



# **Modifying MACE for genomic pre-selection**

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# Introduction

## Will MACE continue?

- **Countries without genomics** use MACE for **selection**
- Countries with genomics use MACE as **input for SNP**
  - 2-step national GEBV systems
  - ssEBV systems with MACE integration
  - Intergenomics Brown Swiss and IG-HOL (2-step)
- Country **correlations from MACE** used in:
  - GMACE, SNP-MACE (Interbull and Eurogenomics)



# Why change MACE?

## - Genomic pre-selection effects

- Mendelian Sampling of AI sires no longer follows the centralized normal distribution assumed in MACE

$$MS \sim N( \mathbf{0}, \frac{1}{2}\sigma_g^2 ) \quad \mathbf{X}$$

- MACE should accommodate effects of genomic pre-selection (GPS) on MS distributions for recent AI bulls:

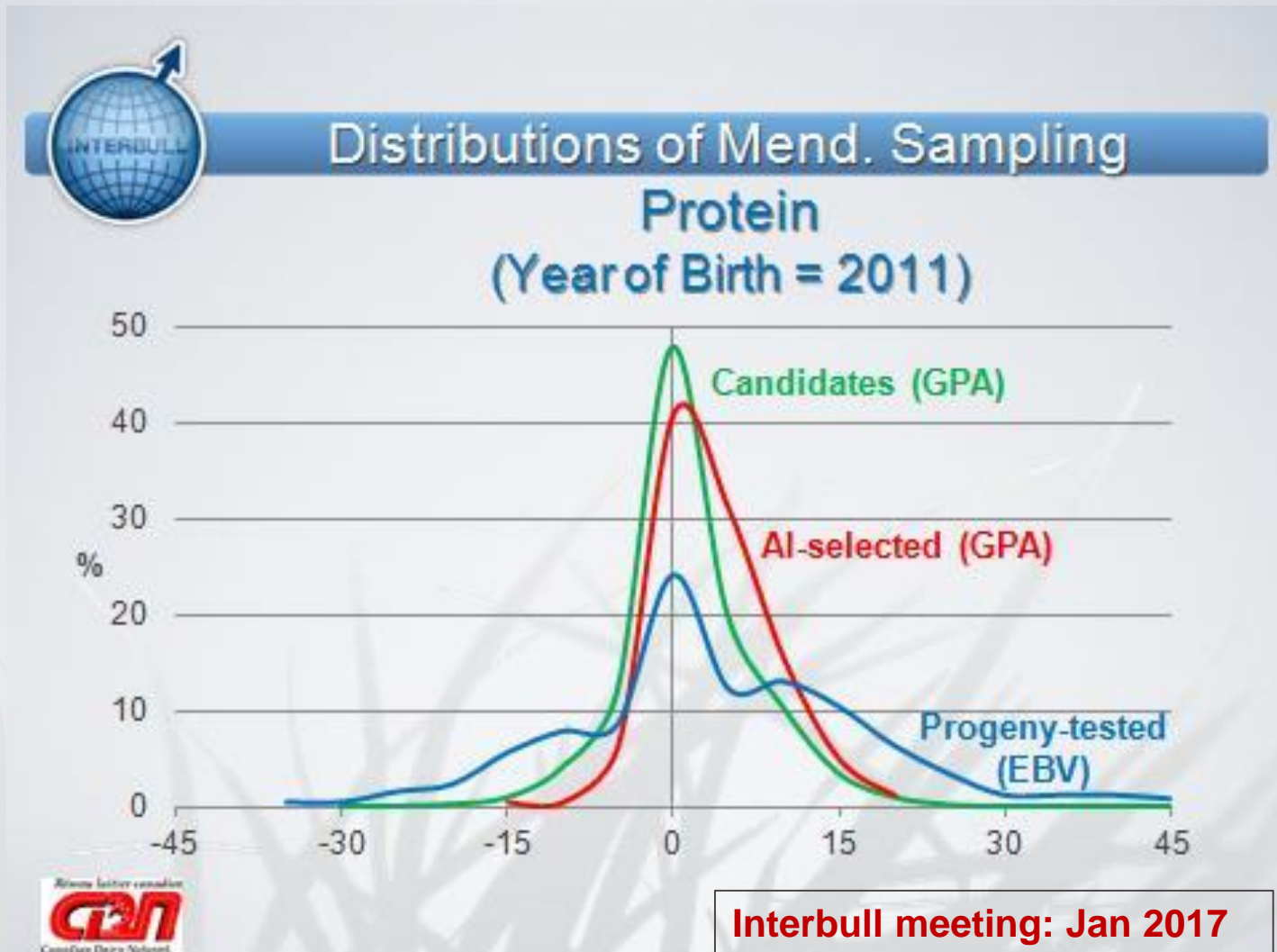
$$E(MS) > \mathbf{0}$$

$$V(MS) < \frac{1}{2}\sigma_g^2$$

- National systems can also accommodate GPS effects to minimize GPS bias in the national EBV input to MACE



# Graphical view of GPS bias



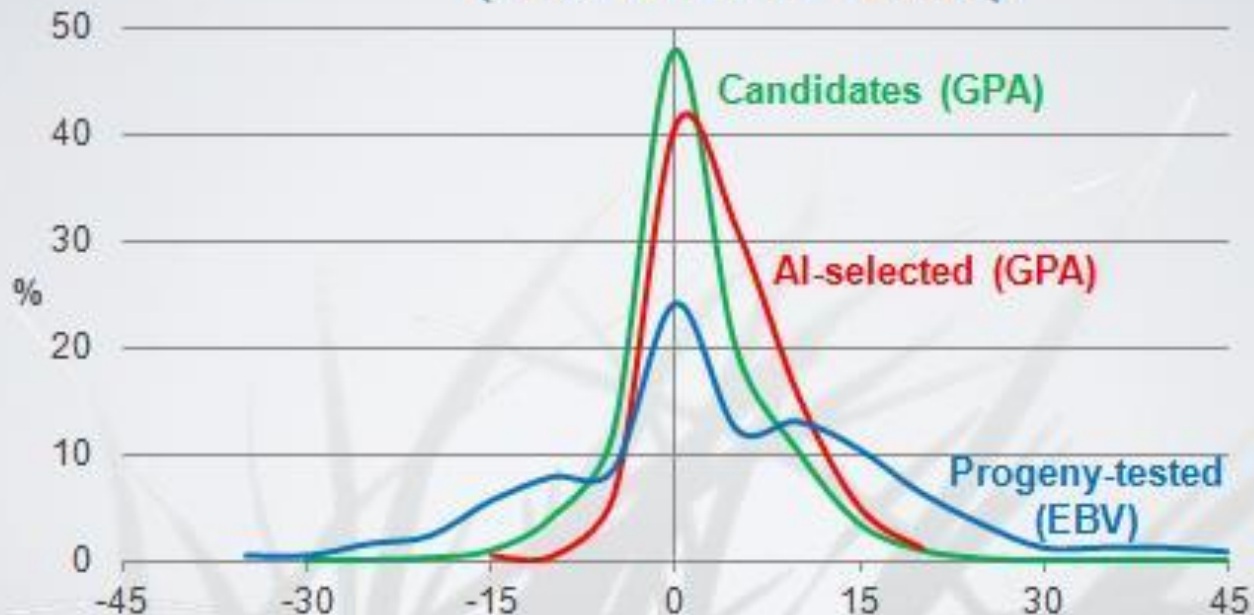


# Graphical view of GPS bias

BLUE *should be* expanded from RED  
but BLUE *is* expanded from RED+GREEN  
Negative tail too heavy *and* wrongly centered on 0



## Distributions of Mend. Sampling Protein (Year of Birth = 2011)





## Current beliefs on GPS bias in EBV

- **Data over-rides** bad model assumptions on MS
  - Biases **larger for culled** than for selected bulls
  - Biases **diminish with** more **daughters**
- Biases similar within a selected group
  - **relatively small** comparing bulls born in **same year** with similar **AI usage** (number daughters)
  - **larger between** birth years
  - shows up as **under-estimated genetic trend**
- **Impact** of bias on MACE is **small? ...increasing**



# Defining GPS bias

- GPS effects should be included as part of predicted genetic merits of genomically pre-selected bulls
- GPS effects are included in GEBV but not in EBV
- Missing GPS effects are referred to as GPS bias

$$\text{GPS bias} = \text{EBV} - \text{GEBV}$$



# Detecting GPS bias in EBV

- $oGEBV_r$  = **genomic** selection criterion, **before AI**
- $GEBV$  = **genomic** estimate **after AI**
- $EBV$  = **conventional** estimate **after AI**

GPS  
bias

- Since 2010

Intensity of GPS increased dramatically, for  $MS > 0$

Expect obvious increasing trends in  $\%MS > 0$

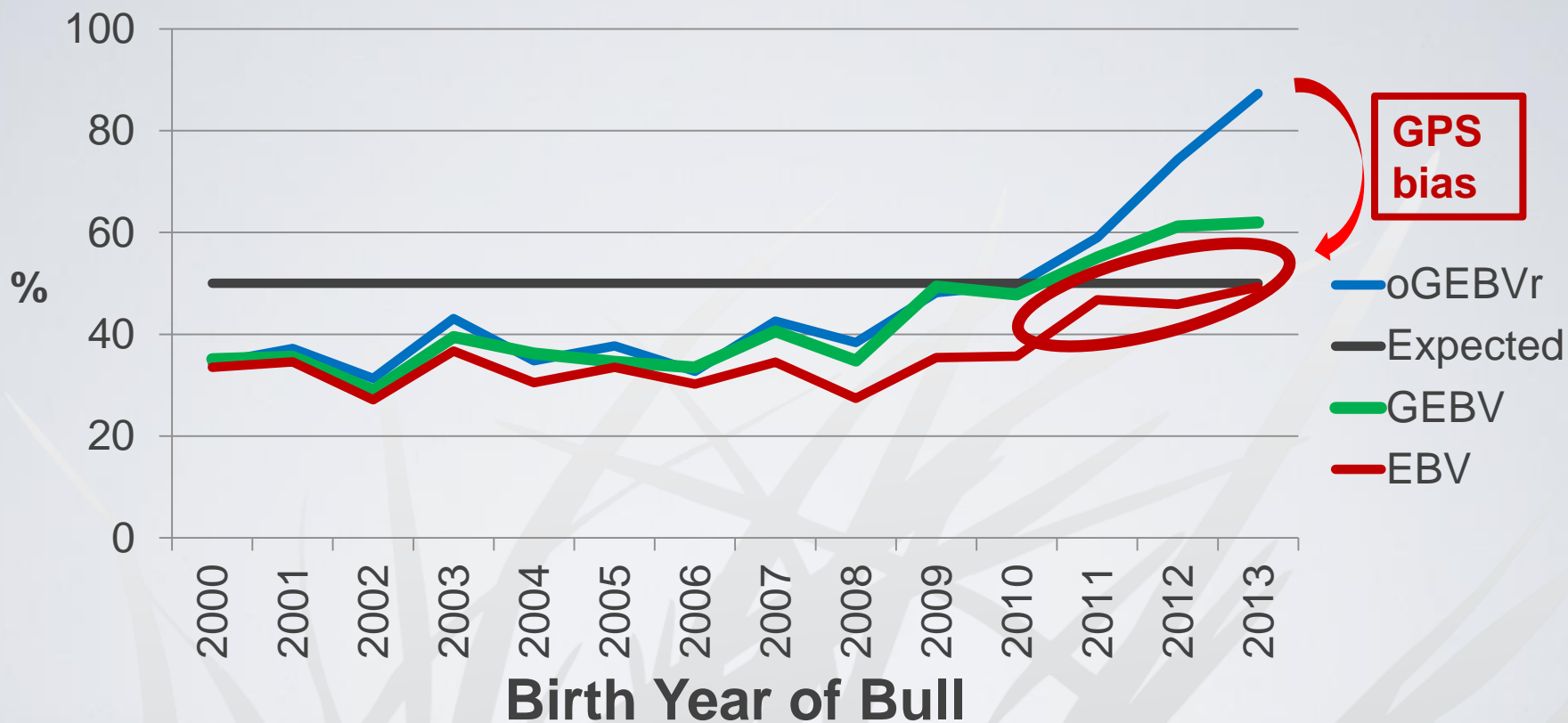
Compare trends in  $\%MS > 0$  for  $GEBV$  and  $EBV$





# %Positive MS: **Conformation**

bull+sire+dam proven in **Canada**

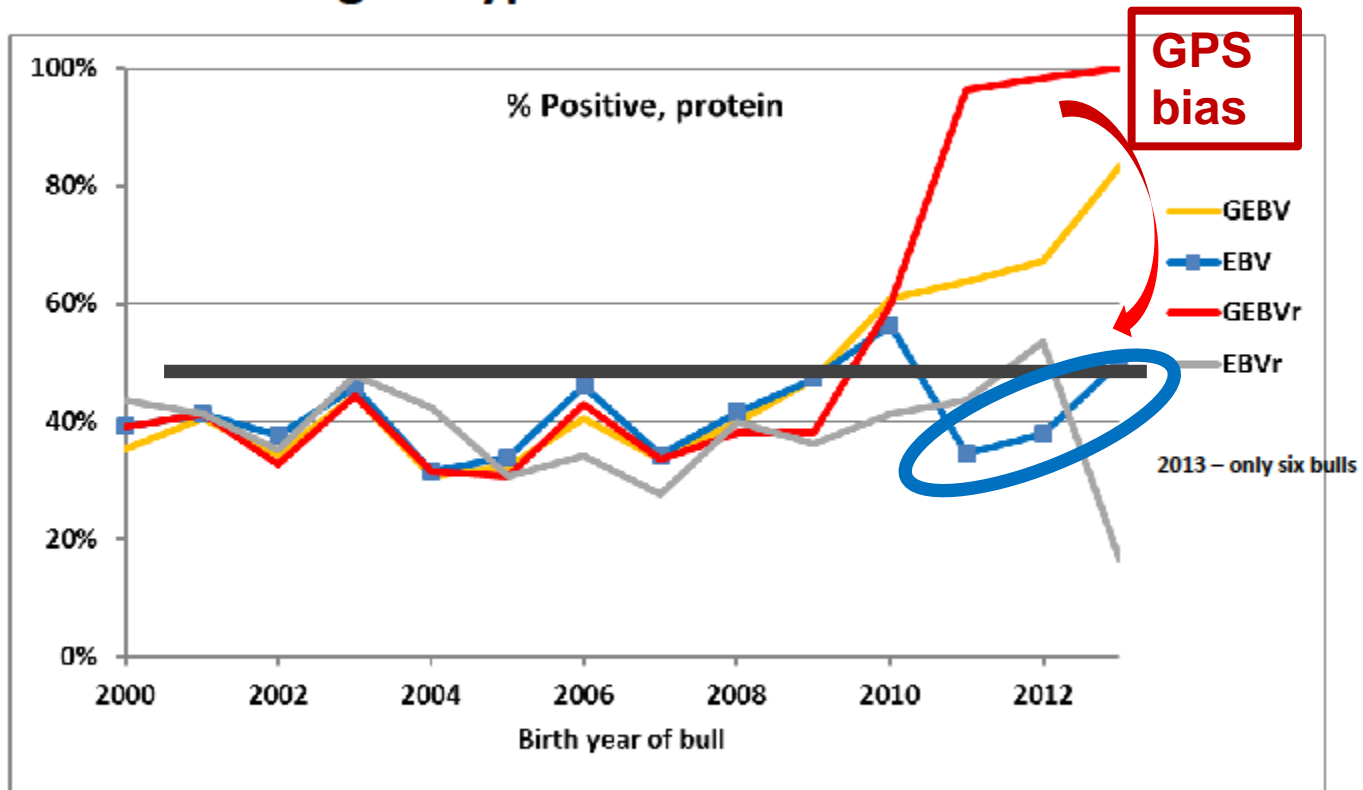




# %Positive MS: Protein

bull proven in DFS

RDC bull mendelian percentage  
genotyped bulls with  $r^2 > 0.79$





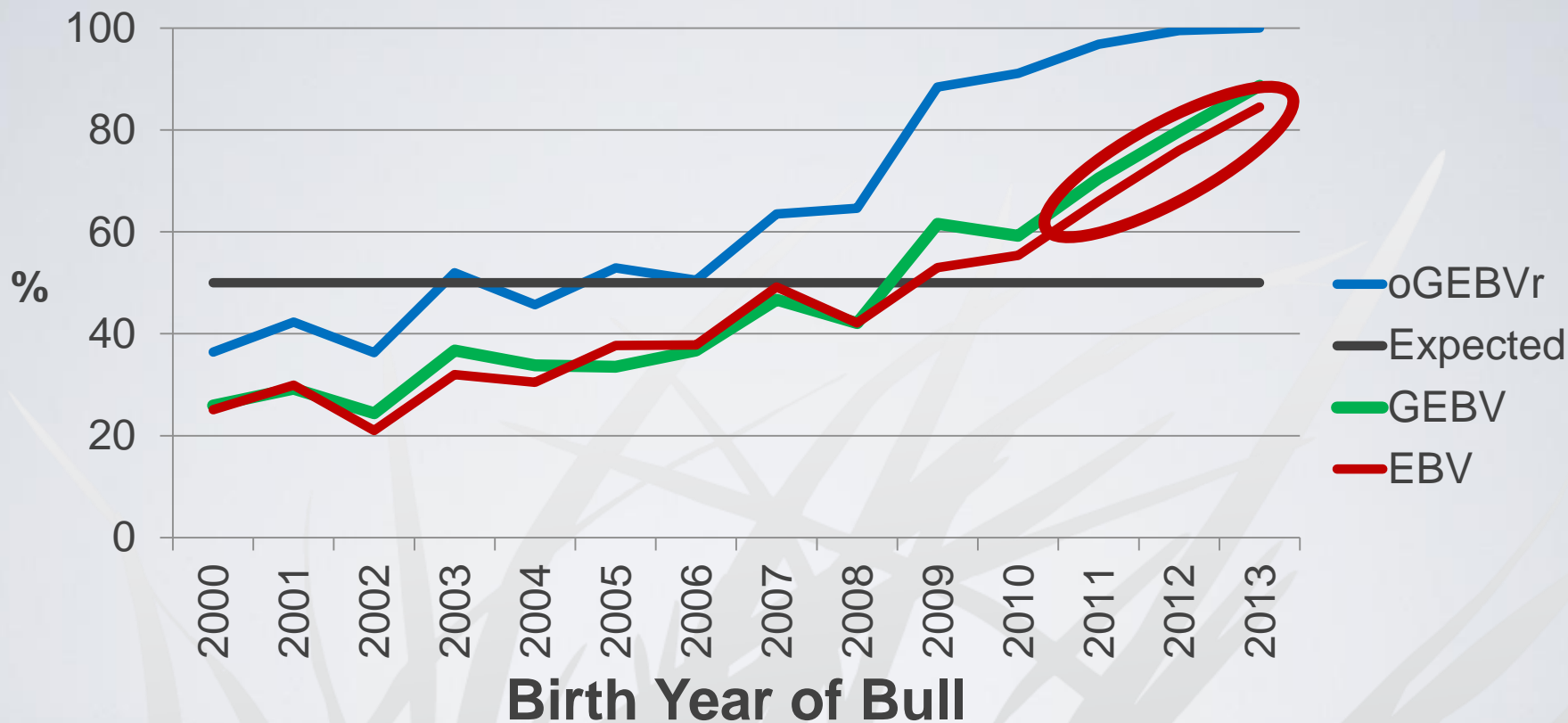
## National EBV sent to Interbull

- Strong trends in  $\%MS > 0$  from GPS effects are included in national GEBV
- The Trends in  $\%MS > 0$  are reduced or eliminated in national EBV, because of GPS bias
- Interbull cannot compute **MS** as  $(AN - \text{Sire}/2 - \text{Dam}/2)$ 
  - Countries do not submit EBV of cows (for **Dam/2**)
- Interbull can only look at **mPI** as  $(AN - \text{Sire}/2 - \text{MGS}/4)$



# %Positive mPI: **Conformation**

bull+sire+dam proven in **Canada**

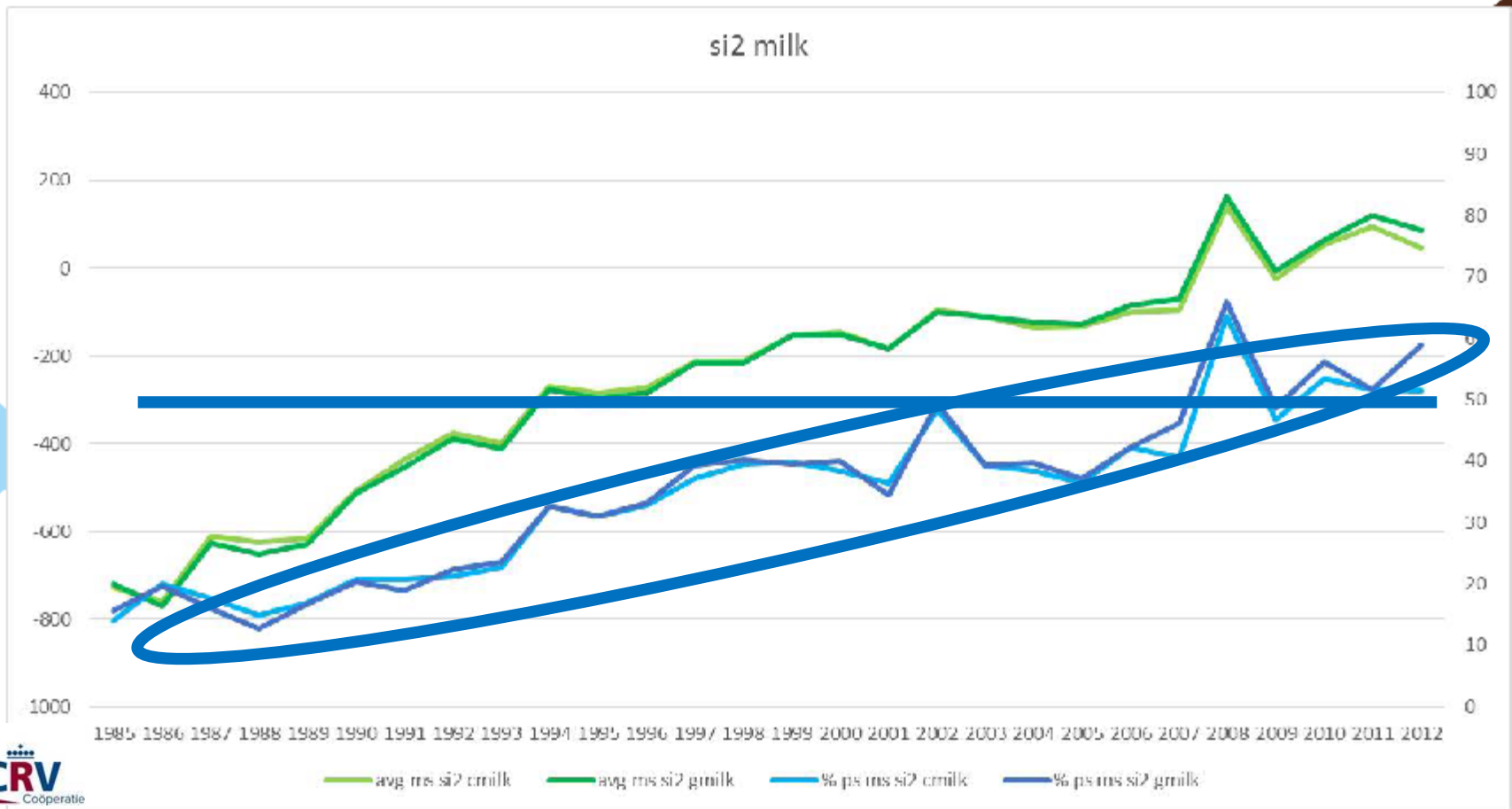




# Average & %Positive mPI: **Milk**

bull+dam tested in **Netherlands**

## MS<sub>si</sub> milk





# Detecting GPS from mPI

- Trends in %mPI more difficult to work with than %MS
- mPI includes genetic trends of females (MGD)
- Current MACE model works more with mPI distributions than MS distributions
  - MACE is Animal Model, but without using cow EBVs
- Can Interbull account for GPS effects in MACE with the data currently provided (only sire EBVs) ???



# Interbull working groups

- GPS and Future MACE:

*Pete Sullivan (Canada), Esa Mäntysaari (Finland),  
Gerben deJong (Netherlands) Haifa Benhajali (Sweden)*

**Develop and test international methods for genomics era**

- Trend Validation Tests

*Paul VanRaden (USA), Pete Sullivan (Canada), Raphael Mrode (UK),  
Zengting Liu (Germany), Esa Mäntysaari (Finland), Valentina Palucci (Sweden)*

**Update current tests and expand beyond trend validation**

- National EBV and MACE (ssEBV input to MACE?)
- National GEBV (2-step) and ssEBV (MACE as input?)
- International GMACE and SNP-MACE



# Options for future MACE

- Using national data provided currently

## *Estimating GPS effects* without genotypes

1. Modified relationship matrix (**3<sup>rd</sup> parent**)
2. **Hyper-parameter** for GPS effects on MS averages
3. **Genetic groups** known animals (+ phantom parents)
4. Data augmentation with **pseudo records** for culls
  - Fill missing gaps to make MS/mPI ~ Normal ???

## *Better underlying assumptions*

$$V(\text{Animal} - \text{PA} - \text{GPS effect}) < V(\text{Animal} - \text{PA})$$

GPS effects can be *in national EBV and MACE* models





# Groups for known animals

- **Genetic groups** (Qg) added to models in the 1970's
  - e.g. AI stud or regions (as genetic pre-selection) effects
- Early-1980's, Kennedy and others showed:
  - Groups **improve** accuracy only if group effects are **large** enough
  - If all ancestors known (**A** complete) genetic groups are **not needed**.
- Late-1980's, Westell, Quaas simplified the application:
  - Replace  $\mathbf{A}^{-1}$  with  $\mathbf{W}$  to add unknown phantom parents groups
  - Became standard** approach for genetic groups in dairy evaluations
  - But using  $\mathbf{W}$  **restricts grouping to unknown**, missing pedigree
- GPS groups are known animals with known parents !!



# Groups for known animals

## -national EBV models

- Methods are well-known (since 1970's), but not standard option in EBV software, except using **W**.

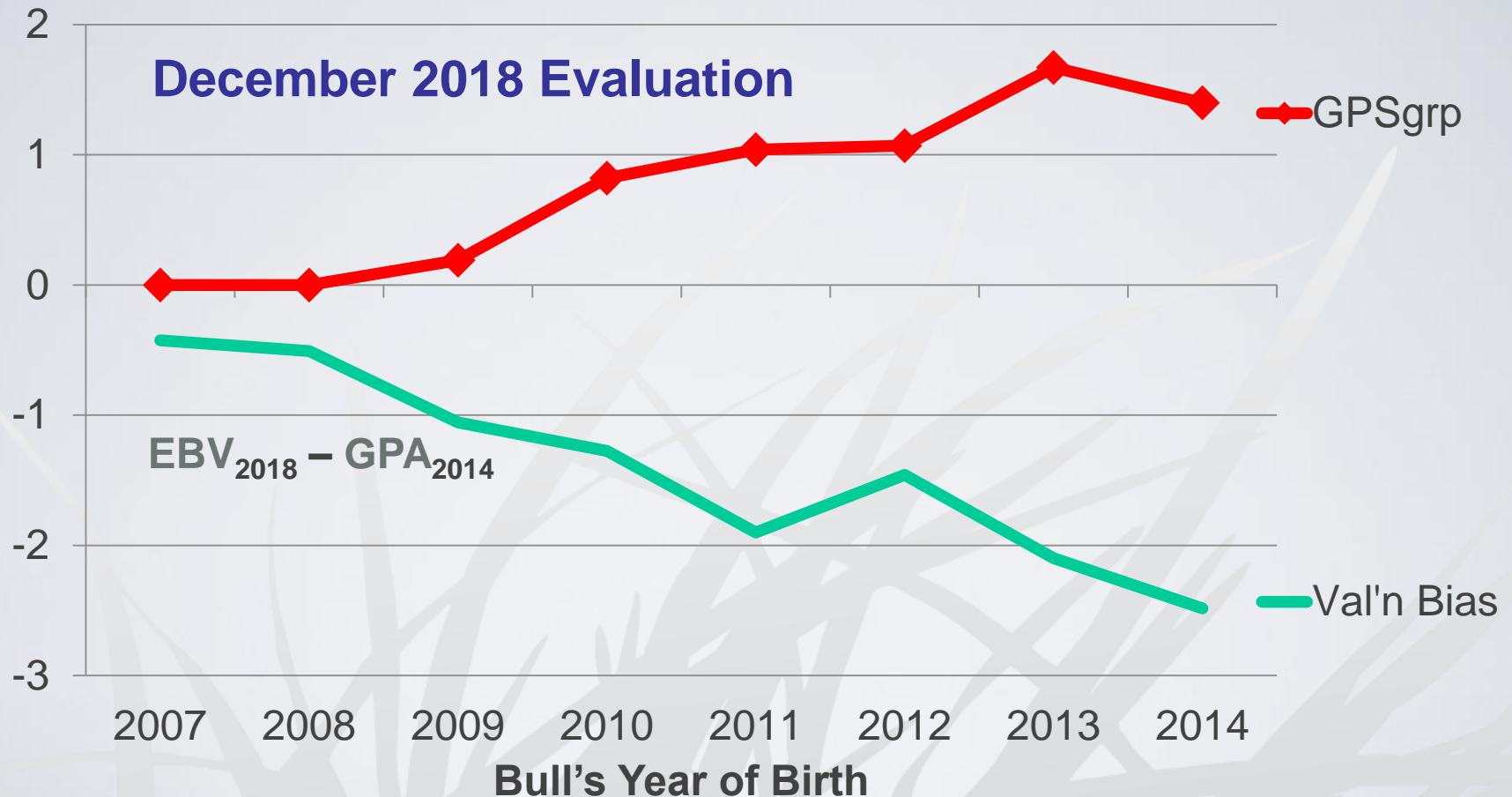
**New programming** required to fit genetic groups for both **Unknown Parents AND** additionally for GPS effects on **known animals** with known parents

- Unknown parent groups (**W**) account for **PA-selection**
- Known-animal GPS groups account for **MS-selection**
- Feasible to update national and MACE software
- Will require **custom programming**, especially for low variance, skewness, or multi-modal ~ MS / mPI



# Holstein Conformation (Canada)

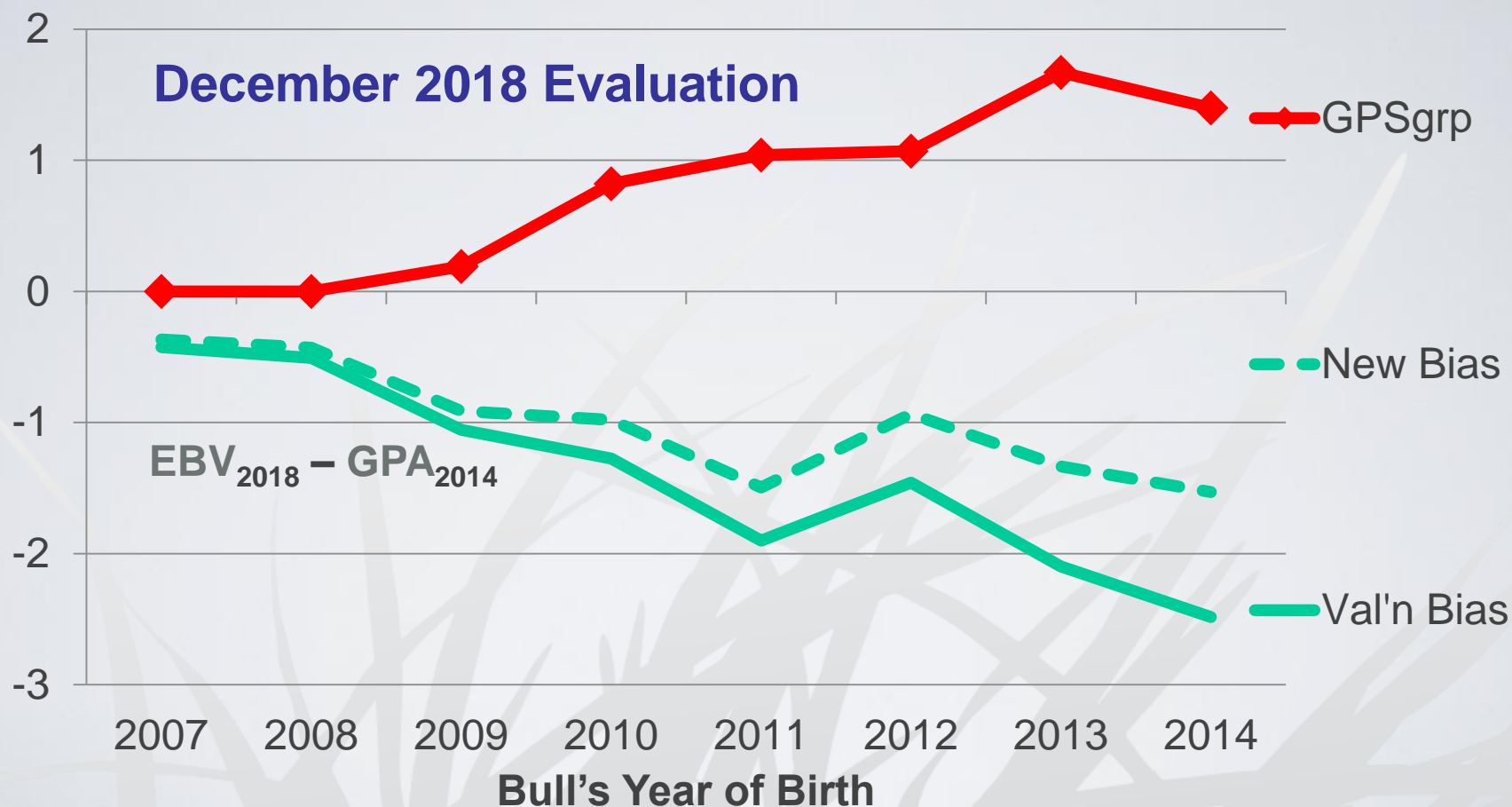
## (Genomic PreSelection Group Effects)





# Holstein Conformation (Canada)

## (Genomic PreSelection Group Effects)





## Holstein Conformation (Canada)

- After adding GPS group effects to the model
  - **Bias** in genetic trend **partially removed** (~40-50% smaller)
  - **Expecting further improvement with reduced variance** for selected MS (next step in this ongoing research)
- Consistent with simulation results (Fikse, 2014)
- GPS groups recommended by Patry and Ducrocq
- Obvious implementation, however, might give only partial benefits



# Groups for known animals

## -international MACE model

- **Success will be in the details** ... some ideas to be tested
- Same Unknown Parent Groups in **Deregression and MACE**
  - Across-country groupings
  - Country of origin, Birth year, Selection path
- GPS groups **only in the MACE** model, not in Deregression
  - Within-country groupings
  - Country where used in AI, Birth year
  - Need to consider single-country versus multi-country bulls



# Options for future MACE

- With new data: Countries provide **EBV** + **GEBV**

If modeling GPS effects is not a good enough solution, another option is to use pre-corrected EBV input data

$$EBV^* = \mathbf{EBV} + f(\text{GEBV} - \text{EBV})$$

MACE\* uses EBV\*

$$\mathbf{MACE} = f^{-1}(\text{MACE}^*)$$

Transformation function  $f()$  could be simple or complex

A simple  $f()$  **example**: add yearly averages of GEBV-EBV, correcting only for the GPS-biased genetic trend in EBV



# Options for future MACE

- Countries provide EBV + GEBV

- The idea with transformation: use EBV\* in **MACE** that are significantly **“less biased”** by GPS, while still excluding individual genotype contributions, to continue **MACE in SNP**
  - i.e. **Not double-counting** genotype effects in national GEBV
- Variances and correlations could be estimated from the “less biased” EBV, with **modifications to allow** truncated MS data
- **Accommodate variation** between countries, in methods for GPS effects, because transformations are relatively smaller (appropriately) for countries with more advanced methods





# Final Comments

- Not yet clear if ***EBV of females*** will be helpful or if ***EBV+GEBV*** will be required for future MACE
- Picking the best approaches objectively will require good ***validation testing*** and ***GPS simulation***