





# Structured resilience phenotyping using big dairy data

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#### Resilience in cattle

- (and livestock generally)
- Major trait of interest
  - Changing climate
  - Unreliable feed sources
- Challenging to define
- Diverse research ongoing
  - SLU Animal Biosciences

Home > Genetics Selection Evolution > Article

## Why breed disease-resilient livestock, and how?

Review | Open access | Published: 14 October 2020 Volume 52, article number 60, (2020) Cite this article

Getting to grips with Resilience: Towards large-scale phenotyping of this complex trait

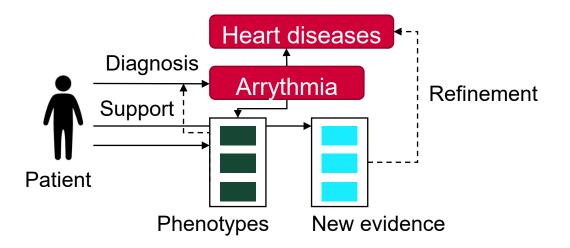
N.C. Friggens <sup>1 4</sup>  $\stackrel{\wedge}{\sim}$   $\boxtimes$  , M. Ithurbide <sup>2</sup>, G. Lenoir <sup>3</sup>



#### Time for structured approach to phenotyping?

#### **Human Phenotype Ontology**

- Wide basis of medical data
- Ontology of terms
- Disease phenotypes in patients
- Diagnoses & treatments linked into ontology
- Reinforces with new evidence





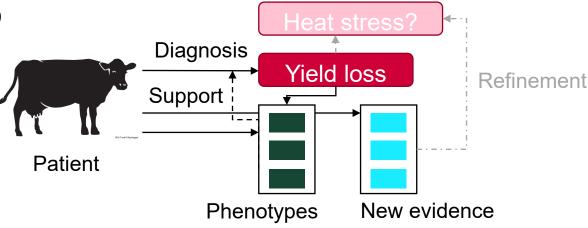
## Time for structured approach to phenotyping?

#### **Human Phenotype Ontology**

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#### "Cattle Phenotype Ontology?"

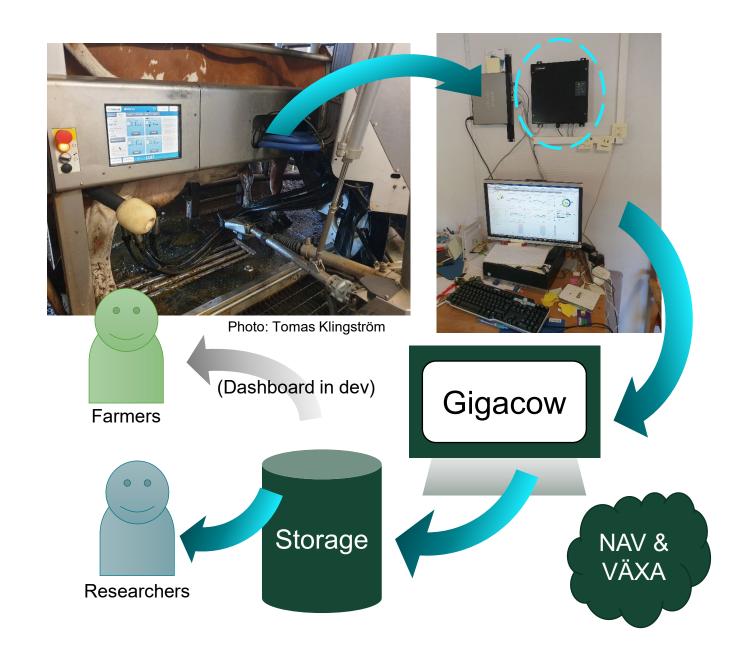
- Big data established & growing
- Disease phenotypes known
- ... now what?





## Gigacow: Structure

- Connected dairy farms
  - DelPro (++?) management system
  - Daily script transfers data to SLU
  - Automates farmer sharing data
- Gigacow server
  - Pseudonymizes identities
  - Unifies data format
  - Transfers to storage
- External data sources
  - SNP genotypes from NAV
  - Växa Kokontrollen
- Data storage
  - Raw data accessible by SQL query
  - R framework available for SQL access





#### **Summary stats SLU Gigacow**

tklingstrom.github.io/gigacow\_exampledata

3 973 animals as of 2024-09-01

	2023-05-03	2024-04-29	Increase	# Animals	# Animals	Increase
Total				17 214	19 673	14 %
Milking						
events	3 589 973	5 164 866	44 %	2 706	3 105	38 %
Robot						
milkings	1 338 560	2 059 780	54%	1 088	1 523	40 %
<b>Activity data</b>	431 577	620 524	44 %	2 165	2 357	25 %
Feed days	2 907 939	5 011 588	72 %	3 170	4 211	77 %



#### From sensitive to robust athlete

The project is using variation observed among high producing individuals to identify successful strategies of coping with heat stress and evaluate the possibilities for including these traits in a breeding program.

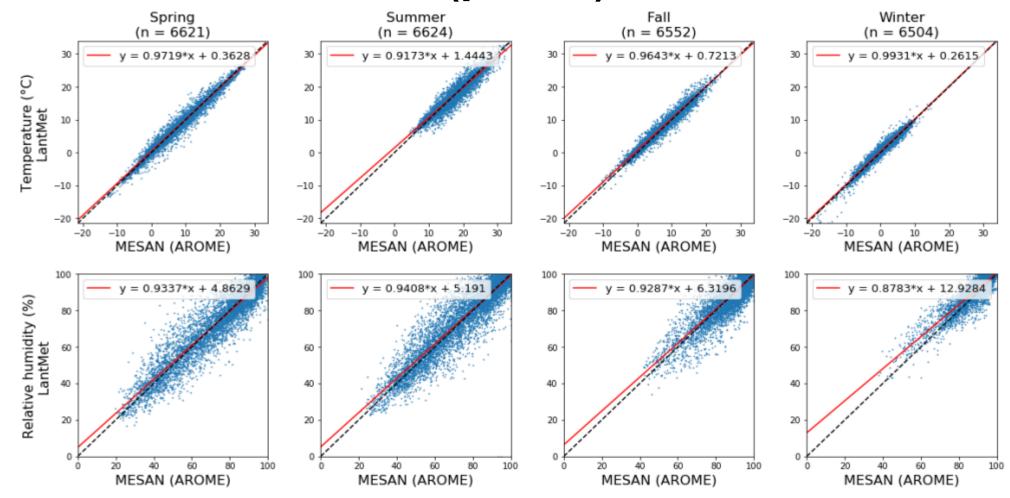


#### **Timeline**

rimeime	2020	2022	2023	Current
Year	Pilot 1	Pilot 2	Pilot 3	Research project
Service provided	Weather data validation	Weather data DelPro data	Weather data DelPro data Multi year	Weather data DelPro data Multi year Calving data Disease data Genotype data



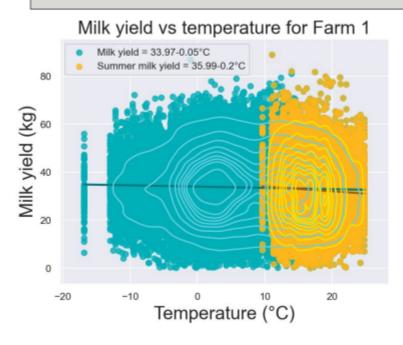
#### Weather data validation (pilot 1)





## Impact of heat stress at a Swedish dairy farm (pilot 2)

#### Regression Analysis

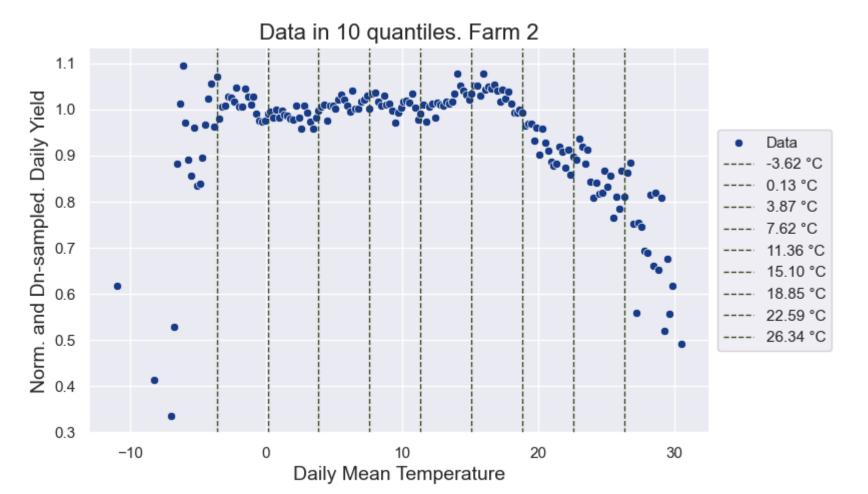


First order linear regression indicates how milk yield (kg) is affected by an increase in temperature (°C).

Farm name	All data		Summer		Top producers	
i ai iii iiaiiie	kg	kg/°C	kg	kg/°C	kg	kg/°C
Farm 1	33.97	-0.05	35.99	-0.20	39.32	+0.04
Farm 2	33.94	-0.16	36.50	-0.15	43.17	-0.24
Farm 3	37.66	-0.03	37.58	-0.05	43.88	+0.07
Farm 5	37.00	+0.02	41.13	-0.21	45.47	-0.10
Farm 7	40.09	-0.01	39.55	+0.03	47.82	-0.05
Farm 8	33.09	-0.11	36.01	-0.31	39.39	-0.21
Farm 9	29.26	-0.02	32.72	-0.20	37.83	-0.06

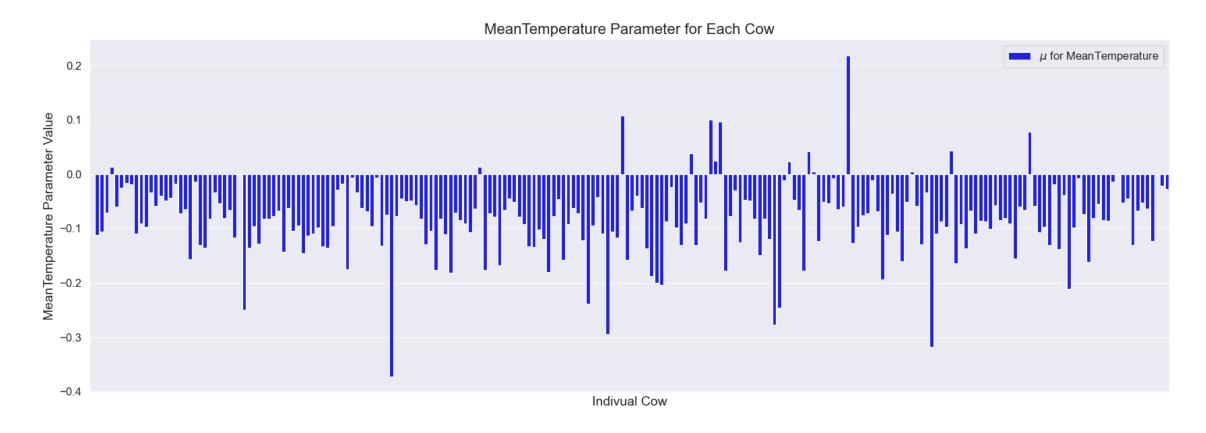


## Capturing heat stress at a Swedish dairy farm (pilot 3)



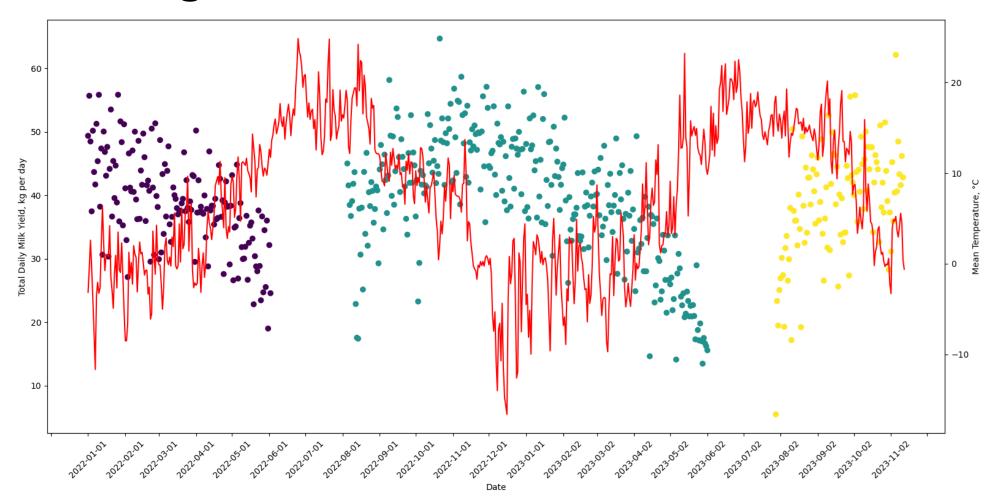


## Individual impact (pilot 3)



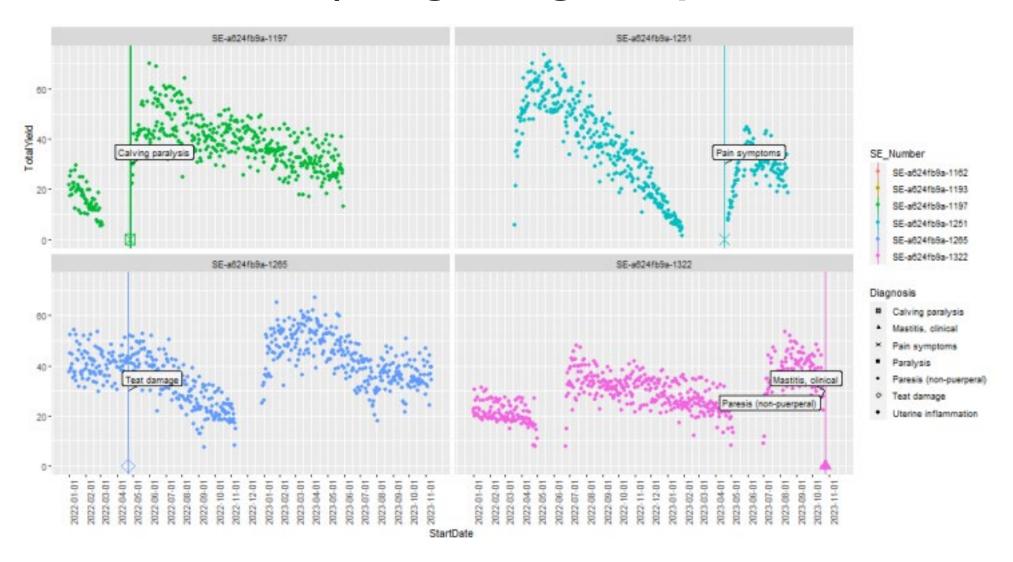


## **Confounding factors!**



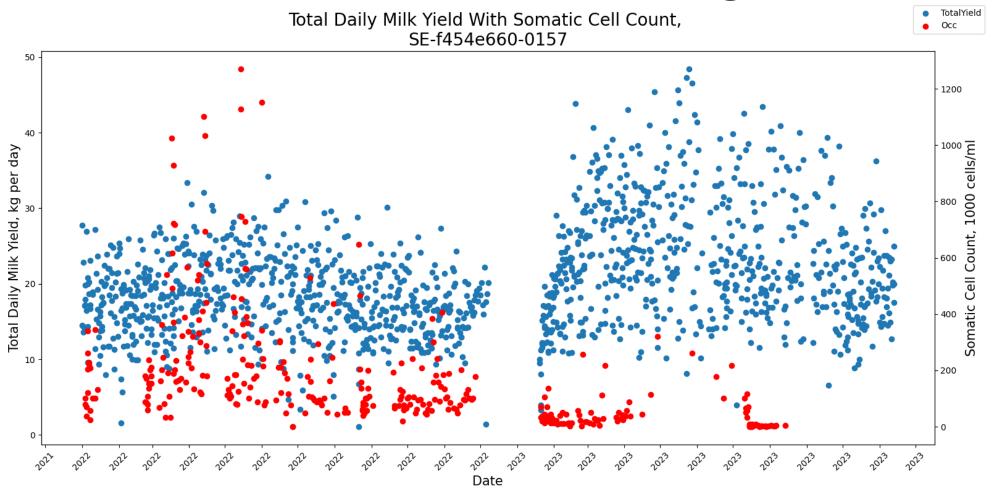


#### Health events (integrating a separate database)





## Heat stress vs mastitis vs something?





#### One project contributes to many others



Heat stress project

Data & methods reapplied

Phenotype – Heat tolerance

Phenotype – Pregnancy loss

Between farm variation

Impact of mastitis

Resilience indicators

Microbiome variation

Lactation length adjustments

iDDEN integration



#### **Future directions**

- Refine phenotyping methods on Gigacow
- Find resilience phenotypes in Swedish dairy cattle
- Expand investigations to local/internional breeds
  - Breedmaps: Bos taurus pangenome structural variation



#### Tomas Klingström's Poster:

Owned vs borrowed data: lessons learned from data collection on commercial dairy farms

Session 94 "Living labs and demonstration farms: approaches to improve sustainability of LFS globally".

tklingstrom.github.io/gigacow\_exampledata



## **Current organisation**



Lena Mari **Tamminen** Research partner



Martin Johnsson Research partner



Tomas Klingström Researcher/ Coordinator



Ingemar Ohlsson Researcher/ Programmer



D.J. de Koning P.I



Ivan Clegg Database developer Researcher



Patricia Gullstrand



Marcus Pedersen Sysadmin (Interbull)











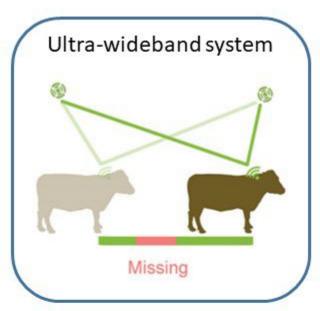


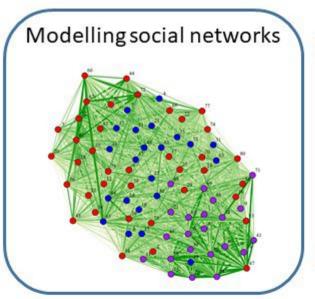


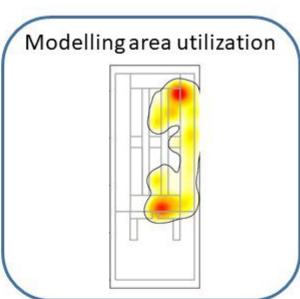


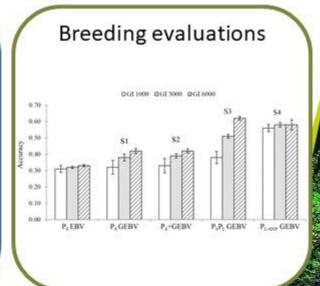


## Deparment of Animal Biosciences















Lars Rönnegård



**Hector Marina** 



Sreten Andonov