

# The impact of genomic selection on genetic diversity and genetic gain in French dairy cattle breeds

Anna-Charlotte Doublet<sup>1,2</sup>, Pascal Croiseau<sup>1</sup>, Sébastien Fritz<sup>1,2</sup>, Chris Hozé<sup>1,2</sup>,  
Alexis Michenet<sup>1,2</sup>, Denis Laloë<sup>1</sup>, Gwendal Restoux<sup>1</sup>

<sup>1</sup> GABI, INRA, AgroParisTech, Université Paris-Saclay, 78350 Jouy-en-Josas, France

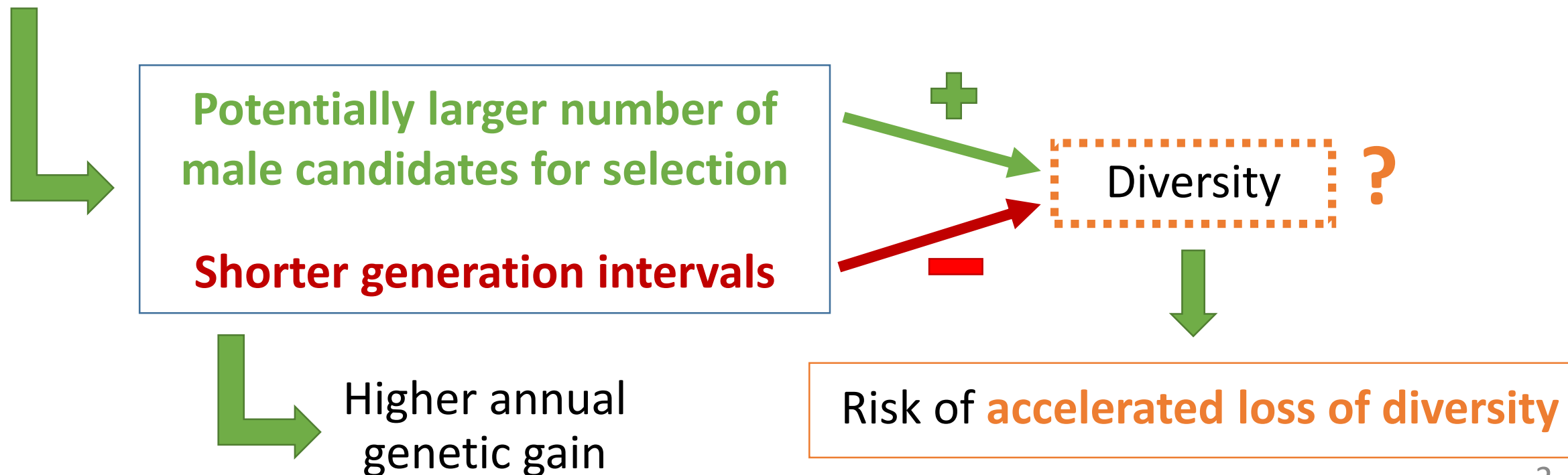
<sup>2</sup> ALLICE, Paris, France

This study was conducted in the frame of the GDivSelGen project, funded by INRA (SELGEN Metaprogram, Paris, France)

# Context – From genetic to genomic selection in dairy cattle in France

## Genomic selection in dairy cattle breeds ⇒ **New breeding schemes**

Before 2010: Genetic selection	2010-2012: Transition phase	Since 2012: Genomic selection
Progeny testing Sires of bulls ≈ 6 yo Dams of bulls ≈ 3 yo in farms	Intermediate situation	Genomic evaluation Sires of bulls ≈ 2 yo Dams of bulls ≈ 2 yo in donor stations



# Consequences of a loss of genetic diversity

Loss of additive genetic variance → **Loss of potential genetic gain**

Loss of overall genetic diversity → **Loss of adaptive potential**

Inbreeding depression → **Detrimental effects on fitness traits**

**→ Economic impact**

# Material

## Marketed sires, genotyped in France from 3 French dairy cattle breeds

Montbéliarde  
**National** breed



Normande  
**National** breed



Holstein  
**International** breed



## Evolution of genetic diversity

**Pedigree data:**  
Inbreeding

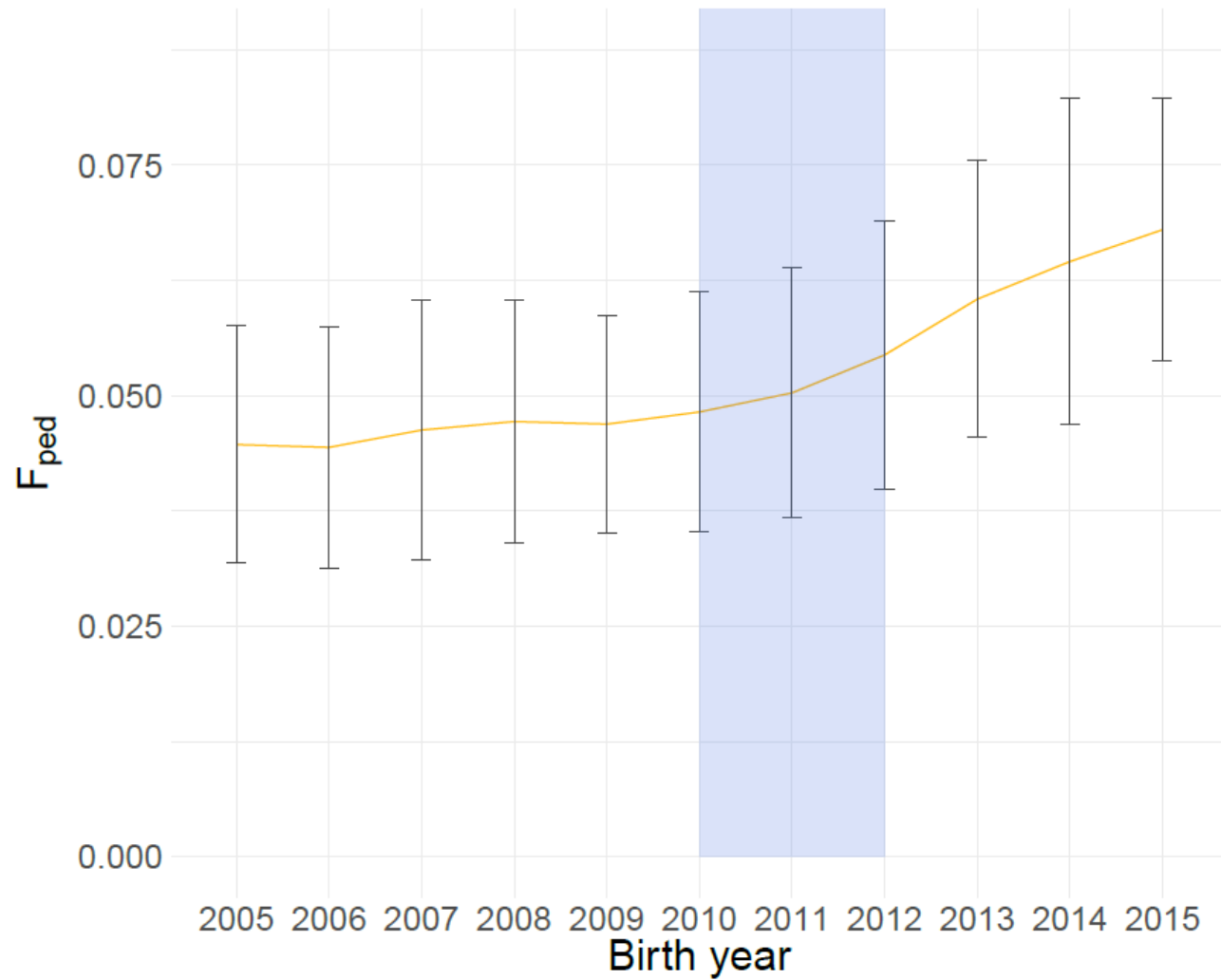
**50K genotyping data  
(Runs Of Homozygosity):**  
Inbreeding  
ROH length

## Evolution of genetic gain

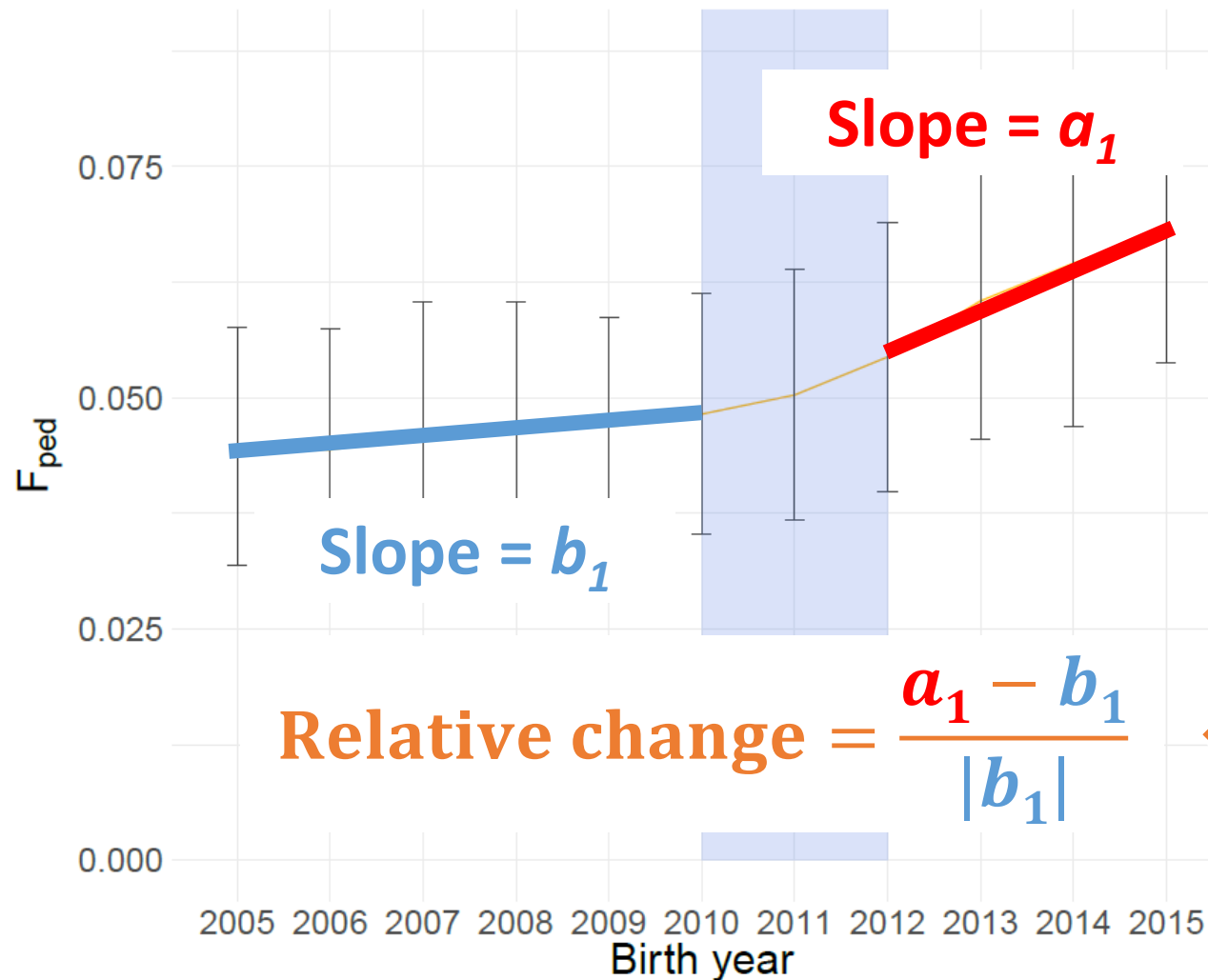
Total Merit Index

Combining production traits,  
functional traits and type traits

# Display of results



# Display of results



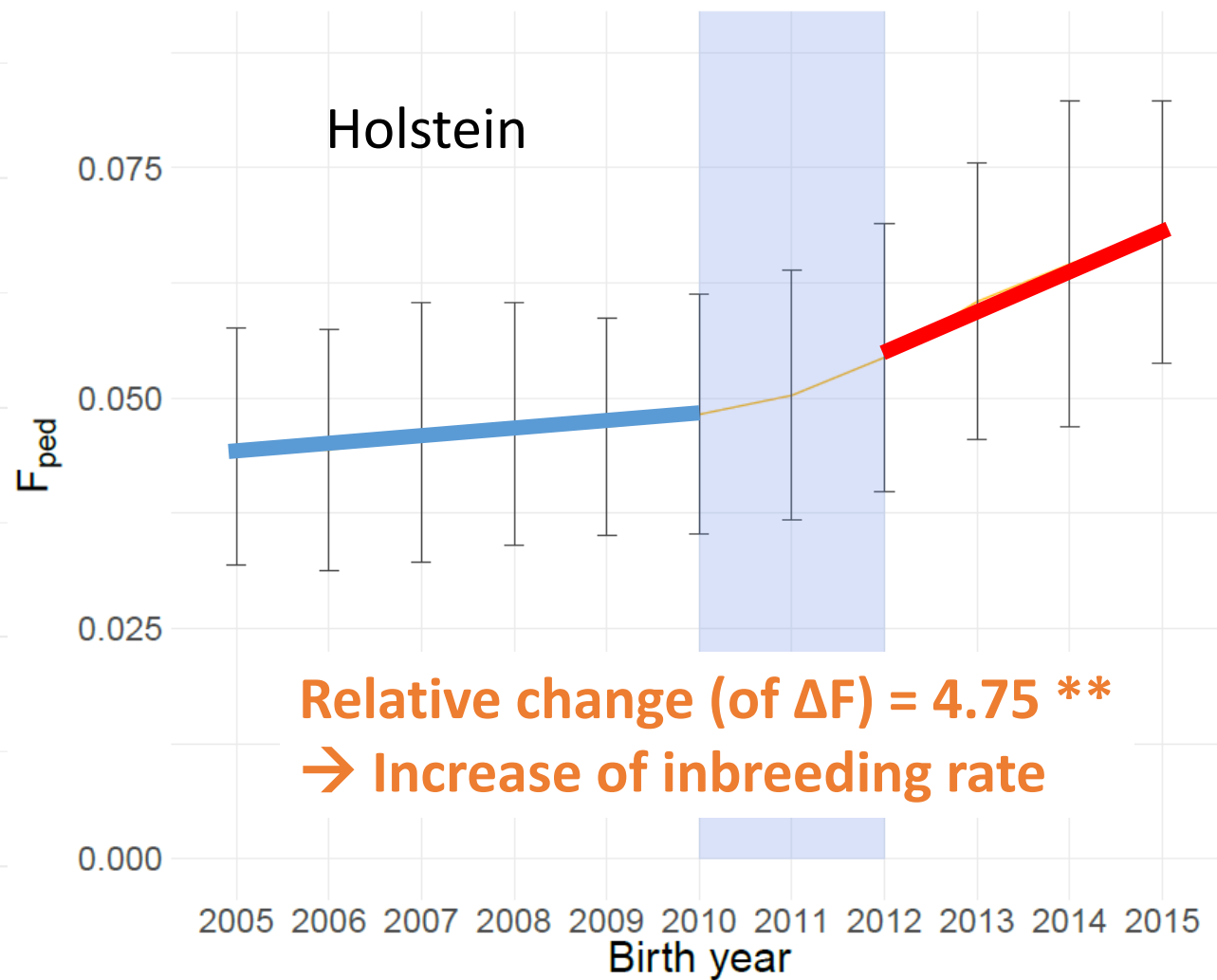
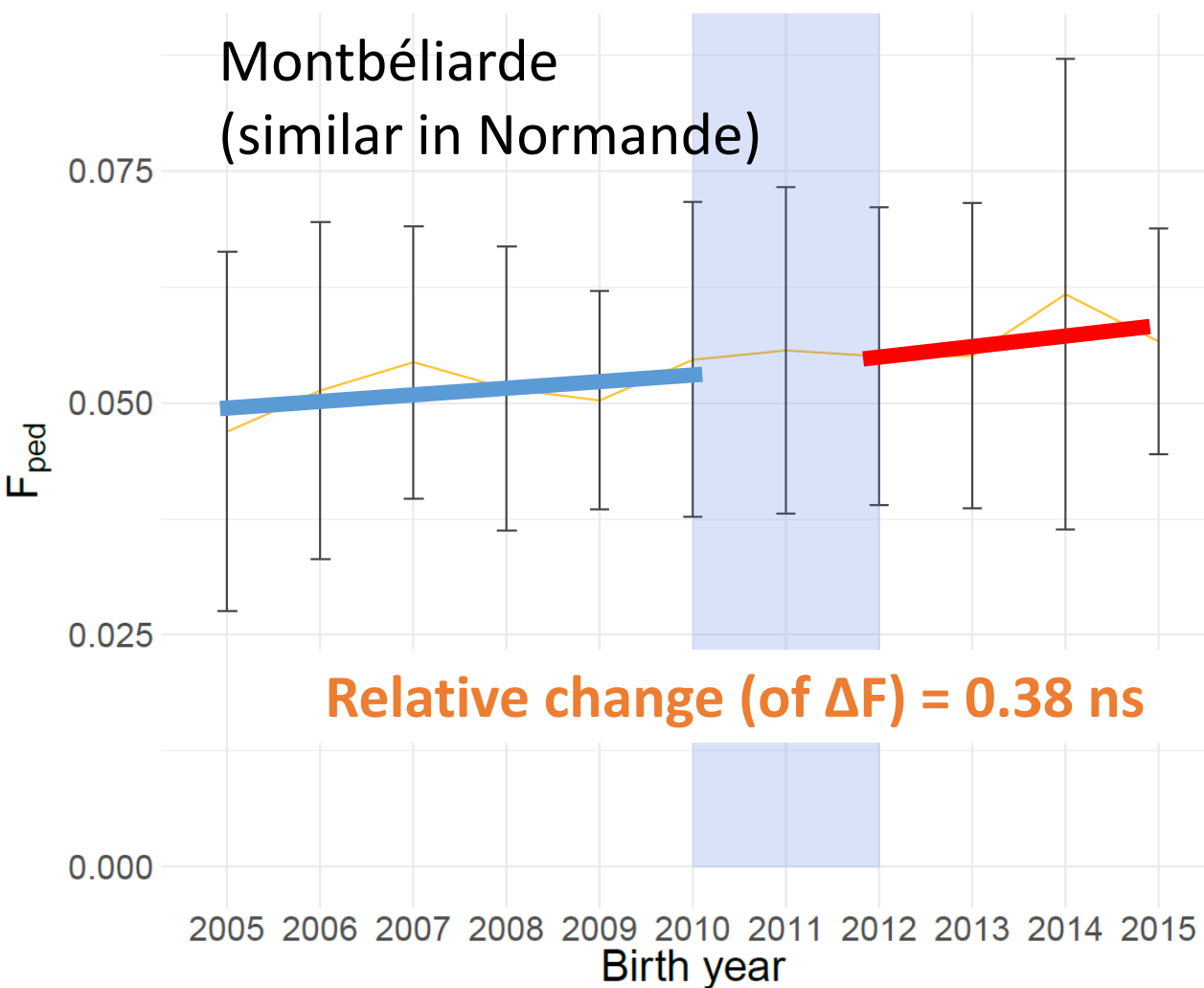
**Comparison** of the slopes of each parameter **before** and **after** the beginning of genomic selection

> 0 : acceleration  
< 0 : deceleration

$p$ -value: pairwise comparison of the slopes

# Inbreeding based on pedigree data $F_{ped}$

\*\*  $p$ -value < 0.001  
 \*  $0.001 < p$ -value < 0.05  
 ns  $p$ -value > 0.05



# Runs Of Homozygosity (ROH)

= long genomic segments consisting of consecutive homozygous SNPs  
≈ autozygous segments of the genome (IBD)

$$F_{ROH} = \frac{\text{Total length of the ROH of an individual}}{\text{Total length of the genome covered by SNPs}}$$

McQuillan *et al*, 2008, adjusted  
as done by Doekes *et al*, 2018

Shorter ROHs = older autozygosity  
Longer ROHs = more recent autozygosity

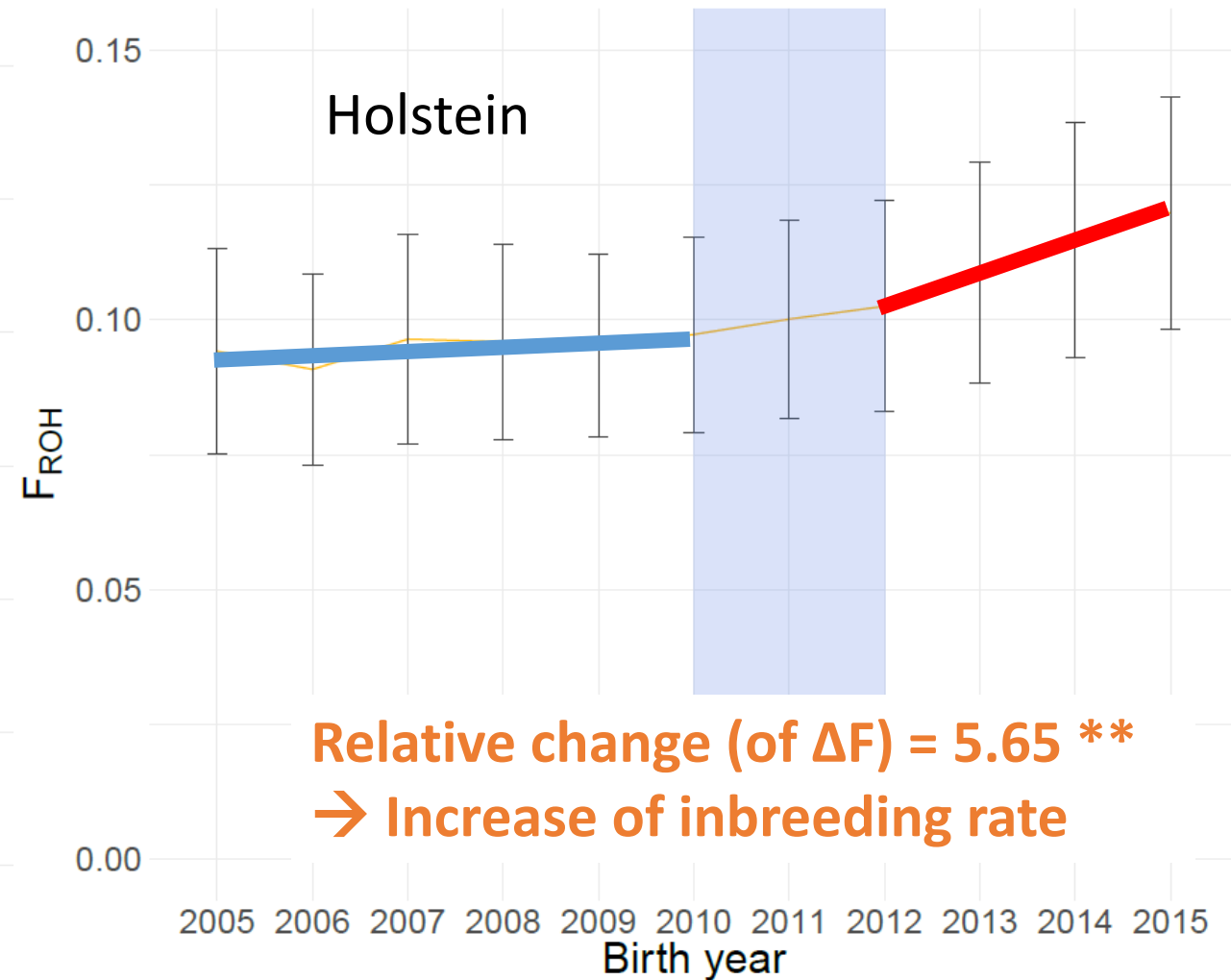
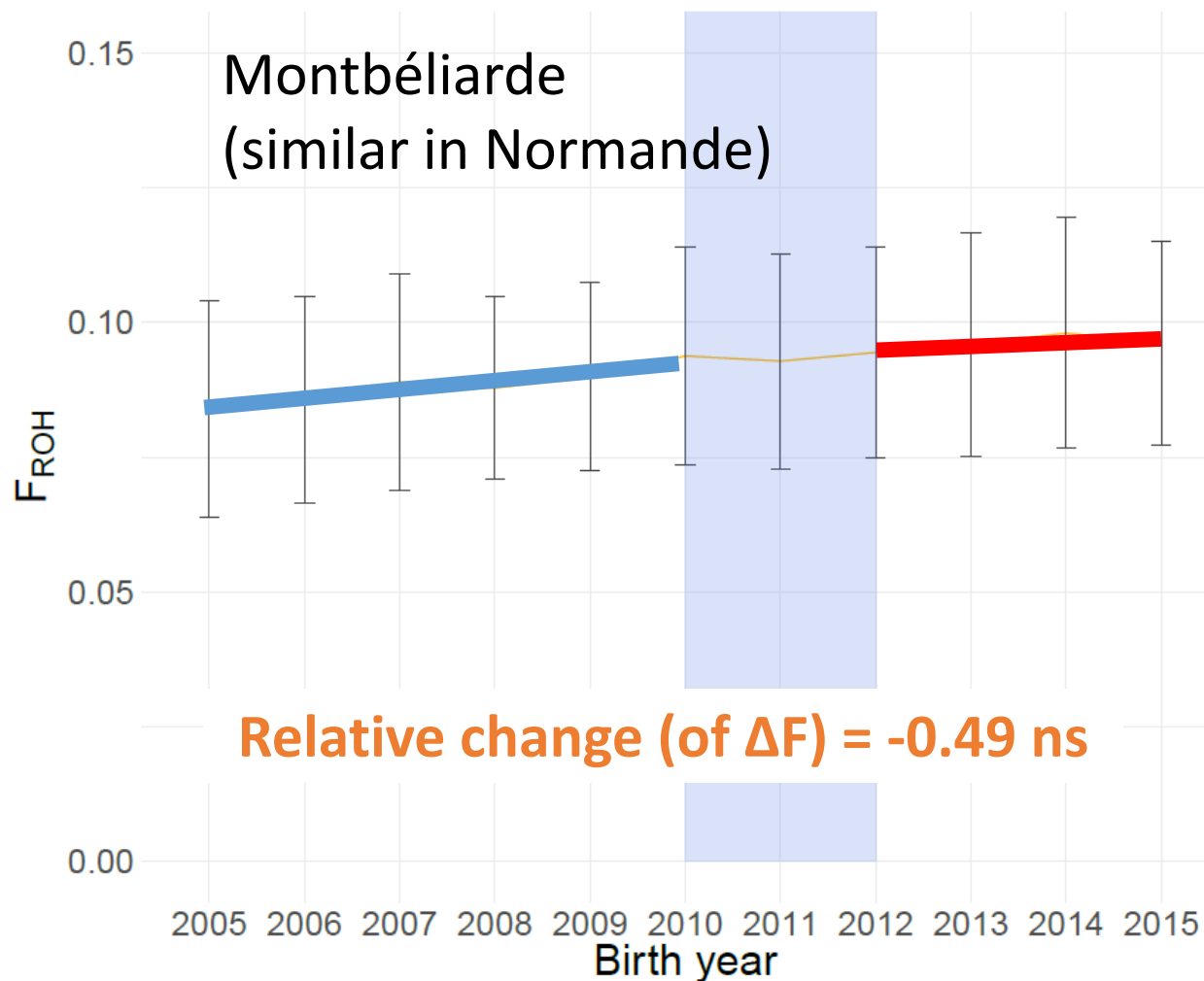
Detected with PLINK (with 50K genotyping data)

- Minimal length = 1Mb
- Minimal number of SNPs per ROH = 15 SNPs
- Sliding window = 15 SNPs
- Minimal SNP density: 1 SNP / 75 kb
- Maximum gap: 150 kb



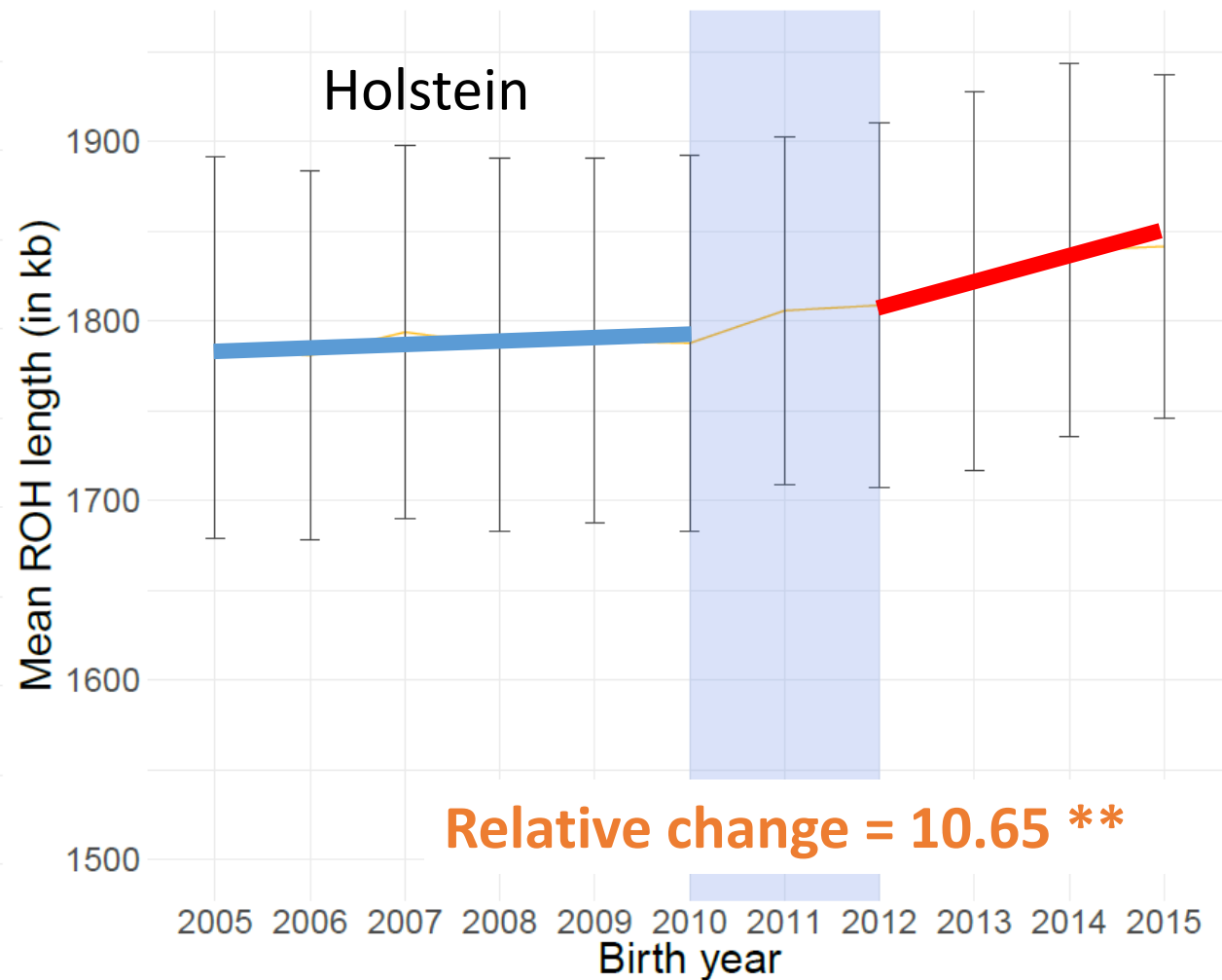
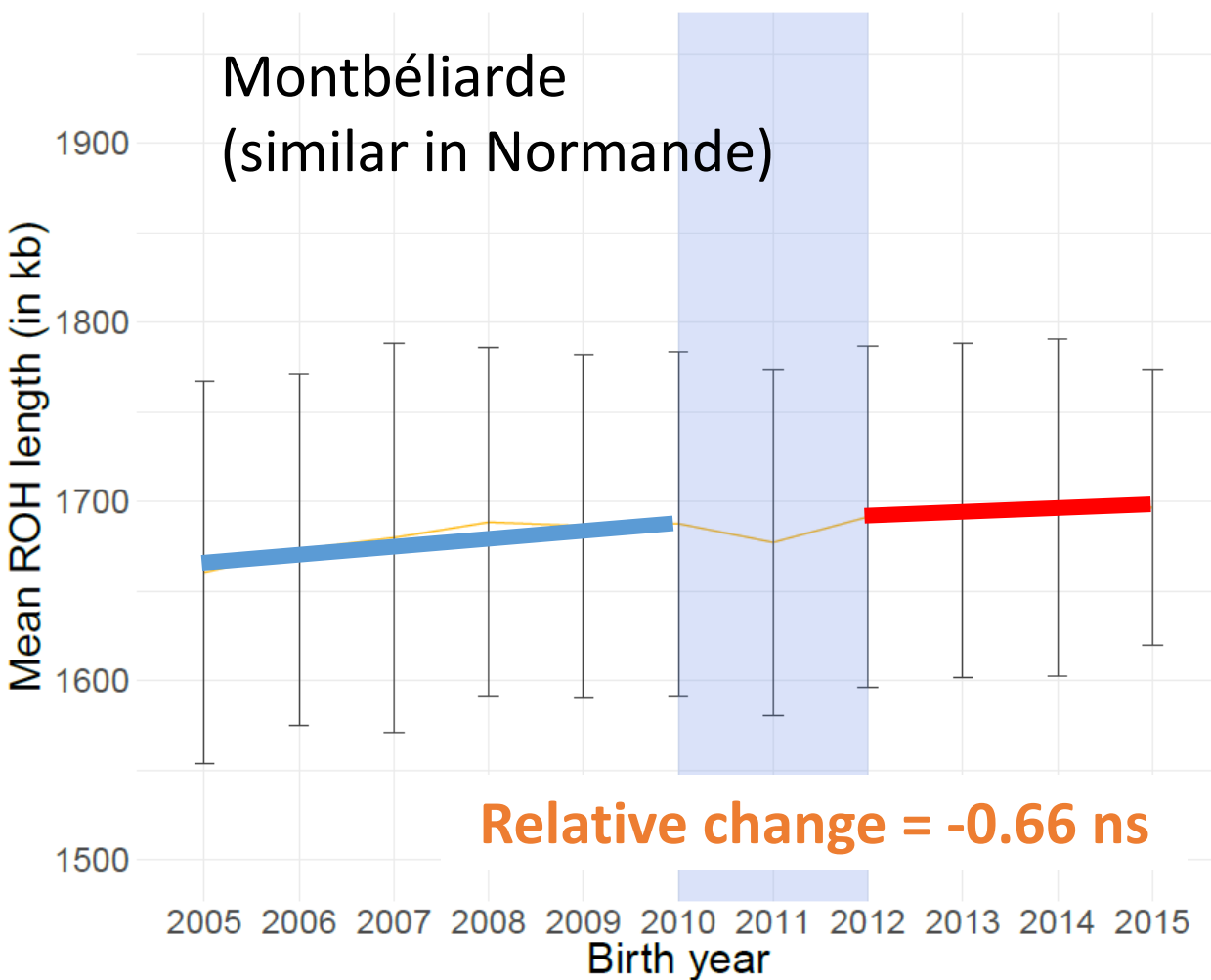
# Inbreeding based on ROH $F_{ROH}$

\*\*  $p$ -value < 0.001  
\*  $0.001 < p$ -value < 0.05  
ns  $p$ -value > 0.05



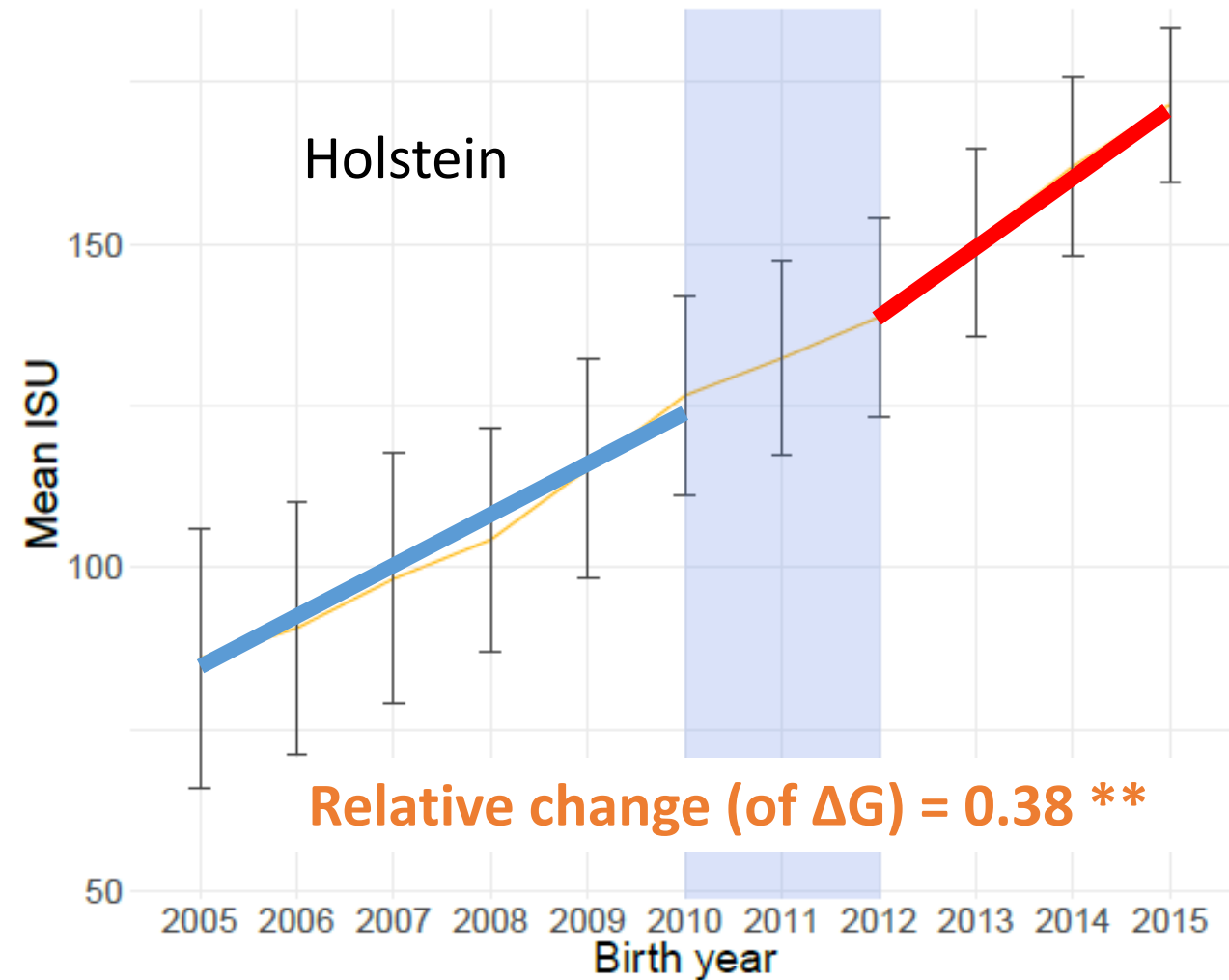
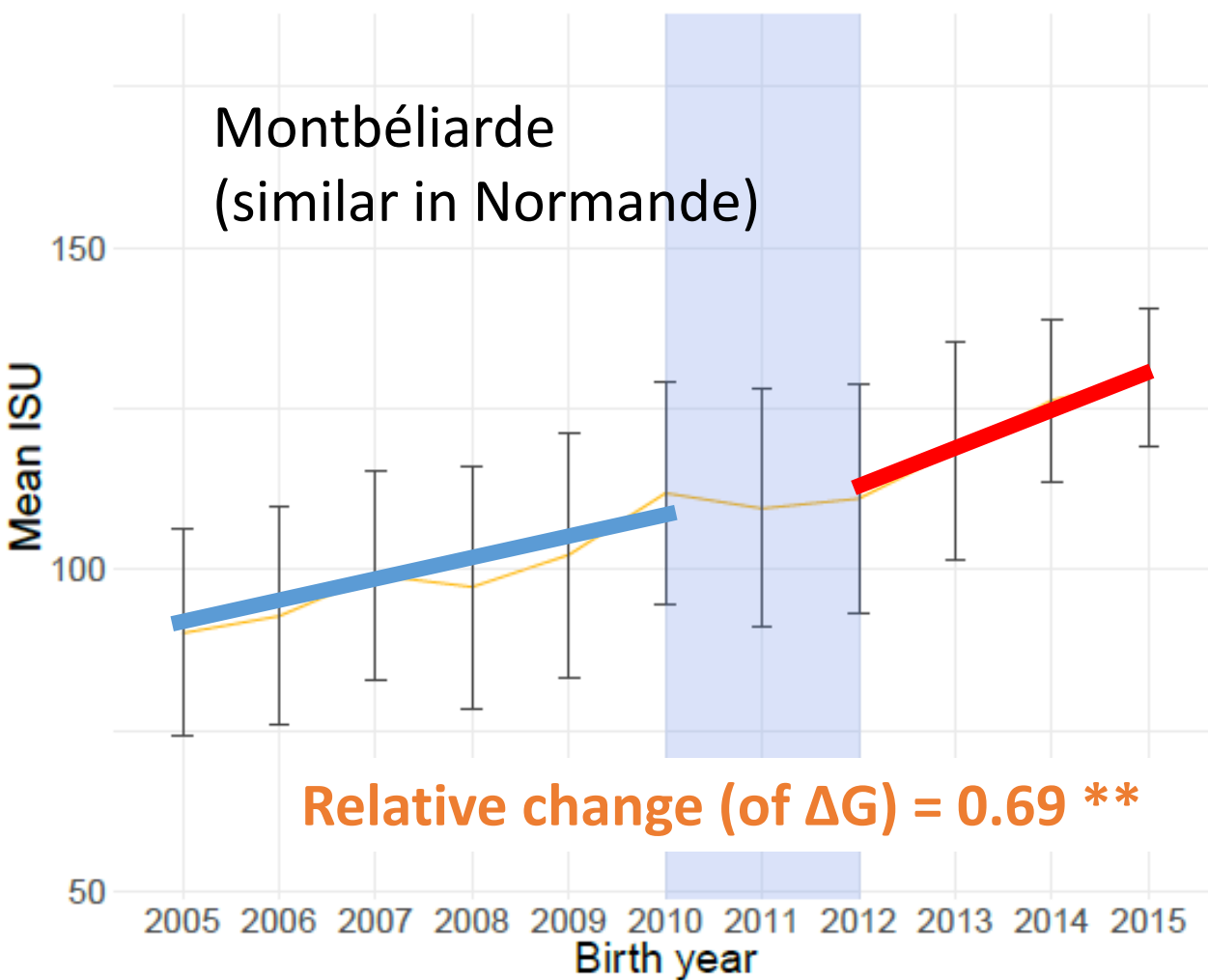
# ROH length

\*\*  $p$ -value < 0.001  
\*  $0.001 < p$ -value < 0.05  
ns  $p$ -value > 0.05



# Genetic gain TMI

\*\*  $p$ -value < 0.001  
 \*  $0.001 < p$ -value < 0.05  
 ns  $p$ -value > 0.05



# Results – Impact of genomic selection

$$\text{Relative changes} = \frac{a_1 - b_1}{|b_1|}$$

\*\*  $p$ -value < 0.001  
 \* 0.001 <  $p$ -value < 0.05  
 ns  $p$ -value > 0.05

Breed	Genetic gain	Genetic diversity		ROH length
	TMI	$F_{\text{ped}}$	$F_{\text{ROH}}$	
Montbéliarde	<b>0.69 **</b>	0.38 ns	-0.49 ns	-0.66 ns
Normande	<b>0.71 *</b>	2.86 ns	-0.12 ns	-18.33 ns
Holstein	<b>0.38 **</b>	<b>4.75 **</b>	<b>5.65 **</b>	<b>10.65 **</b>

# Results – Impact of genomic selection

$$\text{Relative changes} = \frac{a_1 - b_1}{|b_1|}$$

\*\*  $p$ -value < 0.001  
 \* 0.001 <  $p$ -value < 0.05  
 ns  $p$ -value > 0.05

Breed	Genetic gain TMI	Genetic diversity		
		$F_{\text{ped}}$	$F_{\text{ROH}}$	ROH length
Montbéliarde	0.69 **	0.38 ns	-0.49 ns	-0.66 ns
Normande	0.71 *	2.86 ns	-0.12 ns	-18.33 ns
Holstein	0.38 **	4.75 **	5.65 **	10.65 **

Increased annual genetic gain  
for all breeds

# Results – Impact of genomic selection

$$\text{Relative changes} = \frac{a_1 - b_1}{|b_1|}$$

\*\*  $p$ -value < 0.001  
 \*  $0.001 < p$ -value < 0.05  
 ns  $p$ -value > 0.05

Breed	Genetic gain TMI	Genetic diversity		ROH length
		$F_{\text{ped}}$	$F_{\text{ROH}}$	
Montbéliarde	0.69 **	0.38 ns	-0.49 ns	-0.66 ns
Normande	0.71 *	2.86 ns	-0.12 ns	-18.33 ns
Holstein	0.38 **	4.75 **	5.65 **	10.65 **

Increase of the inbreeding rate in Holstein,  
 not in Montbéliarde and Normande  
 → Results are consistent between pedigree and genomic data

# Results – Impact of genomic selection

$$\text{Relative changes} = \frac{a_1 - b_1}{|b_1|}$$

\*\*  $p$ -value < 0.001  
 \*  $0.001 < p$ -value < 0.05  
 ns  $p$ -value > 0.05

## Genetic diversity

Breed	Genetic gain			ROH length
	TMI	$F_{ped}$	$F_{ROH}$	
Montbéliarde	0.69 **	0.38 ns	-0.49 ns	-0.66 ns
Normande	0.71 *	2.86 ns	-0.12 ns	-18.33 ns
Holstein	0.38 **	4.75 **	5.65 **	10.65 **

Higher annual increase of the length of ROH in Holstein,  
 not in Montbéliarde and Normande  
 → Faster increase of recent inbreeding in Holstein

# Discussion

In Holstein, in France: faster increase in recent inbreeding + accelerated loss of diversity

(Forutan *et al*, 2018; Doekes *et al*, 2018)

***How to explain the difference between the 3 breeds?***

- 1) Improved balance of the use of bulls in Montbéliarde and Normande but not in Holstein (already good before)



# Discussion

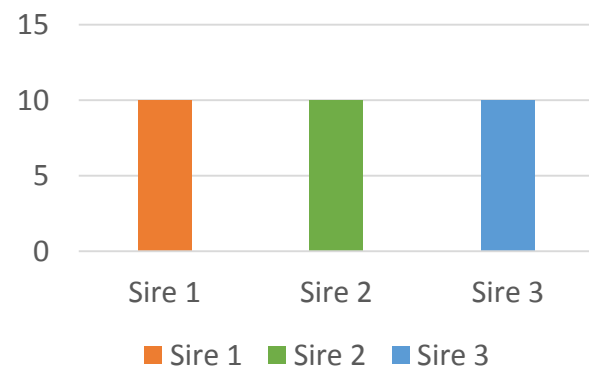
In Holstein, in France: faster increase in recent inbreeding + accelerated loss of diversity  
(Forutan *et al*, 2018; Doekes *et al*, 2018)

## ***How to explain the difference between the 3 breeds?***

- 1) Improved balance of the use of bulls in Montbéliarde and Normande but not in Holstein (already good before)

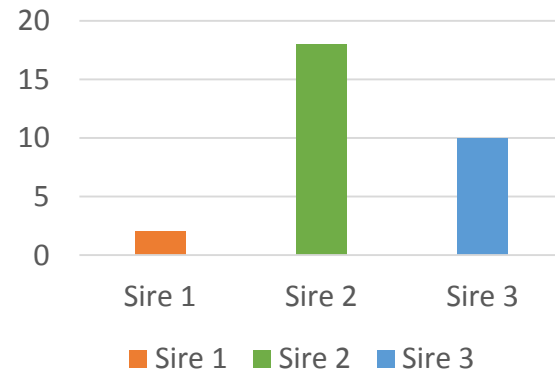
### *Sire use disequilibrium index:*

Number of offsprings



➔ **Sire use disequilibrium index = 0**

Number of offsprings



➔ **Sire use disequilibrium index > 0**

# Discussion

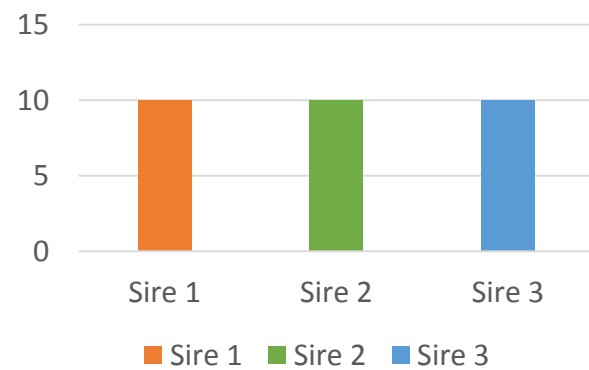
In Holstein, in France: faster increase in recent inbreeding + accelerated loss of diversity  
(Forutan *et al*, 2018; Doekes *et al*, 2018)

**How to explain the difference between the 3 breeds?**

- 1) Improved balance of the use of bulls in Montbéliarde and Normande but not in Holstein (already good before)

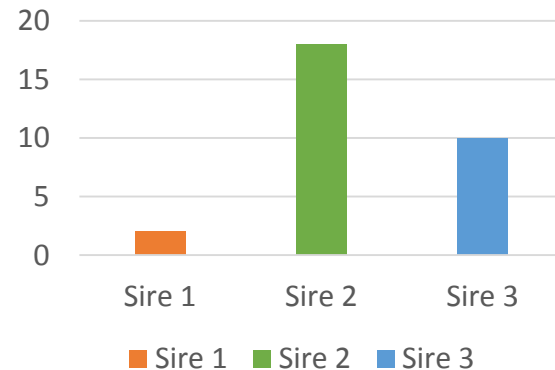
*Sire use disequilibrium index:*

Number of offsprings

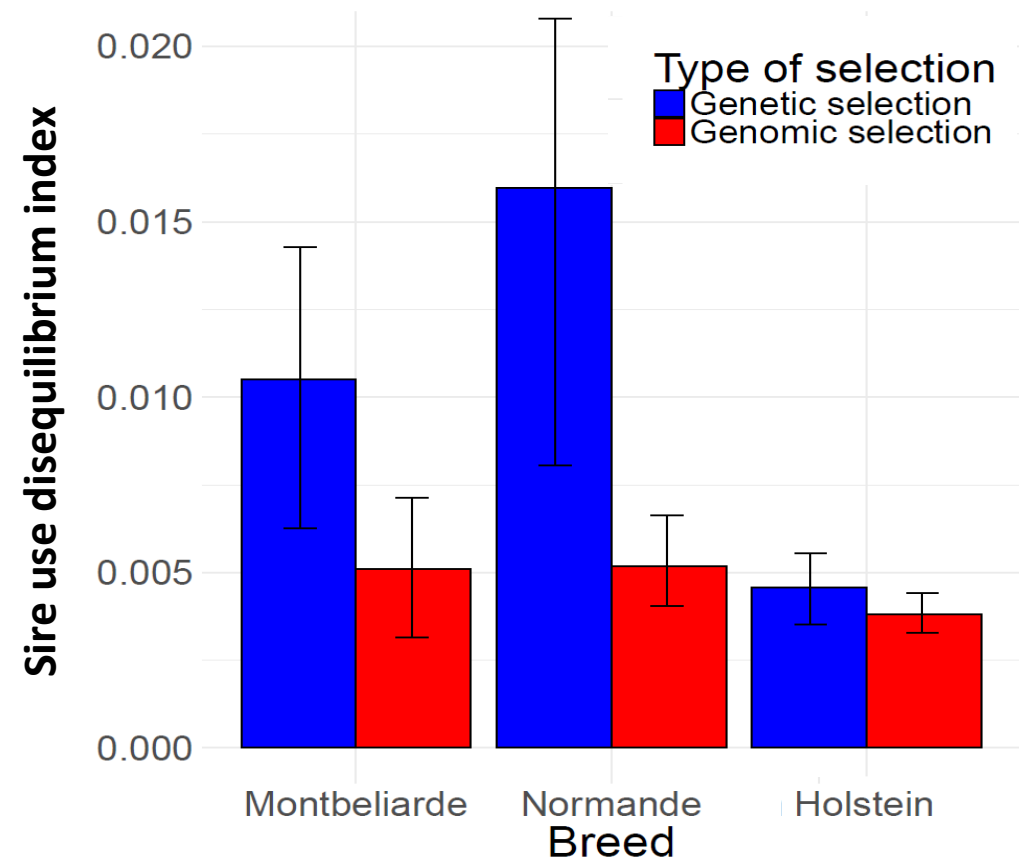


➔ Sire use disequilibrium index = 0

Number of offsprings



➔ Sire use disequilibrium index > 0



# Discussion

In Holstein, in France: faster increase in recent inbreeding + accelerated loss of diversity  
(Forutan *et al*, 2018; Doekes *et al*, 2018)

## ***How to explain the difference between the 3 breeds?***

- 1) Improved balance of the use of bulls in Montbéliarde and Normande but not in Holstein (already good before)
  
- 2) Higher increase in the effective number of sires in Montbéliarde and Normande (depending on their contribution to AI for a year):
  - Montbéliarde **x 3**
  - Normande **x 2.5**
  - Holstein **x 2**

# Conclusion and perspectives

Genomic selection = new breeding schemes in France

In national breeds (Montbéliarde and Normande):

accelerated annual genetic gain without accelerated loss of genetic diversity

In international breed (Holstein): detrimental effect on genetic diversity

It could be the consequence of the way sires are selected and marketed  
(turn over, proportion and number of semen doses per sire, etc.)

## **Perspectives:**

Relevance of genomic measures of diversity

Analysis of the structure and repartition of ROHs

Impact of the use of foreign sires

Impact of national VS international breed management

# Conclusion and perspectives

Genomic selection = new breeding schemes in France

In national breeds (Montbéliarde and Normande):

accelerated annual genetic gain without accelerated loss of genetic diversity

In international breed (Holstein): detrimental effect on genetic diversity

*It could be the consequence of the way sires are selected and marketed  
(turn over, proportion and number of semen doses per sire, etc.)*

## **Perspectives:**

Relevance of genomic measures of diversity

Analysis of the structure and repartition of ROHs

Impact of the use of foreign sires

Impact of national VS international breed management

*Thanks*

Alice

APIS-GENE

INRA GABI – PSGen and G2B teams

GDivSelGen project (SELGEN)

**Thank you for your attention!**

# SUPPLEMENTARY SLIDES

# Number of animals and SNPs

Breed	Number of animals born between 2005 and 2010	Number of animals born between 2012 and 2015	Number of SNPs
Montbéliarde	826	420	39,992
Normande	666	347	40,135
Holstein	3440	1248	41,377

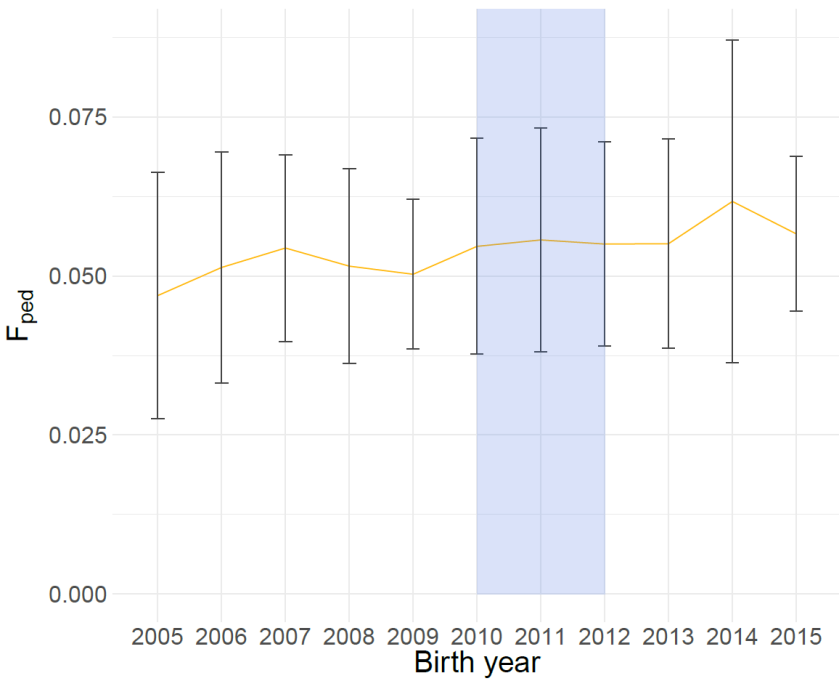
$F_{ped}$ 

Breed	$F_{ped}$				Relative change
	$b_1$	Standard error	$a_1$	Standard error	
Montbéliarde	1.067E-03	3.423E-04	1.475E-03	7.901E-04	<b>0.382 ns</b>
Normande	2.991E-04	3.277E-04	1.153E-03	4.233E-04	<b>2.856 ns</b>
Holstein	7.783E-04	1.415E-04	4.472E-03	3.864E-04	<b>4.746 **</b>

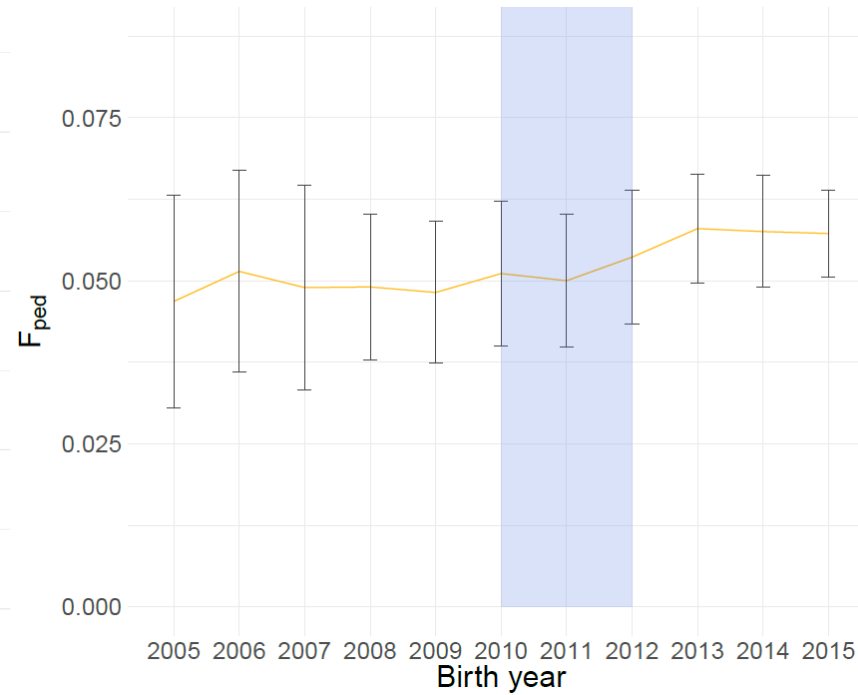


$F_{ped}$ 

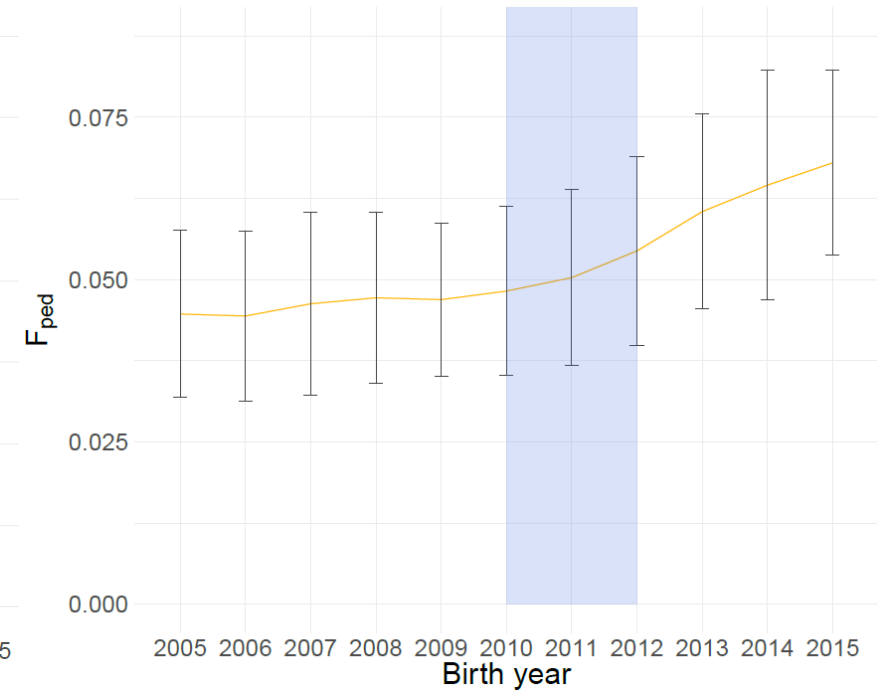
Montbéliarde



Normande



Holstein



# Genome length

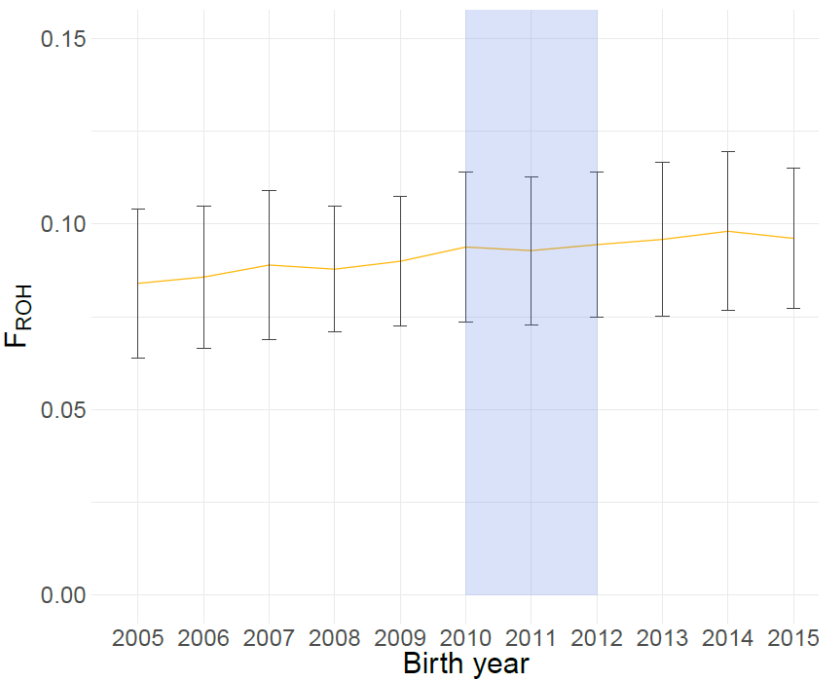
Breed	Length of genome covered by SNPs	Length of genome covered by SNPs minus gaps > 150kb
Montbéliarde	2 499 500 045 bp	1 919 314 607 bp
Normande	2 499 403 287 bp	1 919 653 803 bp
Holstein	2 499 418 974 bp	1 959 205 780 bp

$F_{ROH}$ 

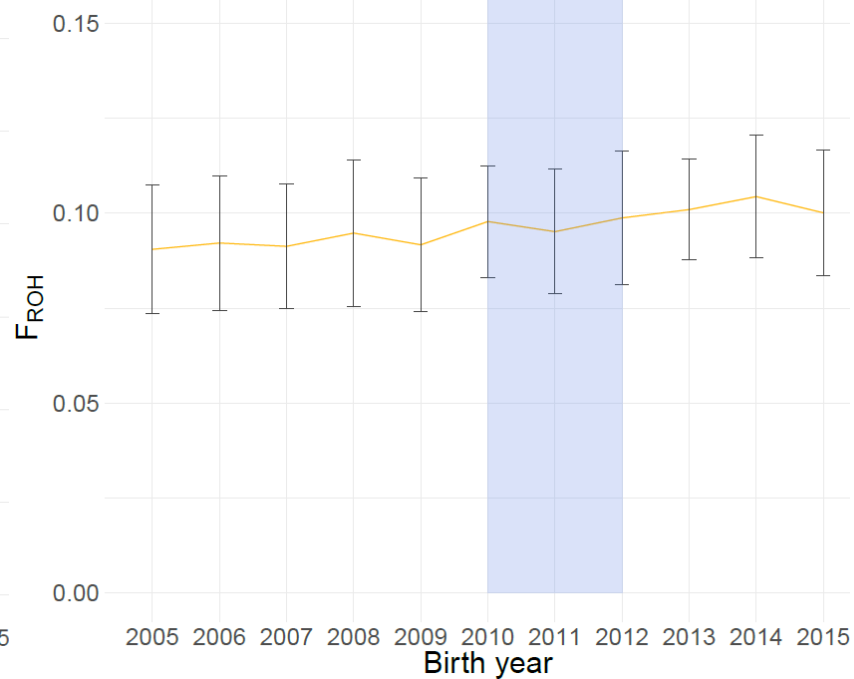
Breed	$F_{ROH}$				Relative change
	$b_1$	Standard error	$a_1$	Standard error	
Montbéliarde	1.766E-03	3.935E-04	9.089E-04	8.577E-04	<b>-0.485 ns</b>
Normande	1.032E-03	4.021E-04	9.054E-04	7.744E-04	<b>-0.122 ns</b>
Holstein	8.730E-04	1.986E-04	5.802E-03	5.218E-04	<b>5.646 **</b>

$F_{ROH}$ 

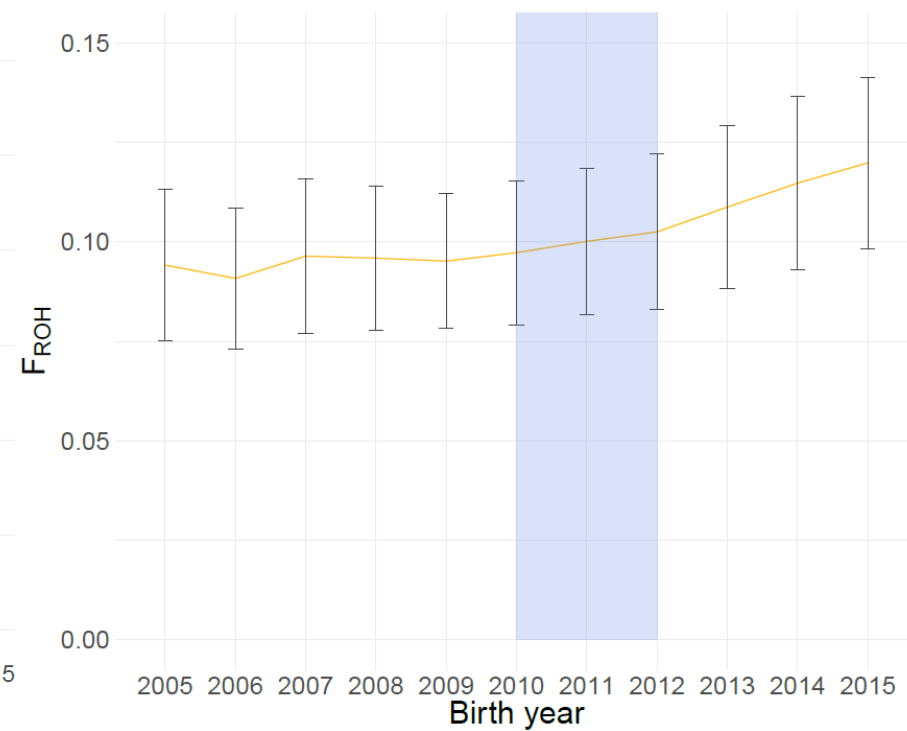
Montbéliarde



Normande



Holstein

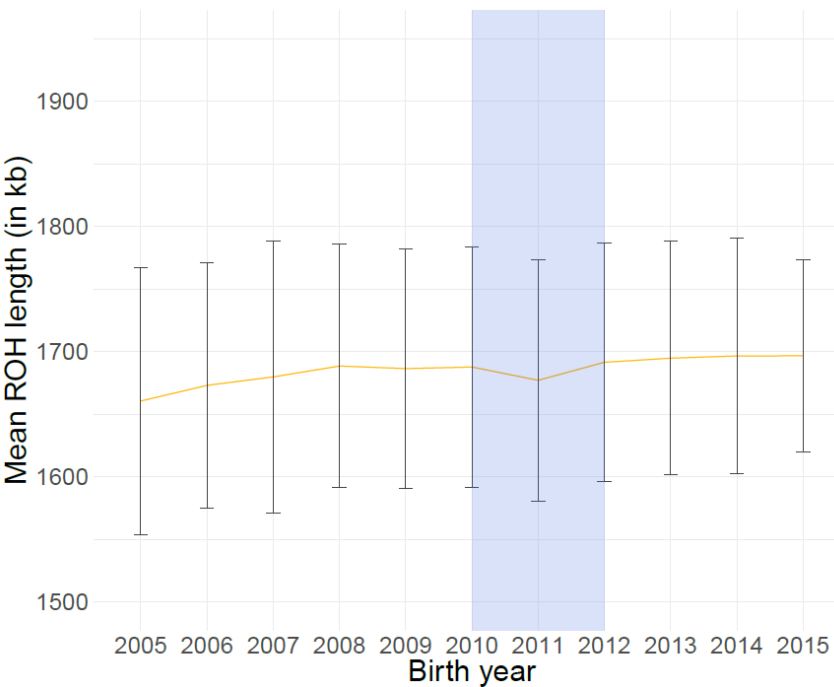


# ROH length

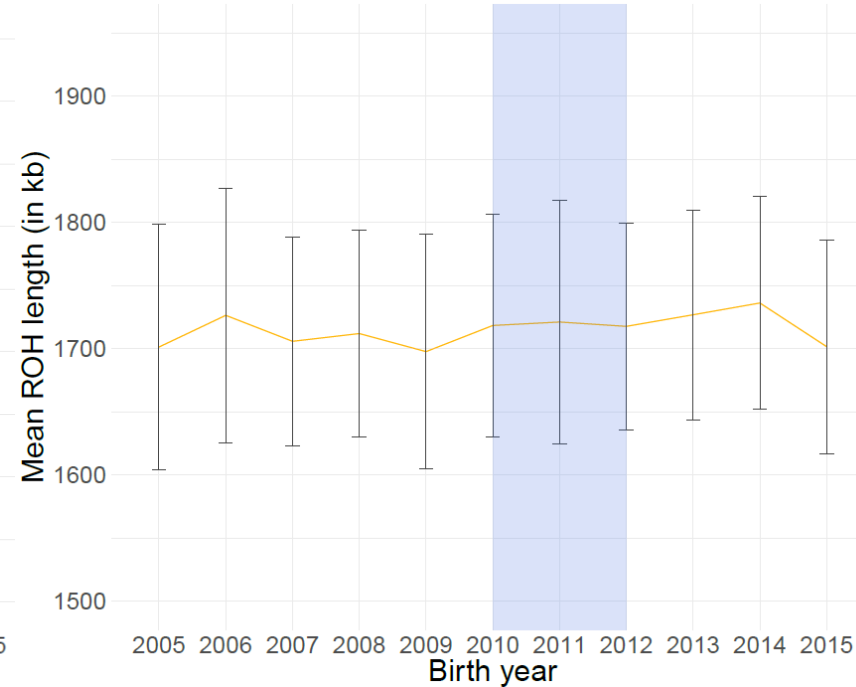
Breed	Number of ROH per individual				
	$b_1$	Standard error	$a_1$	Standard error	Relative change
Montbéliarde	5.447E+00	2.070E+00	1.881E+00	3.859E+00	<b>-0.655 ns</b>
Normande	-1.448E-01	2.146E+00	-2.800E+00	4.052E+00	<b>-18.337 ns</b>
Holstein	9.838E-01	1.120E+00	1.146E+01	2.550E+00	<b>10.649 **</b>

# ROH length

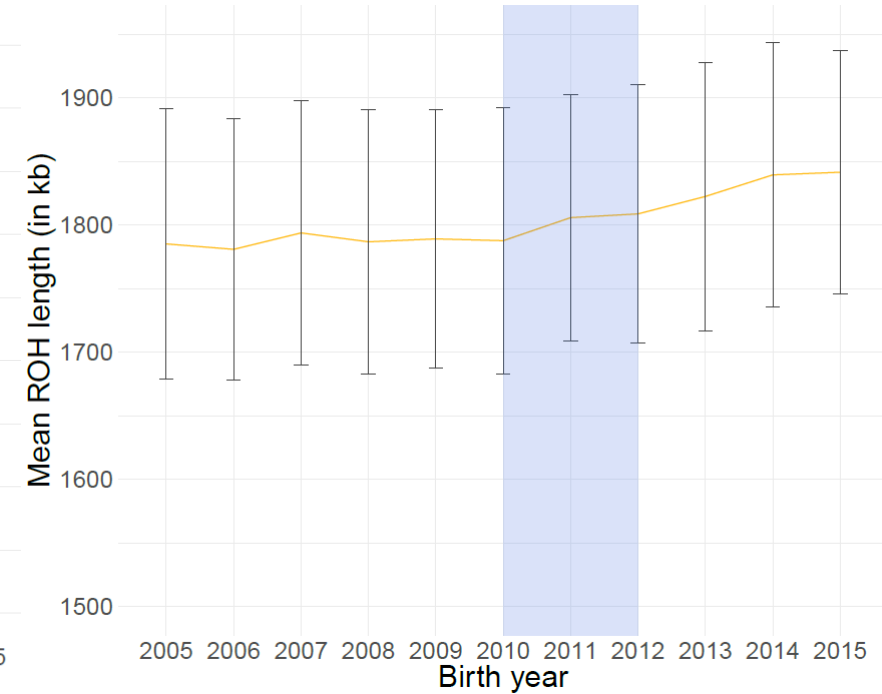
## Montbéliarde



## Normande



## Holstein



# Genetic gain

Total Merit Index (ISU): centered around 100 with a 20 points variability

Breed	Milk production	Morphology	Reproduction	Udder health	Longevity	Milking speed
Montbéliarde	45%	12.5%	18%	14.5%	5%	5%
Normande	40%	18%	15.5%	18.5%	5%	3%
Holstein	35%	15%	22%	18%	5%	5%

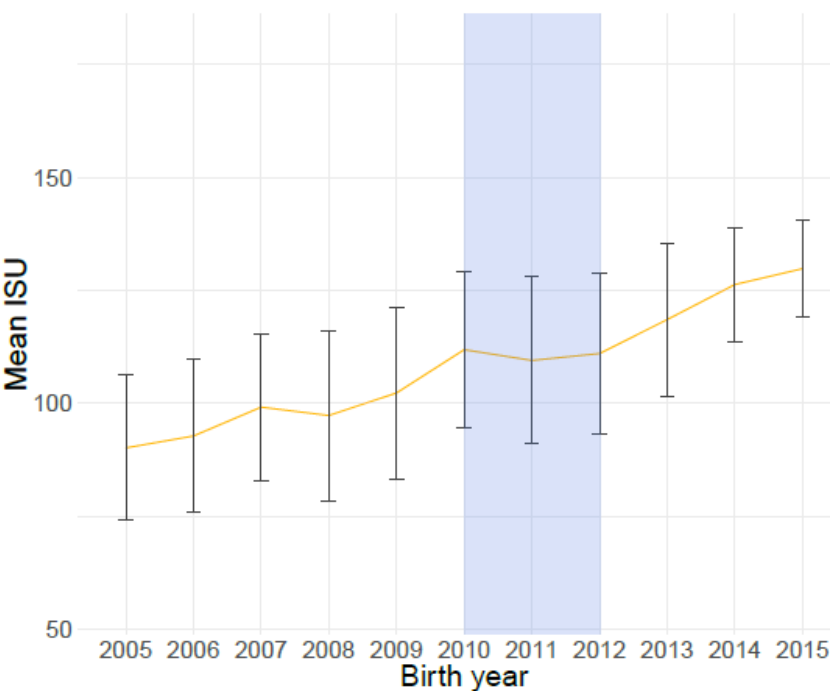
# Genetic gain

Breed	ISU (Total Merit Index)				
	$b_1$	Standard error	$a_1$	Standard error	Relative change
Montbéliarde	3.928	0.355	6.627	0.645	<b>0.687 **</b>
Normande	3.411	0.411	5.815	0.612	<b>0.705 *</b>
Holstein	7.966	0.200	11.020	0.351	<b>0.383 **</b>

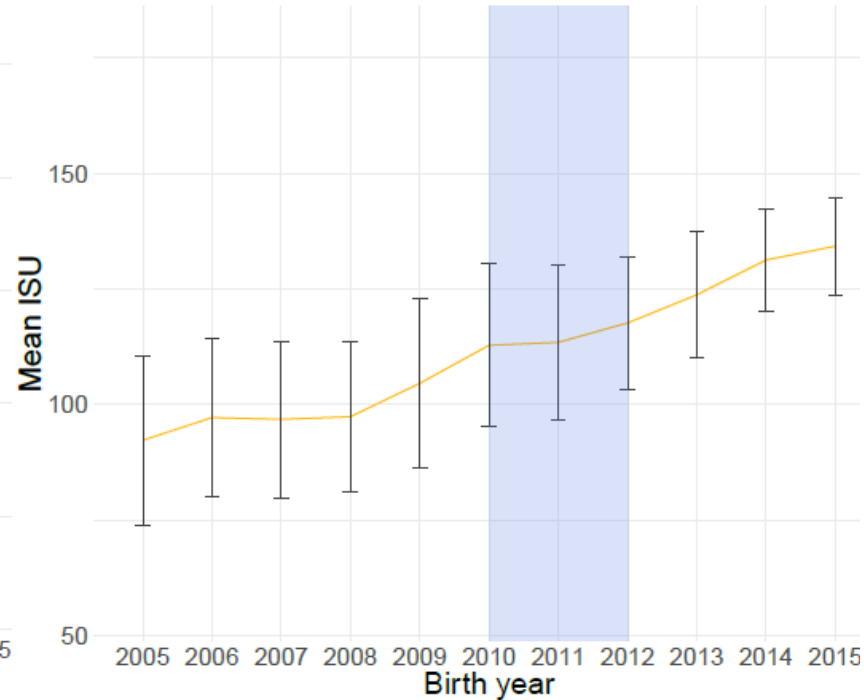


# Genetic gain

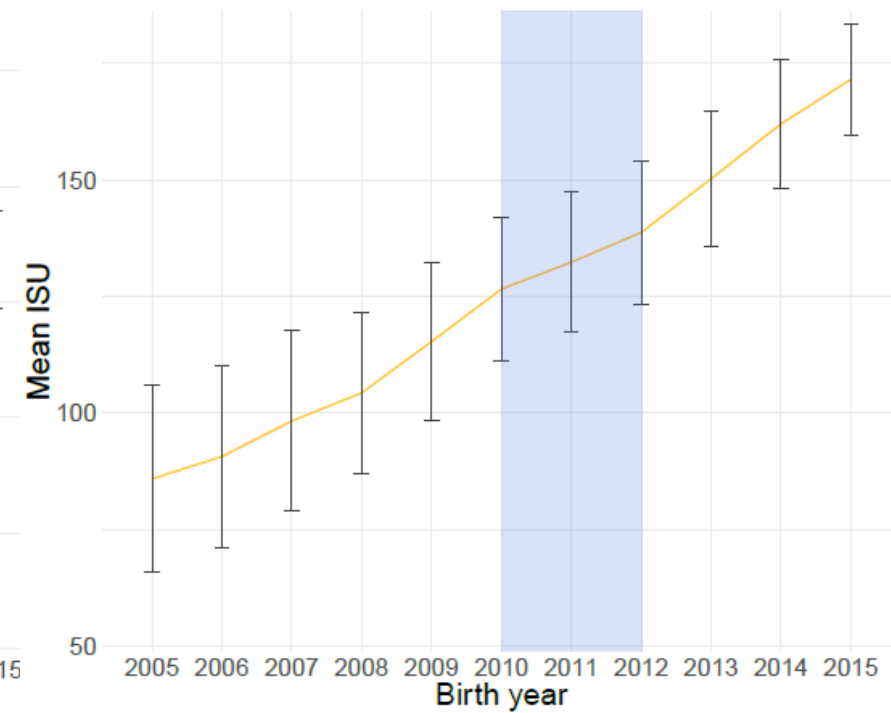
## Montbéliarde



## Normande



## Holstein



# Sire's use disequilibrium index

$$\text{Sire's use disequilibrium index} = 1 - \frac{\text{Observed equilibrium}}{\text{Expected equilibrium}}$$

$$\text{Observed equilibrium} = 1 - \sum_{i=1}^{\text{Number of sires } n} \left( \frac{\text{Number of offsprings for sire } i}{\text{Total number of offsprings for the } n \text{ sires}} \right)^2$$

$$\text{Expected equilibrium} = 1 - \sum_{i=1}^{\text{Number of sires } n} \left( \frac{\text{Mean number of offsprings per sire}}{\text{Total number of offsprings for the } n \text{ sires}} \right)^2$$