

***Developing Accurate Parentage Markers for Cattle:
From BSE Traceback to 50k SNP Chips***

Gary Bennett

USDA, ARS, US Meat Animal Research Center

Clay Center, Nebraska

What are SNPs?

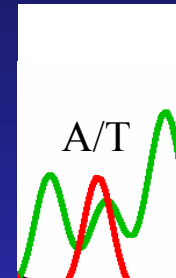
SNPs are sites in the genome where two different nucleotides are observed

individual #1:

maternal chromosome ...aatggtatc**A**attaatgctt...

paternal chromosome ...aatggtatc**T**attaatgctt...

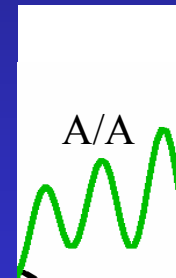
DNA trace file



individual #2:

maternal chromosome ...aatggtatc**A**attaatgctt...

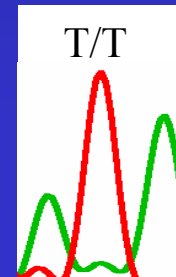
paternal chromosome ...aatggtatc**A**attaatgctt...



individual #3:

maternal chromosome ...aatggtatc**T**attaatgctt...

paternal chromosome ...aatggtatc**T**attaatgctt...



Why SNP?

- **Abundant (approximately 30 million in cattle)**
- **Stable (low back-mutation rate)**
- **Amenable to high-throughput automatic scoring**
- **Low cost per SNP genotype**
- **Many genotyping platforms available**
- **Alleles easily and universally comparable**

Why not SNP?

- Each microsatellite marker is more powerful (several alleles)
- Each SNP can exclude few parents (2 alleles)
- Several SNP needed to equal one microsatellite
- 30 million SNP not independent

Ways to use DNA for traceback

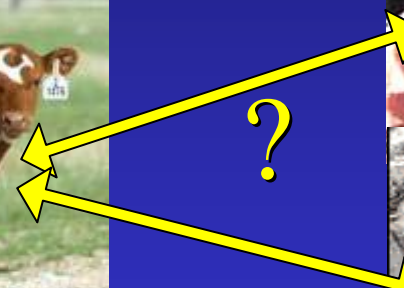
- DNA fingerprinting (sample matching)
 - comparing genotypes between samples
 - resolves disputes if samples were collected at the point of origin *before* a disease outbreak occurred.

- **Advantages:**

- high degree of power
- all genotypes used

- **Disadvantages:**

- requires a preexisting sample



Ways to use DNA for traceback

- **Parentage analysis**

- determining whether alleles are shared between parents and offspring
- may confirm the origin of a diseased animal if tissues from a parent are available.

- **Advantages:**

- preexisting sample of “case” not needed



?



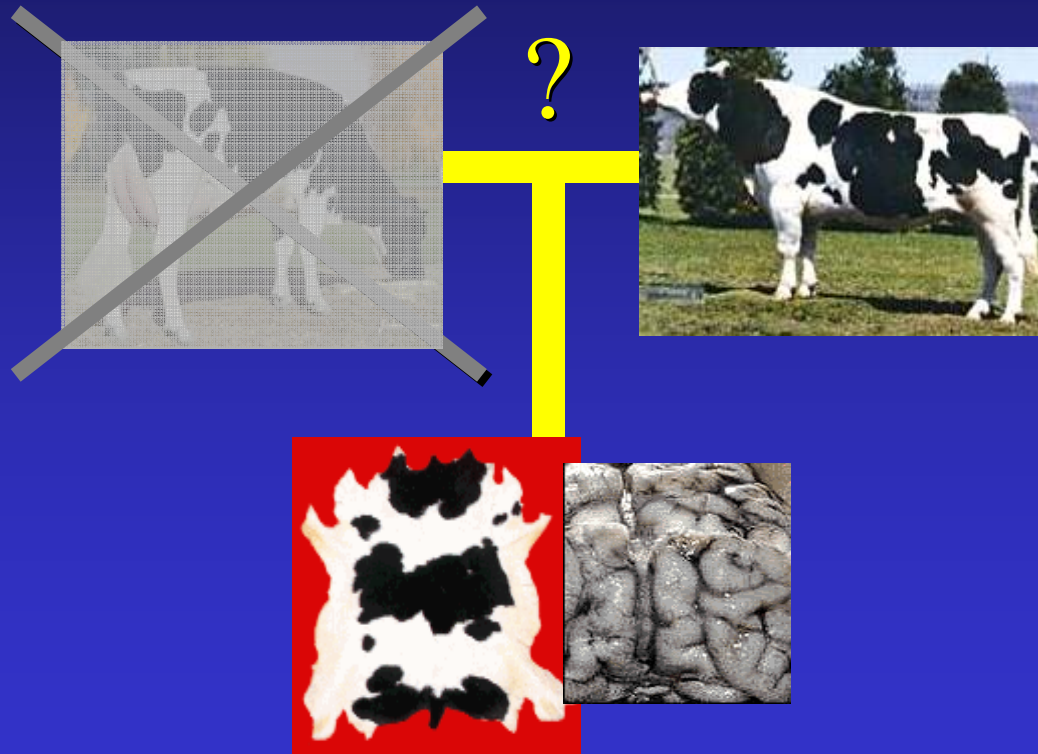
- **Disadvantages:**

- not all genotypes used
- requires more markers
- requires more samples



Sometimes parentage testing is the last resort for DNA-based traceback

- Worst case scenario: only one parent available
- Washington State BSE case



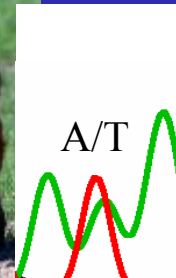
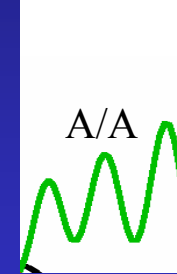
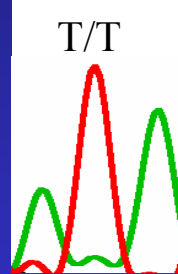
SNP markers for parentage

...aatggtatca**T**attaatgctt...

...aatggtatca**T**attaatgctt...

...aatggtatca**A**attaatgctt...

...aatggtatca**A**attaatgctt...



The offspring must share an allele with each parent

...aatggtatc**A**attaatgctt...

...aatggtatc**T**attaatgctt...

SNP Exclusion – Sire only

Sire	Progeny			Frequency A		
	AA	AT	TT	0.5	0.3/0.7	0.1/0.9
AA			Exclude	.06	.04	.01
AT						
TT	Exclude			.06	.04	.01
Total				.12	.09	.02

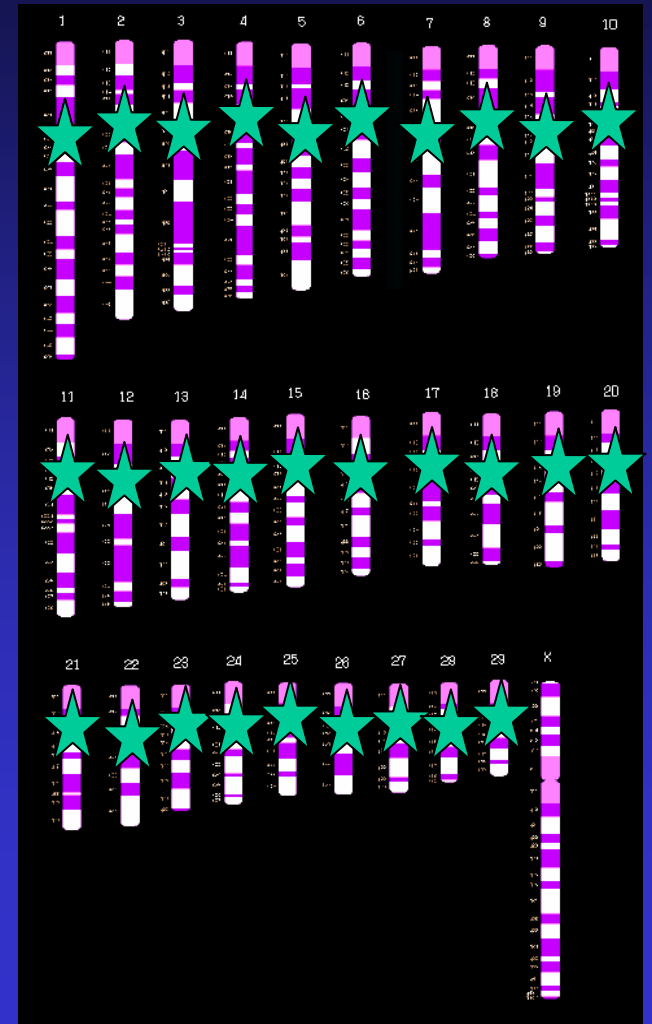
SNP Exclusion – Sire & Dam

Sire	Dam	Progeny			Frequency A		
		AA	AT	TT	0.5	0.3 / 0.7	0.1 / 0.9
AA	AA		X	X	.05	.01	.00
	AT			X	.03	.02	.00
	TT	X		X	.03	.03	.01
AT	AA			X	.03	.02	.00
	AT				0	0	0
	TT	X			.03	.02	.00
TT	AA	X		X	.03	.03	.01
	AT	X			.03	.02	.00
	TT	X	X		.05	.12	.12
Total					.28	.26	.14

The ideal markers are independently inherited



Problem: there are only 29 autosomes



The ideal marker is frequent in all breeds

A collaborative effort was undertaken to assemble many beef and dairy breeds for testing (screening) allele frequency

96 diverse sires from 19 beef breeds (Drs. Heaton and Laegreid; ARS, USMARC)

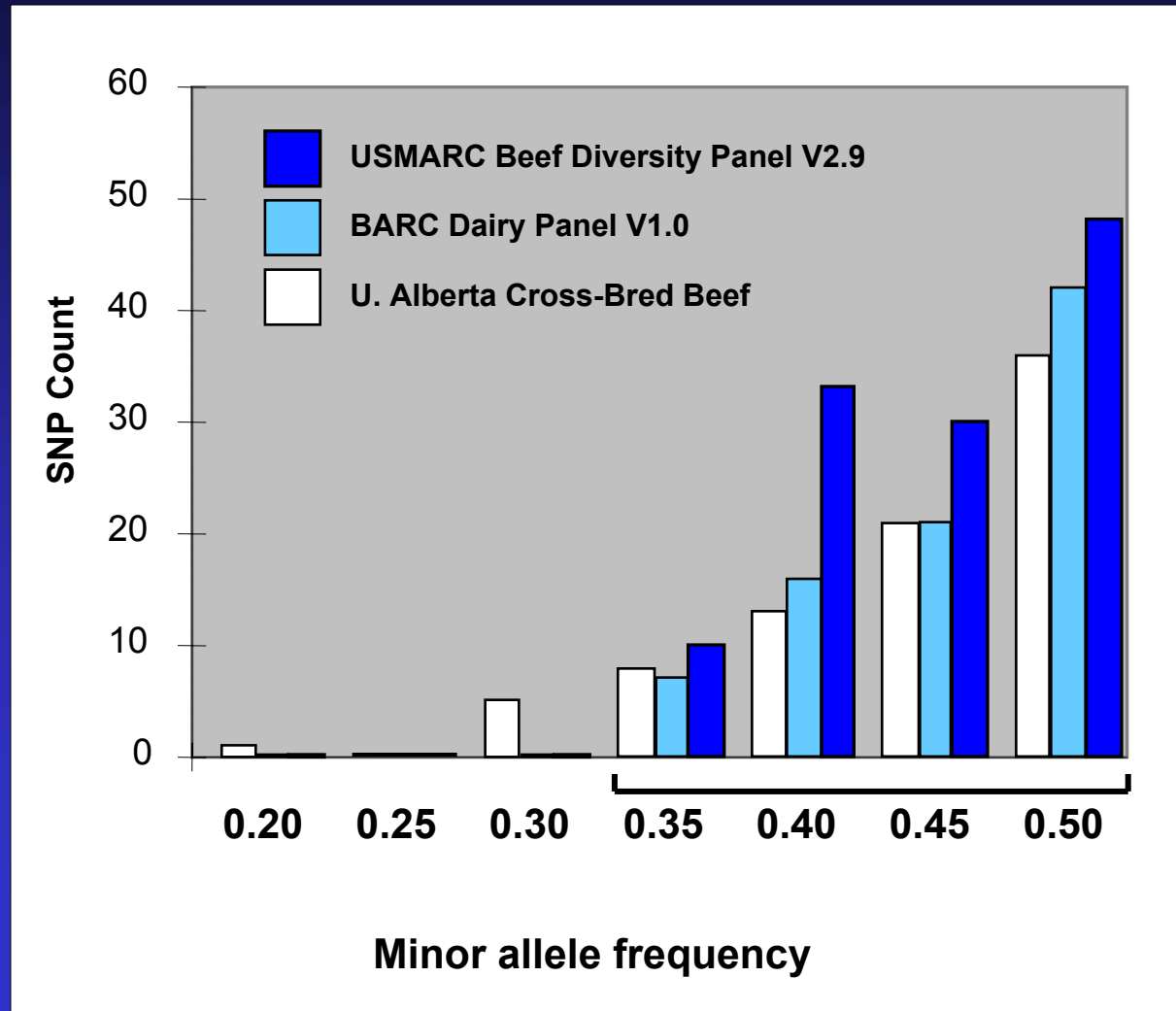
464 cross-bred Canadian beef cattle containing germplasm primarily from Angus, Charolais, Hereford, Simmental, Galloway, and other breeds (Dr. Moore, University of Alberta)

120 prominent sires from 4 dairy breeds (Drs. Van Tassell and Sonstegard; ARS, BARC)

More than 4000 candidate SNPs, mostly from the Bovine Genome Project, were genotyped to select those with best minor allele frequencies (Drs. Heaton, McKay, Moore, and Murdock; MARC and U. Alberta)

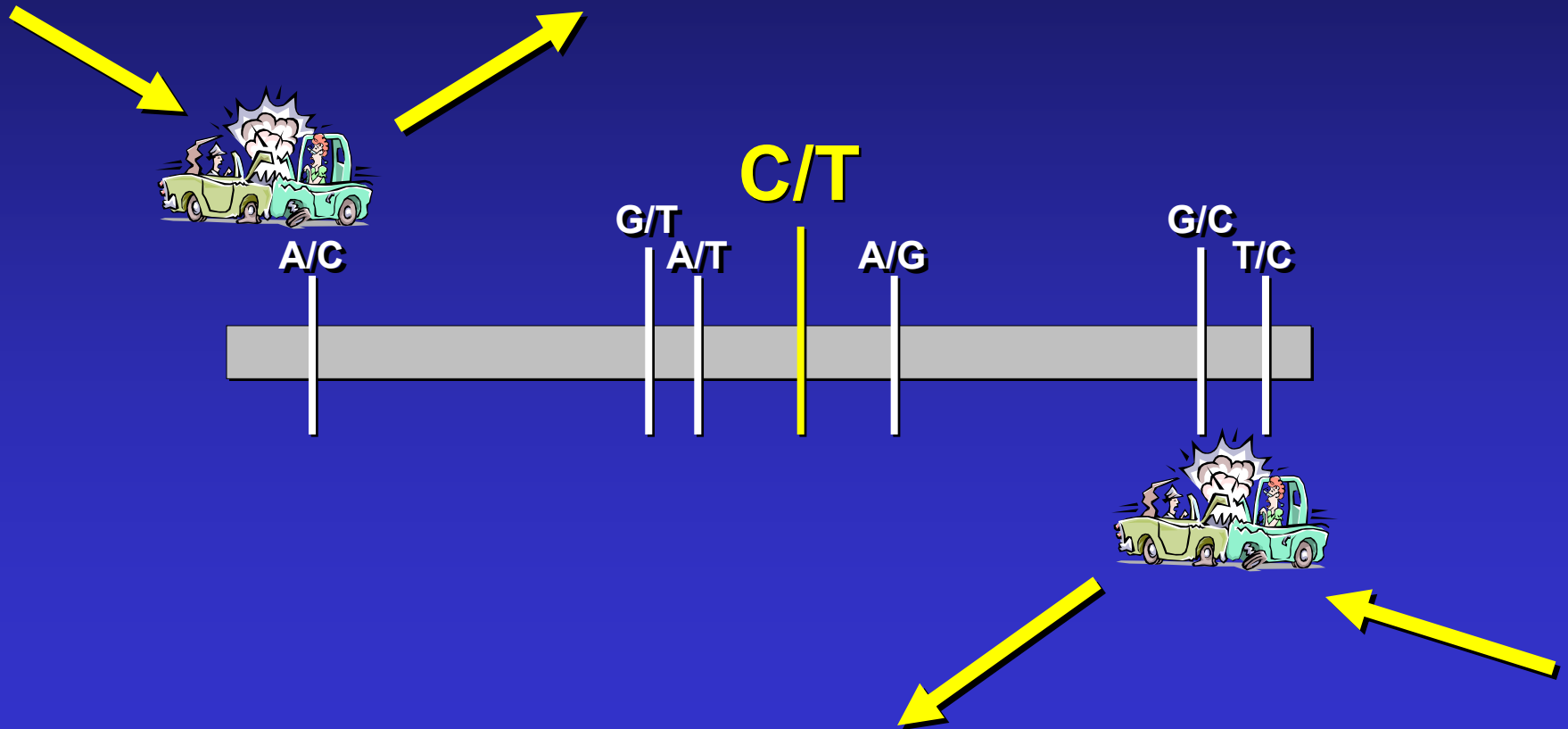


Distribution of minor allele frequencies for 122 parentage SNPs in US and Canadian cattle

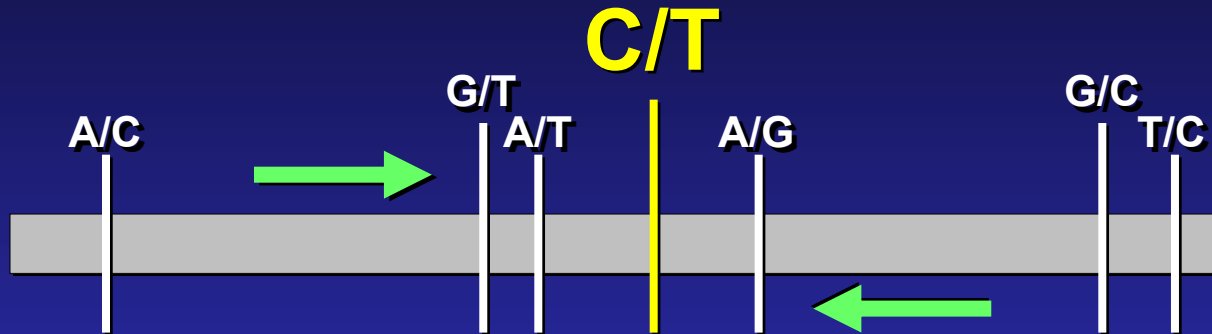


The consequence of 1 SNP every 80 bp

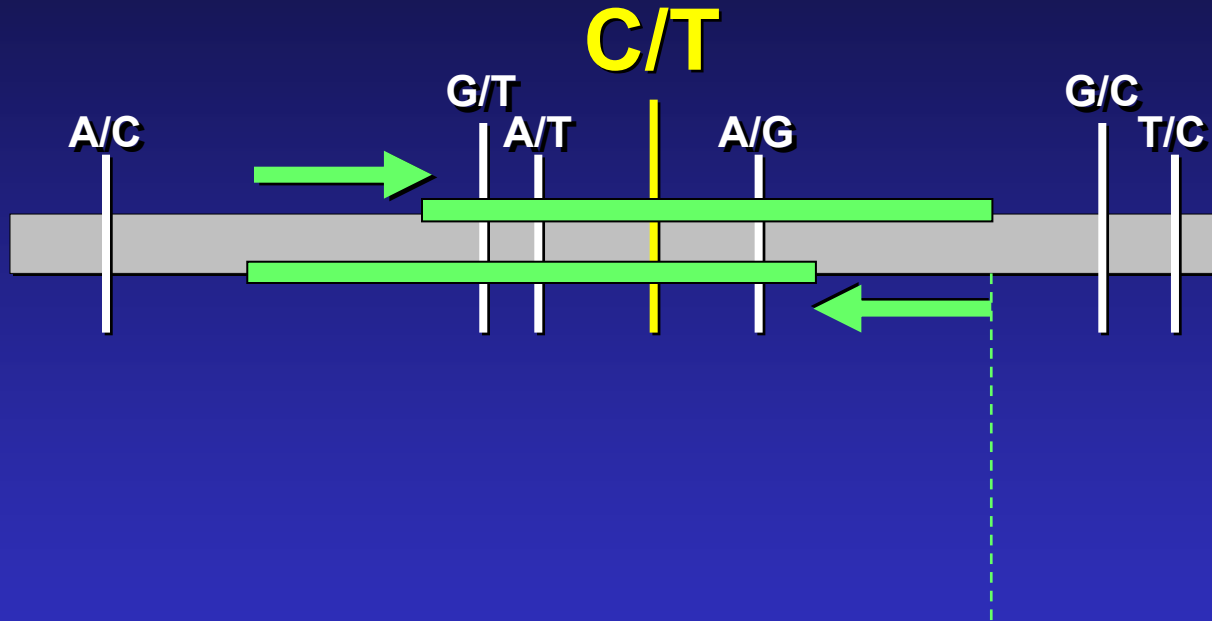
- Wrong genotype assigned to some animals



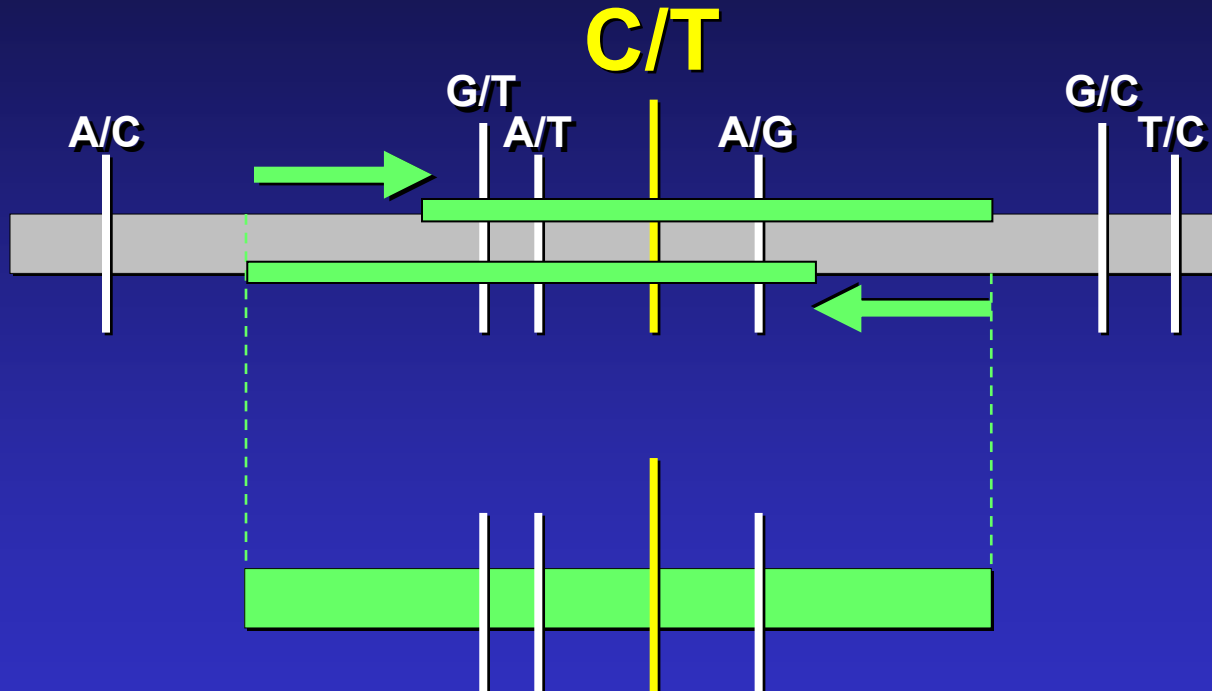
The consequence of 1 SNP every 80 bp



The consequence of 1 SNP every 80 bp

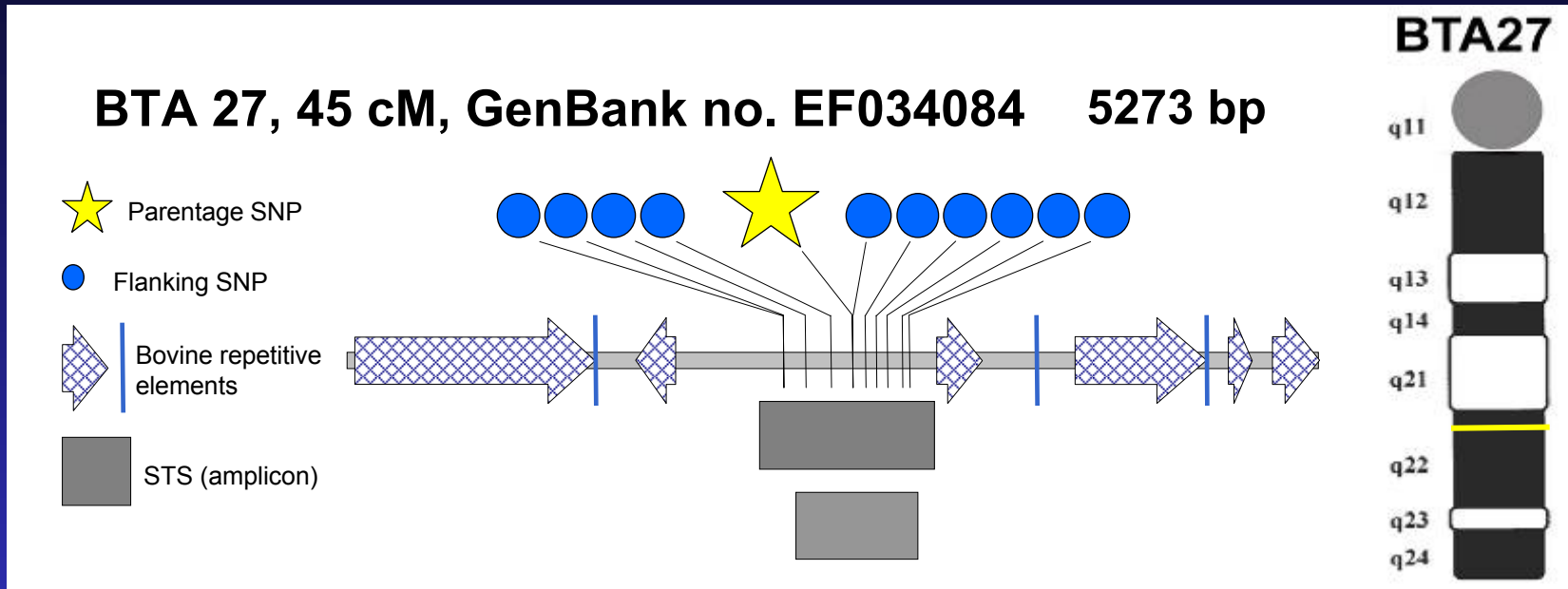


The consequence of 1 SNP every 80 bp



accurate amplification of both maternal and paternal alleles

Physical map



Mean annotation 9.8 kb per file (1.2 Mb total)

1646 adjacent SNPs
259 amplicons
2004 bovine repetitive elements
258 exons
183 CDSs

•Dr. Anjanette Johnston
GenBank Submissions Staff

•Dr. Ilene Karsch Mizrahi
GenBank Coordinator

Public access to SNP information

Ted Kalbfleisch
U. Louisville



http://cgemm.louisville.edu/usmarc/MARC_web_page/traceback.html



A SNP Marker Set for DNA-based Traceback in North American Beef and Dairy Cattle.

SNP Summary Table: SNPs that have been thoroughly screened to accomplish both DNA fingerprinting and parentage testing in U.S. beef and dairy populations, an ability that only a small fraction of known DNA markers have. These are markers are specially selected for optimum power, genome-wide distribution, accuracy in genotyping, and high-throughput "multiplexability". The target SNPs and surrounding DNA was sequenced in a group of 216 diverse sires from 19 beef breeds and 4 dairy breeds representing the vast majority of U.S. cattle. The average minor allele frequencies in beef and dairy are greater than 0.410. The DNA diversity in the adjacent regions has been documented for use in designing DNA tests that will be accurate in more than 99.9% of the North American beef and dairy cattle to be tested. Available information includes, flanking context sequence, allele frequency summaries, cross references to other databases, and genomic mapping.

Available Genotype Data: A table of consensus genotypes for the target SNPs scored in the USMARC Beef Cattle Diversity Panels [V2.1](#) and V2.9, and the BARC Dairy Cattle Diversity Panel [V1.0](#)

Cattle Population Summaries: A table of animal identifiers, as well as their corresponding breed information.

Research results and information provided by Dr. Michael Heaton of the U.S. Meat Animal Research Center ([USMARC](#)), Clay Center, NE.

USDA, ARS Project Number: 5438-32000-023-02 Specific Cooperative Agreement Accession Number: 409004. For more information about the project please see ["Project Info"](#).

This project is in collaboration with scientists at the USDA ARS, Bovine Functional Genomics Laboratory in Beltsville, MD, the University of Alberta's Beef Genomics Laboratory in Edmonton Canada, the Center for Genetics and Molecular Medicine at the University of Louisville, KY, and Cogenics in Morrisville, NC.

Center for Genetics and Molecular Medicine (CGeMM)

Director: Kenneth S. Ramos Ph.D.

Director of Bioinformatics Operations: Ted Kalbfleisch Ph.D.

Please direct questions or comments to [Ted Kalbfleisch](#)



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University of Louisville



SNP Summary Table. SNPs both DNA fingerprinting and an ability that only a small fraction are specially selected for genotyping, and high-throughput surrounding DNA was sequenced in 10 breeds and 4 dairy breeds to determine minor allele frequencies in both the adjacent regions has been tested. Available information includes frequency summaries, cross

Available Genotype Data scored in the USMARC Beef and Dairy Cattle Diversity Panel [View](#)

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Please direct questions or comments to [Ted Kalbfleisch](#)



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Chr	Bank Accession No.	Location of target SNP	USMARC Accession	Oriented (g/c)	Linkage Group	Chr. position (kb)	Chr. Position	Chromosome Identifier	SNP Name	Approximate No. of SNPs in Panel	Minor Allele Frequency	STS Length (bp)	USMARC Breed	USMARC Breed	USMARC Breed	USMARC Breed	USMARC Breed	USMARC Breed	USMARC Breed	USMARC Breed	
DQ383113	1399	rs29012842	rev	BTA_1	7	chr_1	(8)	SCAFFOLD131069_21121		826	21	1383	0.49	0.448	ad	0.408					
DQ451555	2281	rs29010795	rev	BTA_1	34	chr_1	-	SCAFFOLD155476_15944		1191	14	1035	0.432	0.416	ad	0.422					
AY773474	1589	g/c	na	BTA_1	51	chr_1	-	DVEPC18		1192	11	925	0.408	nd	0.355	nd					
DQ404150	2655	rs29012530	rev	BTA_1	70	chr_1	-	SCAFFOLD130660_59457		1071	4	1053	0.448	0.453	ad	0.485					
DQ404146	2834	-	na	BTA_1	115	chr_1	-	RES6_Comp246_498		996	9	1063	0.4375	0.417	ad	0.396					
AY701135	1014	rs29009725	rev	BTA_1	138	chr_1	-	9897		1262	10	798	0.364	nd	0.408	nd					
DQ404151	931	rs29018282	rev	BTA_1	154	chr_1	100381222	SCAFFOLD191312_882		1020	13	1030	0.49	0.469	ad	0.379					

Public access to SNP information

Ted Kalbfleisch
U. Louisville



http://cgemm.louisville.edu/usmarc/MARC_web_page/traceback.html



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Genbank Accession	AY773474	AY776154	AY841151	AY842472	AY842473	AY842474	AY842475	
SNP Position	1589	1982	6724	1027	1511	1201	1726	
dbSNP ID	(a)-	-	rs29003466	rs29001941	rs29001956	rs29003226	rs29002127	
Animal Number	Breed	A/T	G	G	C/G	A/G	C/G	G
176155	Holstein	A/T	G	G	C/G	A/G	C/G	G
182867	-	T	G	T	G	G	G	A
20300442	Holstein	A	A	T	G	G	G	A/G
20300638	Holstein	A	A/G	G/T	C/G	A/G	C/G	A
20300902	Holstein	T	G	G/T	C/G	A/G	C/G	A/G
20300914	Red & White Holstein	T	A/G	T	C/G	A/G	C/G	A/G
20300918	Holstein	T	A/G	G	C/G	G	C/G	A
20300933	Jersey	T	A/G	T	C	A	C	G
20301363	Holstein	A/T	A/G	G/T	C	A/G	G	G
2031217	Red & White Holstein	T	G	G	G	A	C	A/G
2031243	Brown Swiss	T	A	G	C/G	A/G	C/G	A
2031449	Red & White Holstein	A/T	A/G	G/T	C/G	A/G	G	A/G

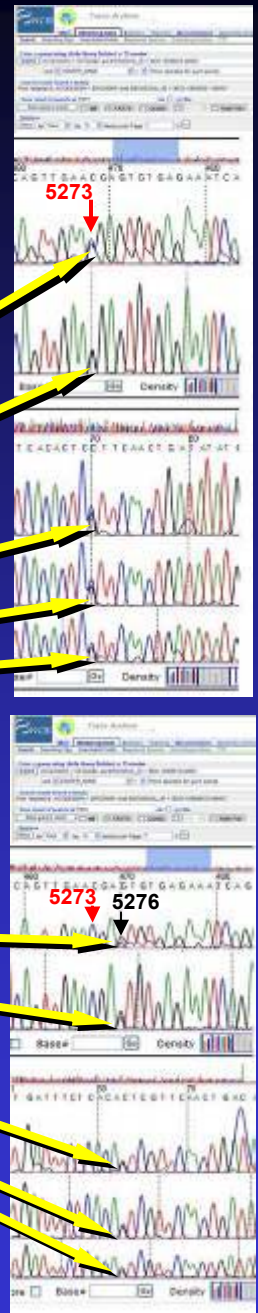
Linking genotypes to tracefiles

- >350,000 genotypes
- >136,000 publicly viewable tracefiles
- >2,000,000 tracefile genotypes

Table 3. Selected animal genotypes for 11 SNPs in EF034084

		Nucleotide position on GenBank accession number EF034084										
Breed	Animal no.	4910	4914	5025	4697	5273 ^a	5276	5345	5378	5456	5506	5574
Angus	19879801	T/T	C/C	G/G	C/C	C/G	G/G	T/T	C/C	C/C	G/G	G/G
Angus	19939802	T/T	C/C	G/G	C/C	C/G	G/G	T/T	C/C	C/C	G/G	G/G
Angus	19999821	T/T	C/C	G/G	C/C	C/G	G/G	T/T	C/C	C/C	G/G	G/G
Angus	19999822	T/T	C/C	G/G	C/C	G/G	G/G	T/T	C/C	C/C	G/G	G/G
Angus	19999823	T/T	C/C	G/G	C/C	G/G	G/G	T/T	C/C	C/C	G/G	G/G
Angus	19999825	T/T	C/C	G/G	C/C	G/G	G/G	T/T	C/C	C/C	G/G	G/G
Brahman	19919842	T/T	C/C	G/G	C/C	C/G	G/G	T/T	C/C	C/C	G/G	G/G
Brahman	19999811	T/T	C/T	A/G	C/C	C/G	G/G	T/T	C/C	C/C	G/G	G/G
Brahman	19999812	T/T	T/T	A/A	C/C	C/C	G/G	T/T	C/C	C/C	G/G	G/G
Brahman	19999813	T/T	C/T	A/G	C/C	C/C	C/G	T/T	C/C	C/C	G/G	G/G
Brahman	19999819	T/T	C/C	G/G	C/C	G/G	G/G	T/T	C/C	C/C	G/G	G/G

^aSNP selected for use in traceback by parentage analysis.



Genetically sound, but ...

- **Sample integrity**
 - Right sample, right label, no contamination
- **SNP genotyping technology**
 - Accuracy of genotypes, high call rates, error free sample handling, no contamination
- **Selection of SNP**
 - Evenly spaced, intermediate frequencies, present in many different breeds and populations
- **Delivery of information**
 - Convenient, when needed, correct
- **Easy, Quick, Accurate, Efficient, Economical**

The DNA-Based Traceback of the Washington State BSE Case



Announced by USDA on December 23, 2003

First recorded BSE case in the U.S. history

USMARC was asked to help. We designed DNA experiments, decoded the results, and wrote the report.



The dispute

“There's some confusion about the paperwork....”

Which of the 9 downer cattle slaughtered that day had the BSE-infected brain?

“DNA testing by the best experts available could compare samples from the mad cow and its offspring or parents.”



Dr. Brian Evans
Chief Veterinary Officer
Canadian Food Inspection Agency

<http://www.cbc.ca/stories/2003/12/27/Evans271203>

<http://www.guardian.co.uk/bse/article/0,2763,1113783,00.html>

USDA briefing – December 31



USDA's Chief Veterinarian
Dr. Ron DeHaven of APHIS

“...we are sending multiple samples to two laboratories -- one in Canada and one in the United States.”

“... the U.S. laboratory is in Nebraska, [and] It's a USDA laboratory that has that expertise.”

The situation

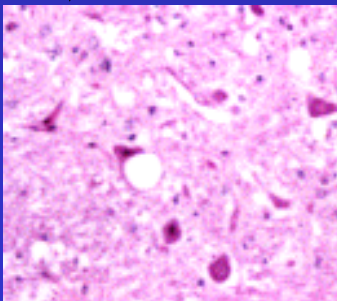
APHIS had physical evidence indicating that the index cow was born in Canada



Holstein downer cow processed at Moses Lake, WA on December 9th



Its brain tested positive for BSE on December 22nd



Case ID	Date of Birth	Sex				
Location No.	Sex	Service Date	Continued Program	Date Due		
Culling Date	Age	Cow Weight	Participation Event	Refused Date		
Call ID	Sex	Call Weight	Industry at Birth	Health	Condition	Inspected Date
Comments						

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Comments						



We asked APHIS to gather pedigree records and tissue samples from all available relatives

The key question:

Was that ear tag really attached to the animal with the BSE brain?

The situation

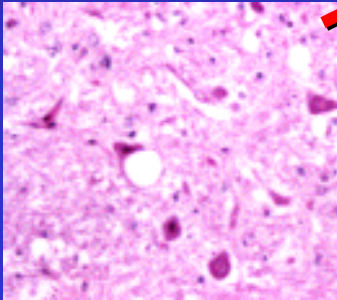
APHIS had physical evidence indicating that the index cow was born in Canada



Holstein downer cow processed at Moses Lake, WA on December 9th



Its brain tested positive for BSE on December 22nd



DNA from BSE brain

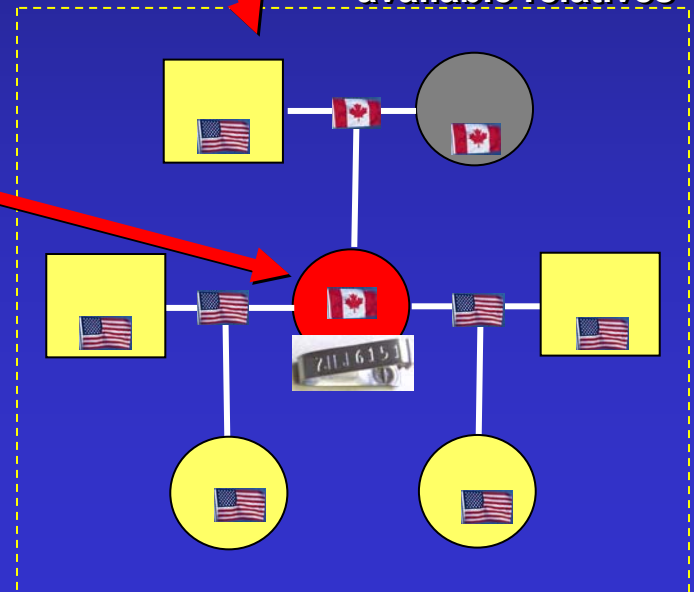


sent from Ames, IA to test validity of *this* pedigree

Cow ID		Date of Birth		Sex	
Location No.	Date	Breeds	Country	Program	Date Recd.
Culling Date	Age	Cow Weight	Parturition Excess	Refused Date	
Calf ID	Sex	Calf Weight	Udders at Birth	Health	Inspected Date
Comments					

Cow ID		Date of Birth		Sex	
Location No.	Date	Breeds	Country	Program	Date Recd.
Culling Date	Age	Cow Weight	Parturition Excess	Refused Date	
Calf ID	Sex	Calf Weight	Udders at Birth	Health	Inspected Date
Comments					

We asked APHIS to gather pedigree records and tissue samples from all available relatives



January 2, 2004

Test results obtained and decoded within 40 hours
(more that 13,000 genotypes from 66 samples)

The screenshot shows a computer desktop with three windows. The top-left window is a spreadsheet with columns labeled E through K and rows containing numerical data. The top-right window is a web browser displaying the Reuters AlertNet website. The browser's address bar shows the URL: <http://www.alertnet.org/the/news/newsdesk/N02318974.htm>. The website header includes the Reuters Foundation logo and a login form with fields for 'Username:' and 'Password:'. Below the header, there is a navigation menu with 'NEWSDESK' selected. The main content area features a news article titled 'Canada says mad cow results not due till next week' dated 02 Jan 2004 15:37:02 GMT. The article text states: 'OTTAWA, Jan 2 (Reuters) - Canada does not expect to release test results until next week on whether a mad cow discovered in Washington state last week came from Canada, an official said on Friday. "Early to mid-next week is what we're looking at right now," Marc Richard, a spokesman for the Canadian Food Inspection Agency said. The U.S. Agriculture Department has set a similar time frame for the DNA tests it is conducting. Earlier, the Canadian government had suggested results could be available this week. Ear tags supplied by the United States led investigators to a cow born in April 1997 on a dairy farm near Leduc, Alberta. The DNA tests will compare the infected brain tissue from the diseased cow in Washington with the sire of the Leduc cow. Mad cow disease is spread when cattle eat feed containing the remains of infected cattle. Both Canada and the United States banned the use of cattle remains in cattle feed in late 1997, after the Leduc cow was born. Another mad cow was discovered in Alberta last May. The two incidents have led to billions of dollars of losses as trade partners...' A 'RELIEF TOPICS' sidebar is visible on the left side of the article, with 'Middle East' selected. The bottom-left window is a 'Date and Time Properties' dialog box showing the date as January 2, 2004, and the time as 10:34:14 AM.

January 6

"We now have DNA evidence that allows us to verify with a high degree of certainty, the [Canadian] birthplace of the BSE-infected cow."



Dr. Ron DeHaven

Canadian officials concurred

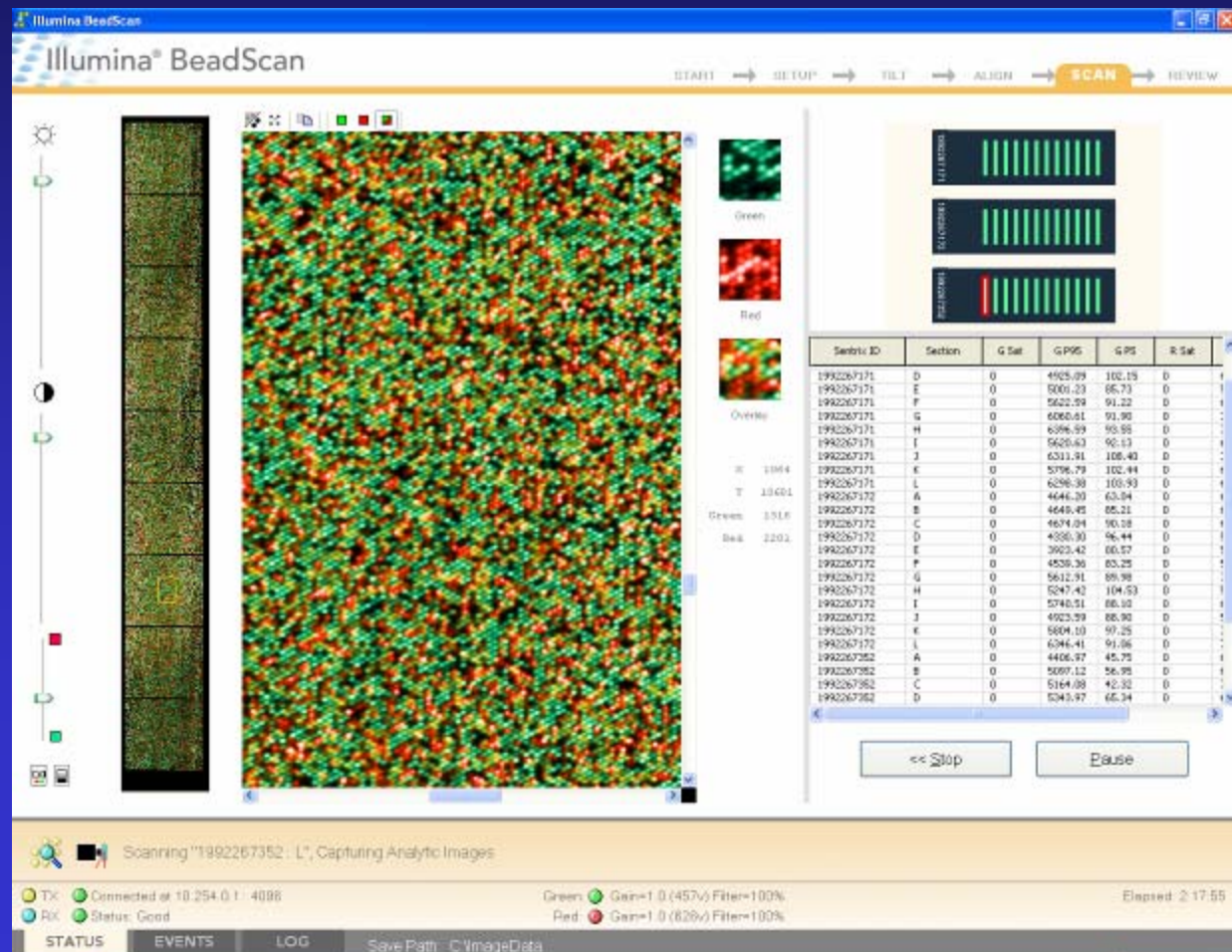


Dr. Brian Evans

Cattle SNP-chip Collaboration

- USDA-ARS U.S. Meat Animal Research Center
- USDA-ARS Beltsville Agricultural Research Center (BARC)
- University of Missouri
- University of Alberta
- Illumina / Solexa

Illumina
iSelect™
assay
(60,800
bead types)
-- hope for
about
53,000
useful SNP
markers



Requirements for Genome Wide Association or Selection

**Markers within each block of Linkage
Disequilibrium (LD) that track the main
functional haplotypes**

**LD blocks of about 100 kilobases in cattle
genome achieve r^2 around 0.3**

3 Gb / 0.1 Mb = 30,000 LD blocks

Goal for the bovine SNP array

- **Achieve > 30,000 SNP**
- **Spread evenly across genome**
- **Highly informative across cattle breeds and populations**

March 2008 | volume 5 | number 3

nature | methods

www.nature.com/naturemethods

Techniques for life scientists and chemists



- Bovine SNP map
- Following stochastic tumor initiation
- High-content TF analysis
- A yeast genome library
- Resolving RNA dynamics with NMR

SNP Content on the Chip

SNPs With MAF (68%)

Reduced Representation Library	25,125
Bovine Hapmap Consortium	12,641
UA-IFASA	934
Others(US-MARC,DPI)	55

Insilico SNPs (32%)

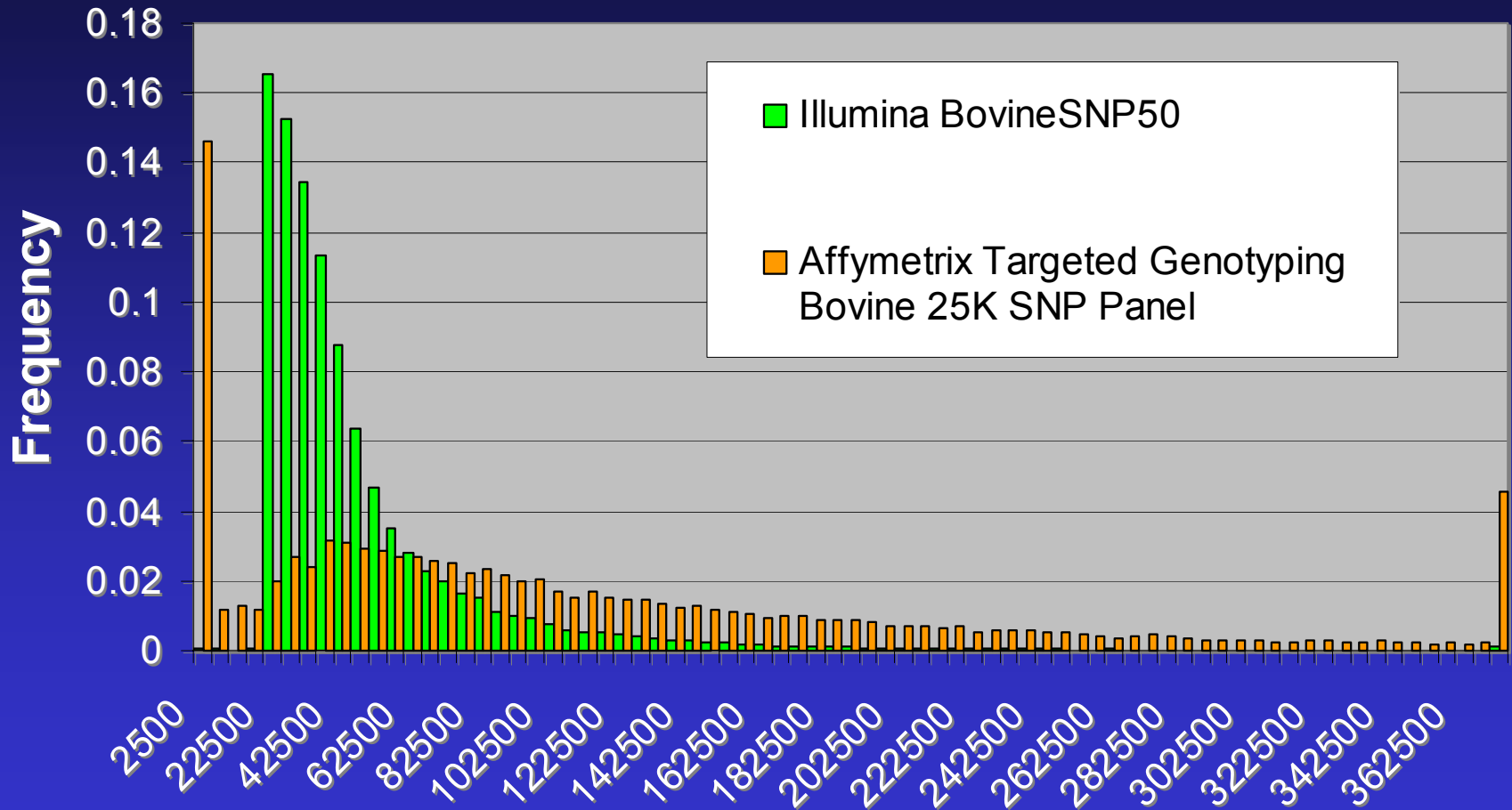
Assembly SNPs	10,075
Inter Breed	6,200
BACend Derived	1,484
INRA, DIAS	310

Mandatory Inclusions (0.2%)

Parentage Markers	118
Selected Genes (BPI,CAPN)	5

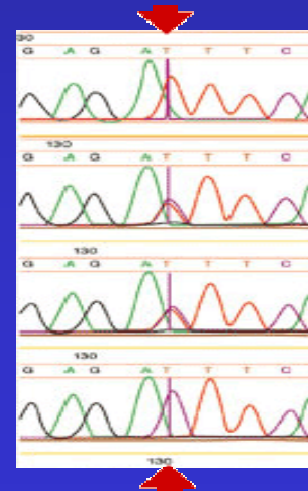
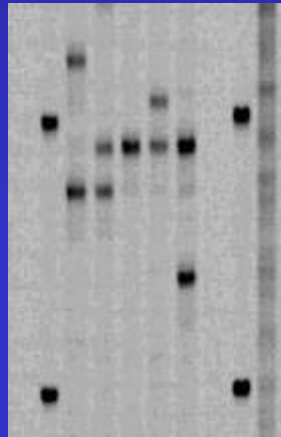
Total **56,947**

Gap Distribution of SNPs along chromosomes



Definitions

- Genome is the whole set of DNA
- Genetic Markers track regions of the genome
 - May be linked/explain phenotypes we observe
- A SNP is a type of genetic marker
 - Single Nucleotide Polymorphism
- A Genotype is the form of DNA present at a specific location in the genome.



Whole Genome Selection (WGS)

- Use 1,000's of SNP to predict EPDs
- Like current marker sets but denser
- Genetic differences in DNA that cause phenotypic differences likely close to many markers
- Accounts for small and ambiguous SNP effects on traits
- Should allow WGS to account for more genetic variation
- As of now unproven but promising

Potential looks good

Simulated accuracy of genetic prediction:

Simulated	EPD	Whole Genome
Sires	72%	84%
Progeny with no records	41%	69%
Unrelated with no records	0%	55%

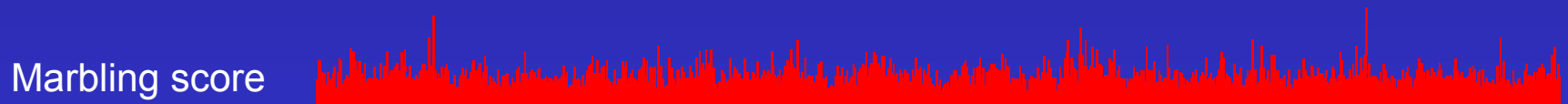
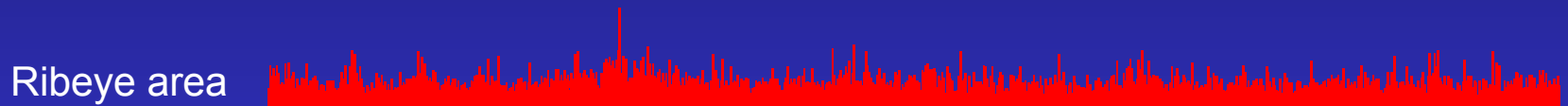
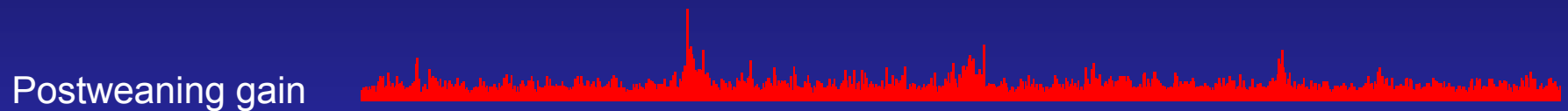
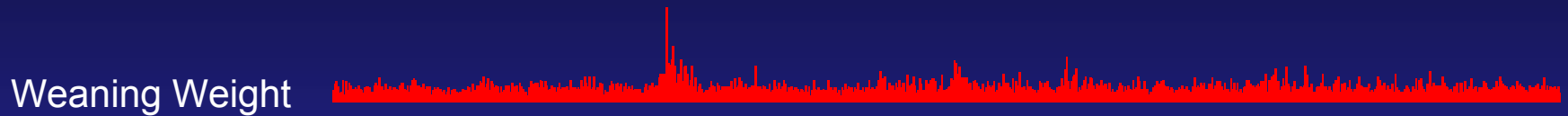
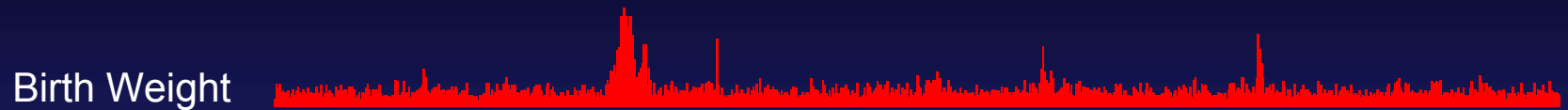
Steps to an initial WGS:

- **Low cost for 1,000's of genotypes (done)**
- **Measure traits on 1,000's of animals or get EPDs on 1,000's of animals (done)**
- **Genotype these animals (done)**
- **Analyze the above training data (in progress)**
- **Genotype breeding animals (in progress)**
- **Estimate molecular breeding values**
- **Interpret and disseminate**

Training Data

- **3,000+ head of pedigreed animals with extensive phenotypes at USMARC genotyped using the 50K chip:**
 - **2,000+ with individual feed intake in finishing or heifer development phase**
 - **2,000+ with carcass data, slice shear force, and rib dissection**
 - **1300+ with age at puberty, pregnancy rate, and maternal performance**
 - **1,100+ that will eventually have individual feed intake as mature cows to estimate maintenance requirements**
 - **3,000+ with calving and growth traits**

Preliminary SNP Associations



1 <----- Chromosomes -----> 29,X

- **Initial results look encouraging**

2,000 Bull Project



2000 Bull Project

- Collaborative effort between USMARC and 16 U.S. beef breed associations that register the most cattle and have a genetic evaluation system.
- Breed associations provide semen for DNA on influential sires
- USMARC runs 50K SNP chip on those 2,000 sires
- USMARC estimates molecular breeding values

Objectives

- **Extend genetic predictions from USMARC phenotypes to industry bulls**
 - EPDs for traits not typically reported (e.g. feed efficiency) delivered to breed associations
- **Validate the effectiveness of WGS using EPDs from the 2000 bulls relative to USMARC data on common traits (e.g., weaning weight)**
- **Improve accuracy of EPDs for common traits**
- **Determine to what extent training data must be of the same breed as in which WGS will be applied**

Number of Sires to Sample

• Angus	400	• Brangus	84
• Hereford	282	• Beefmaster	83
• Simmental	234	• Maine-Anjou	59
• Charolais	156	• Brahman	42
• Red Angus	154	• Chiangus	39
• Limousin	145	• Santa Gertrudis	39
• Gelbvieh	135	• Salers	37
• Shorthorn	91	• Braunvieh	20

Potential pitfalls

- We don't know that the process of WGS will work
- May need more than 50,000 markers
- Patents might restrict use? Our results will be accessible to all.
- Need to develop complex computational methods
 - 1992-2006: 1.7 million genotypes at USMARC
 - 2007-2008: ~300 million genotypes expected from chip results

