



Animal Life Cycle Submodule on Ruminant Farms Systems (RuFaS) Model: a Sensitivity Analysis to Evaluate Heifer Reproductive Protocols



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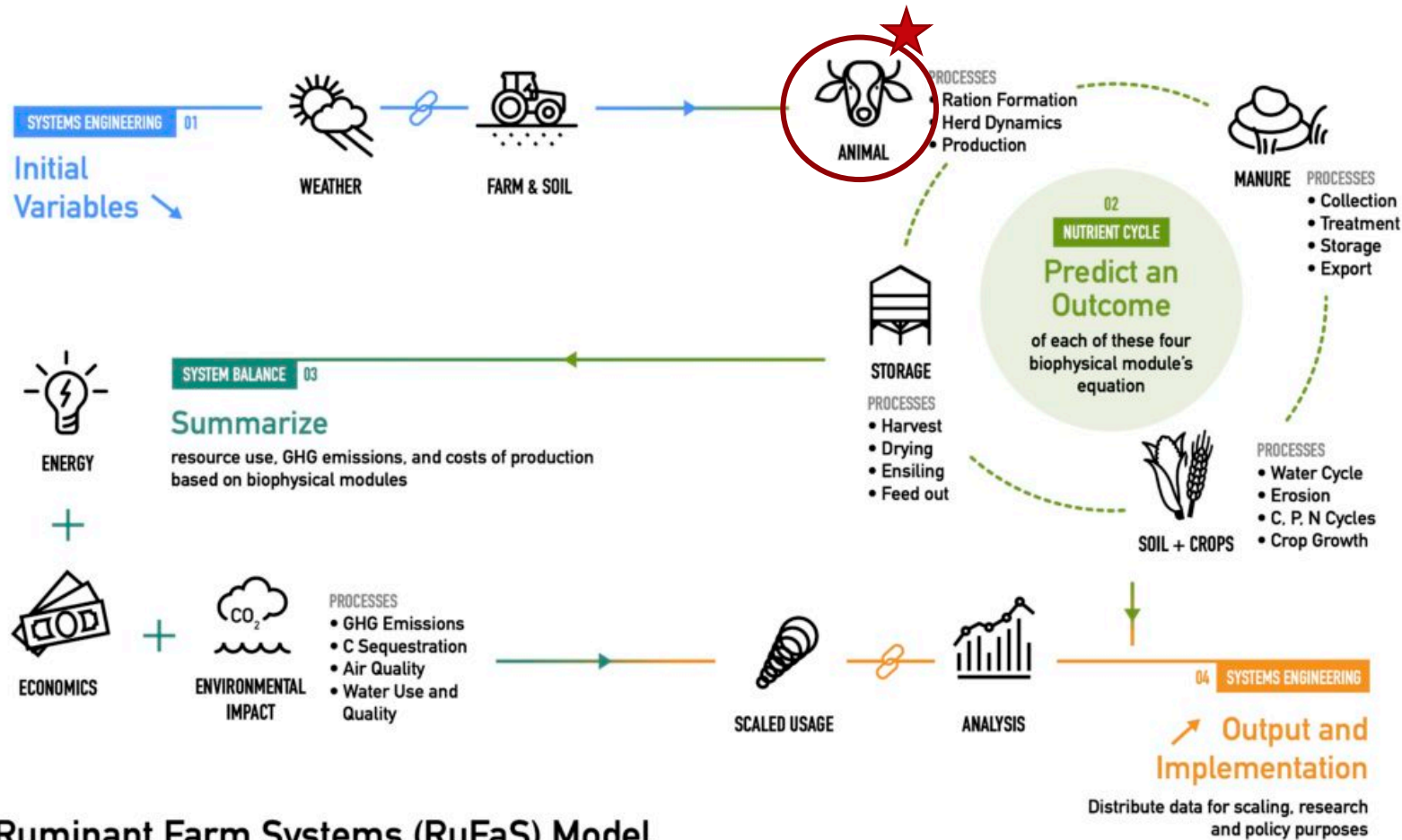
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Objective

- Identify the most influential factors affecting heifer reproduction performance when the herd is managed through:
 - Pure estrus detection (ED)
 - Timed AI (TAI)
 - Synch-ED

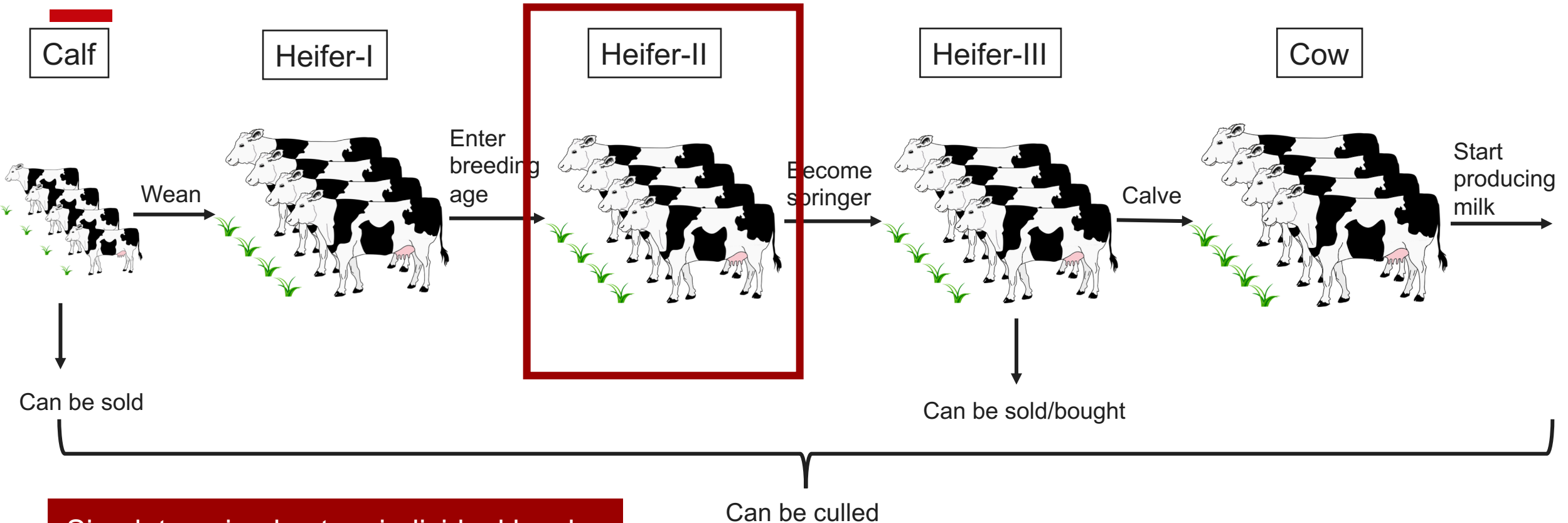
Ruminant Farms Systems (RuFaS) Model



Ruminant Farm Systems (RuFaS) Model

(Hansen et al., 2021)

Animal Life Cycle Submodule



- Simulate animals at an individual level
- Monte Carlo methods

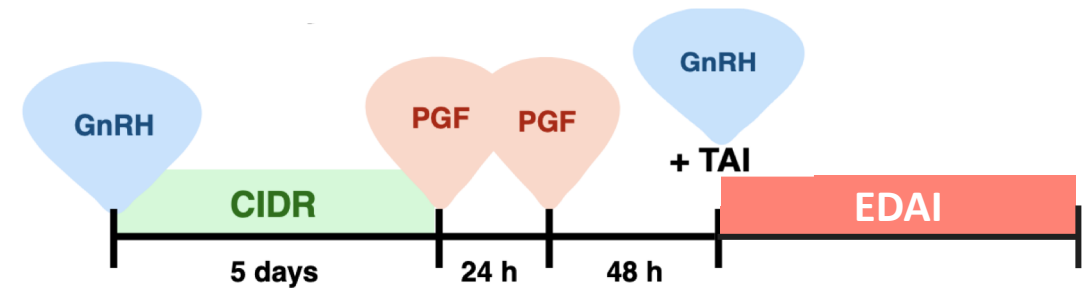
Heifer Reproductive Protocols

- Pure estrus detection (ED)



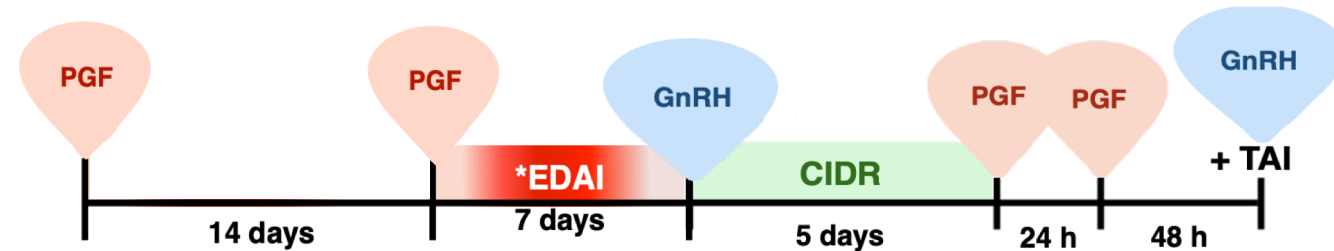
- Timed AI (TAI)

- First breeding:
 - 5-d CIDR-Synch with GnRH and 2 PGF
- Consequent breedings
 - EDAI



- Synch-ED

- First breeding:
 - Two PGF followed by ED
- Consequent breedings
 - TAI



(DCRC, 2018)

Sensitivity Analysis

- To quantify how much of the model variance each input parameter is responsible for
 - If a parameter has **large sensitivity index**, a change in this parameter can lead to a **large change in the model output**





Some of Sensitivity Analysis Methods

- Local: one-at-a-time (OAT)
- Global
 - Sampling-based methods (based on the analysis of linear models)
 - Morris method
 - Supersaturated design
 - Fractional factorial design
 - Latin Hypercube Sample
 - Uniform design
 - Variance-based method (for non-linear and non-monotonic model)
 - Sobol method
 - Fourier Amplitude Sensitivity Test (FAST)

(Bertrand Iooss and Paul Lematre, 2014; An Van Schepdael, and Aurélie Carlier and Liesbet Geris, 2016; Jing Yang, 2011)



Sobol Method

- Global sensitivity analysis
 - Values of all input parameters are sampled quasi-randomly within a pre-defined range
- Variance-based
- Allow the effects of interactions between parameters
- Computational requirement is high
 - $N \times (\# \text{ of parameters} \times 2 + 2)$

For example:

$N = 128$

of parameters = 7 for heifer TAI

of runs required = $128 \times (7 \times 2 + 2) = 2048$



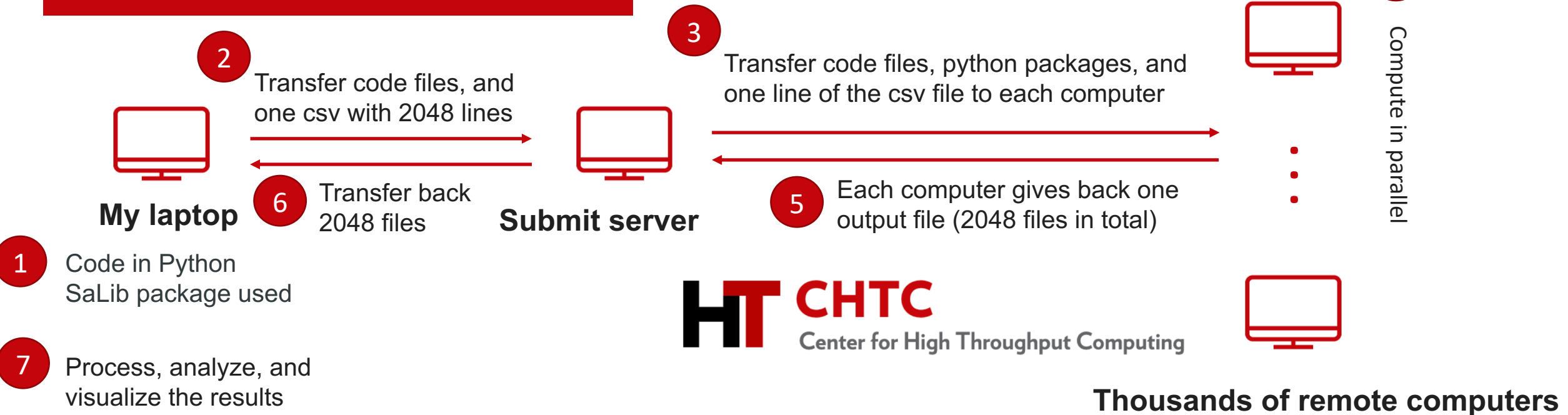
Analytic Framework

For example:

$N = 128$

of parameters = 7 for heifer TAI

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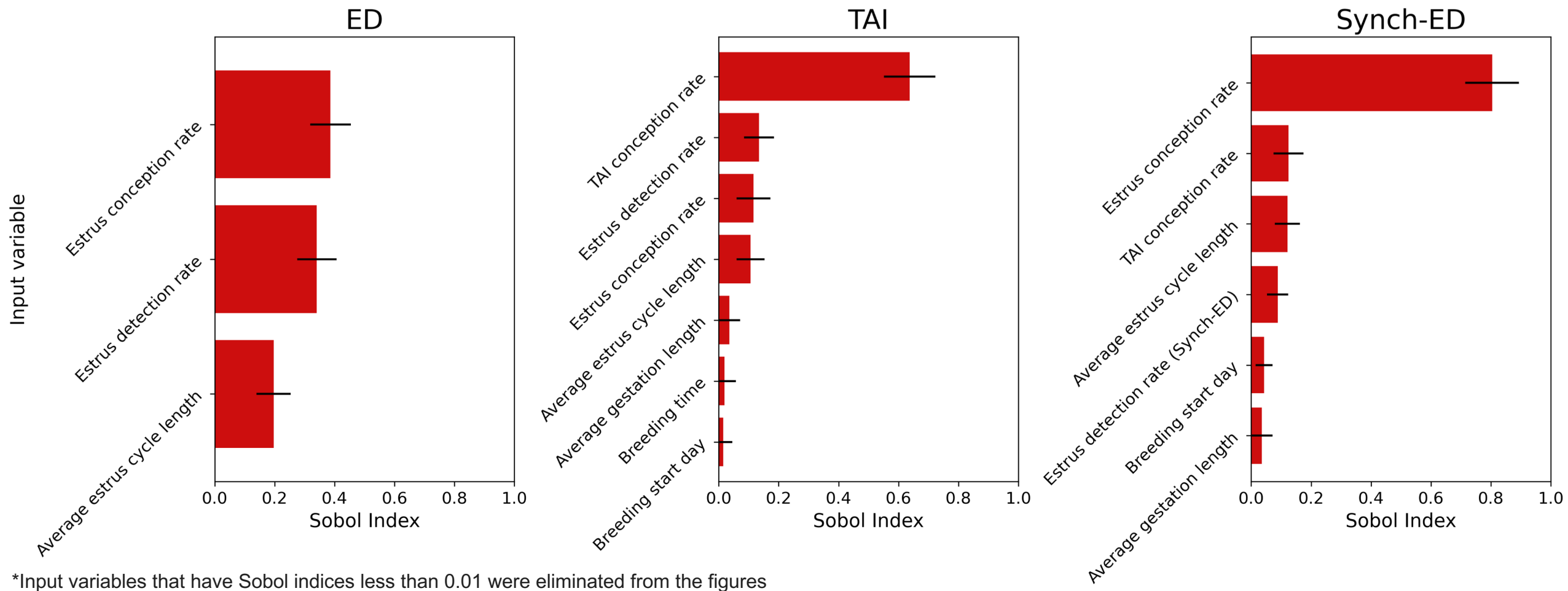


Input Parameter Interval

Input variables	ED	TAI	Synch-ED
Breeding start day (d)		(342, 418)	
Breeding time (d)		(126, 154)	
TAI conception rate (%)	NA	(48, 72)	(48, 72)
Estrus detection rate (%)	(48, 72)	(48, 72)	(56, 84)
Estrus conception rate (%)		(48, 72)	
Average estrus cycle length (d)		(18, 24)	
Average gestation length (d)		(272, 284)	



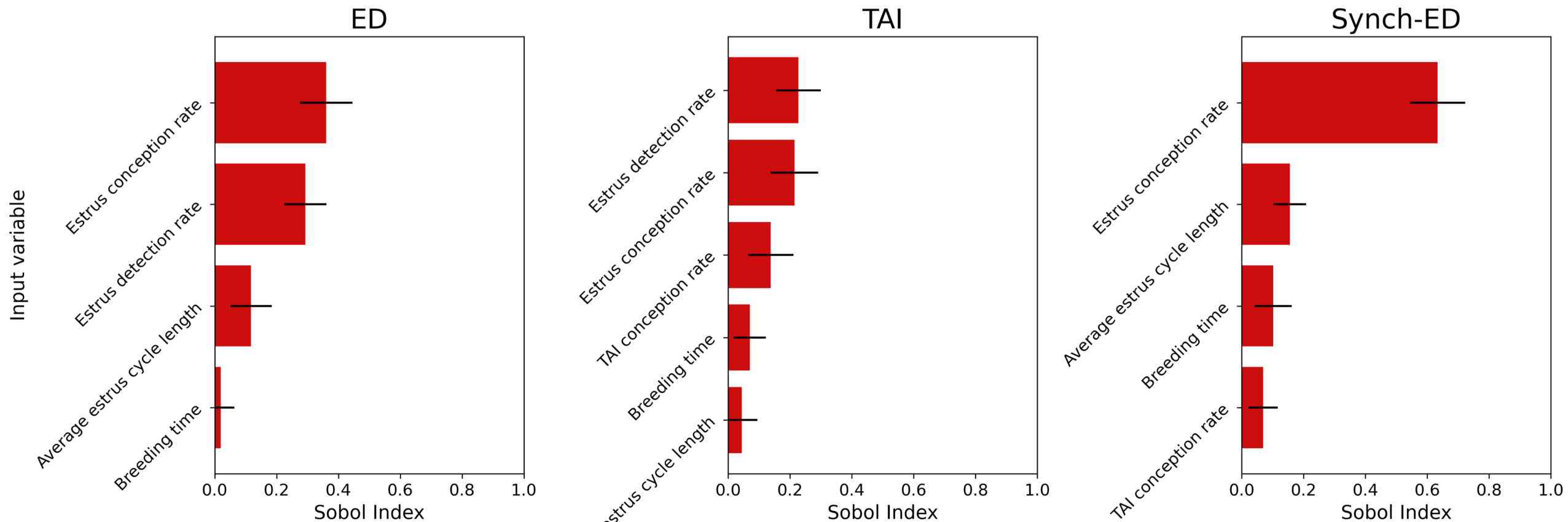
Results: Heifer Pregnant Rate



*Input variables that have Sobol indices less than 0.01 were eliminated from the figures



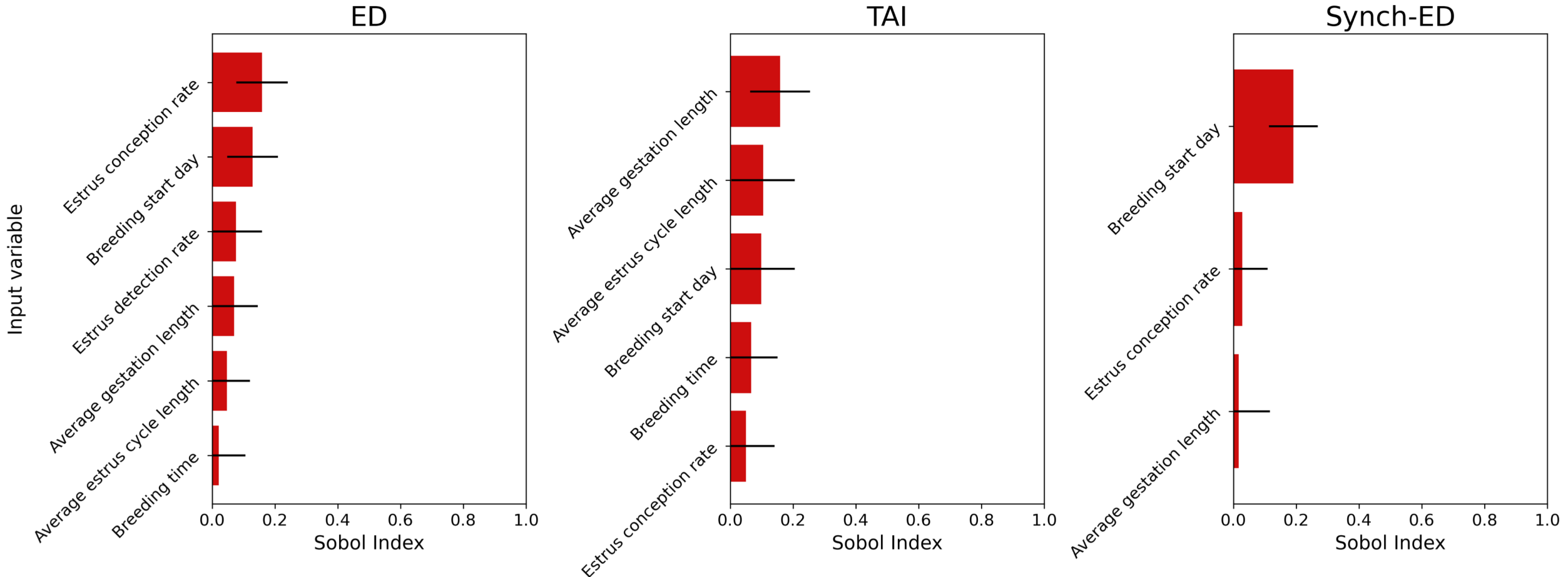
Results: Culled Heifer Last Year



*Input variables that have Sobol indices less than 0.01 were eliminated from the figures



Results: Net Return



*Input variables that have Sobol indices less than 0.01 were eliminated from the figures

Take-home Messages

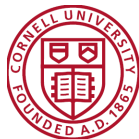


- ED
 - Estrus conception rate and estrus detection rate are similarly important to both pregnant rate and the number of culled heifer last year.
- TAI
 - TAI conception rate is the most influential factor to pregnant rate.
 - Estrus conception rate and estrus detection rate are the top two influential factors to the number of culled heifer last year.
- Synch-ED
 - Estrus conception rate is the dominant factor to pregnant rate and the number of culled heifer last year.
- Breeding start day, Estrus related variables, gestation length and are important factors to net return.



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