

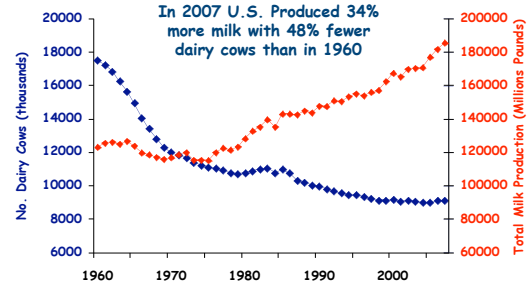
## Improving Genetic Prediction for Beef Cattle – Lessons Learned from Dairy Cattle

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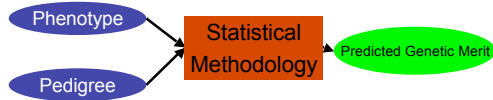
AIPL – Animal Improvement  
Programs Laboratory  
BFGL – Bovine Functional  
Genomics Laboratory

## Trends in U.S. Milk Production Selection Works



## Traditional Selection Programs

- Collect phenotypic data from animals (e.g., milk production, growth rate, conformation, etc.)
- Estimate genetic merit for animals in a population
- Select superior animals as parents of future generations



## Cattle SNP Collaboration iBMAC

- Developed 54,001 SNP Illumina assay
  - USDA-ARS Beltsville Agricultural Research Center: Bovine Functional Genomics Laboratory and Animal Improvement Programs Laboratory
  - University of Missouri
  - University of Alberta
  - USDA-ARS US Meat Animal Research Center
- Consortium planned to genotype ~30,000 animals for multiple projects



## Participants

### iBMAC Consortium

- Illumina
  - Marylinn Munson
  - Cindy Lawley
  - Christian Haudenschild
- BARC
  - Curt Van Tassell
  - Lakshmi Matukumalli
  - Tad Sonstegard
- Missouri
  - Jerry Taylor
  - Bob Schnabel
  - Stephanie McKay
- Alberta
  - Steve Moore
- USMARC – Clay Center
  - Tim Smith
  - Mark Allan

### Funding Agencies

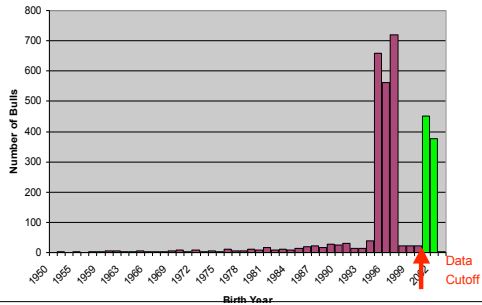
- USDA/NRIC/SREES
  - 2006-35205-16097
  - 2006-35205-16888
  - 2006-35205-16701
- USDA/ARS
  - 1265-31000-081D
  - 1265-31000-090D
  - 5438-31000-073D
- Merial
  - Stewart Bauck
- NAAB
  - Gordon Doak
  - ABS Global
  - Accelerated Genetics
  - Alta Genetics
  - CRI/Genes
  - Select Sires
  - Semex Alliance
  - Taurus Service



## USDA-ARS project – Initiated 2006

- Genotype 3,000 to 5,000 Holsteins
  - Built in validation
    - Historic group
      - 2000 bulls born in 1995-1997
      - 400 ancestor bulls born in 1950-1994
    - Prediction group
      - 800-1000 bulls born in 2001-2002
  - Test ability to predict “forward”
- Genotype 750-1000 Jerseys
- Genotype 250-400 Brown Swiss
- Depended on CDDR

## Population Structure



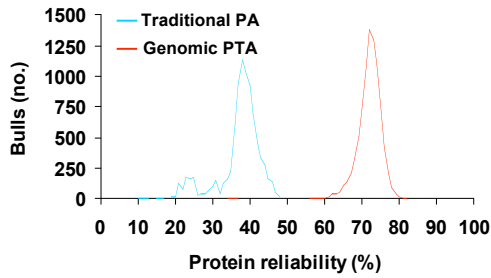
## Reliability Gain<sup>1</sup> by Breed

Yield traits and NM\$ of young bulls

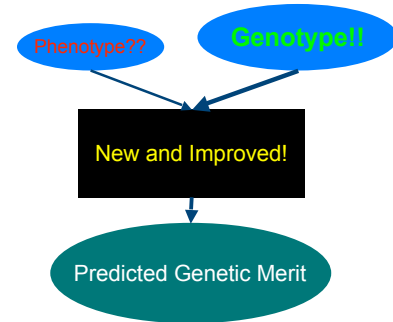
Trait	HO	JE	BS
Net merit	23	9	3
Milk	23	11	0
Fat	33	15	5
Protein	22	4	1
Fat %	43	41	10
Protein %	34	29	5

<sup>1</sup>Gain above parent average reliability ~35%

## Reliabilities for Young Bulls



## Build a Better Black Box



## Problems...

- Upper limit on accuracy of genetic prediction – even for Holstein
- What do we do with smaller breeds – marker effects were not consistent enough to justify cross-breed genetic prediction

## Development of a Bovine High-Density SNP Assay

- Why?
  - Increased accuracy in genetic prediction
  - Utilize across breed information
  - Enhance gene mapping precision
  - Enhanced performance in *Zebu* cattle

## Collaboration

- **Illumina** provided:
  - DNA sequence for a range of breeds
- **Pfizer** provided:
  - DNA sequence of additional breeds
  - SNP discovery expertise
- **USDA-ARS** provided:
  - DNA and library construction
  - SNP discovery expertise
  - Assay design expertise

## Additional Collaborators

- University of Missouri
- Roslin Institute
- UNCEIA (France)
- Sao Paulo State University
- University of Milan
- Technische Universitaet Muenchen
- Beef CRC
- Embrapa
- National University (Korea)

## Data Highlights

- Enormous amount of DNA sequence data
  - ~180x genome equivalent coverage
  - ~550 **BILLION** base-pairs
- Represents:
  - ~120 libraries
  - >300 animals
- Animals from breeds representing:
  - European and Zebu cattle
  - Beef and dairy
  - Temperate and tropically adapted

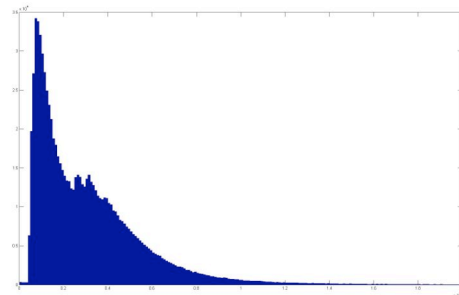
## SNP Chip Design

- >45 million SNPs discovered
  - ~6 million were used to design the high density chip
  - Selected ~800,000 new SNPs added
  - Kept all of the BovineSNP50 SNPs
- Breed groups used:
  - Holstein, Angus, Nelore, Taurine dairy, Taurine beef, Indicine, tropically adapted Taurine
- 852,645 total gaps
  - 850,816 <20kb
  - 1795 >20kb, < 100kb
  - 34 > 100 kb

## Assay Design Results

- All of BovineSNP50 SNP were attempted
- ~800,000 bead types after 60,800 beads of BovineSNP50 positioned
- 795,000 SNP positioned on BTA1-29,X
- 5,000 beads represent unknown contigs, BTA Y, and mitochondrial SNP

## Gaps <20,000 bp



## Conclusions

- The Illumina BovineHD genechip will be available *very soon*
- The information from this DNA chip looks very promising for a wide range of uses
- A large number of SNP have been discovered and will be made publically available

## Low Density Assay

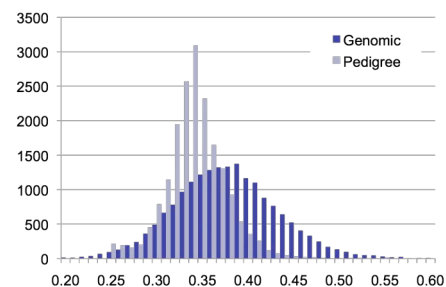


- What?
  - 96, 384, 1,500, 3,000, ....
- Why?
  - Parentage
    - 10 to 30% incorrect parentage
  - Traceability
    - Disease outbreak
  - Genetic Prediction
    - Intermediate accuracy
  - Shortcut to pedigree data

## Reduced SNP Set

- Collaboration
  - Illumina
  - Genomics companies - Merial, Pfizer, MMI
  - Artificial insemination organizations
  - Breed associations
  - Genotyping service providers
  - Eartag manufacturers
- Technology applicable to extensive management practices.

## Bull – MGS Relationships

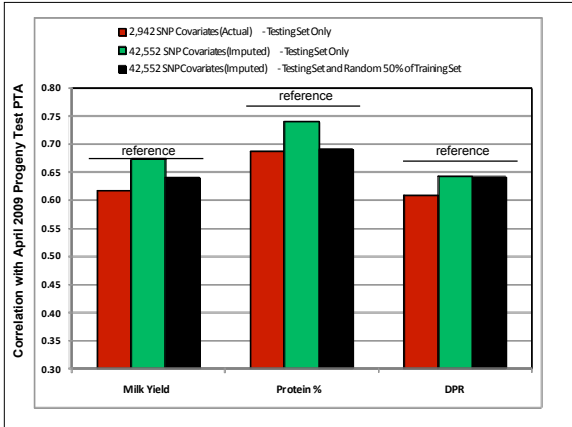


## What is imputation?

- Prediction of **unknown** genotypes from **observed** genotypes
  - Pedigree haplotyping
  - Matching allele patterns
- **Genotypes** indicate how many copies of each allele were inherited
- **Haplotypes** indicate which alleles are on which chromosome

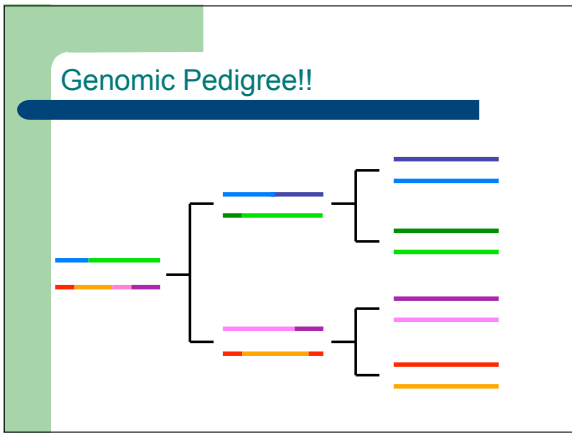
## Why impute haplotypes?

- Predict dam from progeny SNP
- Predict unknown SNP from known
  - Measure 3,000, predict 50,000 SNP
  - Measure 50,000, predict 850,000
  - Measure each haplotype at highest density only a few times
- Increase reliabilities while minimizing costs – \$40 vs \$225 vs \$325



### Correlations of 3K and PA with 50K

Trait	Corr(3K,50K) <sup>2</sup>	Corr(PA,50K) <sup>2</sup>	Gain
NM\$	.899	.518	79%
Milk	.920	.523	83%
Fat	.920	.516	83%
Prot	.920	.555	82%
PL	.933	.498	87%
SCS	.912	.417	85%
DPR	.937	.539	86%



- ### Conclusions
- Genomics is radically altering dairy cattle breeding
  - We are collaboratively developing tools to increase the ability to characterize cattle with very high density SNP chips
  - We are developing with industry partnerships to bring this technology to the producer level
    - This technology has the potential to impact the developing world

iBMAC Consortium	Implementation Team	Funding
<ul style="list-style-type: none"> <li>• Illumina (industry)               <ul style="list-style-type: none"> <li>– Marylann Munson</li> <li>– Cindy Lawley</li> <li>– Diane Lince</li> <li>– LuAnn Glaser</li> <li>– Christian Haudenschild</li> </ul> </li> <li>• Beltsville (USDA-ARS)               <ul style="list-style-type: none"> <li>– Curt Van Tassell</li> <li>– Lakshmi Matukumalli</li> <li>– Steve Schroeder</li> <li>– Tad Sonstegard</li> </ul> </li> <li>• Univ Missouri (Land-Grant)               <ul style="list-style-type: none"> <li>– Jerry Taylor</li> <li>– Bob Schnabel</li> <li>– Stephanie McKay</li> </ul> </li> <li>• Univ Alberta (University)               <ul style="list-style-type: none"> <li>– Steve Moore</li> </ul> </li> <li>• Clay Center, NE (USDA-ARS)               <ul style="list-style-type: none"> <li>– Tim Smith</li> <li>– Mark Allan</li> </ul> </li> </ul>	<ul style="list-style-type: none"> <li>• AIPL               <ul style="list-style-type: none"> <li>– Paul VanRaden</li> <li>– George Wiggins</li> <li>– John Cole</li> <li>– Leigh Walton</li> <li>– Duane Norman</li> </ul> </li> <li>• BFGL               <ul style="list-style-type: none"> <li>– Marcos de Silva</li> <li>– Tad Sonstegard</li> <li>– Curt Van Tassell</li> </ul> </li> <li>– University of Wisconsin               <ul style="list-style-type: none"> <li>– Kent Weigel</li> </ul> </li> <li>– University of Maryland School of Medicine               <ul style="list-style-type: none"> <li>– Jeff O'Connell</li> </ul> </li> <li>– Partners               <ul style="list-style-type: none"> <li>– GeneSeek</li> <li>– DNA Landmarks</li> <li>– Expression Analysis</li> <li>– Genetic Visions</li> </ul> </li> </ul>	<ul style="list-style-type: none"> <li>• USDA/NRI/CSREES               <ul style="list-style-type: none"> <li>– 2006-35616-16697</li> <li>– 2006-35205-16888</li> <li>– 2006-35205-16701</li> </ul> </li> <li>• USDA/ARS               <ul style="list-style-type: none"> <li>– 1265-31000-081D</li> <li>– 1265-31000-090D</li> <li>– 5438-31000-073D</li> </ul> </li> <li>• Merial               <ul style="list-style-type: none"> <li>– Stewart Bauck</li> </ul> </li> <li>• NAAB               <ul style="list-style-type: none"> <li>– Gordon Doak</li> <li>– Accelerated Genetics</li> <li>– ABS Global</li> <li>– Alta Genetics</li> <li>– CRI/Genex</li> <li>– Select Sires</li> <li>– Semex Alliance</li> <li>– Taurus Service</li> </ul> </li> </ul>

