# Applications of haplotypes in dairy farm management

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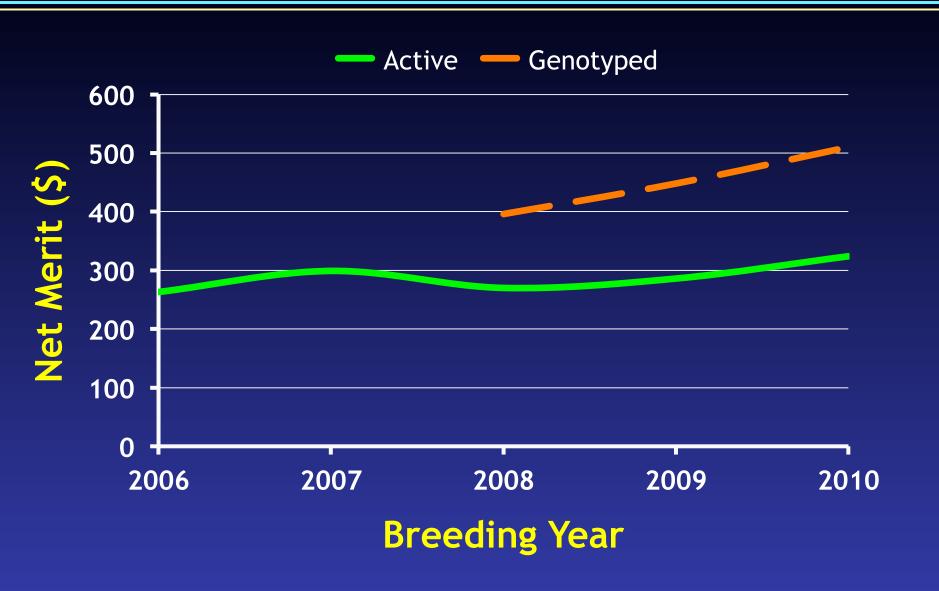
#### Introduction

- Genomic selection increases selection response by reducing generation interval
- Bulls were genotyped first due to cost
- Now we have genotypes for many cows
- What can we do with those data that we couldn't do before?

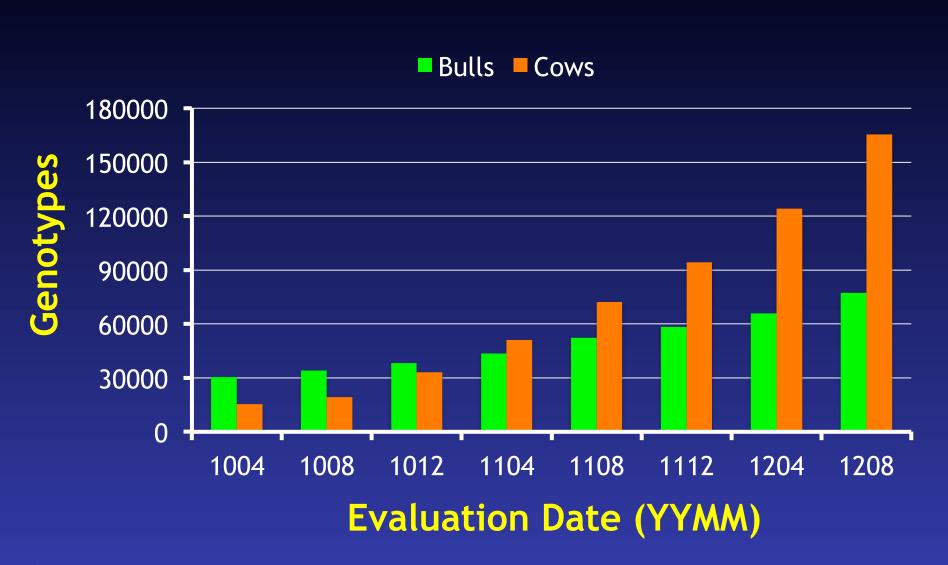
# O-Style Haplotypes Chromosome 15



#### Genetic merit of Jersey bulls

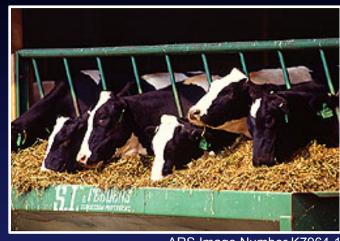


#### Many cows have been genotyped



#### Haplotypes for farm management

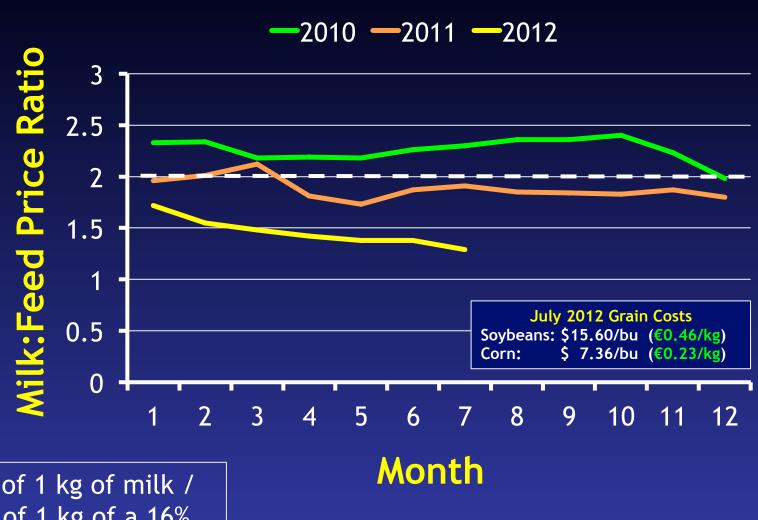
- Many uses other than genetic evaluation
  - Culling decisions
  - Mating strategies



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- Identification of new recessive defects
- Phenotypic prediction

#### Input costs are rising quickly



M:FP = price of 1 kg of milk / price of 1 kg of a 16% protein ration

# Optimal culling decisions

- Low density genotypes on females can be used to guide early culling decisions
  - 165,526 genotyped cows in August 2012
- Sexed semen increases heifer population from which to select
- What animals should be retained and what animals culled?

#### Testing and selecting heifer calves

	EBV selected calves	Optimal fraction calves	EBV selected calves	Cost of genomic testing	NIDV/ - 6
Calves selected	(pre- ranked, 35% rel.)	tested with genomic test (65% rel.)	(after genomic testing)	per selected calf	NPV of selected calves
100%	€0	-		€0	€0
90%	€31	70-100	€46	€13	€52
80%	€64	60-90	€78	€14	€94
70%	€87	50-90	€113	€22	€136
60%	€112	40-80	€145	€25	€176
50%	€139	30-70	€179	€30	€218

EBV = estimated breeding value, NPV = net present value

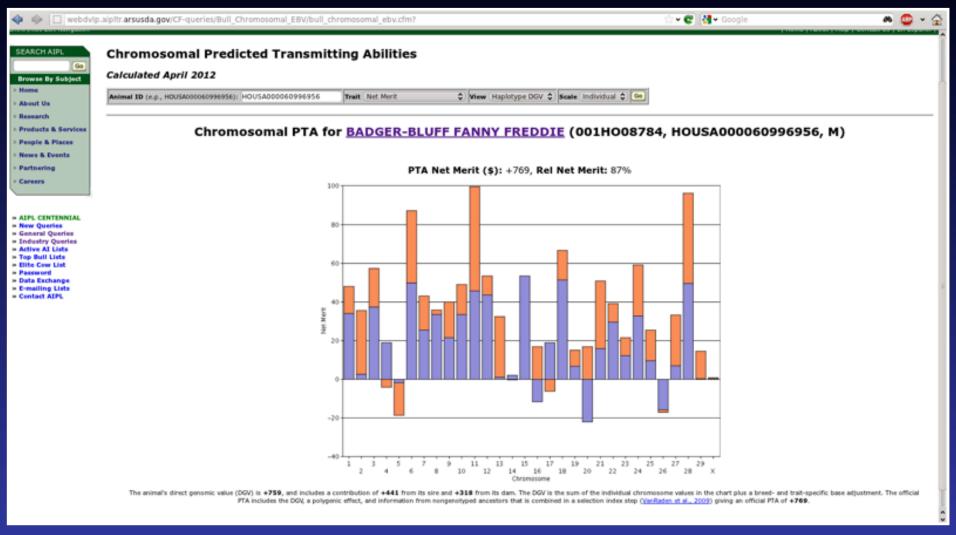
# Bottom line economics

	No sexed	2x sexed	No sexed	2x sexed
Pre-ranking calf reliability	0%	0%	35%	35%
Genomic testing policy <sup>1</sup>	20-100	0-100	70-90	50-90
Statistics (€/cow/year):				
Profit without heifer calf value	381	378	381	378
Heifer calves sold	14	31	14	31
NPV calves before pre-ranking	99	101	99	101
NPV calves due to pre-ranking	0	0	30	51
Added NPV from genomic testing	38	71	7	16
Cost of genomic testing	7	23	4	9
Heifer calf value	146	180	148	191
Profit with heifer calf value	527	558	529	569
		¹7K test (€	€36.50, 65%	reliability)

#### Farmers want new genomic tools



### New haplotype query

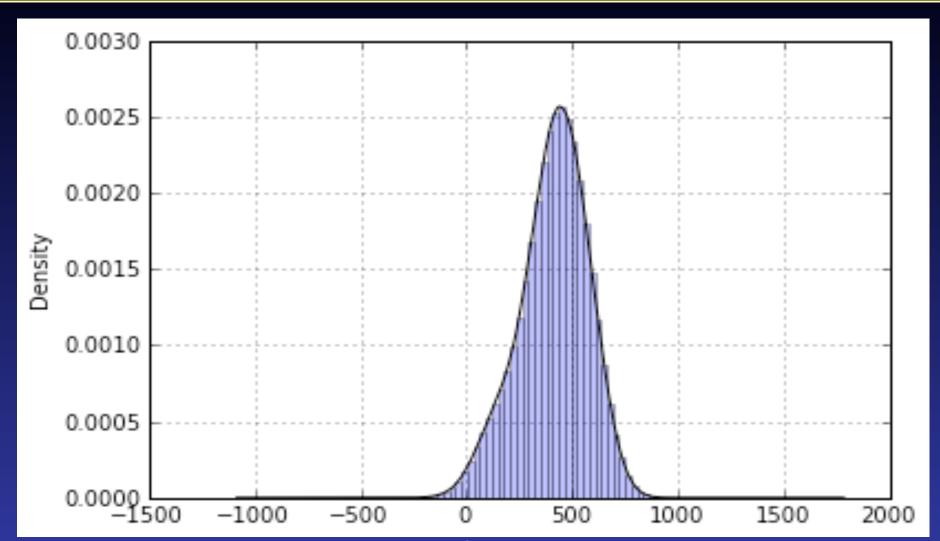


Cole, J.B., and Null, D.J. 2012. AIPL Research Report GENOMIC2: Use of chromosomal predicted transmitting abilities. Available: <a href="http://aipl.arsusda.gov/reference/chromosomal\_pta\_query.html">http://aipl.arsusda.gov/reference/chromosomal\_pta\_query.html</a>.

#### Simulated matings

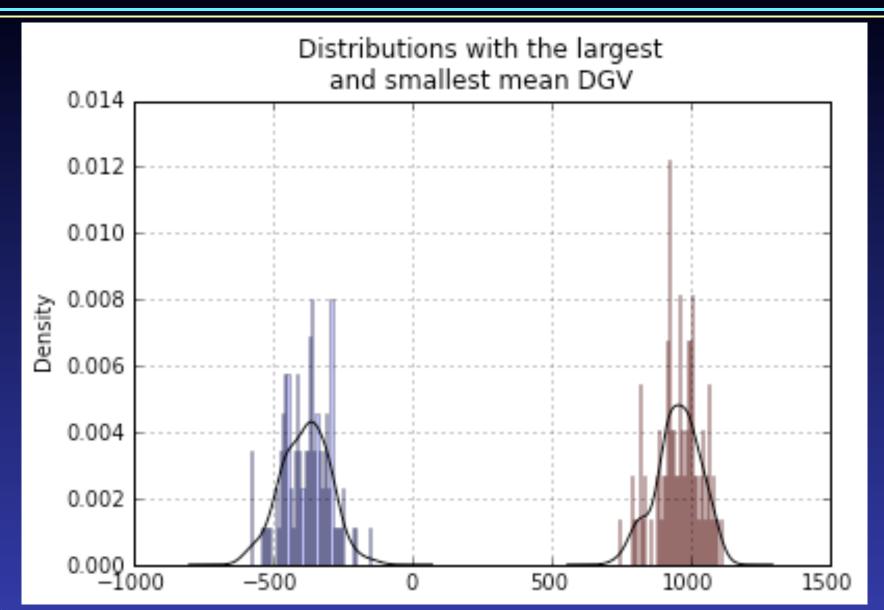
- Mated all genotyped Jersey bulls and cows in a fully cross-classified design
  - ▶ 5,877 bulls and 15,553 cows
    - 91,404,981 matings
  - Crossovers, independent assortment
  - 100 replicates per mate pair
- Mean, variance, skewness, and kurtosis

# Distribution of progeny DGV

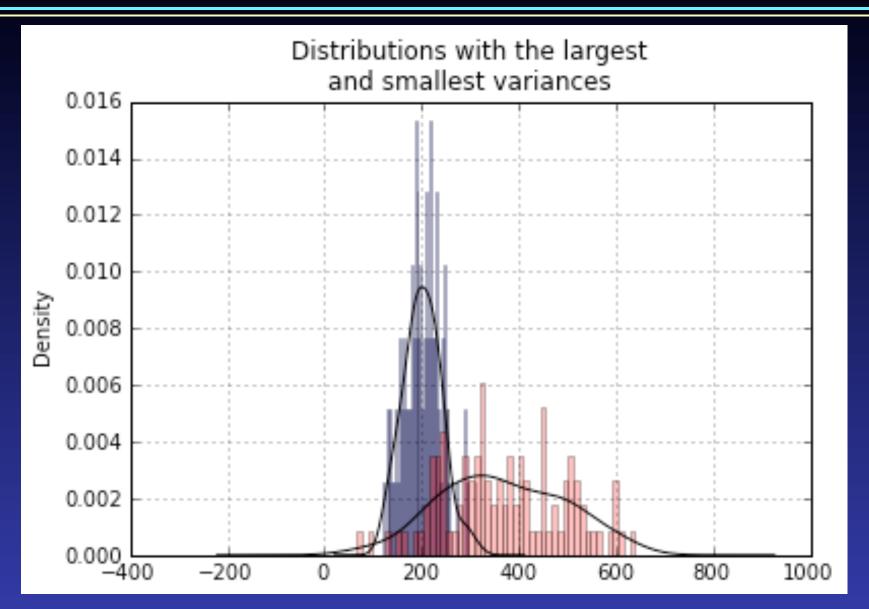


Distribution of 6,000,000 randomly sampled simulated matings.

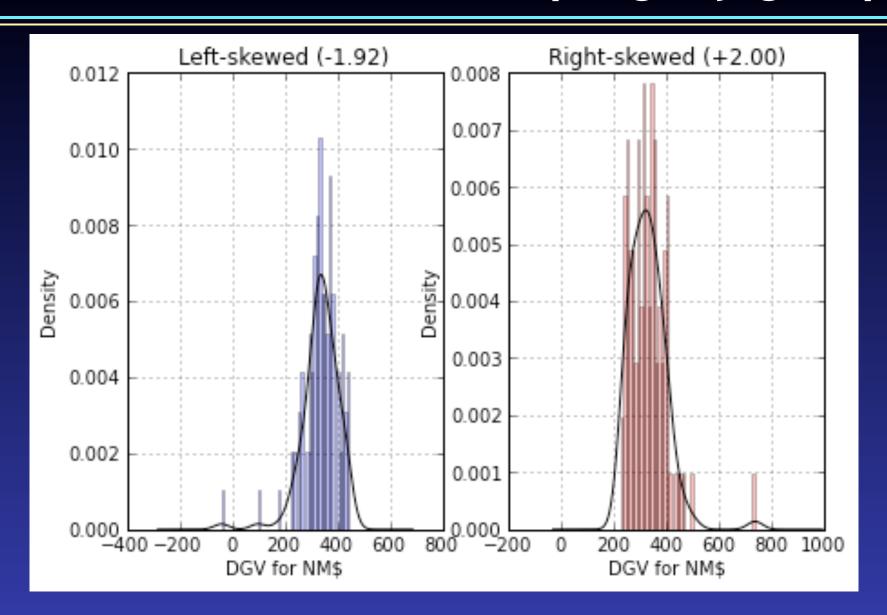
## Most extreme groups for progeny DGV



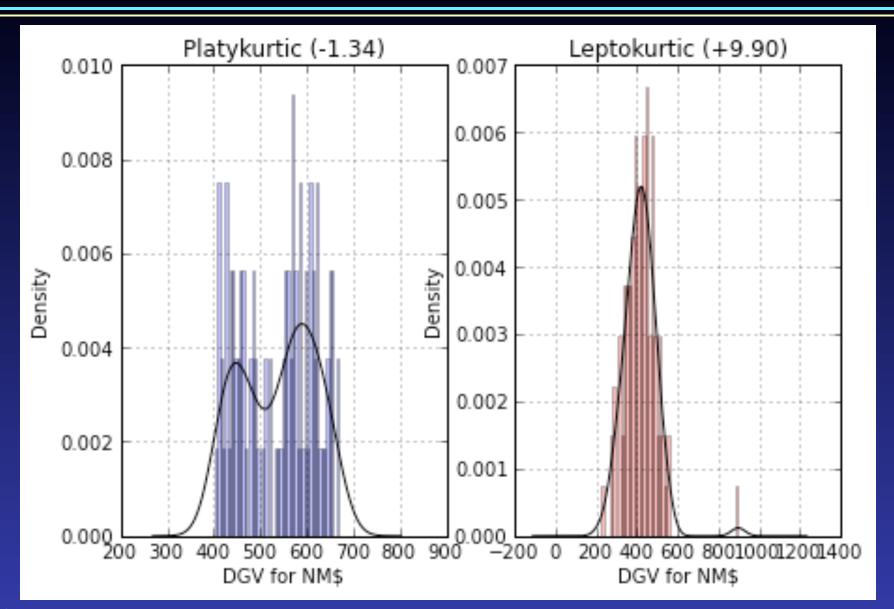
# Most extreme groups for DGV variance



#### Most- and least-skewed progeny groups



### Most- and least-kurtotic progeny groups



#### Within-herd analysis

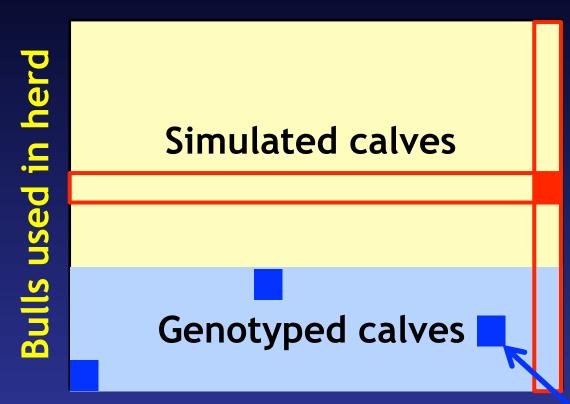
- Selected 3 Jersey herds
  - Ranked by number of genotyped animals and percentage of 50K genotypes
- Compared actual with possible matings
- Could the herd manager have selected better mate pairs?

#### Comparison to actual matings

- Simulated matings were compared to
  220 actual matings from 142 mate pairs
- Three strategies tested in simulation
  - Mating plans using traditional and genomic PTA as in Pryce et al. (2012)
  - Selection of mate pairs with greatest mean DGV
  - Bulls limited to 10 matings

#### Sire portfolios

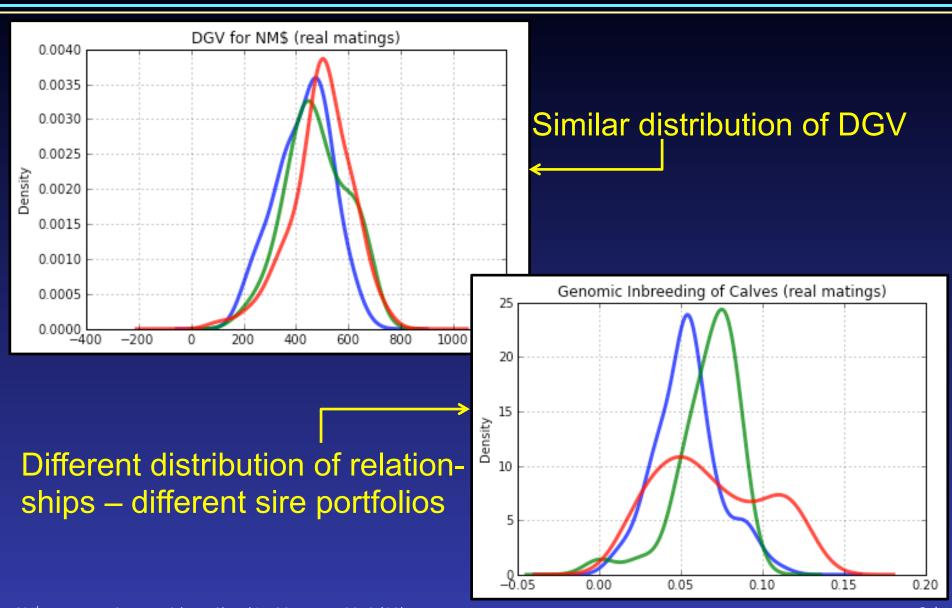
#### Cows in herd



Consider each bull as a mate for each cow using different strategies.

Actual calves born to these parents.

#### Actual DGV and inbreeding



#### Herd 1 results

	Actual <sup>1</sup>	Best PTA <sup>2</sup>	Best gPTA <sup>2</sup>	Best DGV <sup>2</sup>
Genetic value	416	308	446	452
Difference	-	-108	+28	+36
SE(Genetic)	12	7	11	12
Inbreeding	0.053	0.075	0.083	0.070
Min	0.010	0.005	0.027	<0.001
Max	0.110	0.274	0.145	0.112
Correlation	_	0.443	0.218	0.247

<sup>&</sup>lt;sup>1</sup>Results from 94 genotyped offspring of 62 cows.

 $<sup>^{2}</sup>$ Simulated matings of 62 cows to a portfolio of 54 bulls (n=3348 combinations).

#### Herd 2 results

	Actual <sup>1</sup>	Best PTA <sup>2</sup>	Best gPTA <sup>2</sup>	Best DGV <sup>2</sup>
Genetic value	468	396	534	538
Difference	-	-72	66	70
SE(Genetic)	23	14	13	13
Inbreeding	0.068	0.051	0.077	0.077
Min	0.025	0.001	0.021	0.021
Max	0.090	0.120	0.124	0.106
Correlation	_	0.577	0.735	0.745

<sup>&</sup>lt;sup>1</sup>Results from 31 genotyped offspring of 19 cows.

<sup>&</sup>lt;sup>2</sup>Simulated matings of 19 cows to a portfolio of 31 bulls (n=589 combinations).

#### Herd 3 results

	Actual <sup>1</sup>	Best PTA <sup>2</sup>	Best gPTA <sup>2</sup>	Best DGV <sup>2</sup>
Genetic value	480	342	505	501
Difference	-	-138	25	21
SE(Genetic)	19	8	12	10
Inbreeding	0.068	0.076	0.093	0.068
Min	0.015	0.000	0.045	0.015
Max	0.125	0.183	0.178	0.106
Correlation	_	0.665	0.682	0.495

<sup>&</sup>lt;sup>1</sup>Results from 95 genotyped offspring of 38 cows.

<sup>&</sup>lt;sup>2</sup>Simulated matings of 38 cows to a portfolio of 25 bulls (n=950 combinations).

#### Specific combining ability

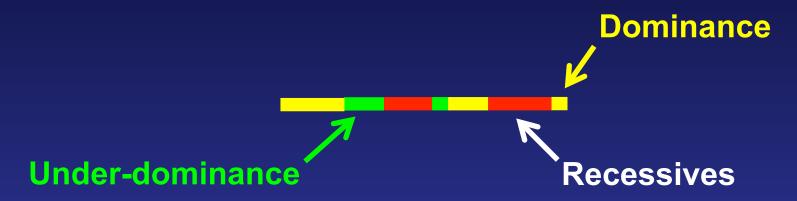
- Quantitative model
  - Must solve equation for each mate pair
- Genomic model
  - Compute dominance for each locus
  - Haplotype the population
  - Simulate matings and compute average dominance

#### Inbreeding effects

- Are inbreeding effects distributed uniformly across the genome?
  - Where are the recessives and the overand under-dominant loci?
- Inbreeding changes transcription levels and gene expression profiles in D. melanogaster (Kristensen et al., 2005)

### Precision inbreeding

 Runs of homozygosity may indicate genomic regions where inbreeding is acceptable



 Can we target those regions by selecting among haplotypes?

#### Phenotypic prediction

- Can haplotypes be used to improve phenotypic predictions?
  - Models with GxE are better predictors (Bryant et al., 2005)
  - Models with A+D better than records from relatives (Lee et al., 2008)
  - Disease risk can be predicted even if mechanisms unknown (Wray et al., 2005)

#### Unknown phenotypes

- Susceptibility to disease
  - e.g., Johne's is difficult to diagnose
- Differential response to management
  - e.g., Feed conversion efficiency
- Can simulate more plausible outcomes with haplotypes than genotypes
  - Chromosome transmitted, not means

#### Loss-of-function mutations

- At least 100 LoF per human genome surveyed (MacArthur et al., 2010)
  - Of those genes ~20 are completely inactivated
  - Uncharacterized LoF variants likely to have phenotypic effects
- How can mating programs deal with this?

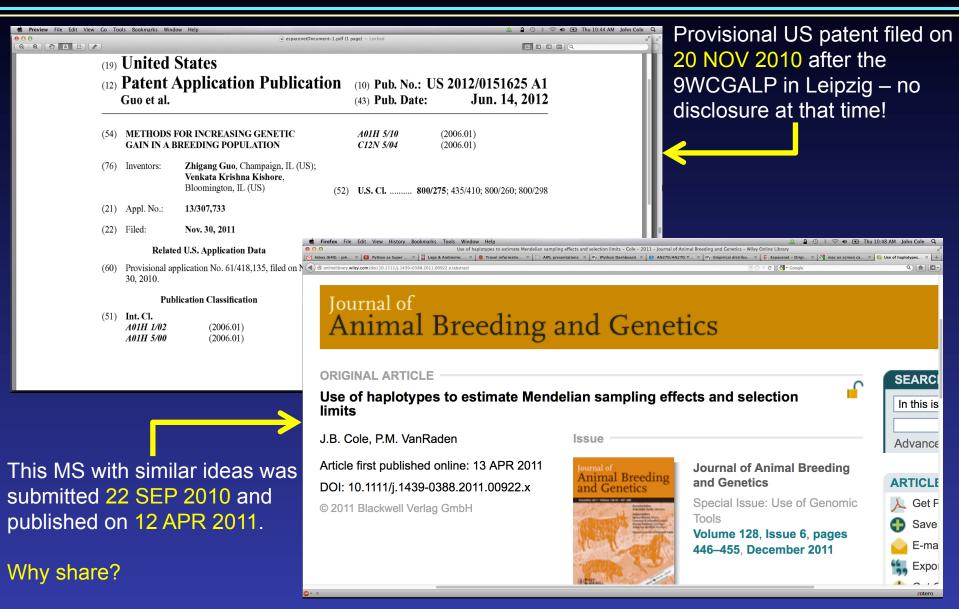
### Novel haplotypes affecting fertility

Name	Chrom- osome	Loca- tion	Carrier Freq	Earliest Known Ancestors
HH1	5	62-68	4.5	Pawnee Farm Arlinda Chief
HH2	1	93-98	4.6	Willowholme Mark Anthony
НН3	8	92-97	4.7	Glendell Arlinda Chief, Gray View Skyliner
JH1	15	11-16	23.4	Observer Chocolate Soldier
BH1	7	42-47	14.0	West Lawn Stretch Improver

#### **Precision mating**

- Eliminate undesirable haplotypes
  - Detection at low allele frequencies
- Avoid carrier-to-carrier matings
  - Easy with few recessives, difficult with many recessives
- Include in selection indices
  - Requires many inputs

#### Threats to continued progress



#### Conclusions

- Selecting calves based on genomic tests can increase farm profitability
- Simple mate selection using haplotypes is as good or better than other strategies
- We may be able to do interesting things with inbreeding and prediction
- Tools for handling many new recessives in breeding programs are needed

#### Acknowledgments

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