahe Pigs

Kunzhe Dong<sup>1\*</sup>, Na Yao<sup>1\*</sup>, Yabin Pu<sup>1</sup>, Xiaohong He<sup>1</sup>, Qianjun Zhao<sup>1</sup>, Yizhao Luan<sup>2</sup>, Weijun Guan<sup>1</sup>, Shaoqi Rao<sup>2\*</sup>, Yuehui Ma<sup>1\*</sup>

ARTICLE

Received 20 Jan 2015 | Accepted 6 Mar 2015 | Published 15 Apr 2015

DOI: [10.1038/ncomms7863](https://doi.org/10.1038/ncomms7863)

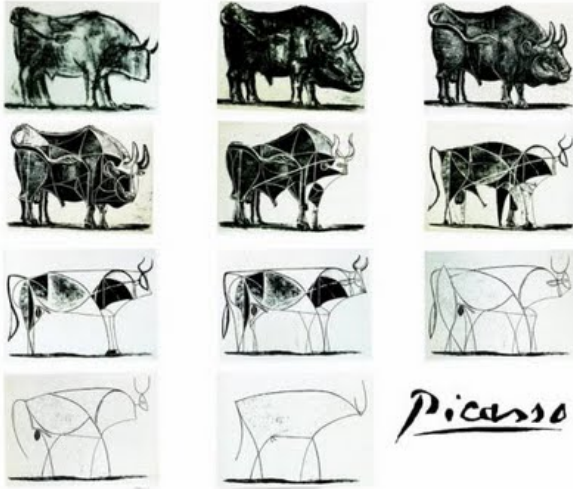
OPEN

## Increased prevalence of *EPAS1* variant in cattle with high-altitude pulmonary hypertension

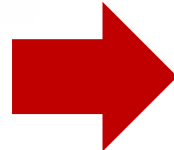
John H. Newman<sup>1</sup>, Timothy N. Holt<sup>2</sup>, Joy D. Cogan<sup>3</sup>, Bethany Womack<sup>3</sup>, John A. Phillips III<sup>3</sup>, Chun Li<sup>4</sup>, Zachary Kendall<sup>3</sup>, Kurt R. Stenmark<sup>5</sup>, Milton G. Thomas<sup>6</sup>, R. Dale Brown<sup>5</sup>, Suzette R. Riddle<sup>5</sup>, James D. West<sup>1</sup> & Rizwan Hamid<sup>3</sup>



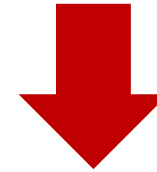
# FUNCTIONAL VALIDATION!!!!



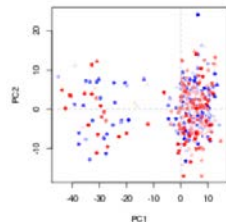
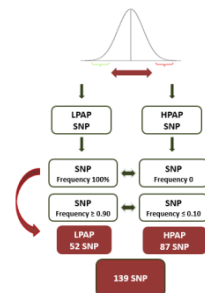
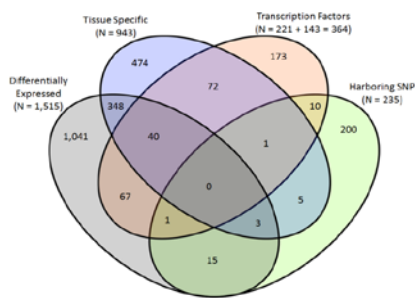
Pablo Picasso, Bull (plates I - XI) 1945



**139 SNP  
Located in 36 Genes**



**Functional Validation  
Independent Population  
1,000 steers approx.**



**... crossing fingers!!!!**

# New Cattle Genome Assembly

\*Slide courtesy of Juan F. Medrano



UMD3.1

Reported April 2009 (Genome Biol)

Based on 9x Sanger coverage  
WGS Dominette, BAC path Domino  
BAC end, RH map scaffolding and  
human-cow synteny map.

**75,618 contigs (97 kb contig N50)**  
**6337 scaffolds (6.4 Mb scaffold N50)**

Btau5.1

Released 11/19/2015

Based on 9x Sanger coverage initial  
+ 19x coverage P5 PacBio data  
BAC end, RH map, PBJelly2  
scaffolding

**42,267 contigs (276 kb contig N50)**  
**5,998 scaffolds (6.8 Mb scaffold N50)**

ARS-UCD v0.1

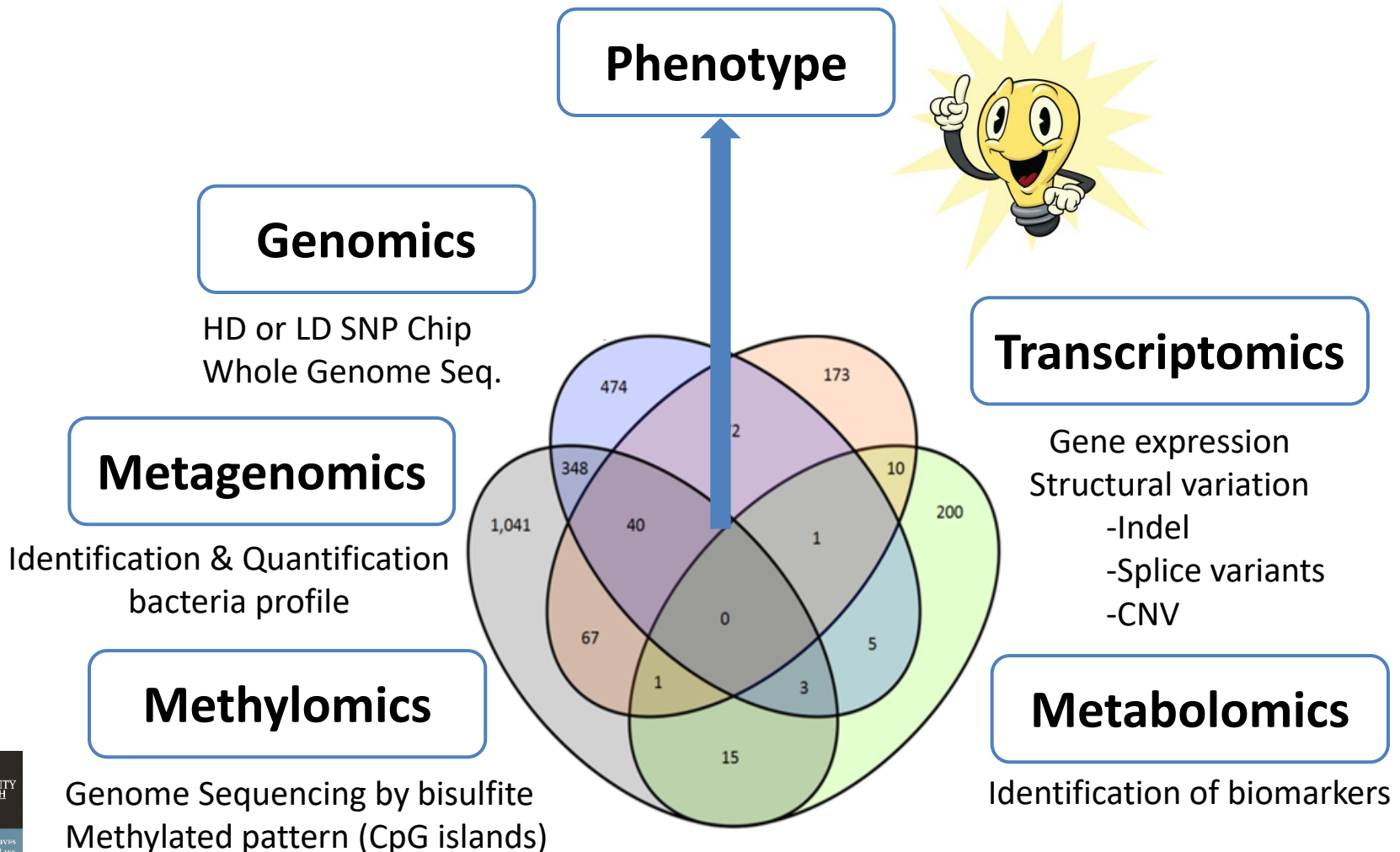
In progress, update 7/10/2016

Based on ~80x PacBio data  
P6 chemistry, Falcon assembly  
(PacBio), Scaffolding: Dovetail HiRise,  
Optical Map, Rec Map

**640 contigs (11.7 Mb N50)**  
**29 scaffolds (110.9 Mb N50)**

# -OMICS technologies

- New -OMICS Technologies to Understanding the Biological Processes and Network Pathways Associated with Cattle Growth and Health



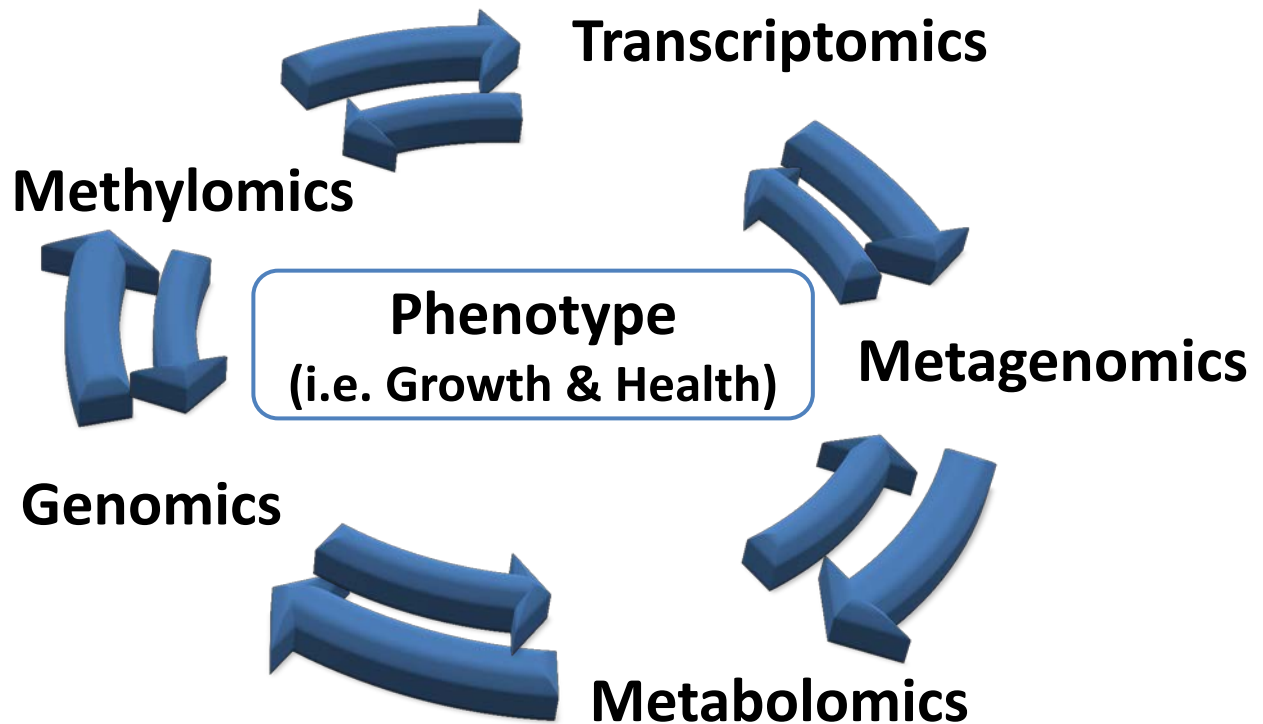


# -OMICS technologies

- New -OMICS Technologies to Understanding the Biological Processes and Network Pathways Associated with Cattle Growth and Health

Inferring causal phenotype networks using structural equation models

  
**Interactions**



# Acknowledgements

**Milton G. Thomas**

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R. Mark Enns

Scott E. Speidel



**Juan F. Medrano**

Alma Islas-Trejo



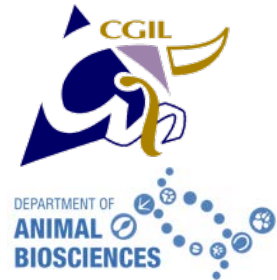
**Kurt R. Stenmark**

Suzette K. Riddle

R. Dale Brown



**Rebecca R. Cockrum**



# Thanks!



Planking at **low altitude**  
(sea level; San Diego, California)



Planking at **high altitude**  
(~3,800 m; Rocky Mountain, CO)