

DEPARTMENT OF  
**ENGINEERING  
SCIENCE**



people  
~~technology~~  
It's the ~~economy~~, stupid

**Socio**-Technical Transitions for Net Zero – MT2023

Phil Grunewald

# Why are we here?

**Climate change**

→ **Sustainability**

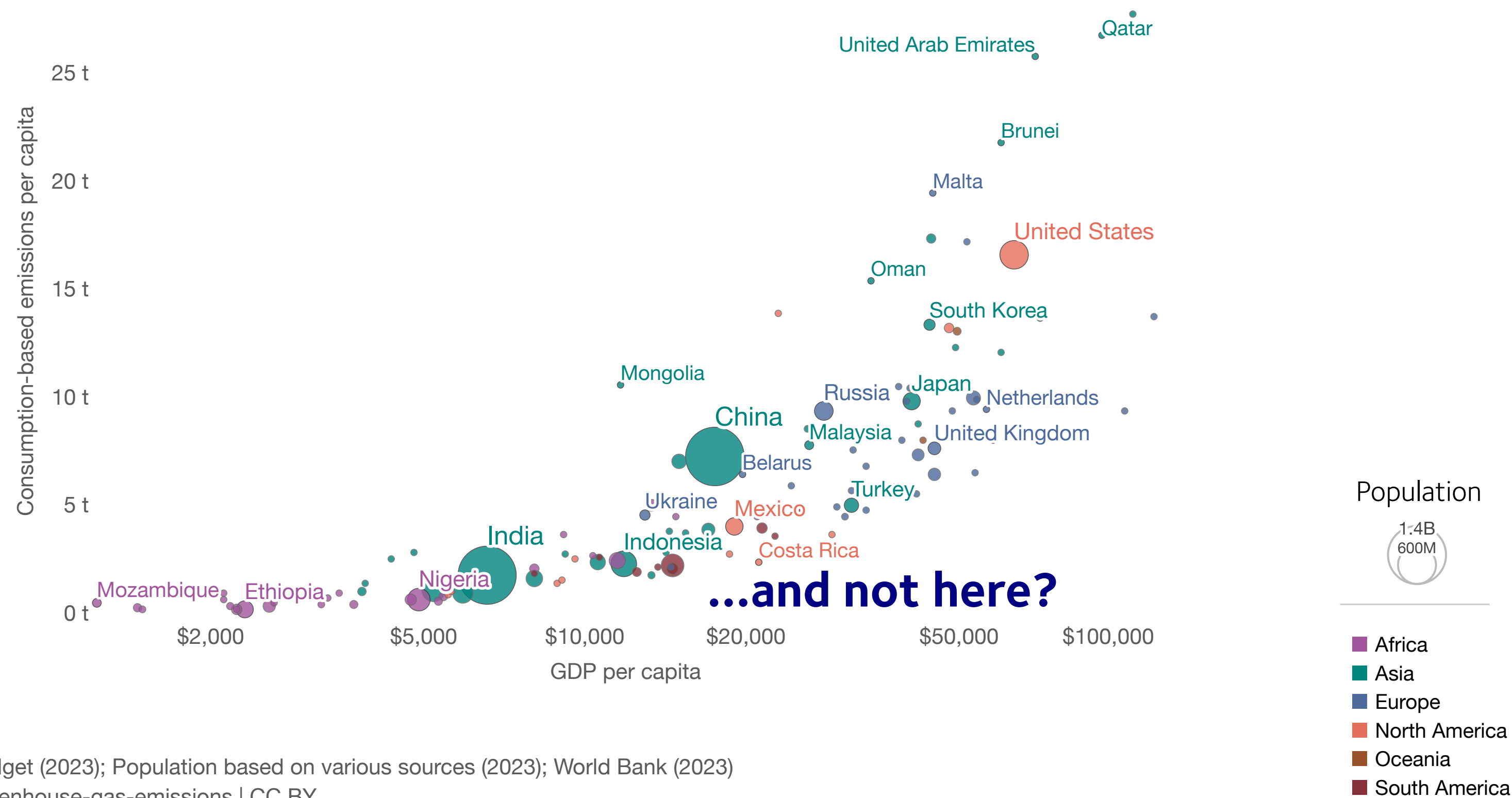
→ **Energy**

→ **Generation**

→ **Demand**

→ **Energy service**

# Why are we here...?

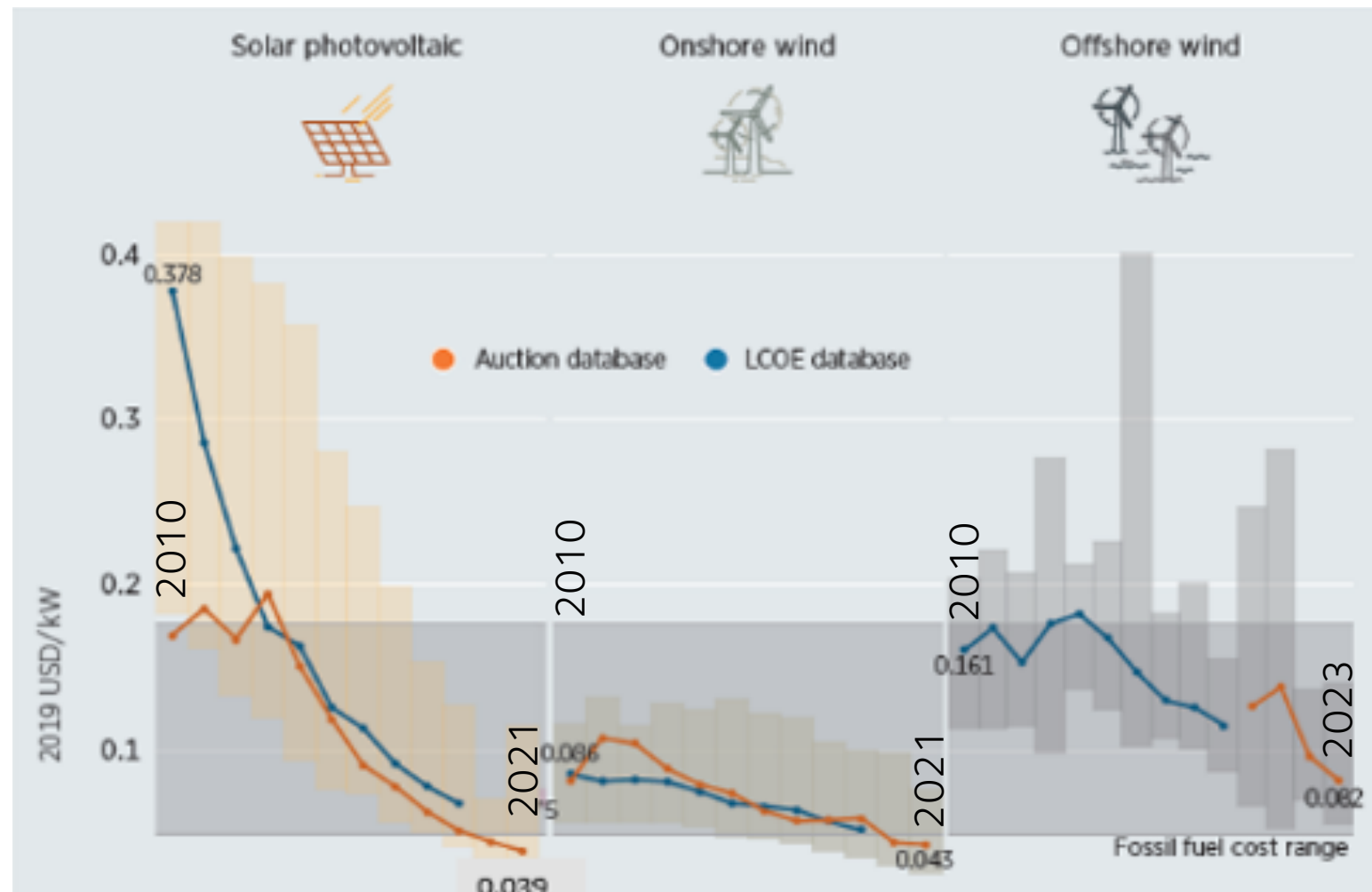


...and not here?

Data source: Global Carbon Budget (2023); Population based on various sources (2023); World Bank (2023)  
OurWorldInData.org/co2-and-greenhouse-gas-emissions | CC BY

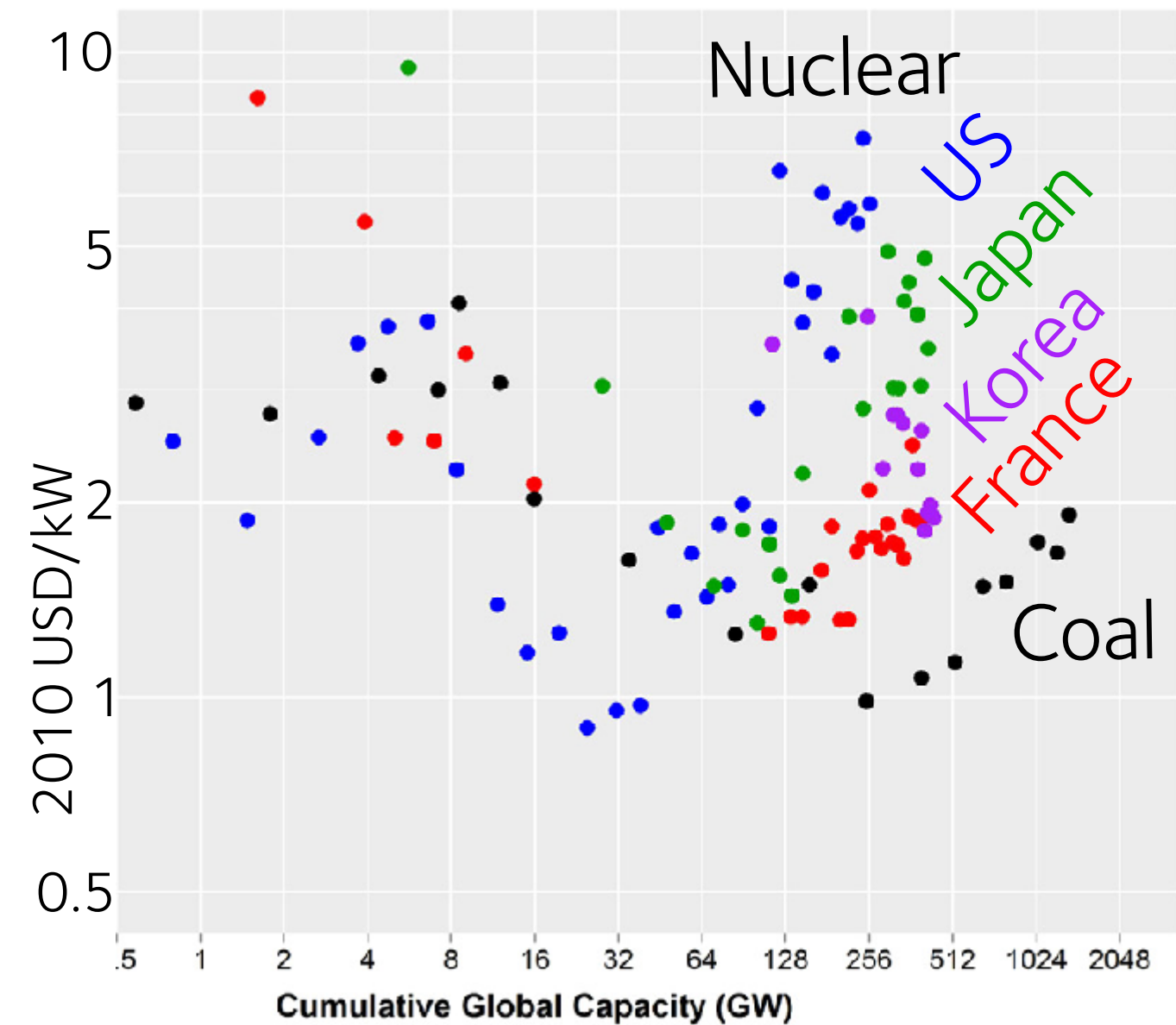
# Supply matters: it's the economy (after all)

## Winners



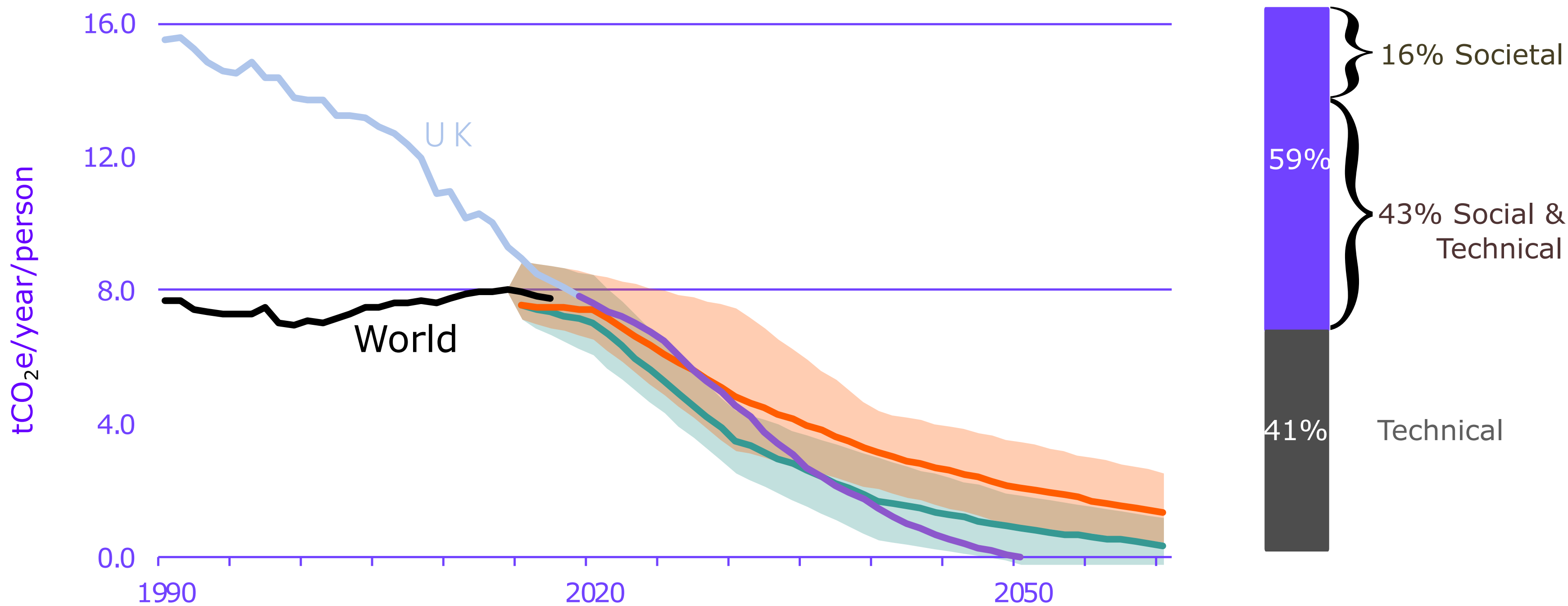
Irena (2020)

## Losers





# The transition becomes more socio-technical



Source: Climate Change Committee. The UK's path to net zero.  
The sixth carbon budget, Climate Change Committee, December 2020

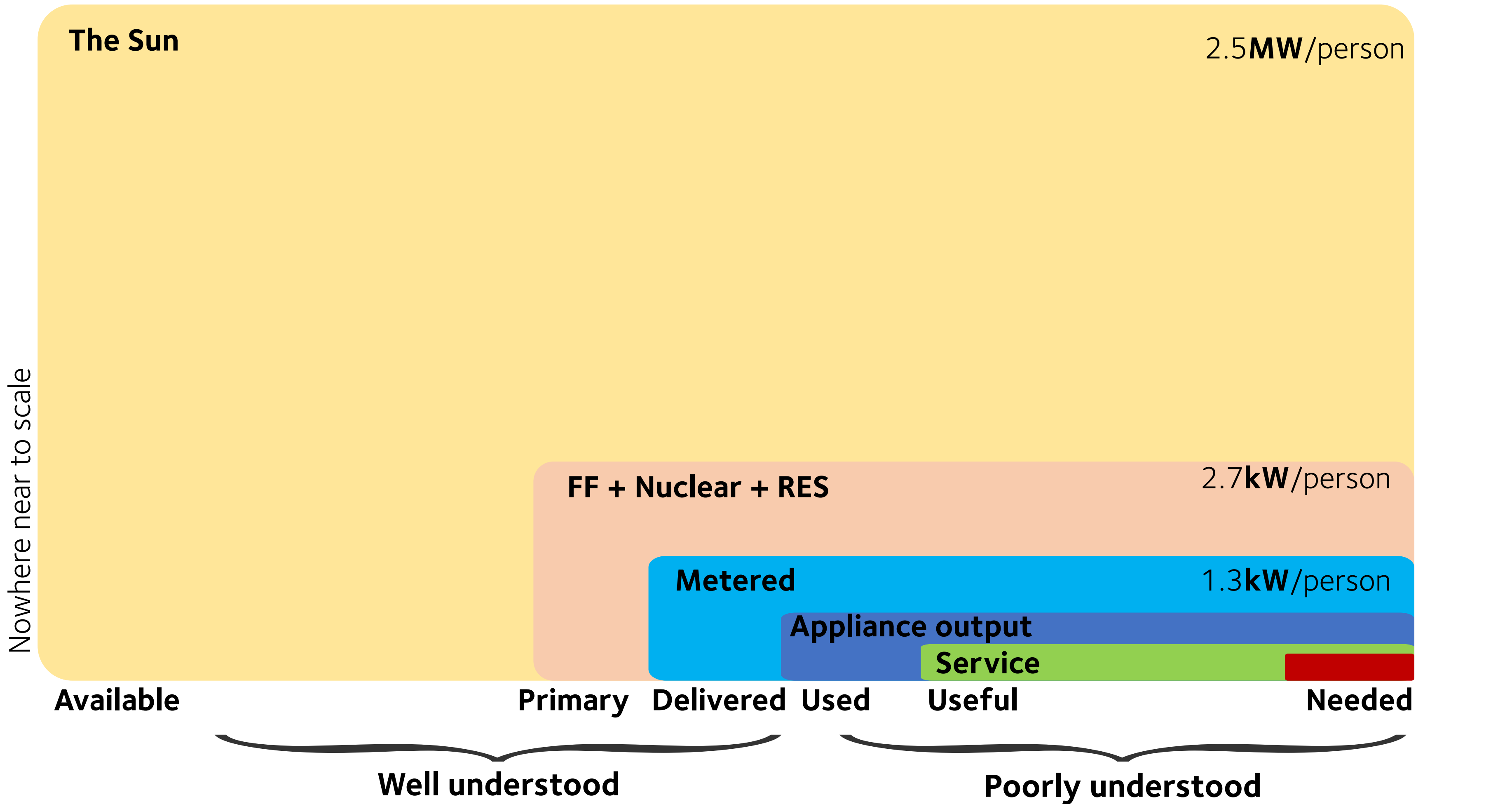
# Changing a socio-technical system: systematically

Goals/paradigm	GDP, net zero, use less Meet needs
Rules/structure	Pay per kWh Pay for energy service
Feedbacks	Bills, In-home-displays (IHD) Analytics, needs met
Parameters	Network operators, supplier, generator Distributed systems (fractal grids)





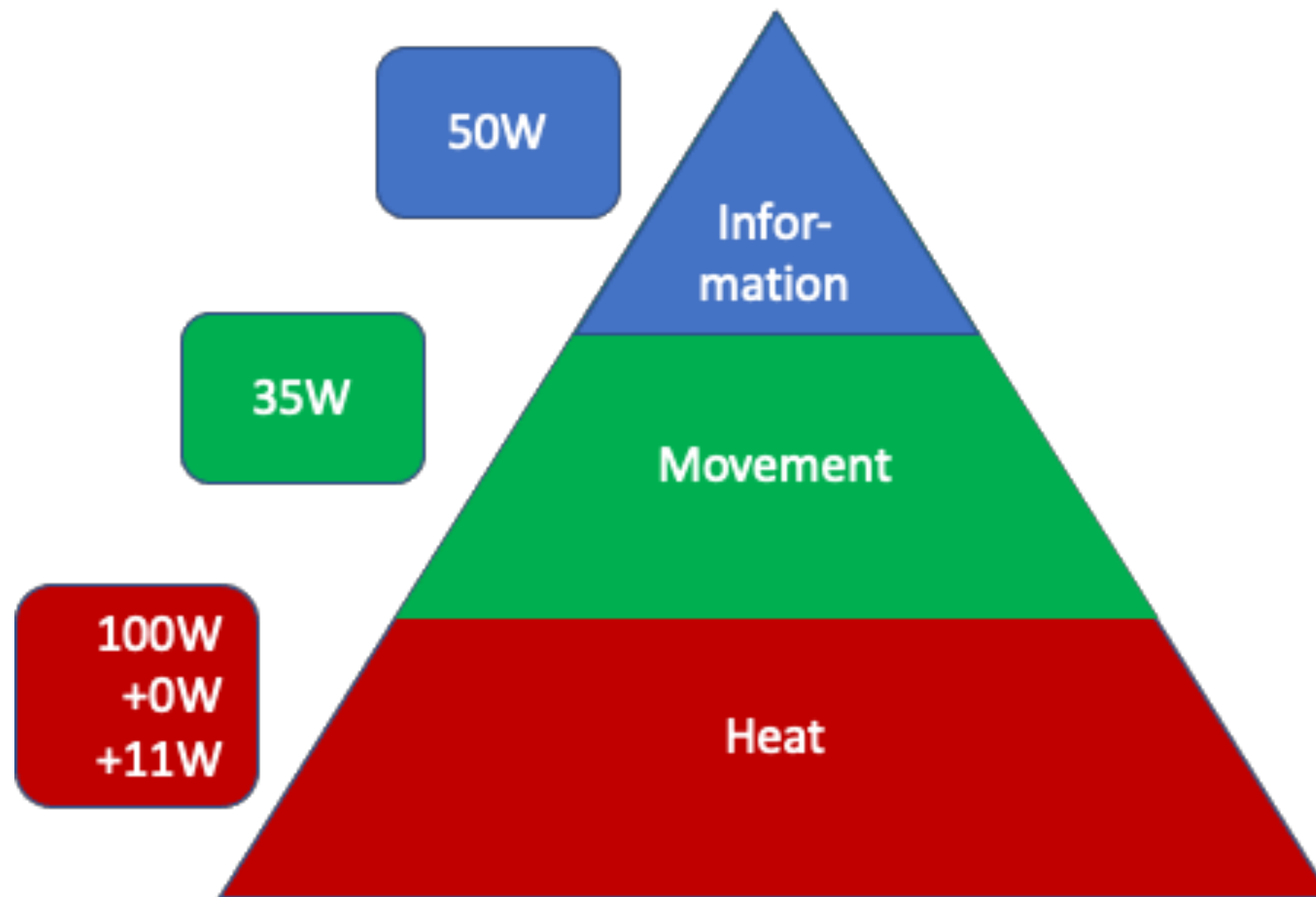




# Maslow's Hierarchy of Needs



# Energy service needs



## Information

- 60W / GB (IEA)
- Streaming at 1.25 GB 16 hours per day

## Movement

- $E = m (v^2/2 + g h)$
- $m=100\text{kg}$ ,  $v=100\text{km/h}$ ,  $h=100\text{m}$
- 5 trips per day: 830Wh

## Heat (100W ~2,000kcal)

- $E = -k \Delta T A$
- Inside 36°C, outside 0°C, surface 2m<sup>2</sup>,  $E=100\text{W}$
- $k = -1.4 \text{ W/mK}$

## Coolth

- Inside 36°C, outside 40°C,  $k = -1.4\text{W/mK}$

# Energy service needs

2.5 **MW**/person

Efficiency requirement ~1 in 10,000

(Yes we can meet everyone's needs sustainably)

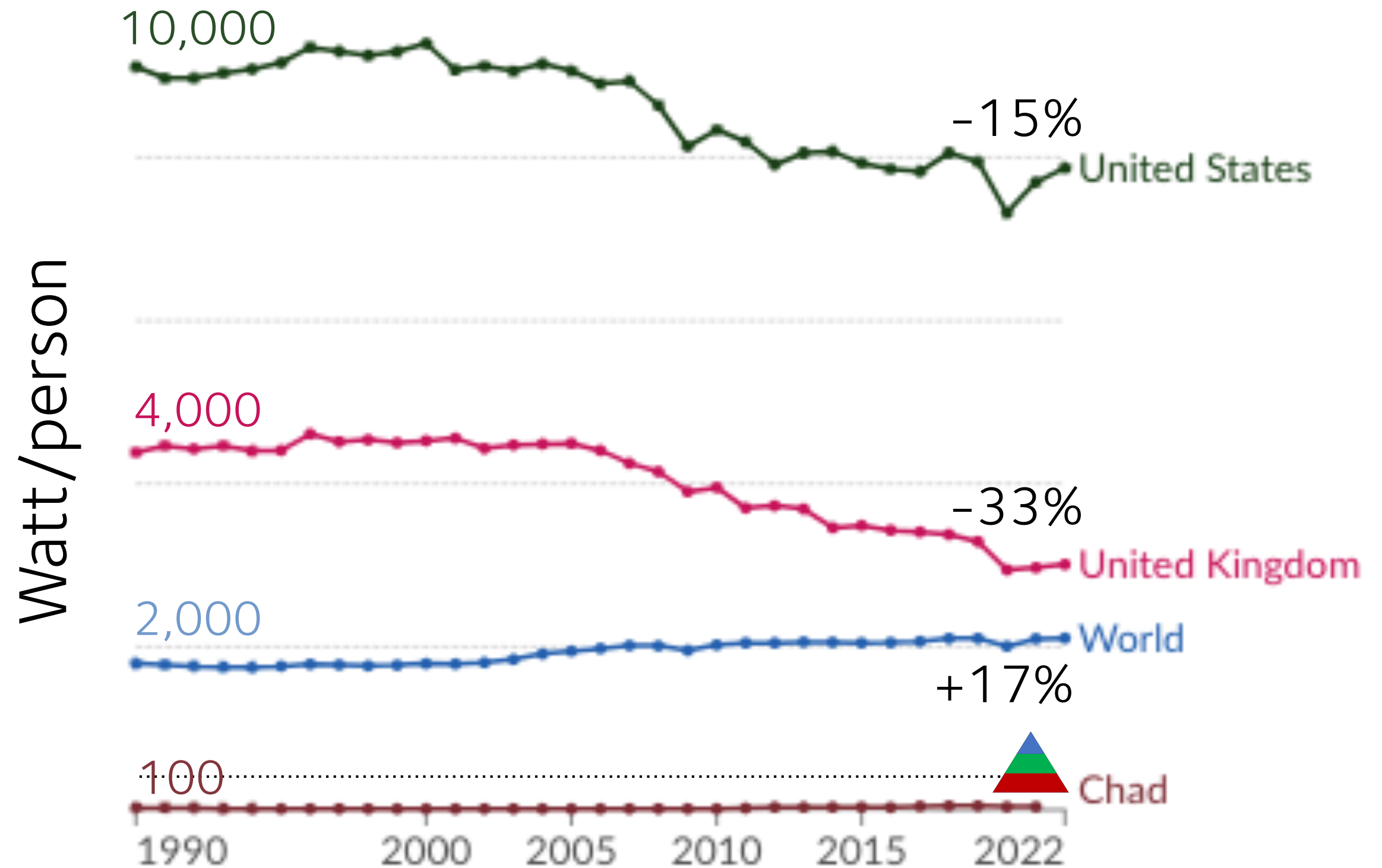


200 **W**/person

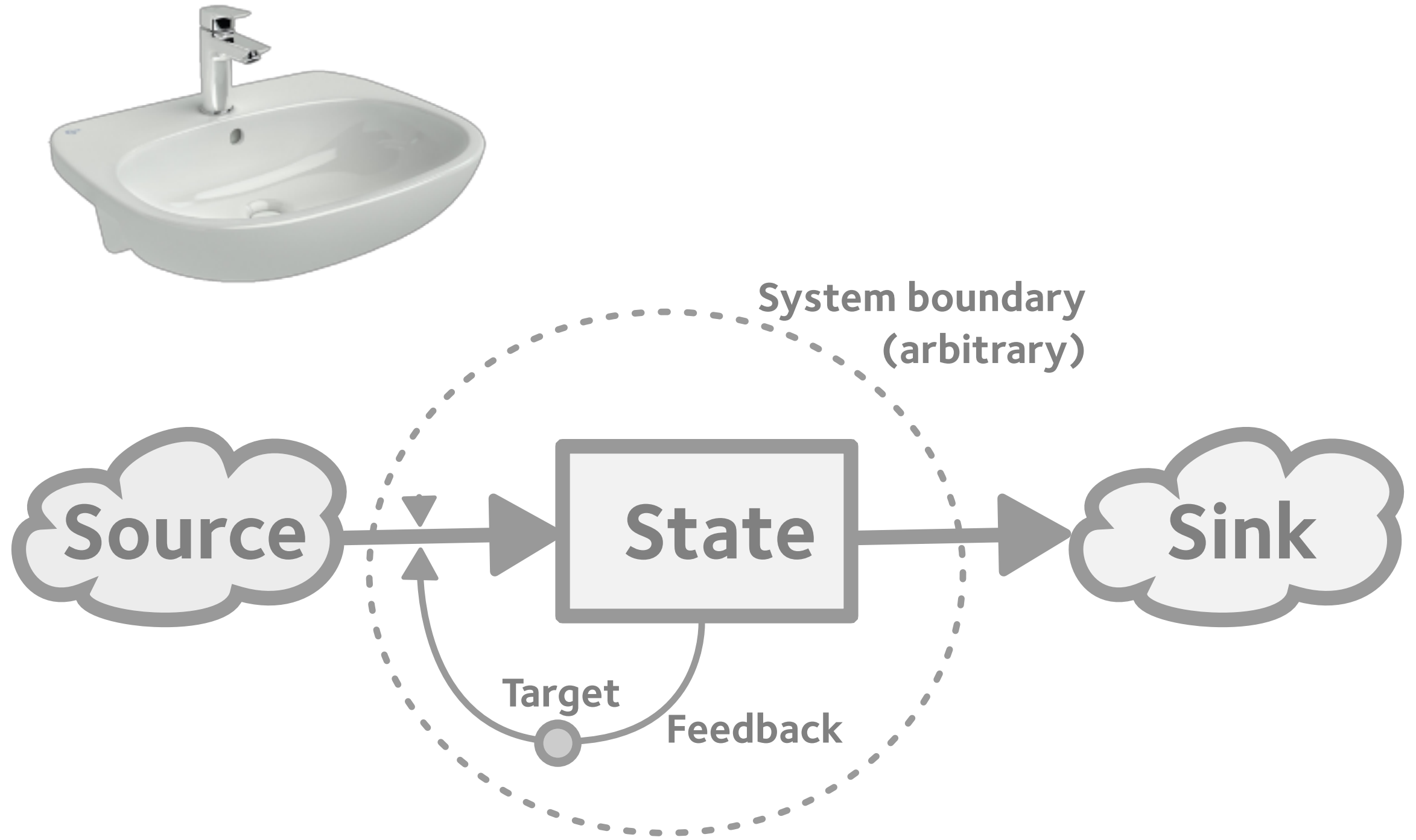
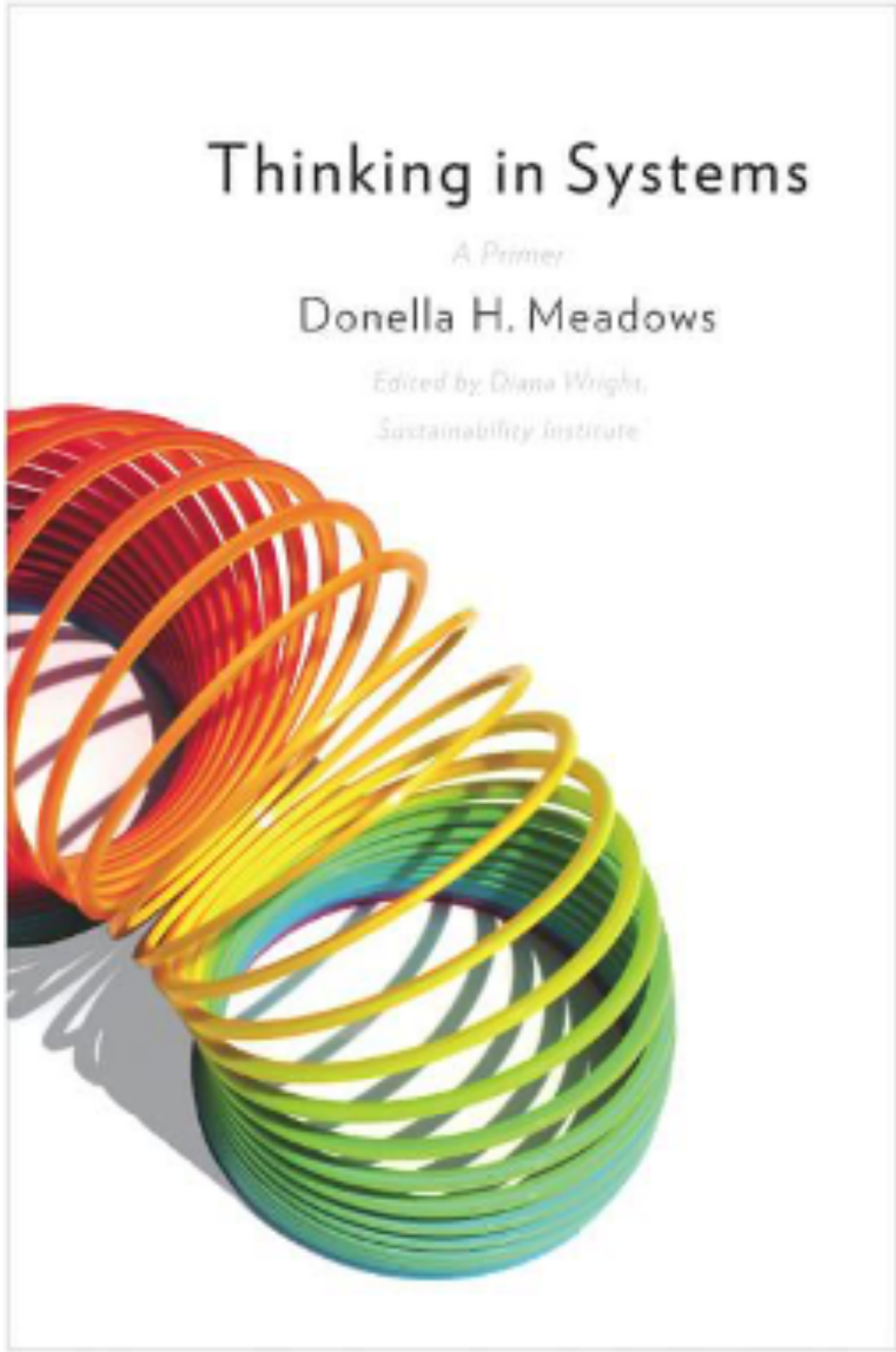
# Energy service needs

Over the past 30 years  
Energy use in the UK

- a) Increased 50%
- b) Increased 20%
- c) stayed the same
- d) reduced by 20%



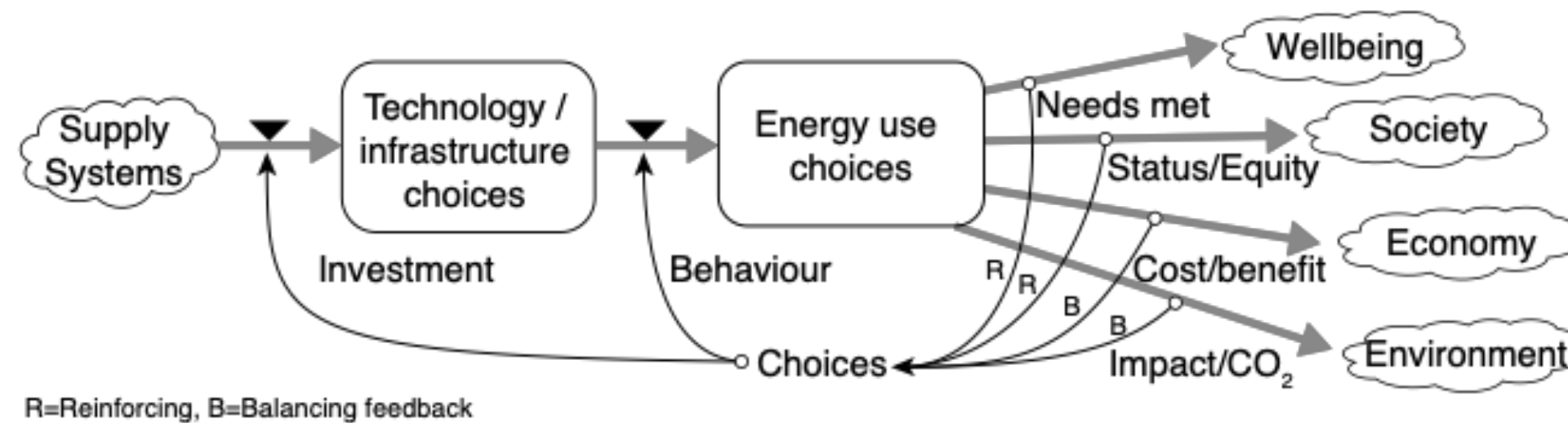




# Energy feedback

## Good feedback is:

- Timely (not just fast)
- Accurate
- Relevant to system goals

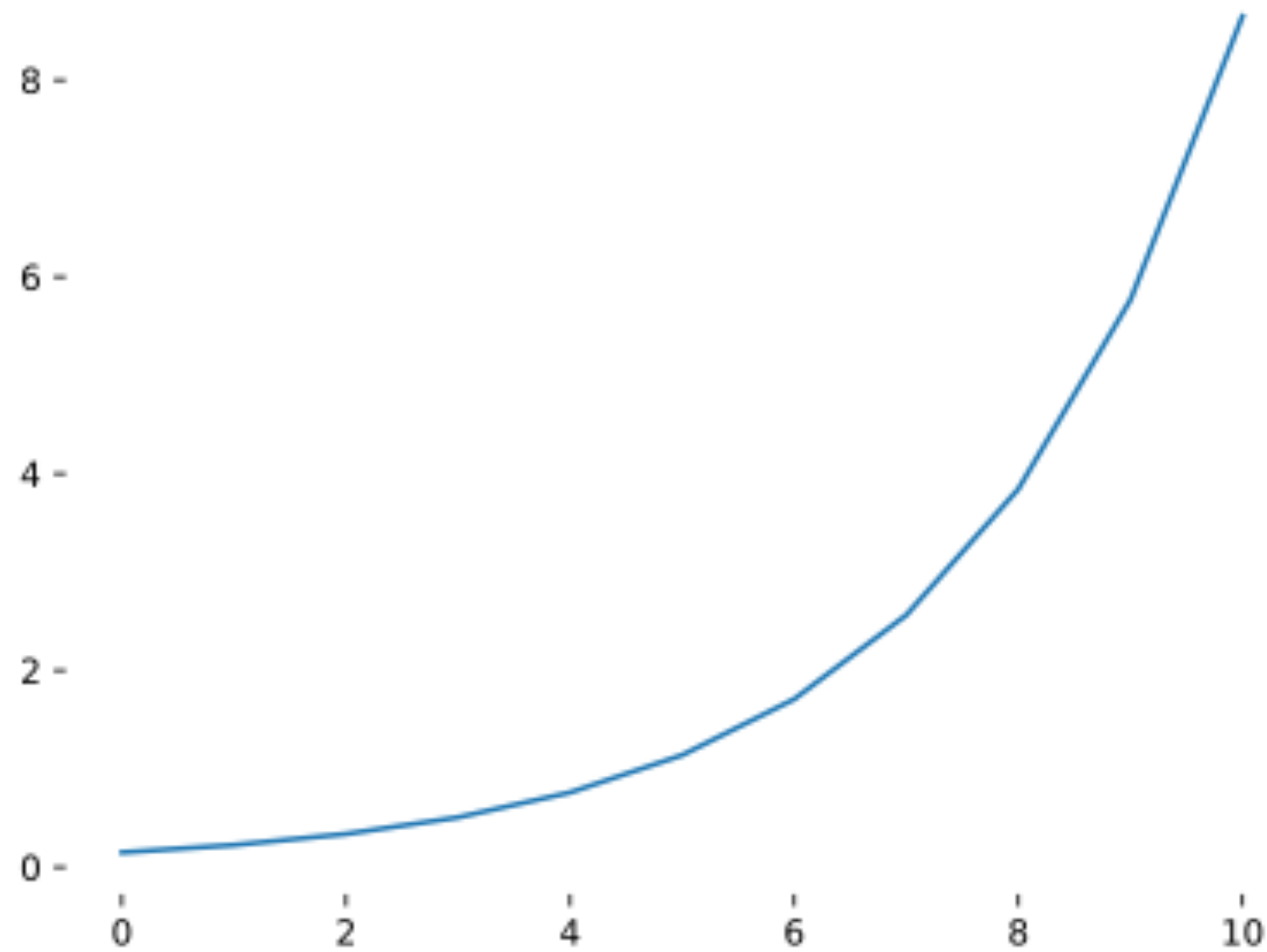


# The power of feedback

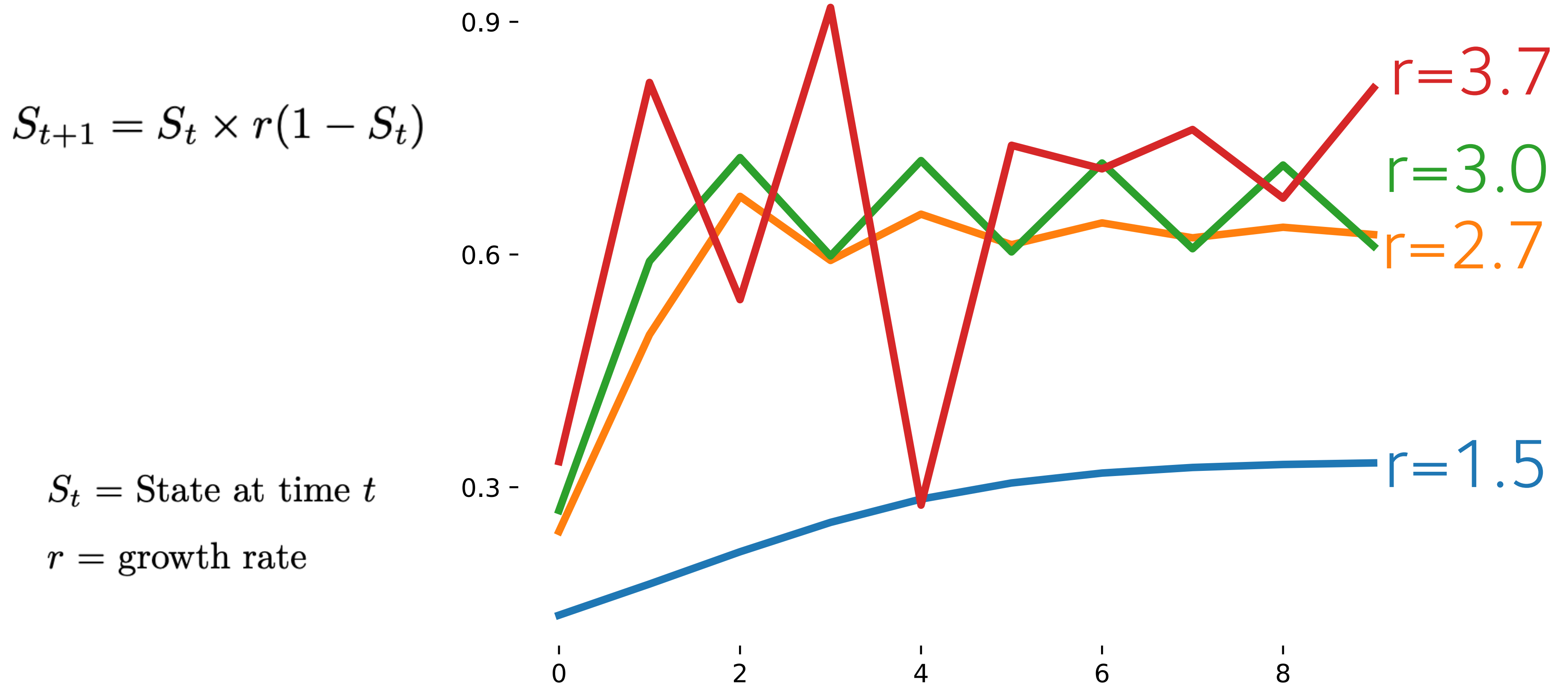
$$S_{t+1} = S_t \times r$$

$S_t$  = State at time  $t$

$r$  = growth rate

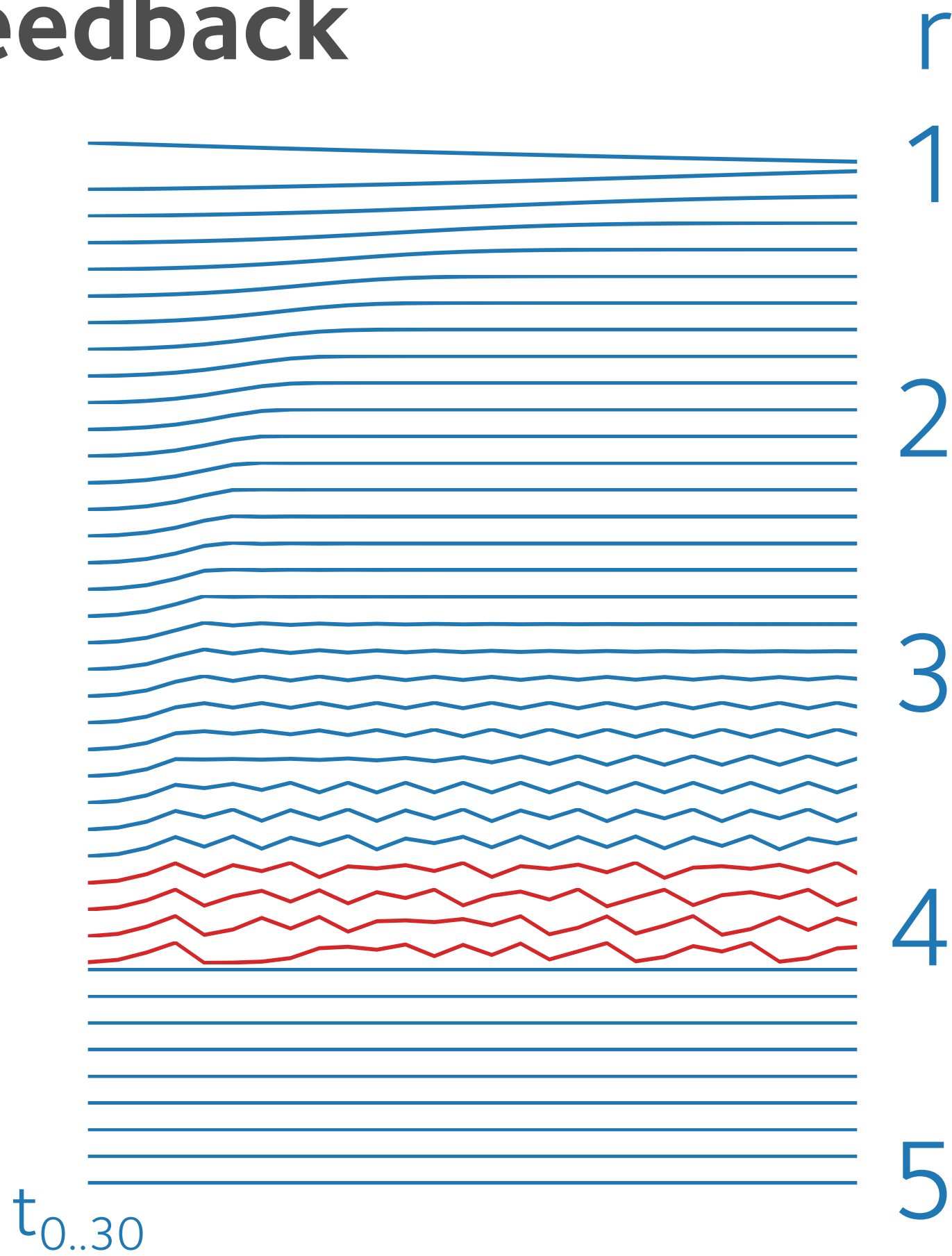


# The power of feedback



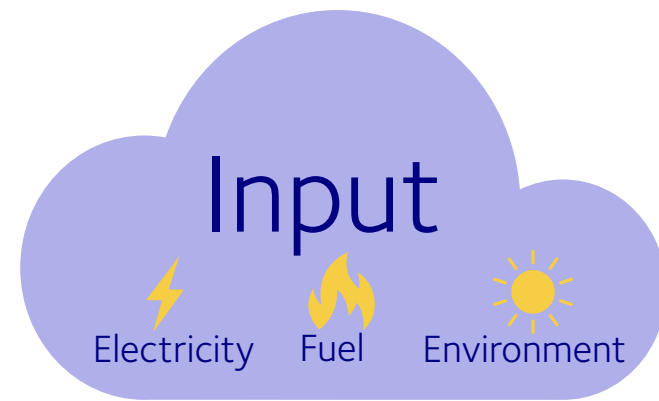
# The power of feedback

$$S_{t+1} = S_t \times r(1 - S_t)$$



# To change energy use we need to **understand** energy use (as a system)

## How much?

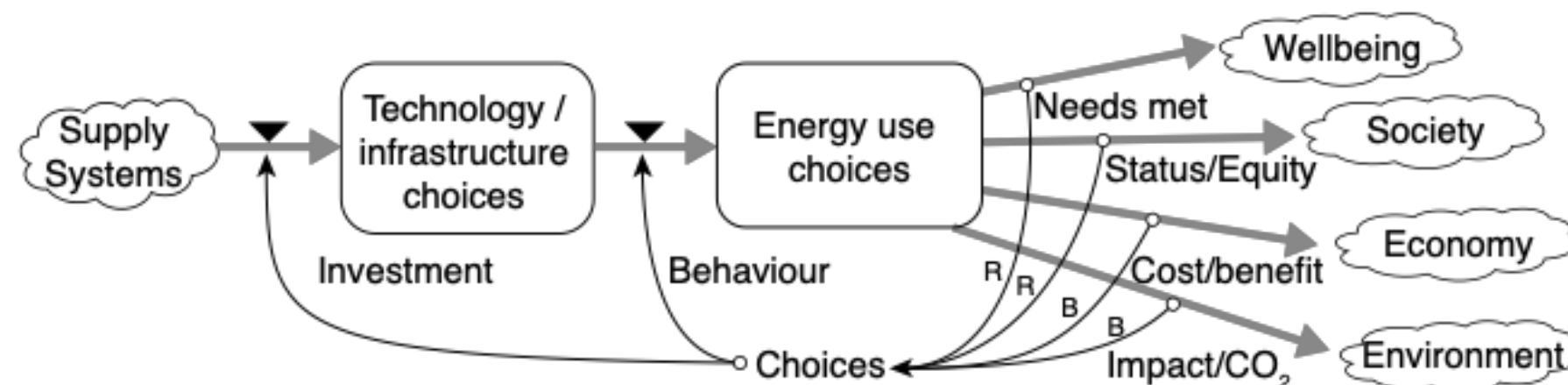
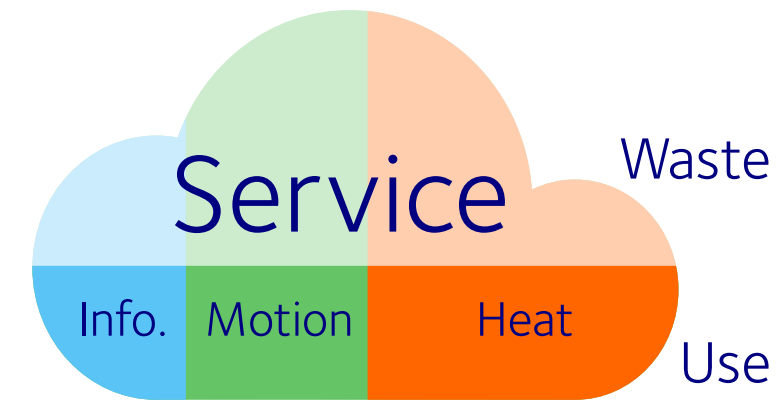


Gas    Sun (light)  
Wood   Air (temp)  
Coal   Wind  
Oil  
H<sub>2</sub>

## What?



## Why?



R=Reinforcing, B=Balancing feedback

**Good feedback is:**

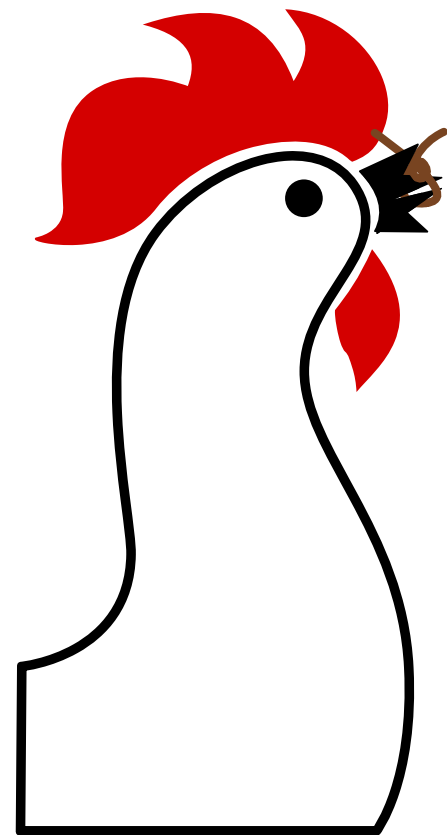
- Timely (not just fast)
- Accurate
- Relevant to system goals



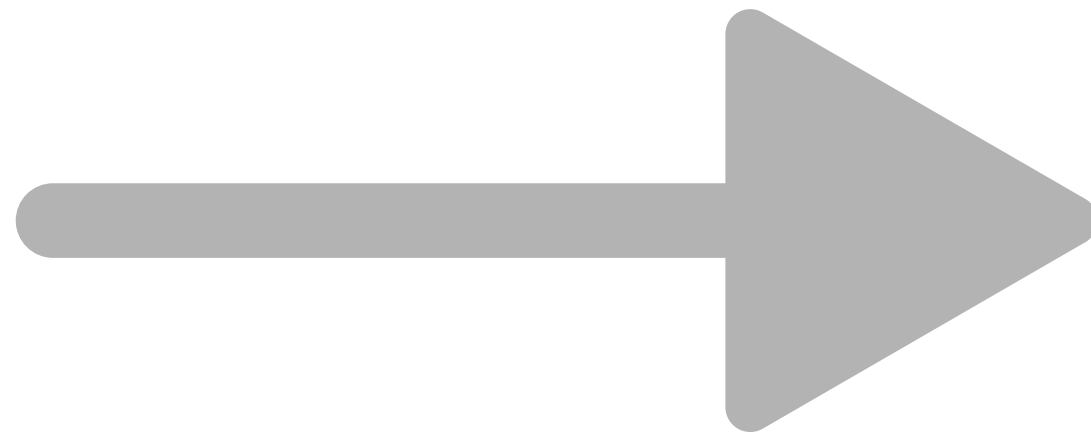
Judea Pearl



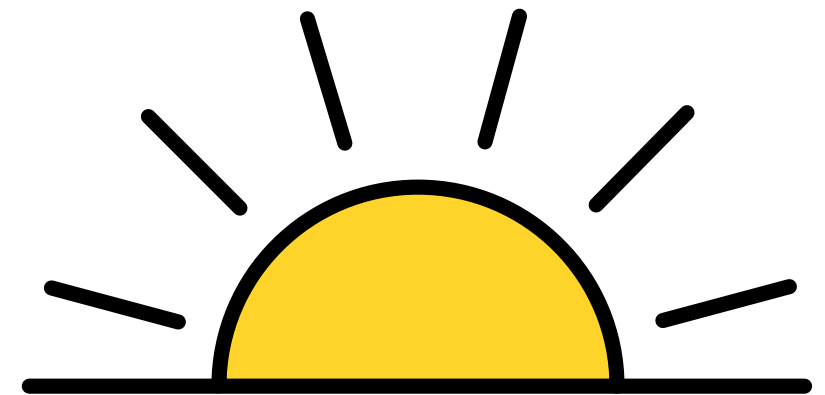
What **causes** the sun to rise?



$P(\text{Sun} \mid \text{Crow})$

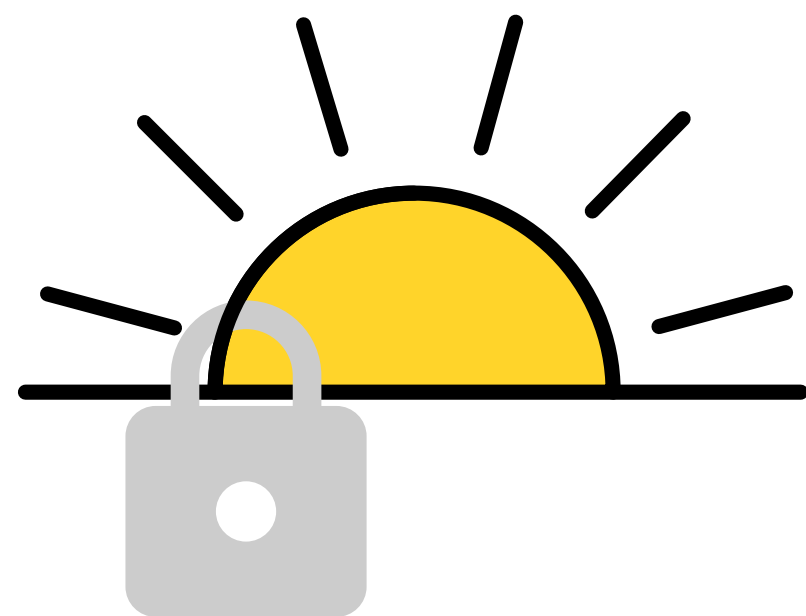


$P(\text{Sun} \mid \text{do not (Crow)})$

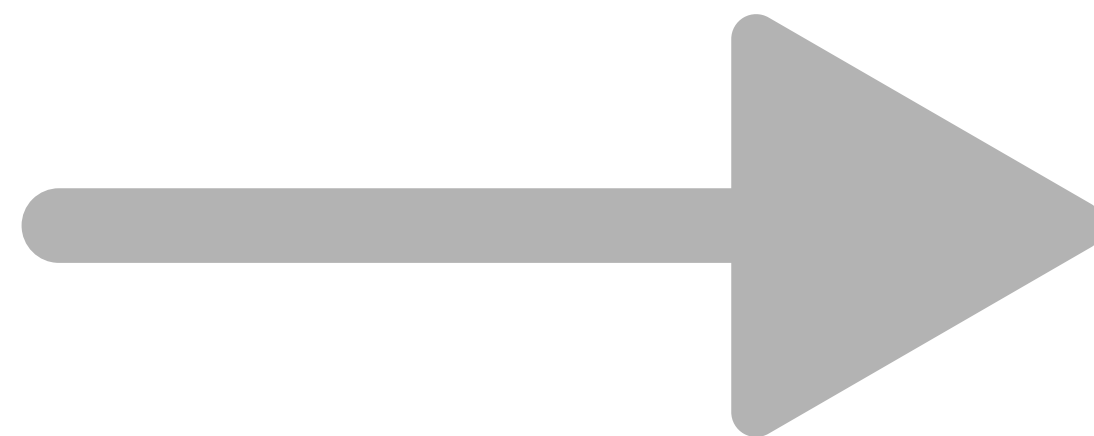




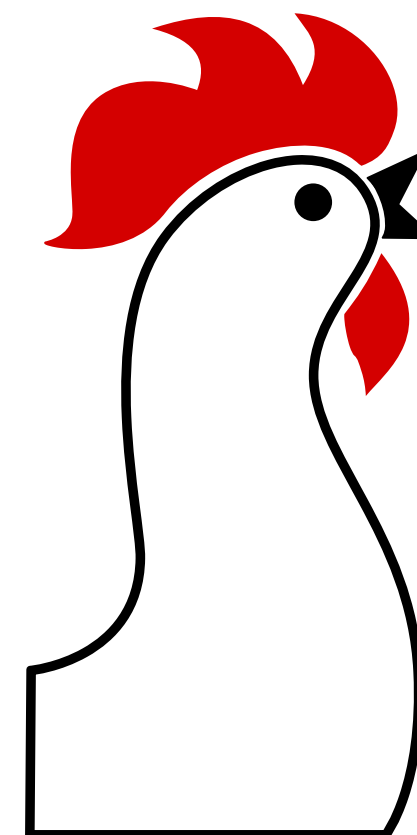
What **causes** the the cockerill to crow?



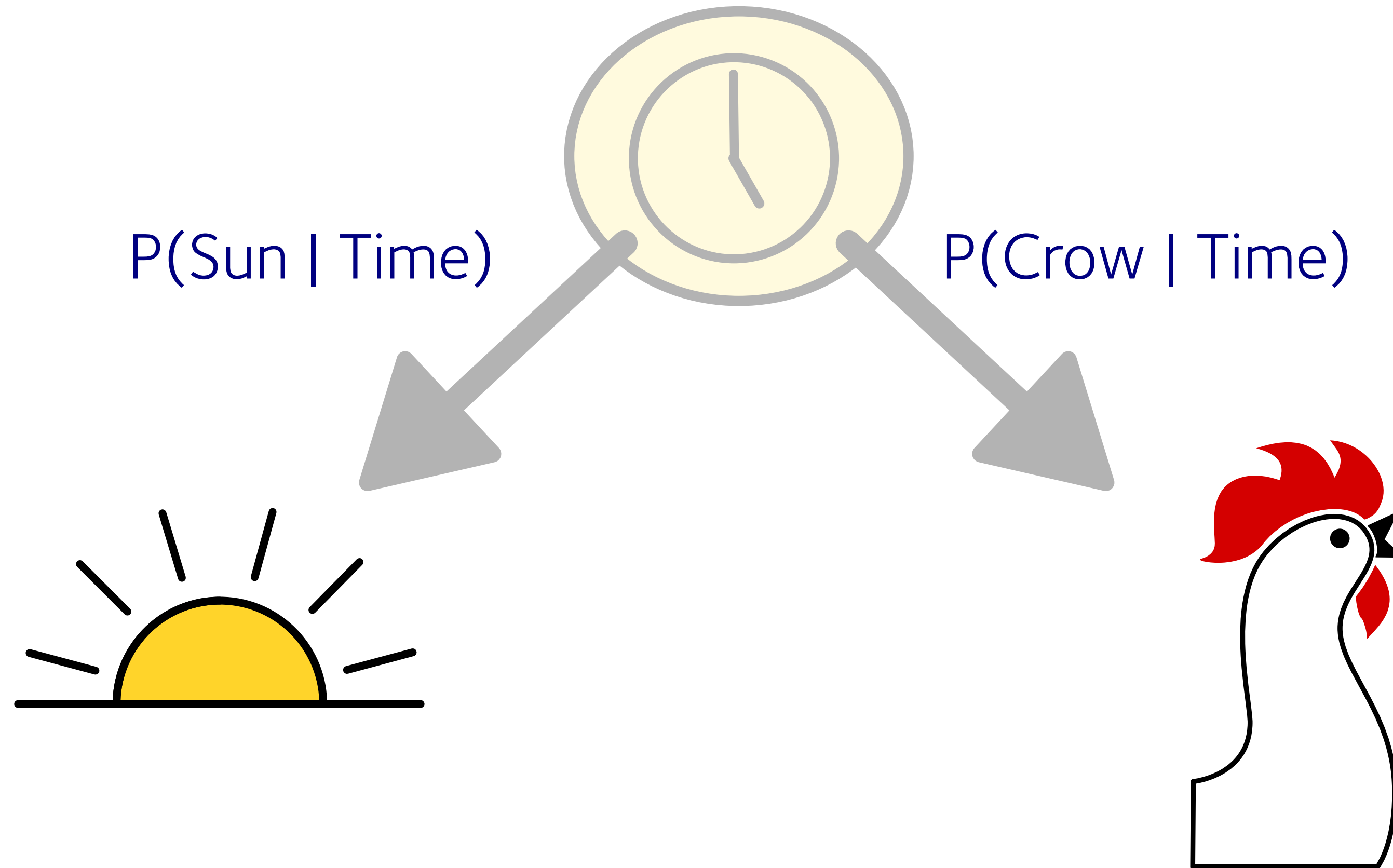
$P(\text{Crow} \mid \text{Sun})$



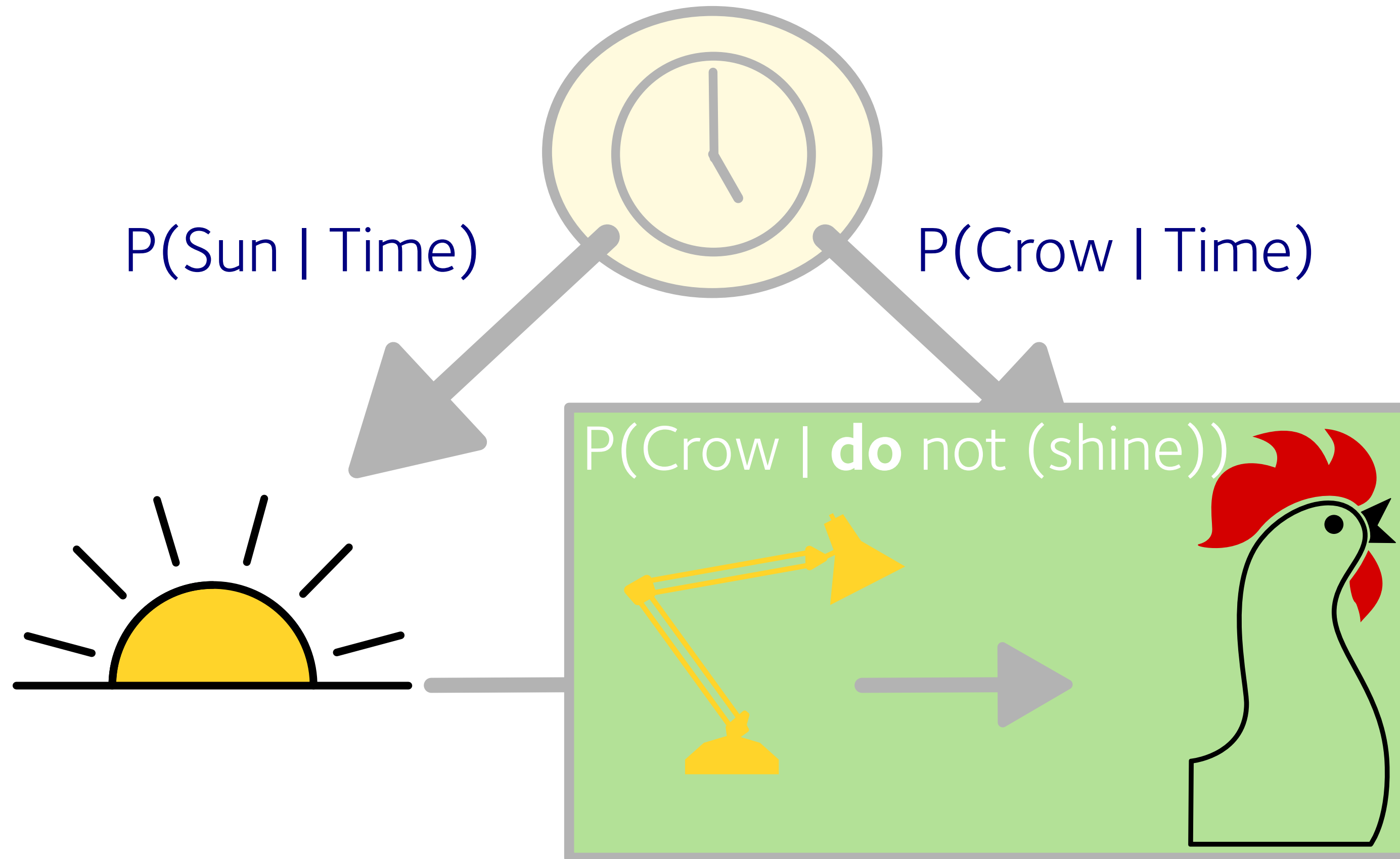
$P(\text{Crow} \mid \text{do not (Sun)})$



# How to eliminate confounders?



# How to eliminate confounders?



To understand causes we need (up to) three things

Causal model

Observation

Do something

# Energy demand research is evolving

Understanding Demand

No data

Assume  
& model

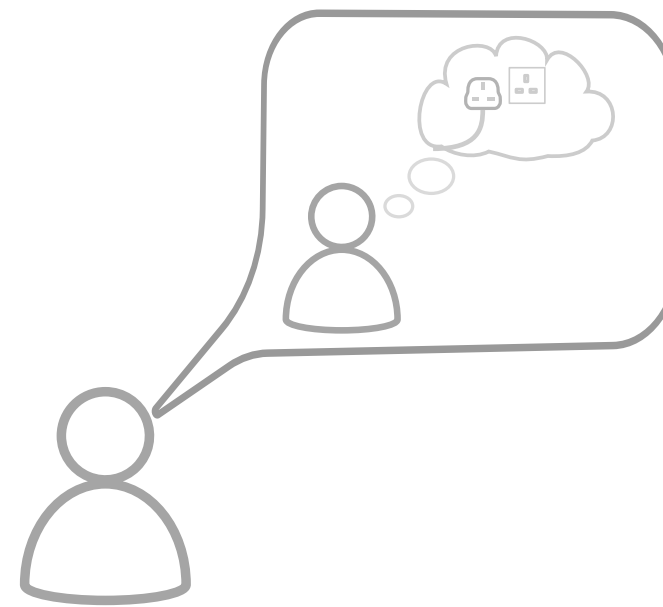
What **I think**  
people do



Some data

Interpolate  
& scale up

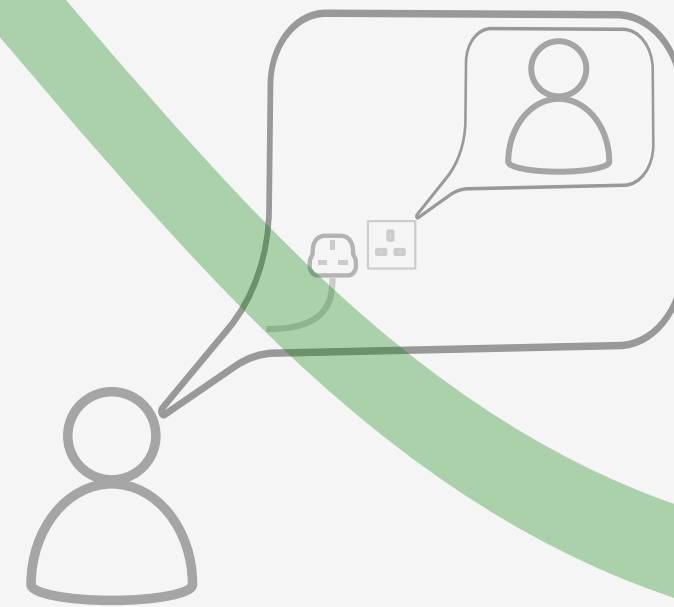
What **people** think  
they do



Big data

Observe (intervene)  
& analyse

What **data** says  
people do



# Understanding demand the hard way

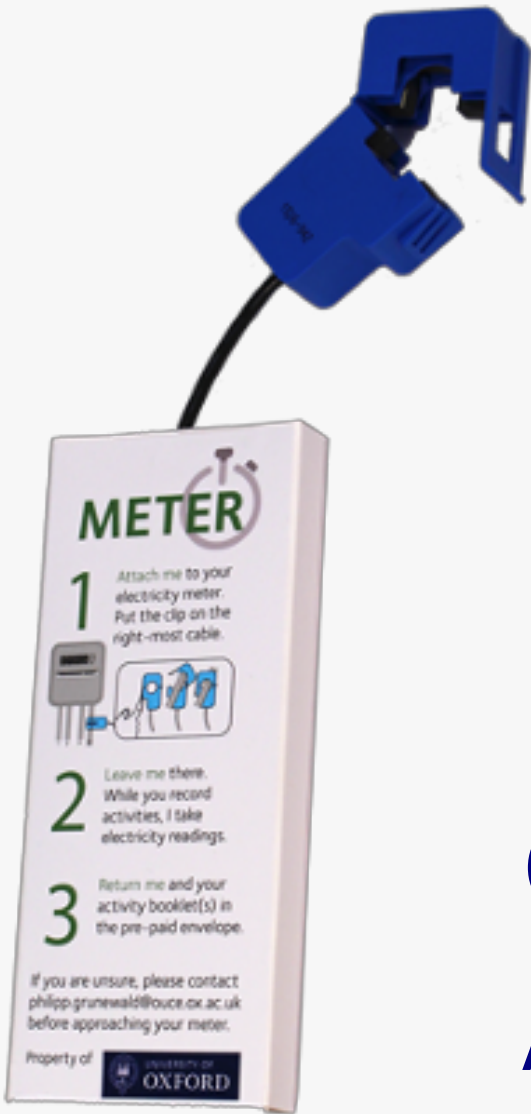
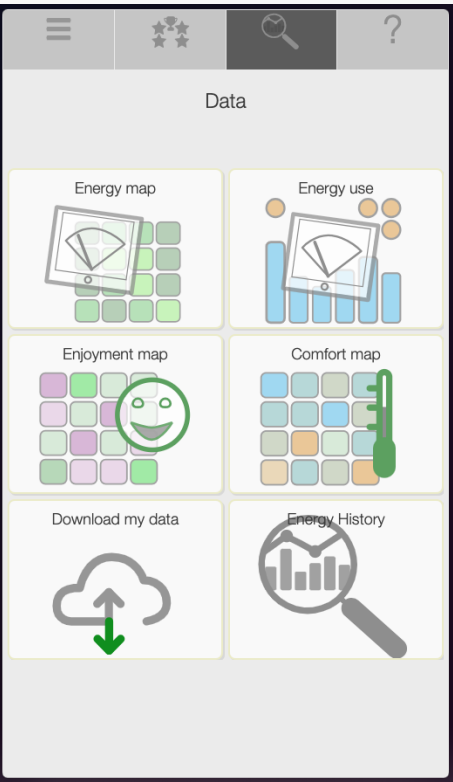
JoyMeter.uk



EDDI



App



Current clamp

CAD (Consumer  
Access Device)

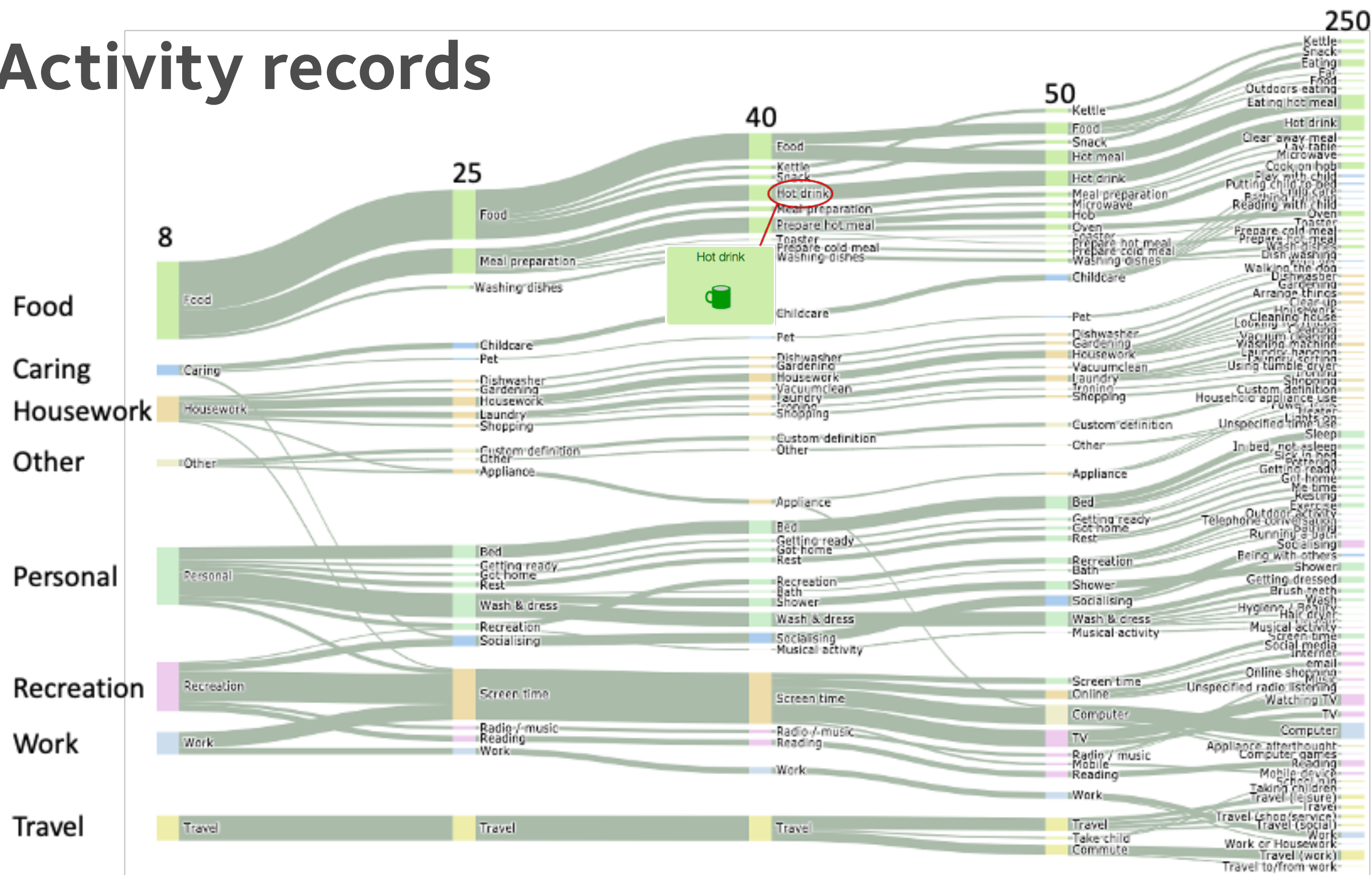
Diary



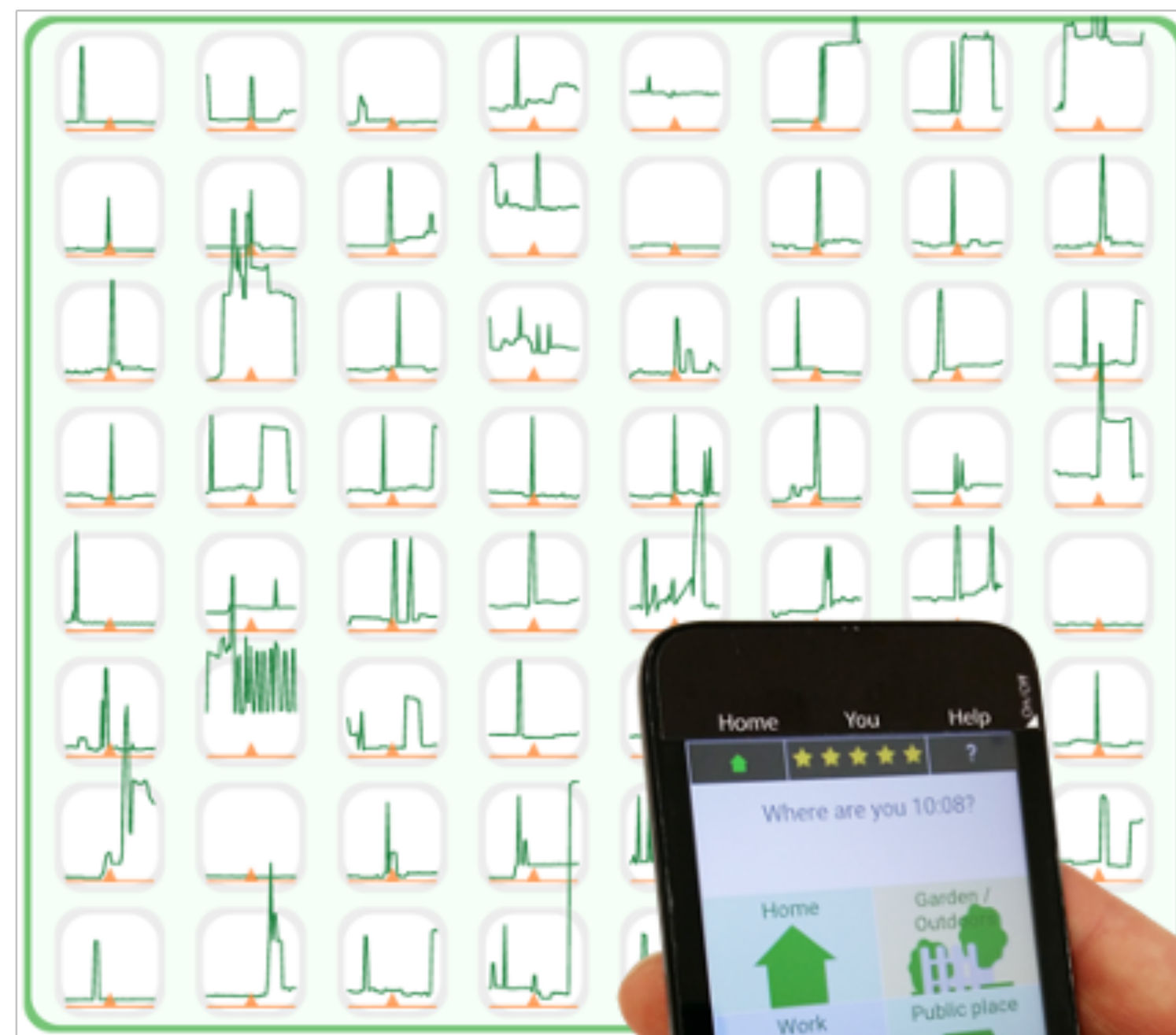
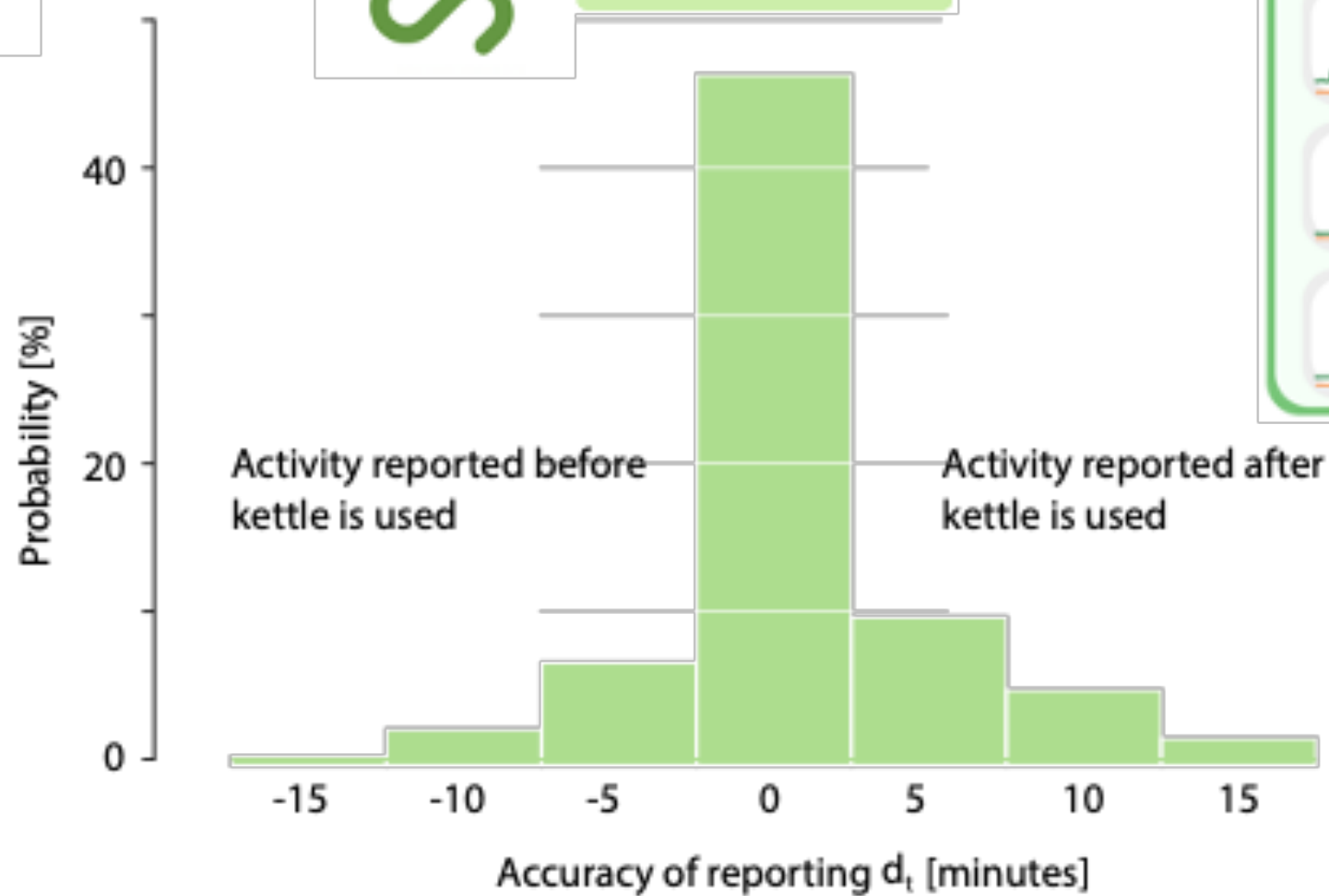
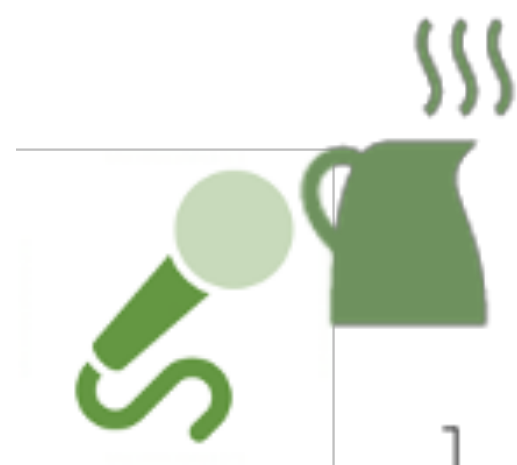
Time	What were you doing? Please write down your activities
5:00 p.m.	TV
5:40	prepare dinner
6:00	lay



# Activity records

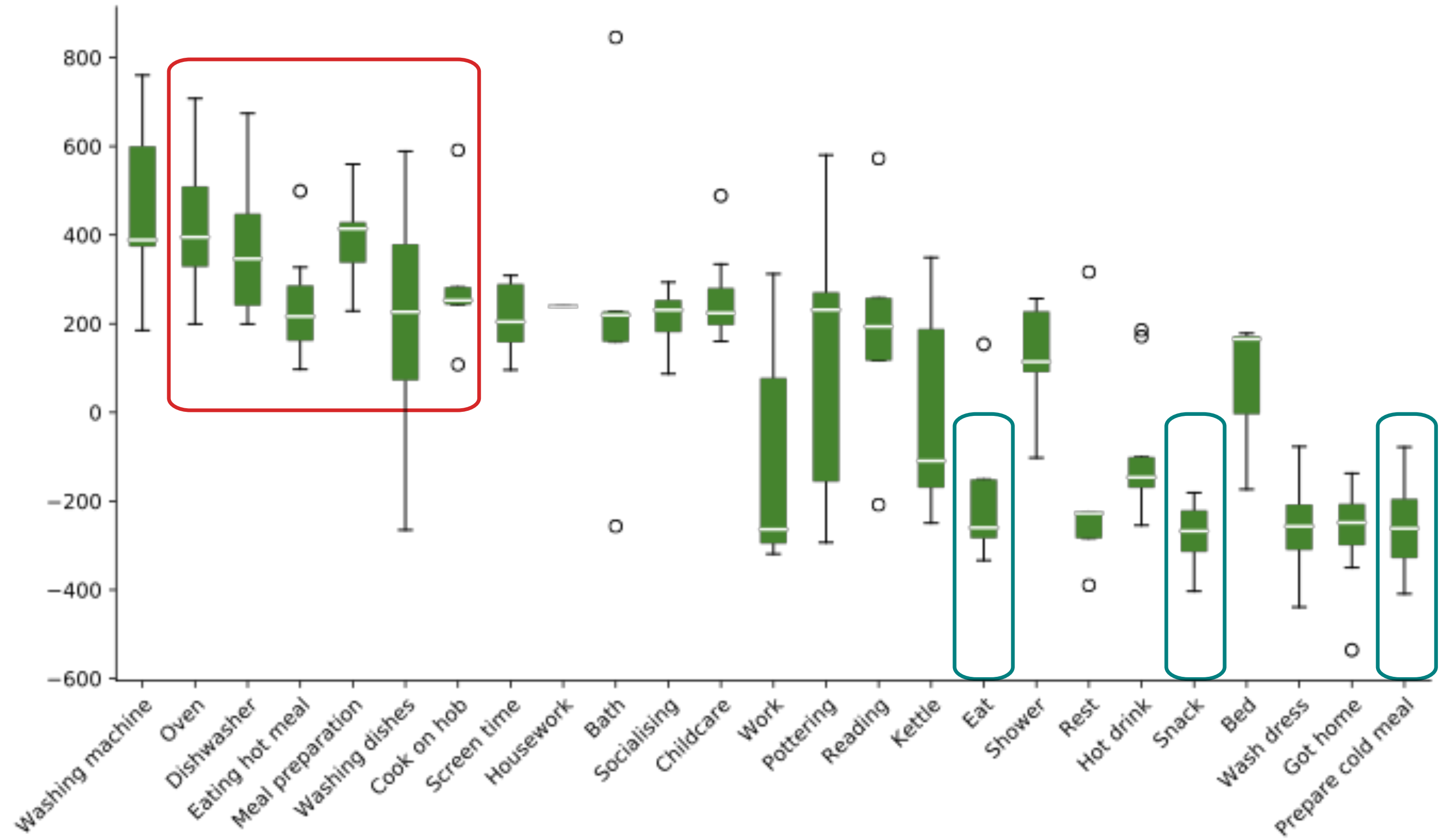


# Tea-test





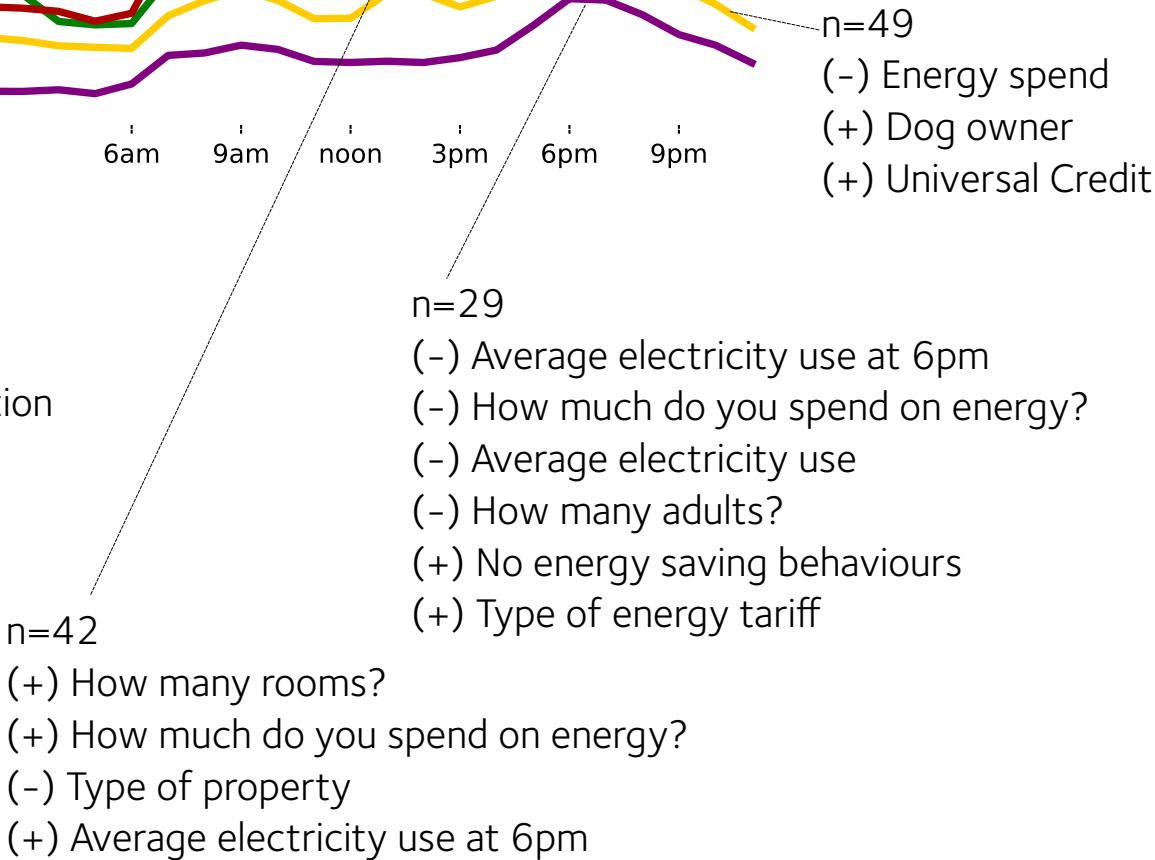
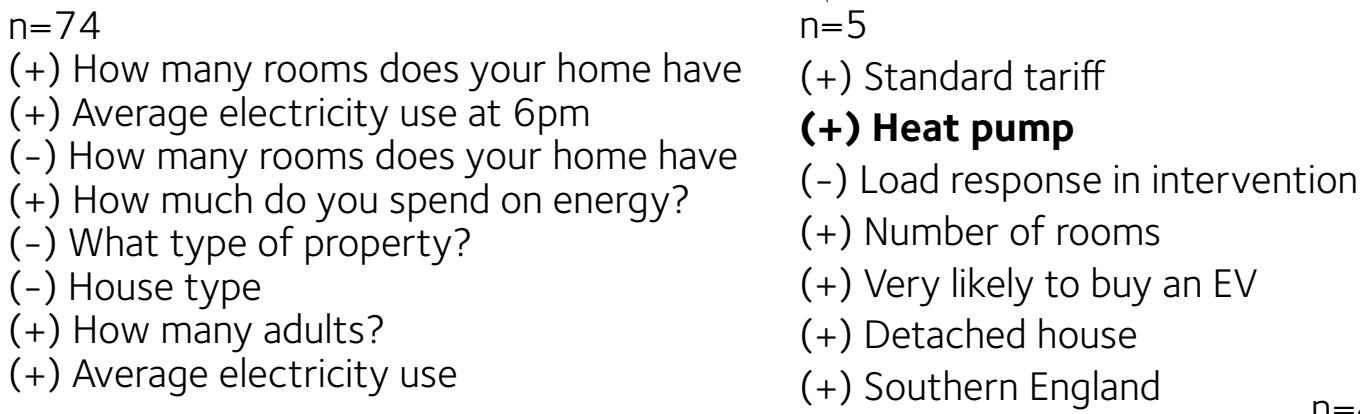
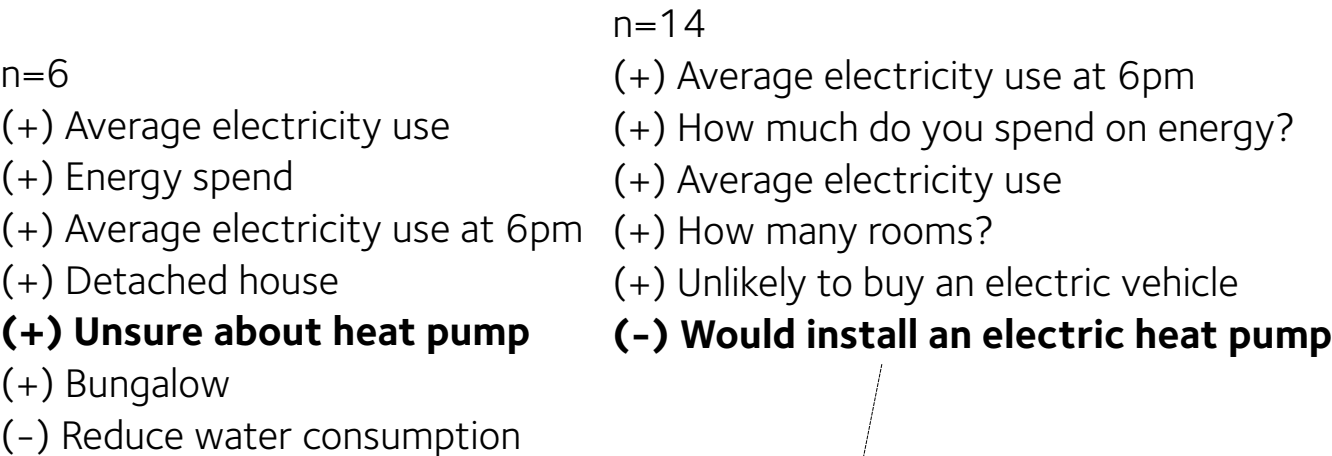
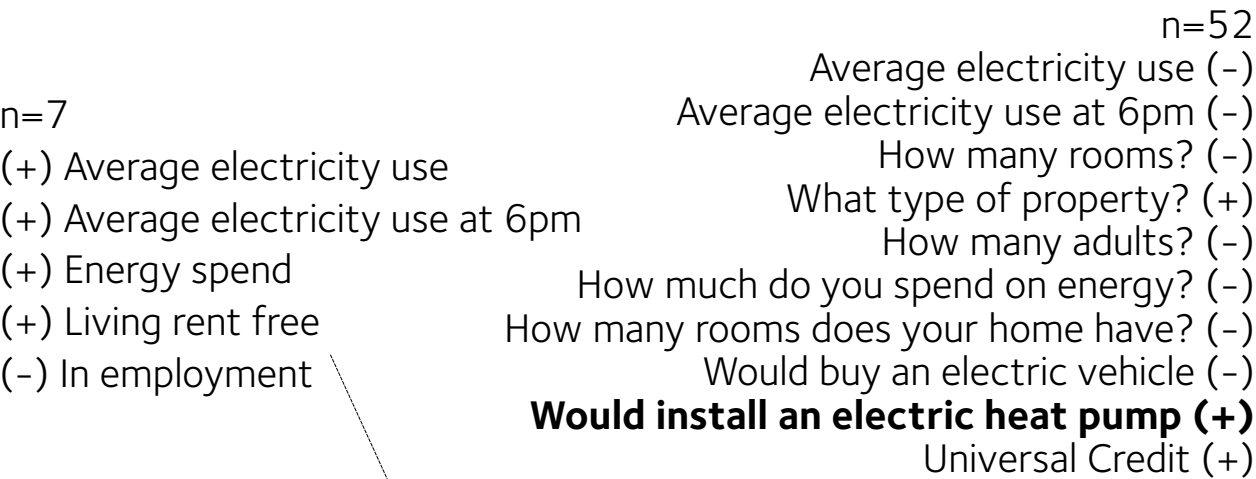
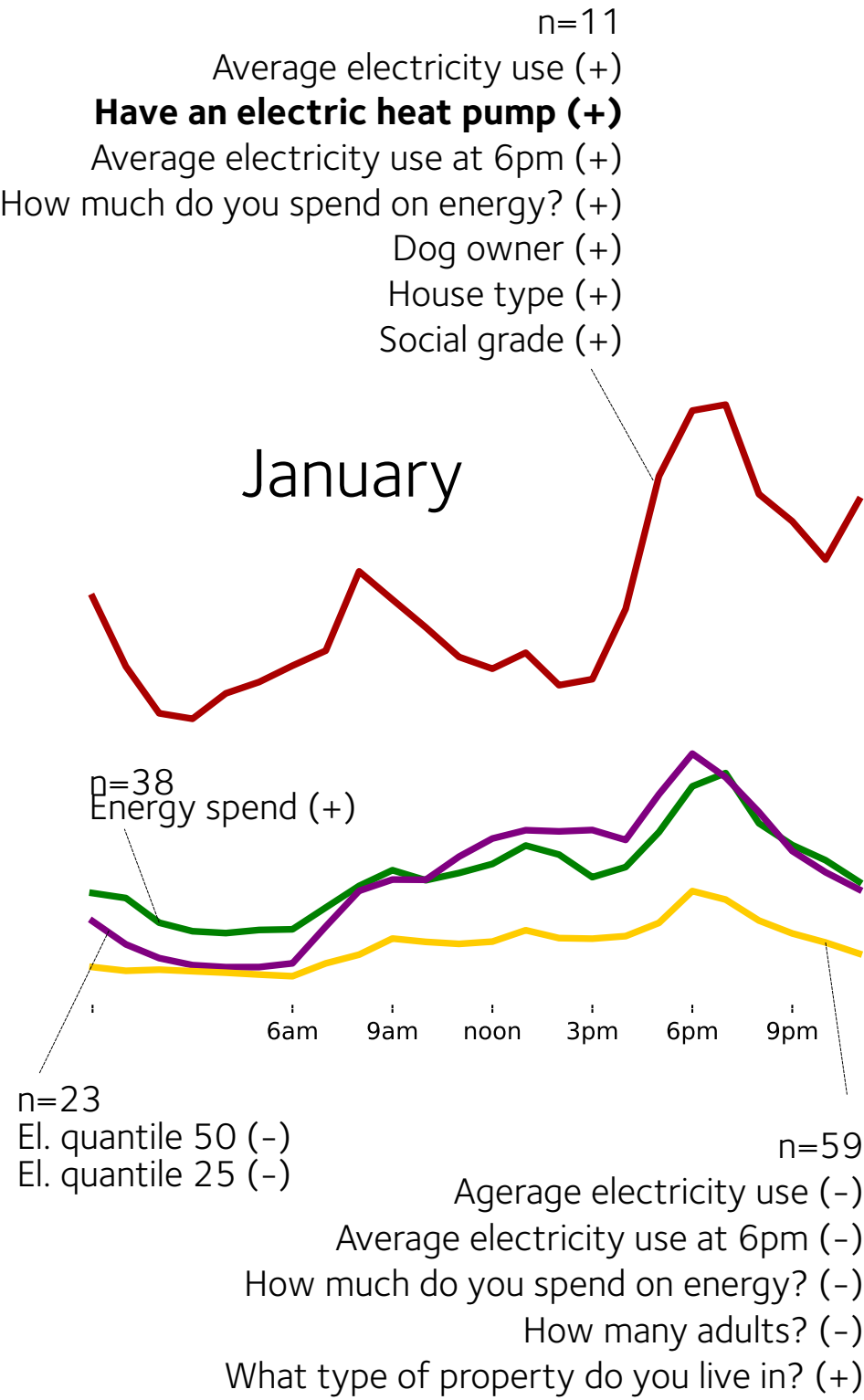
# Marginal contribution of activities to demand



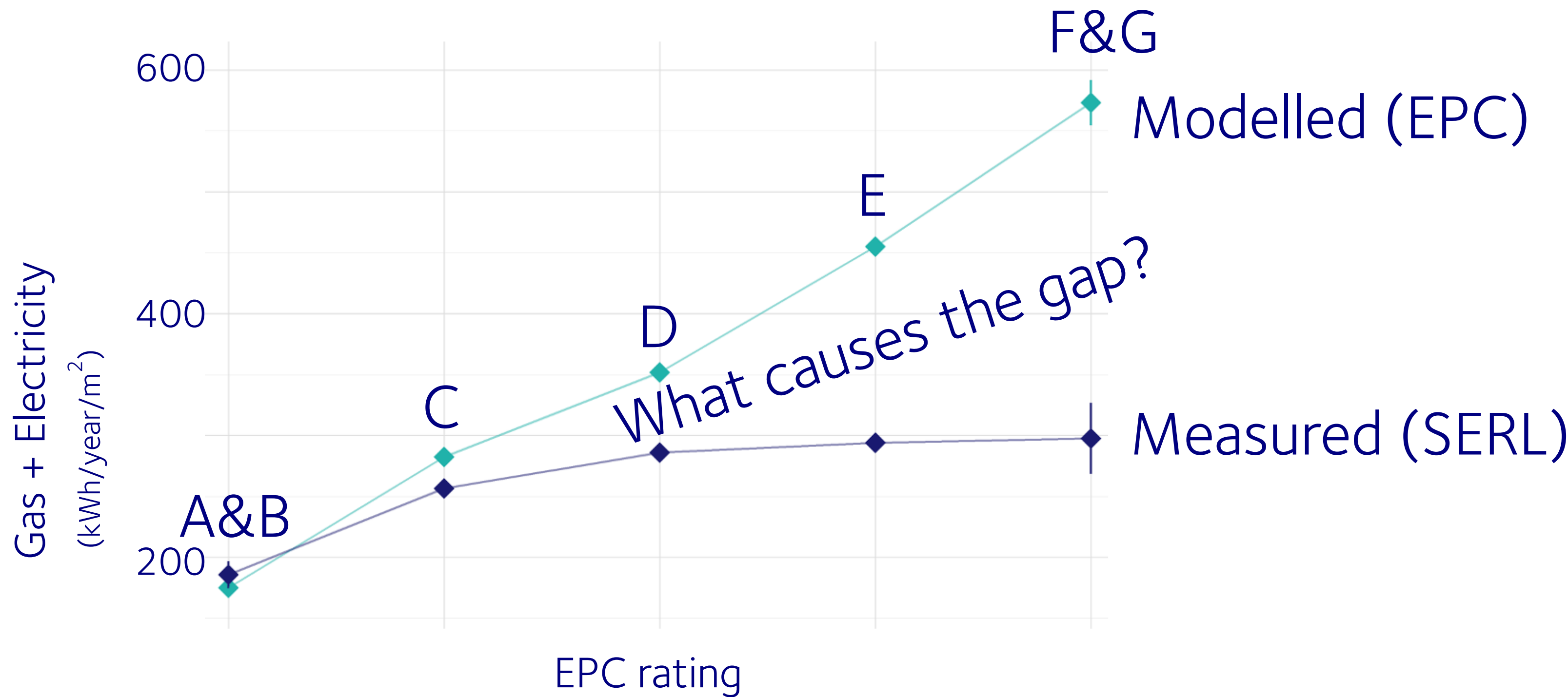
# Enjoyment of activities and demand



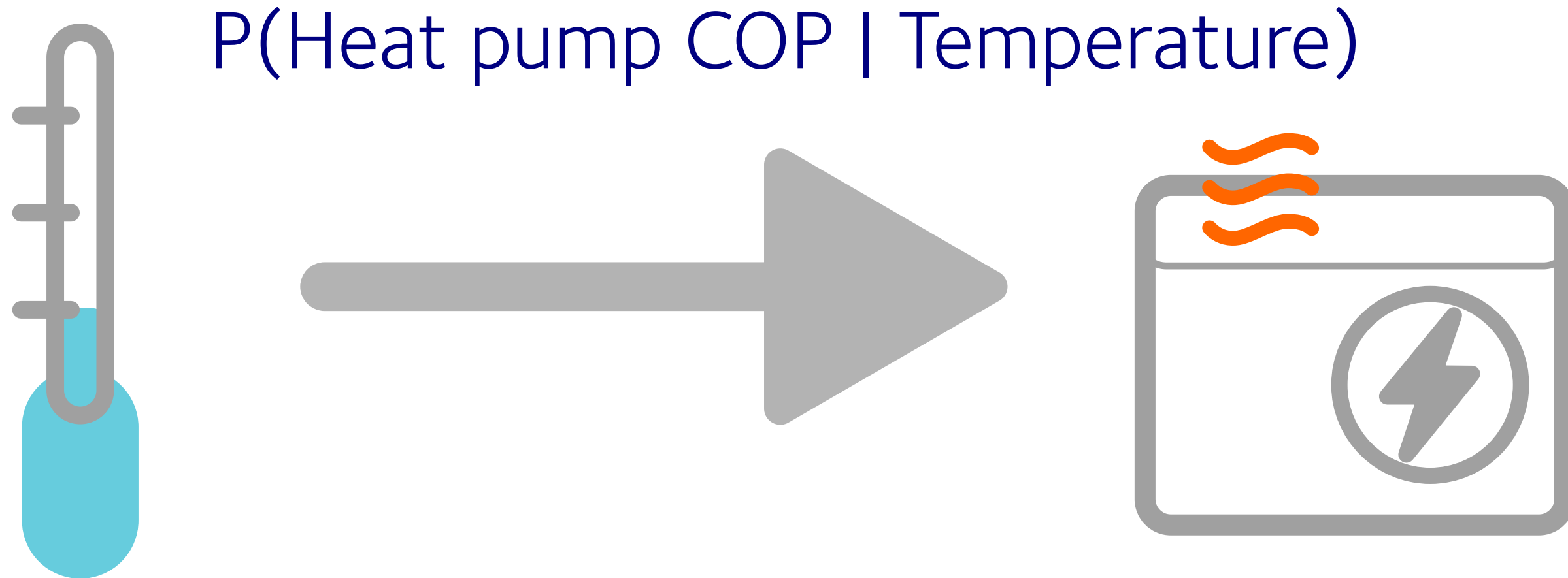
DTW clusters



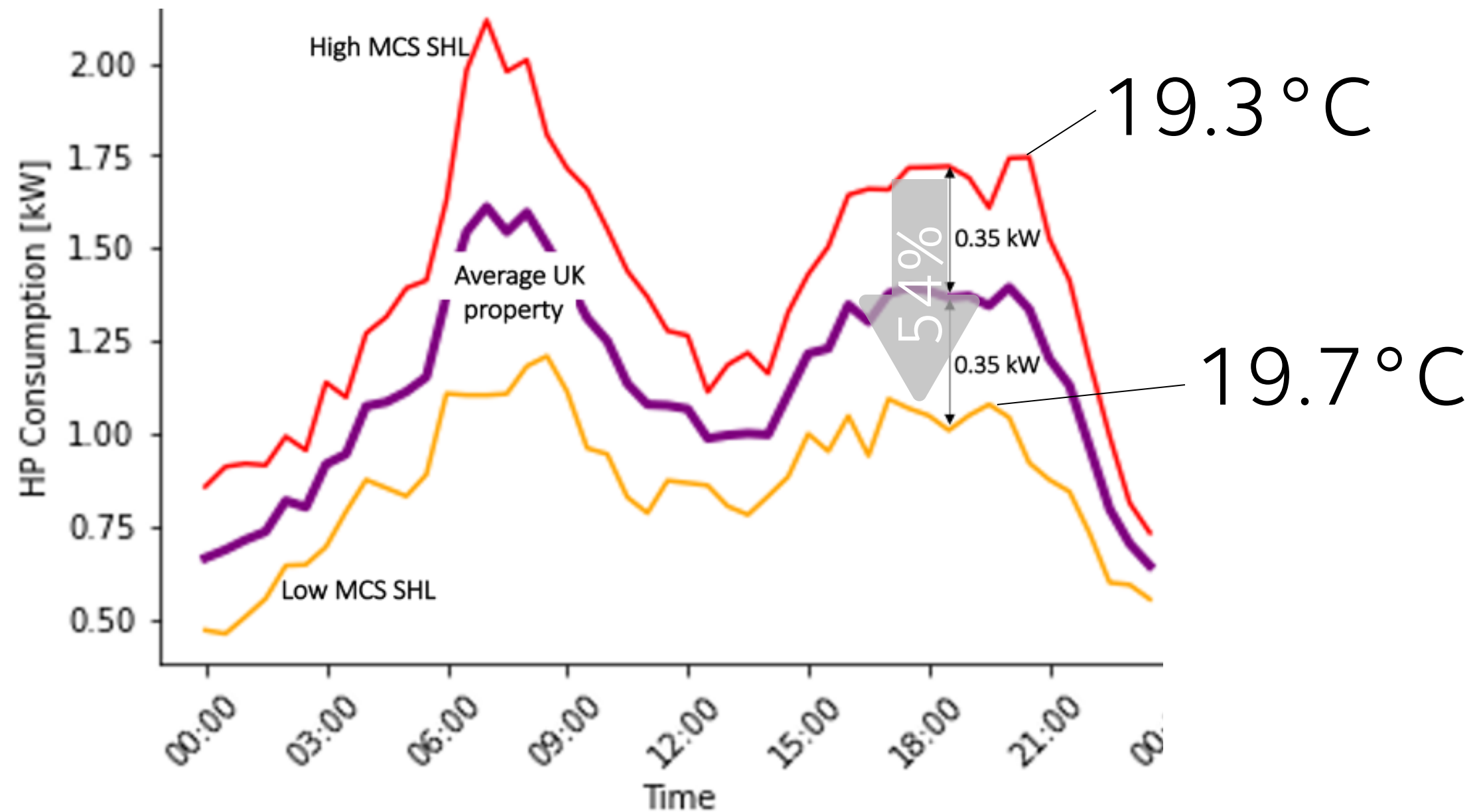
# Model vs Reality: EPCs are poor predictors of demand



**No data:** I think... heat pumps don't work on cold days

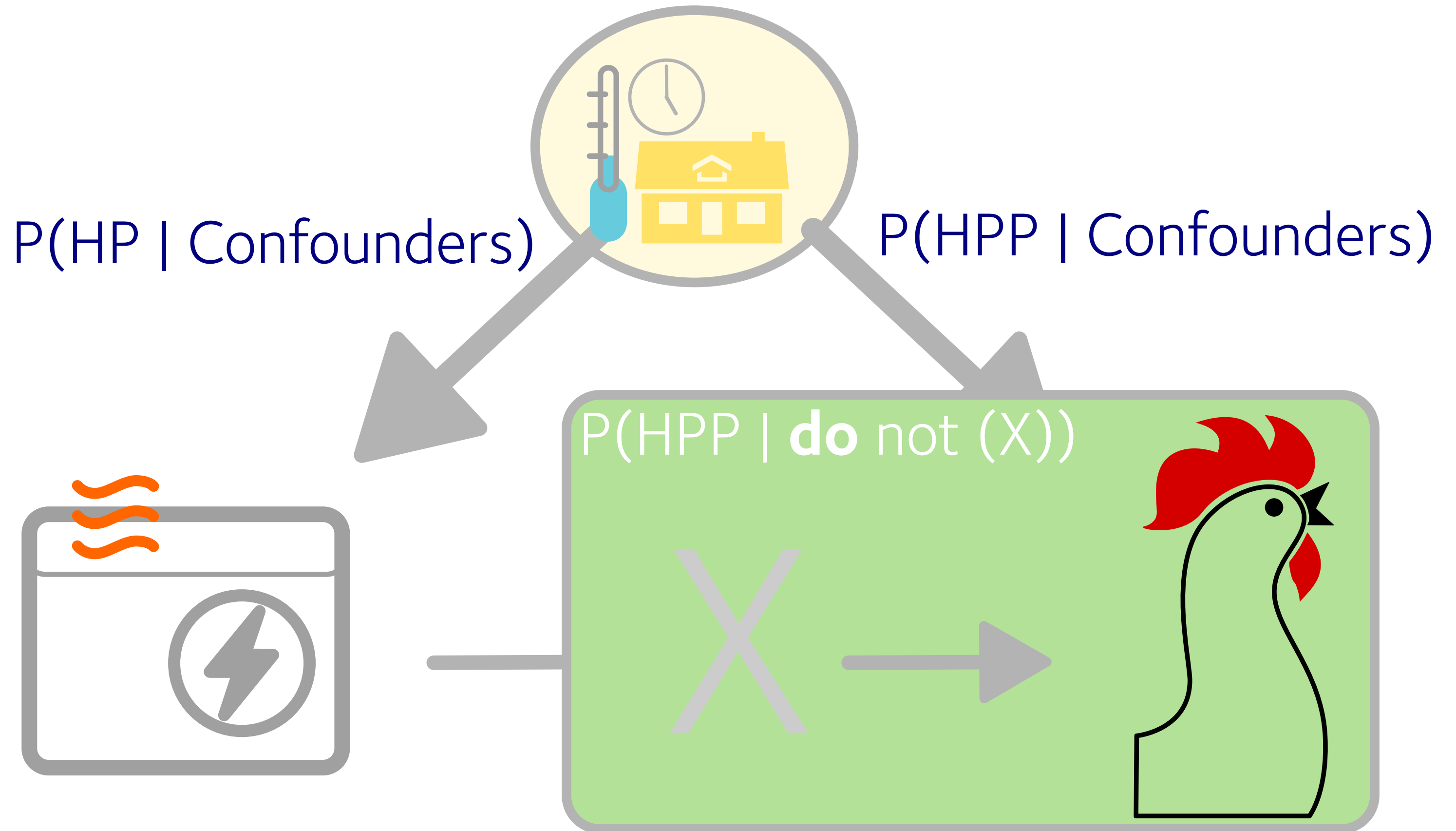


**Some data:** heat pumps work on cold days  
and even better in efficient homes

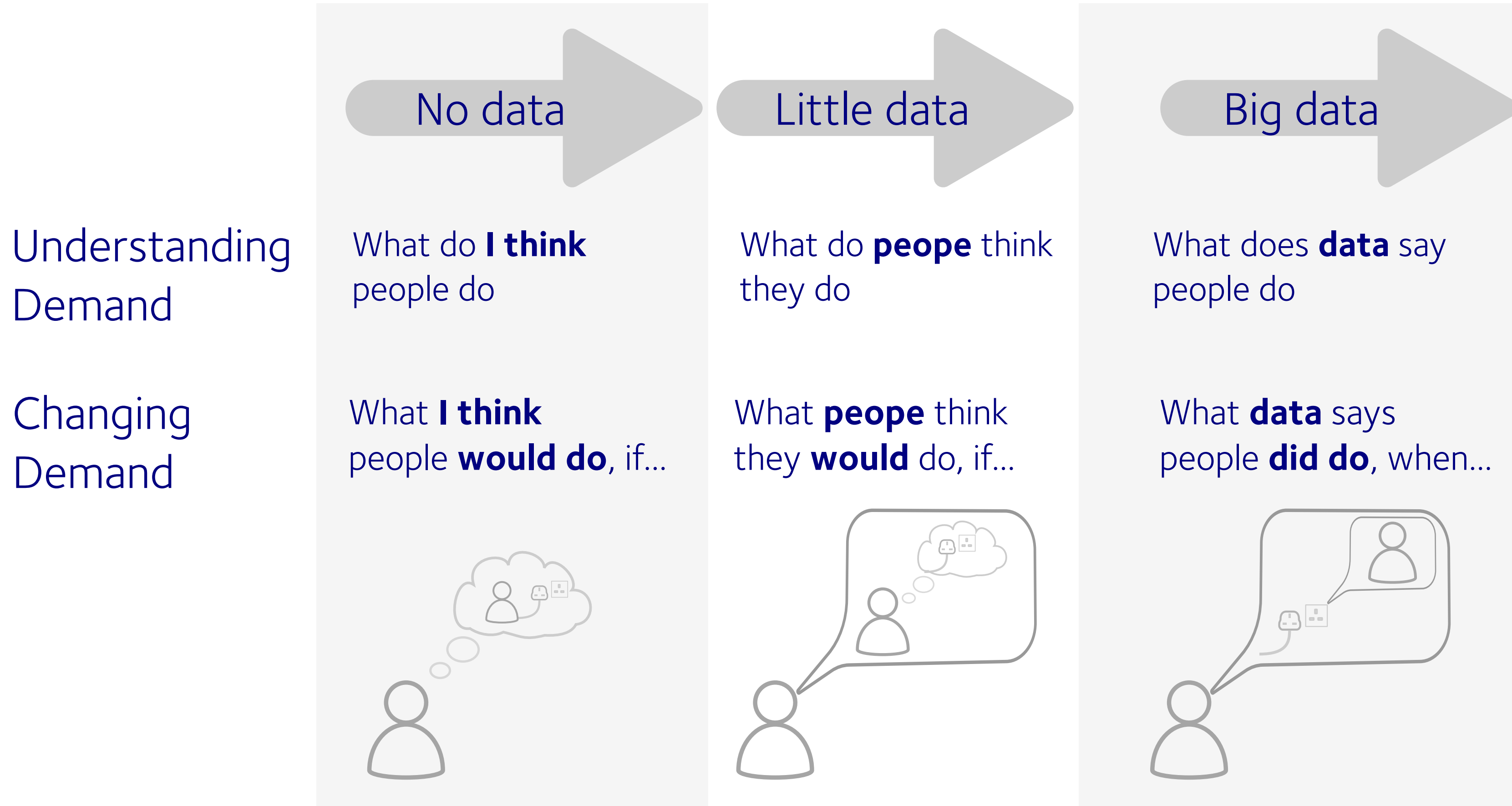


Credit: Sofia Perelli-Rocco, Energy Systems MSc 2022/23 and ChatGPT

# Big data: What improves heat pump performance?

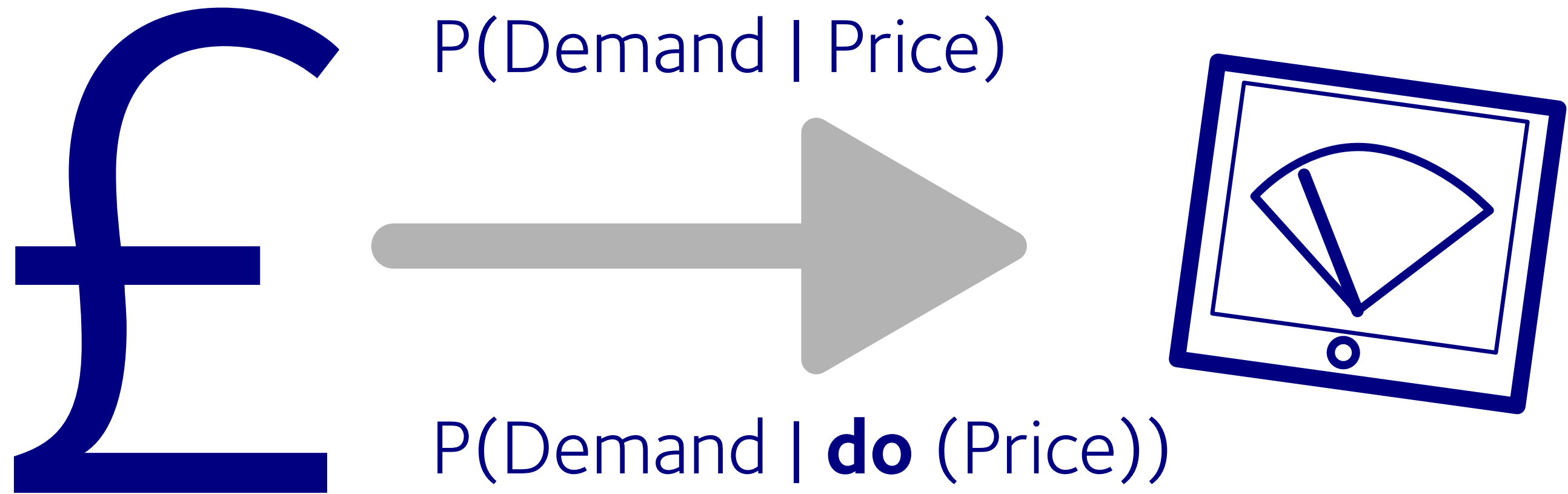


# Observation is not enough – make a change

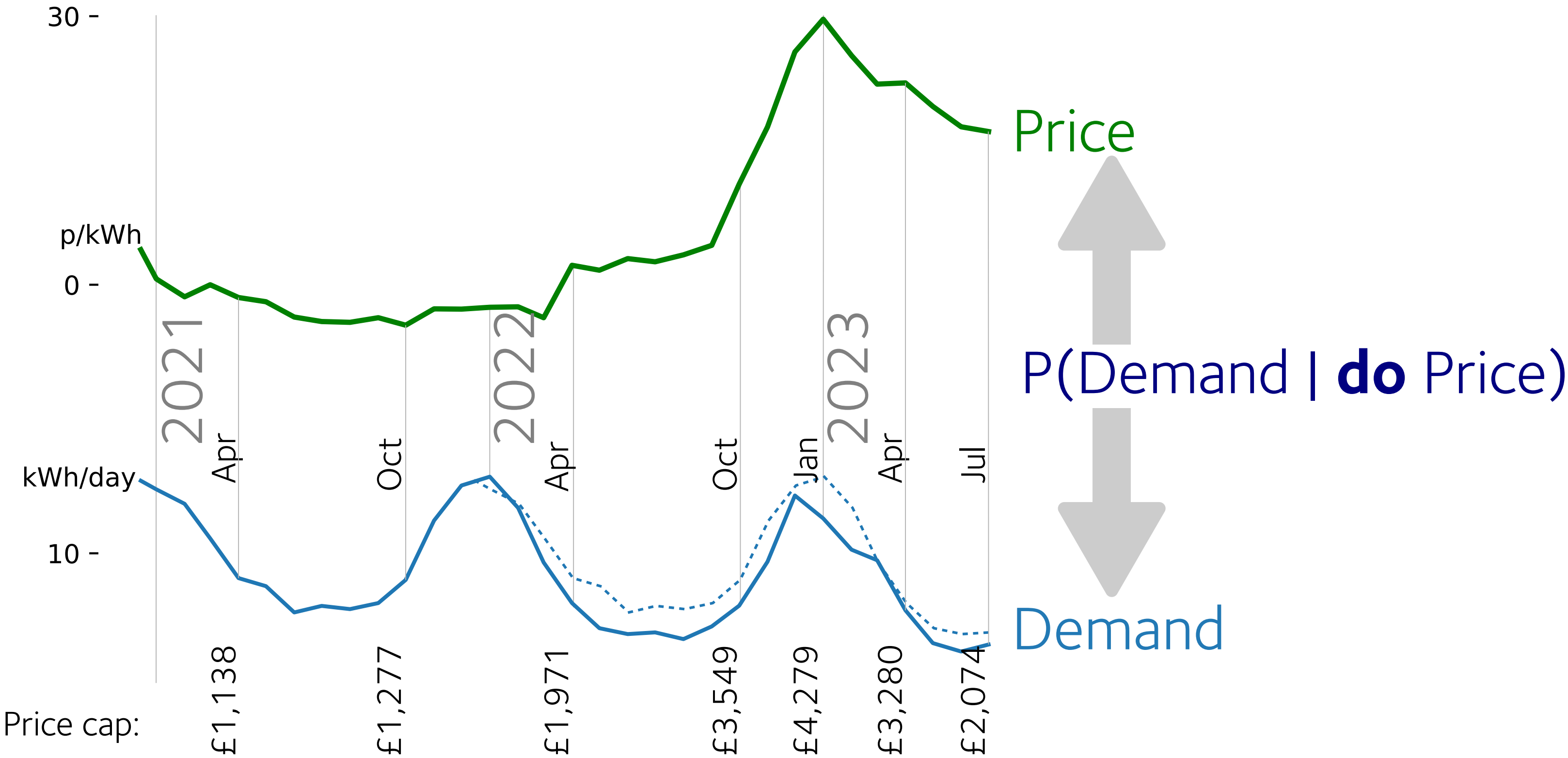




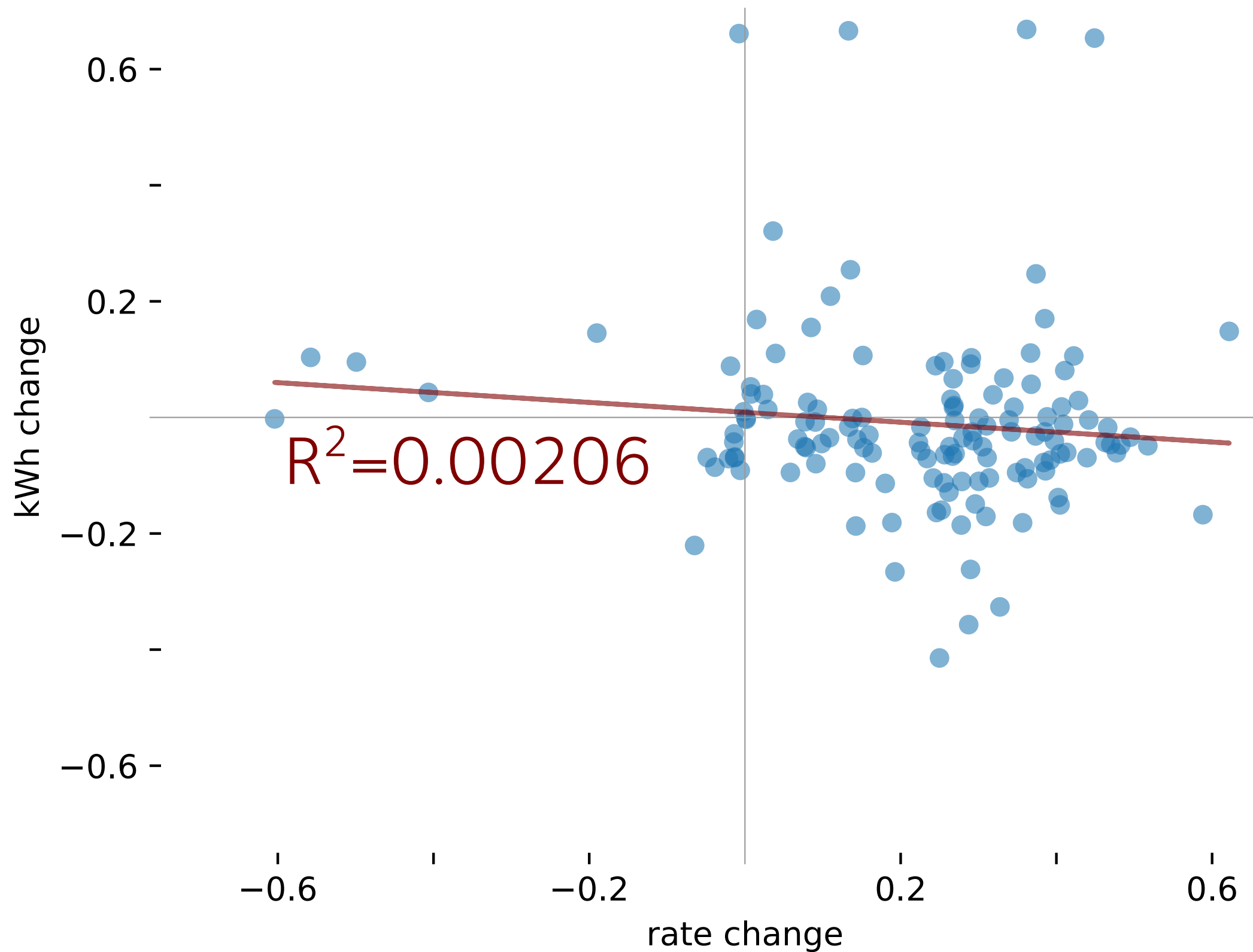
**No data:** I think... demand falls when prices rise



# Little data: demand falls when prices rise



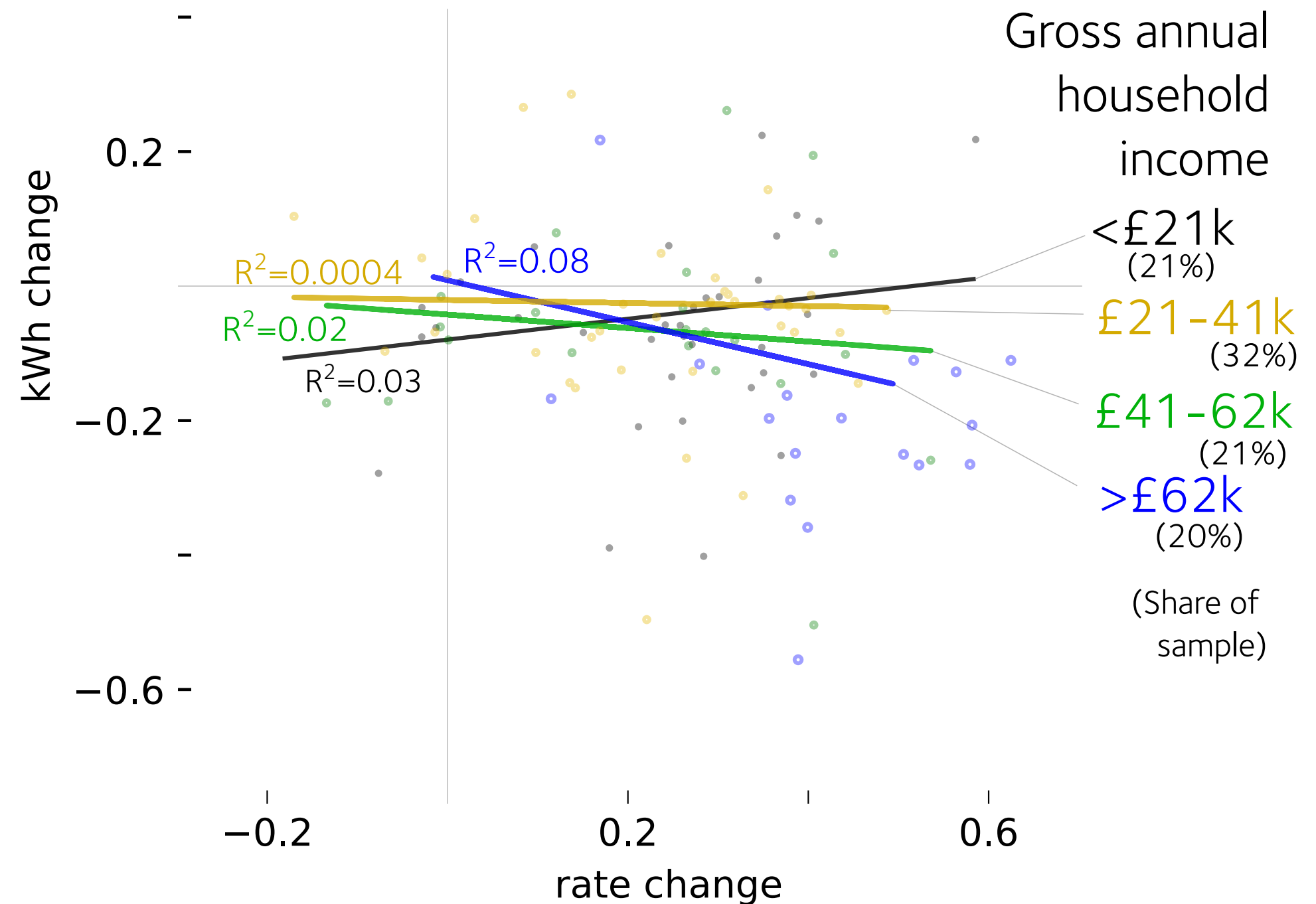
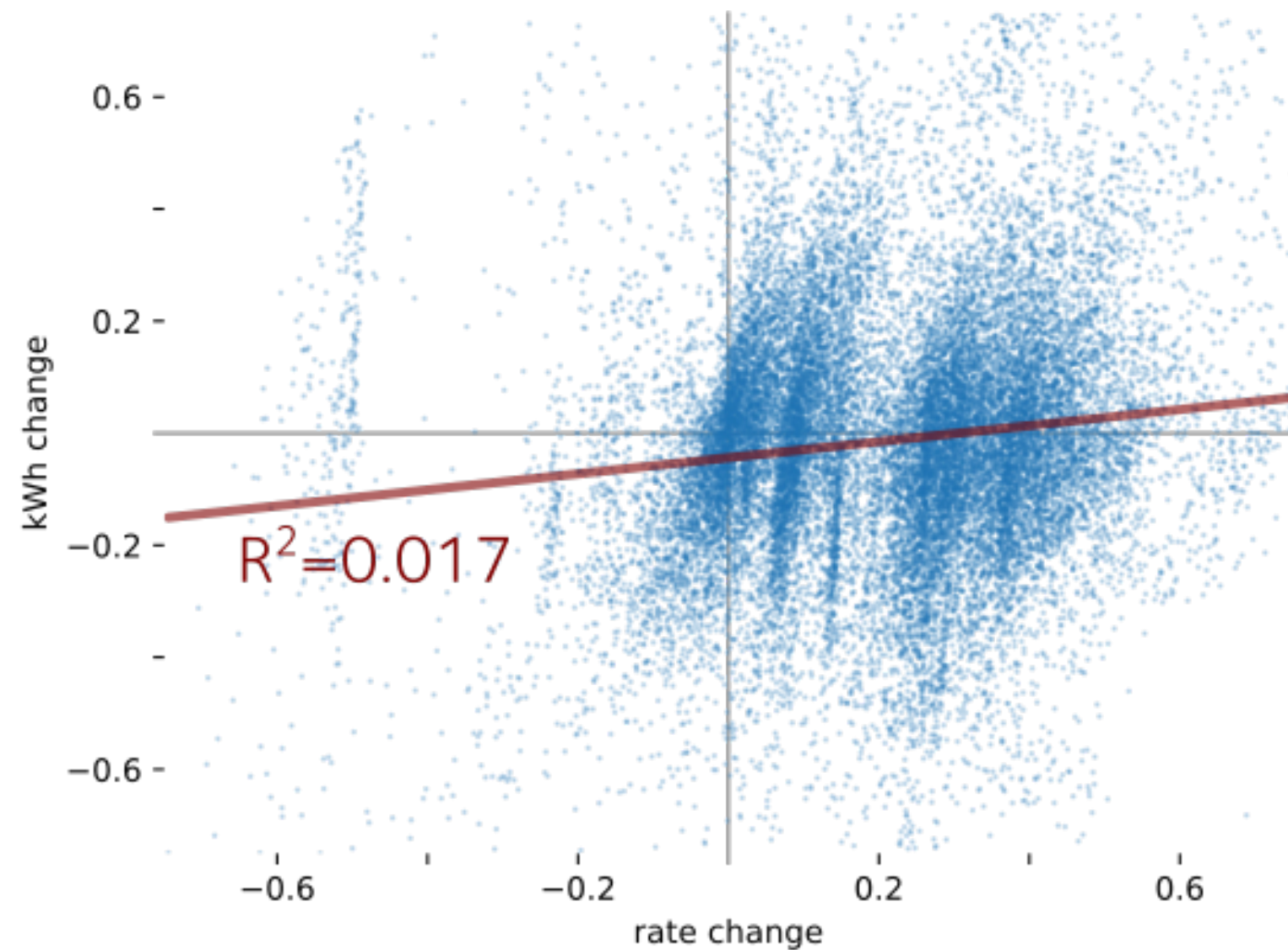
# Medium data: negative price elasticity?



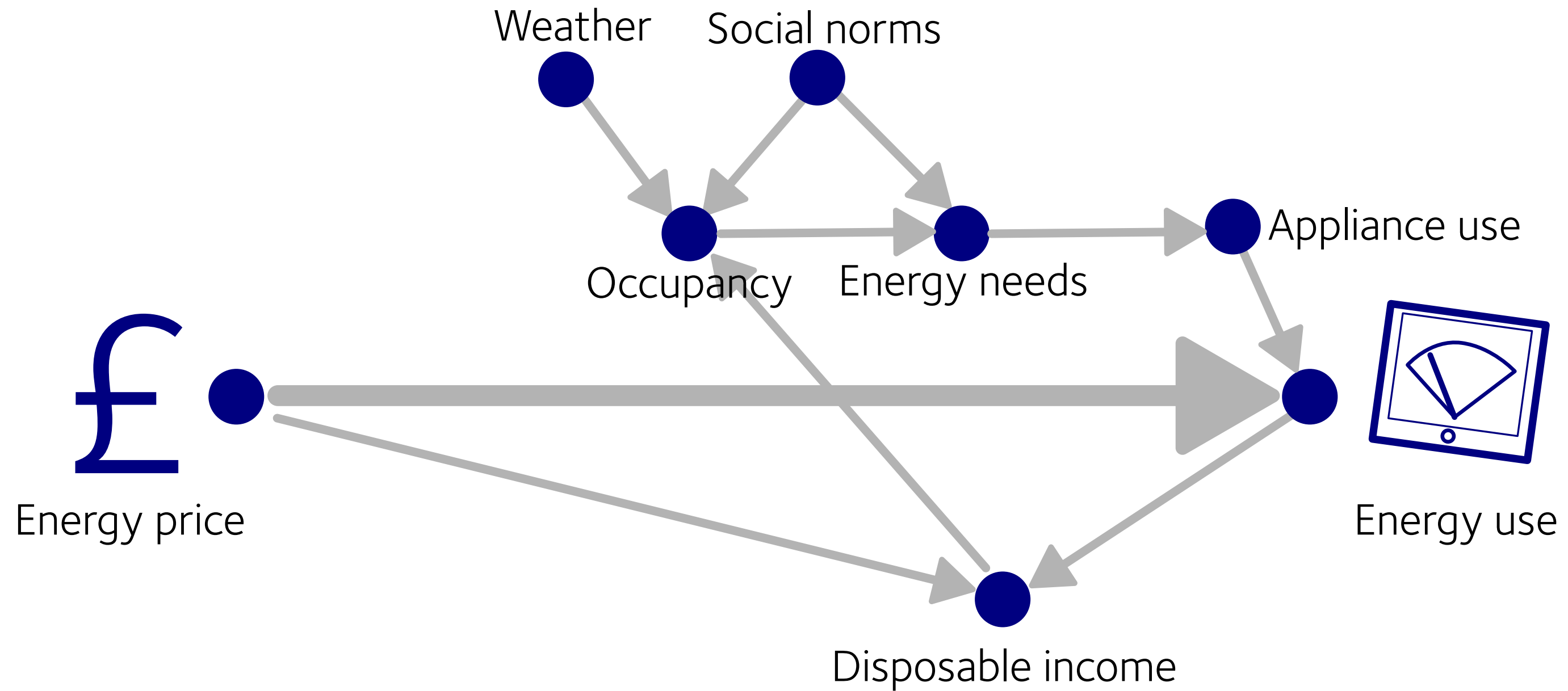
Jan 2022  
vs.  
Jan 2023

# Big data: ... it depends

Price elasticity is weak and depends on circumstances



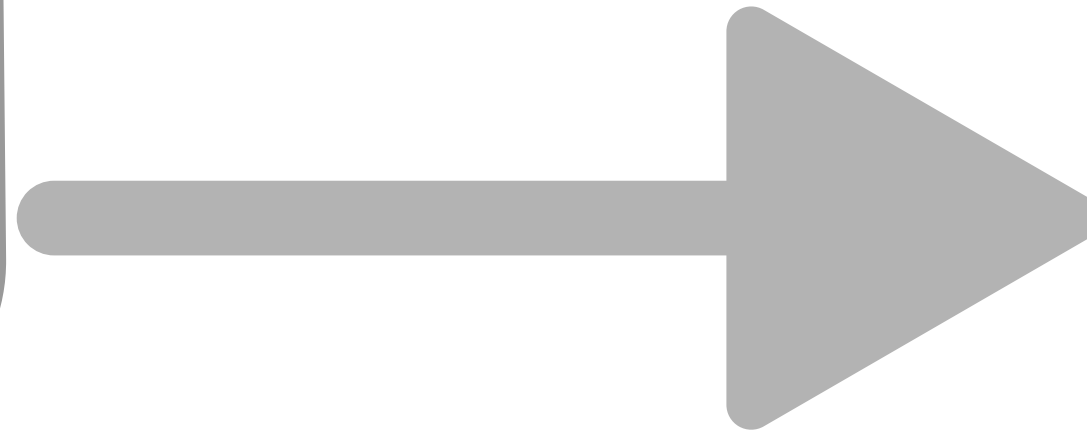
# Causal model: What causes energy demand to change?



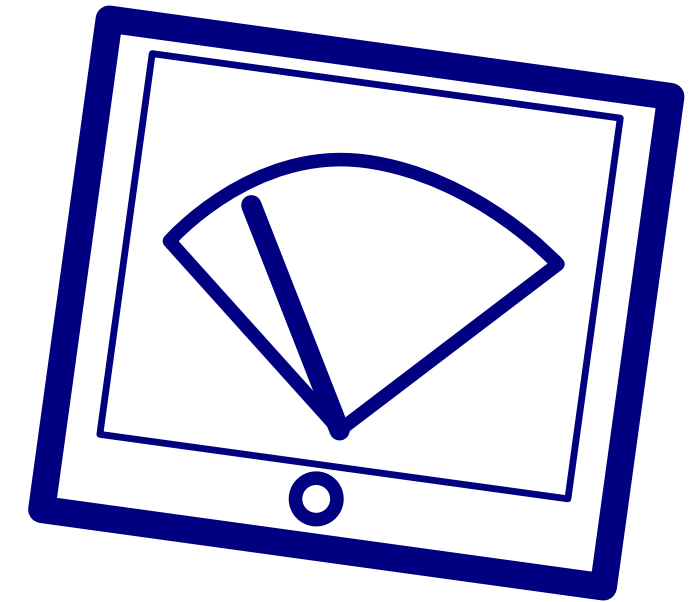
**No data:** I think... people will never give up dinner for DSR

Please,  
1) Keep a diary  
2) Reduce demand  
5pm to 7pm

$P(E \mid \text{Life})$



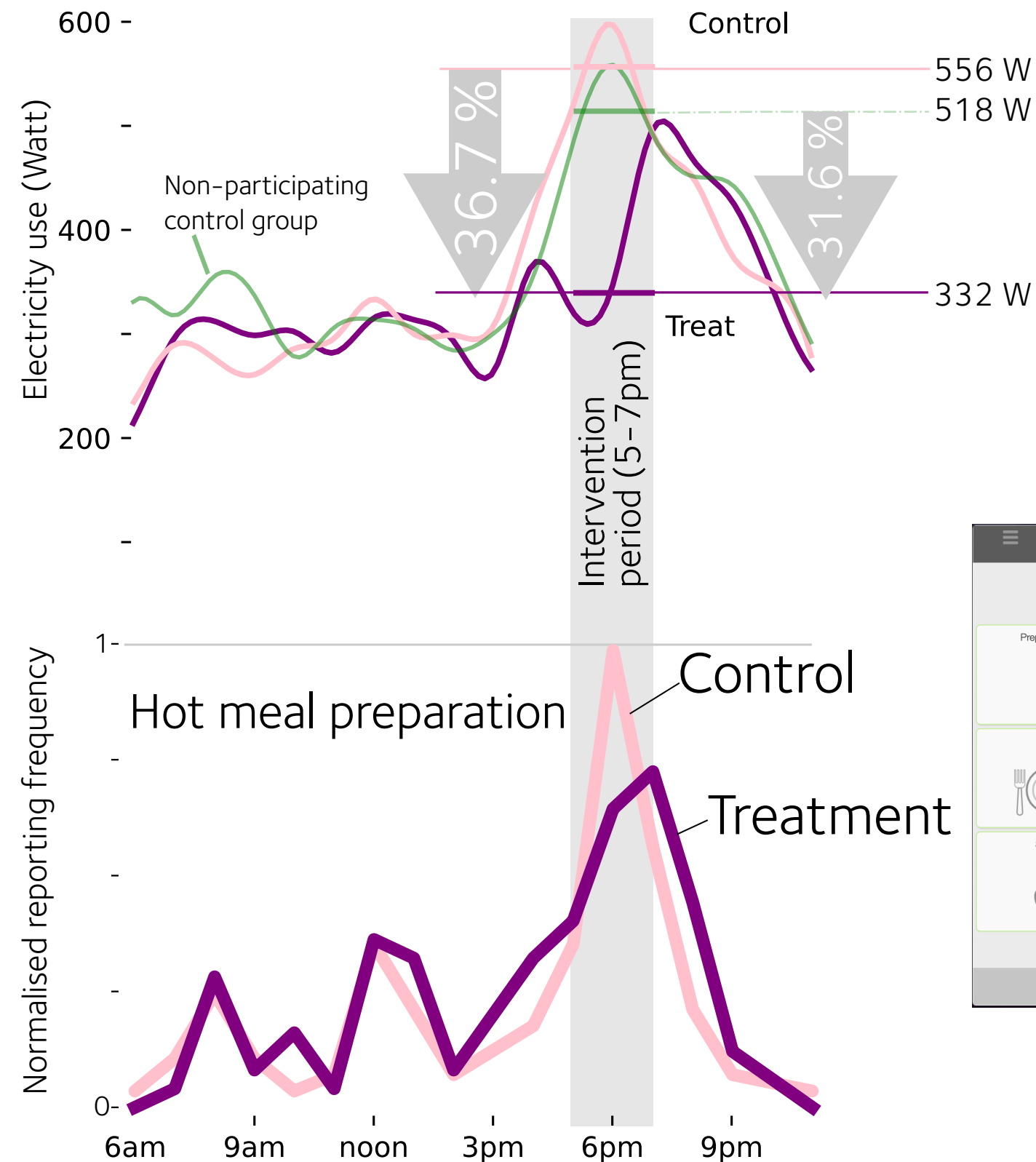
$P(E \mid \text{Life} + \mathbf{do}(\text{Ask}))$



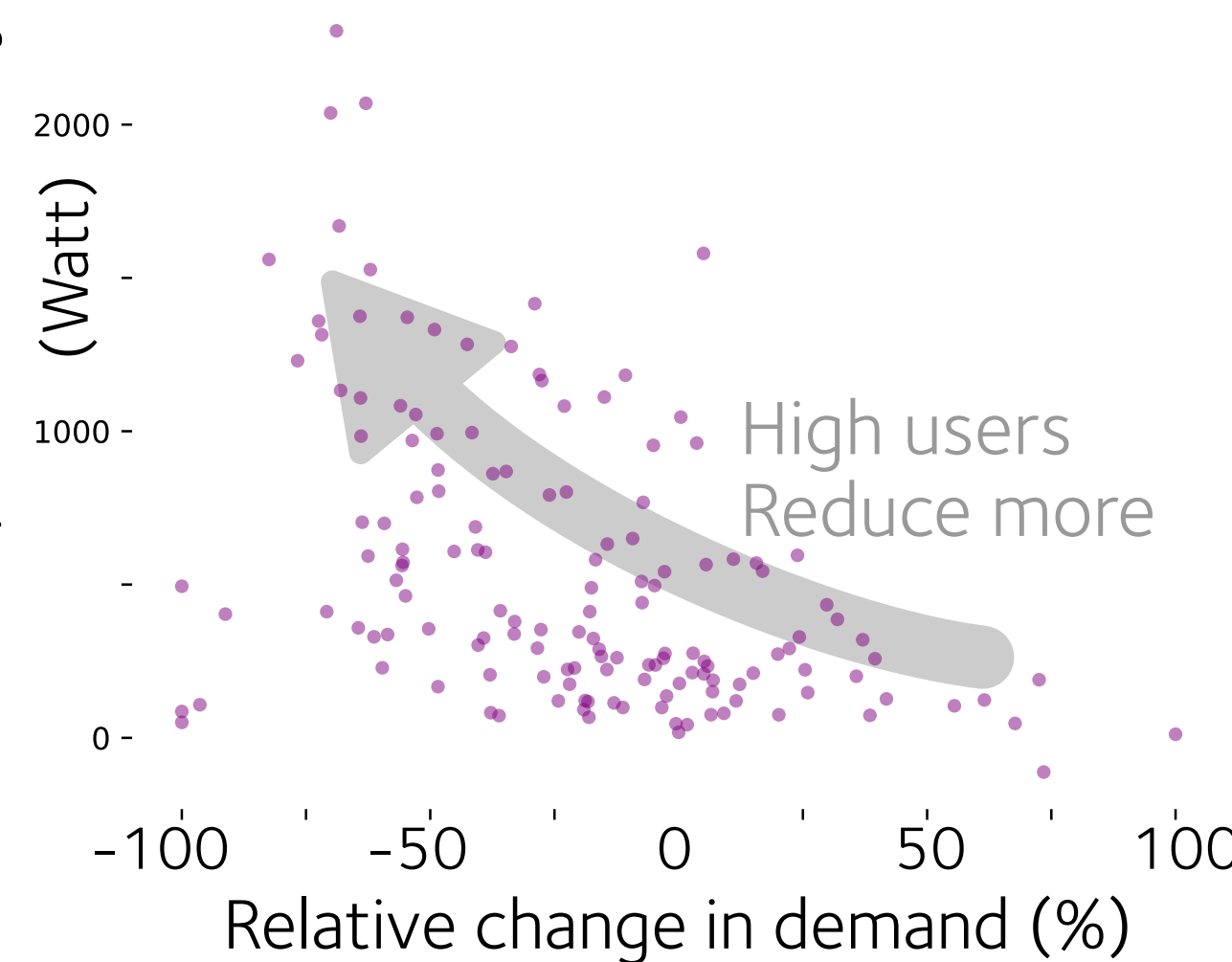


# Little Data: Control and intervention:

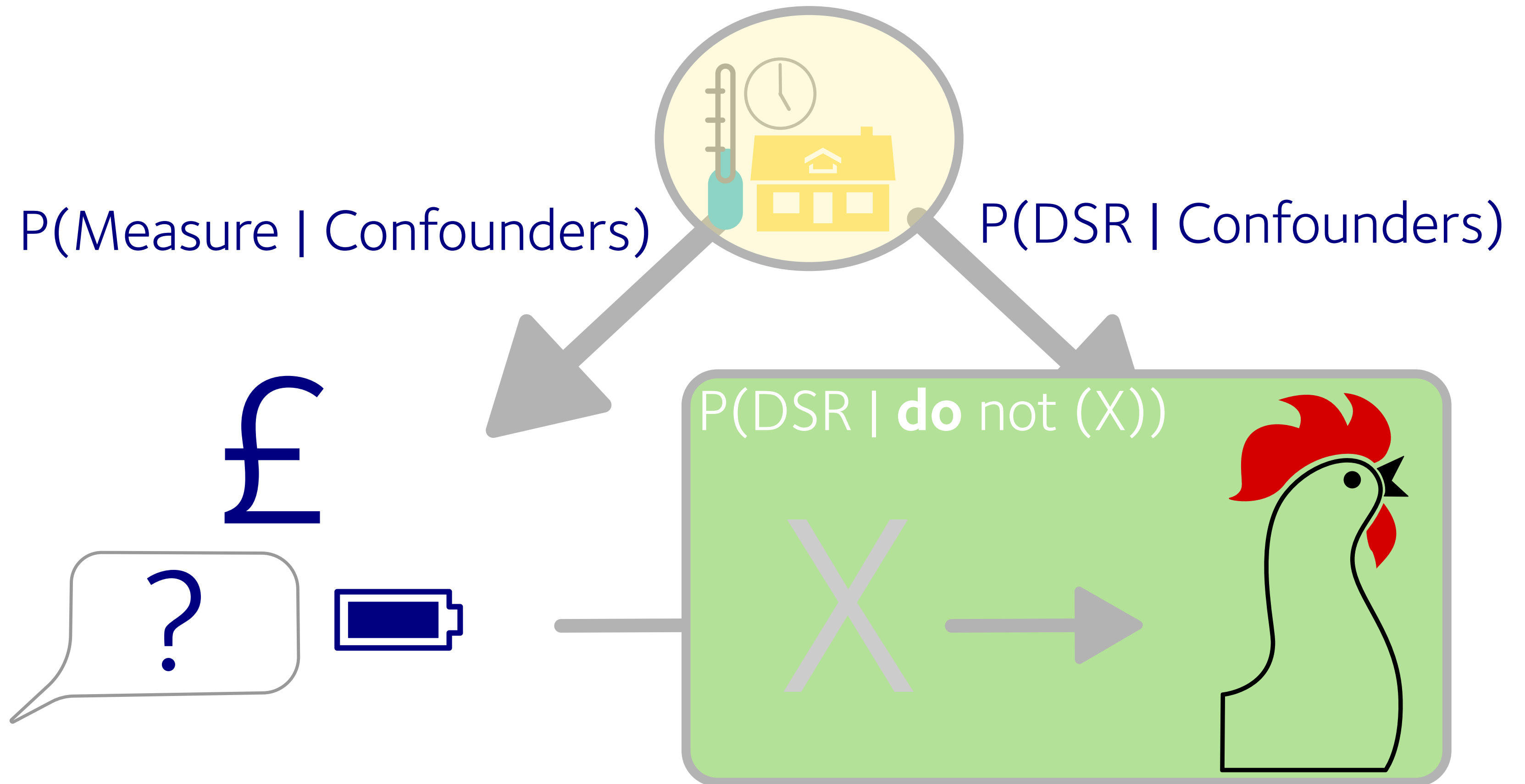
Responses are significant, repeatable and effective



Demand 5-7pm on Control Day

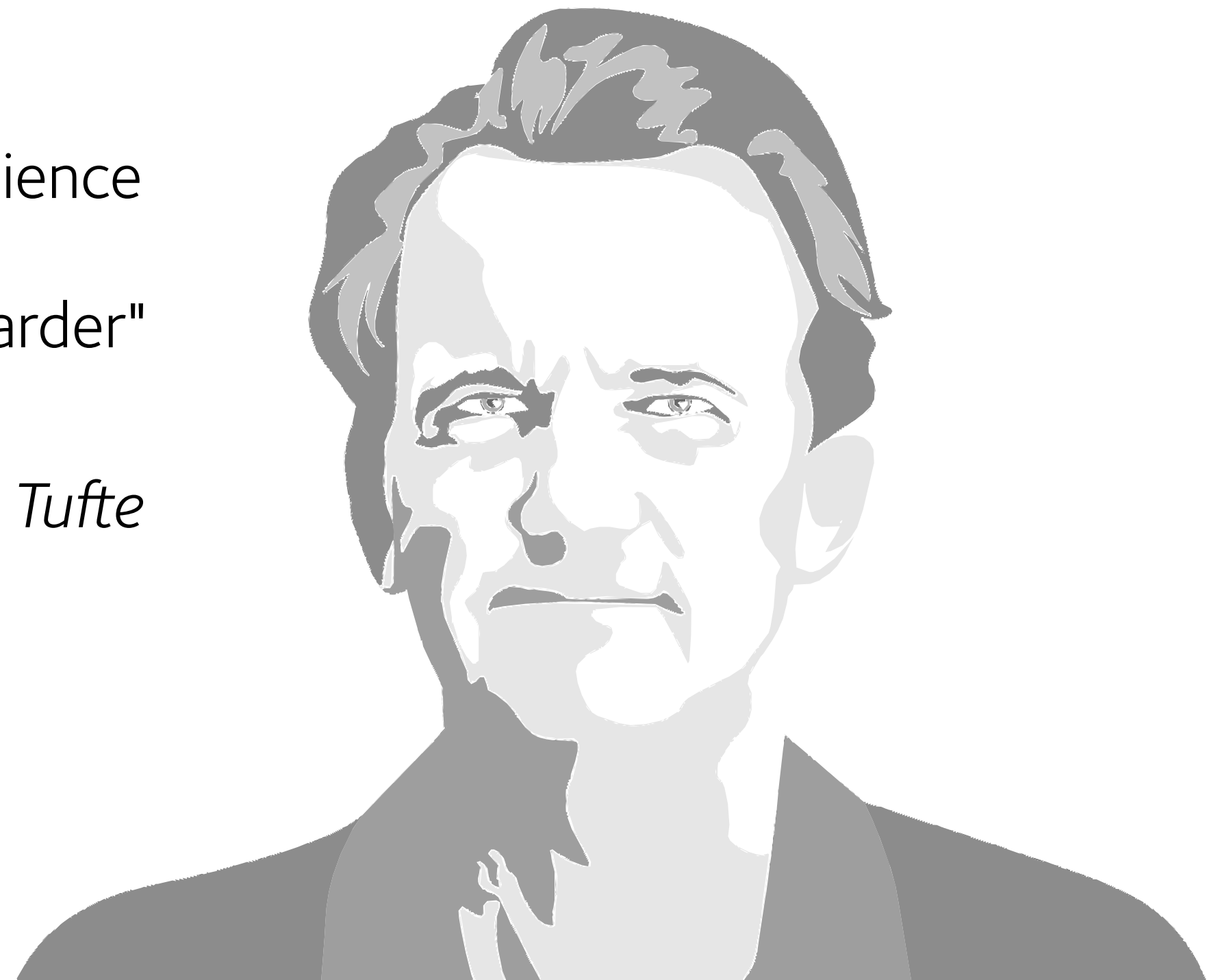


# Big data: Who/what delivers demand side responses?

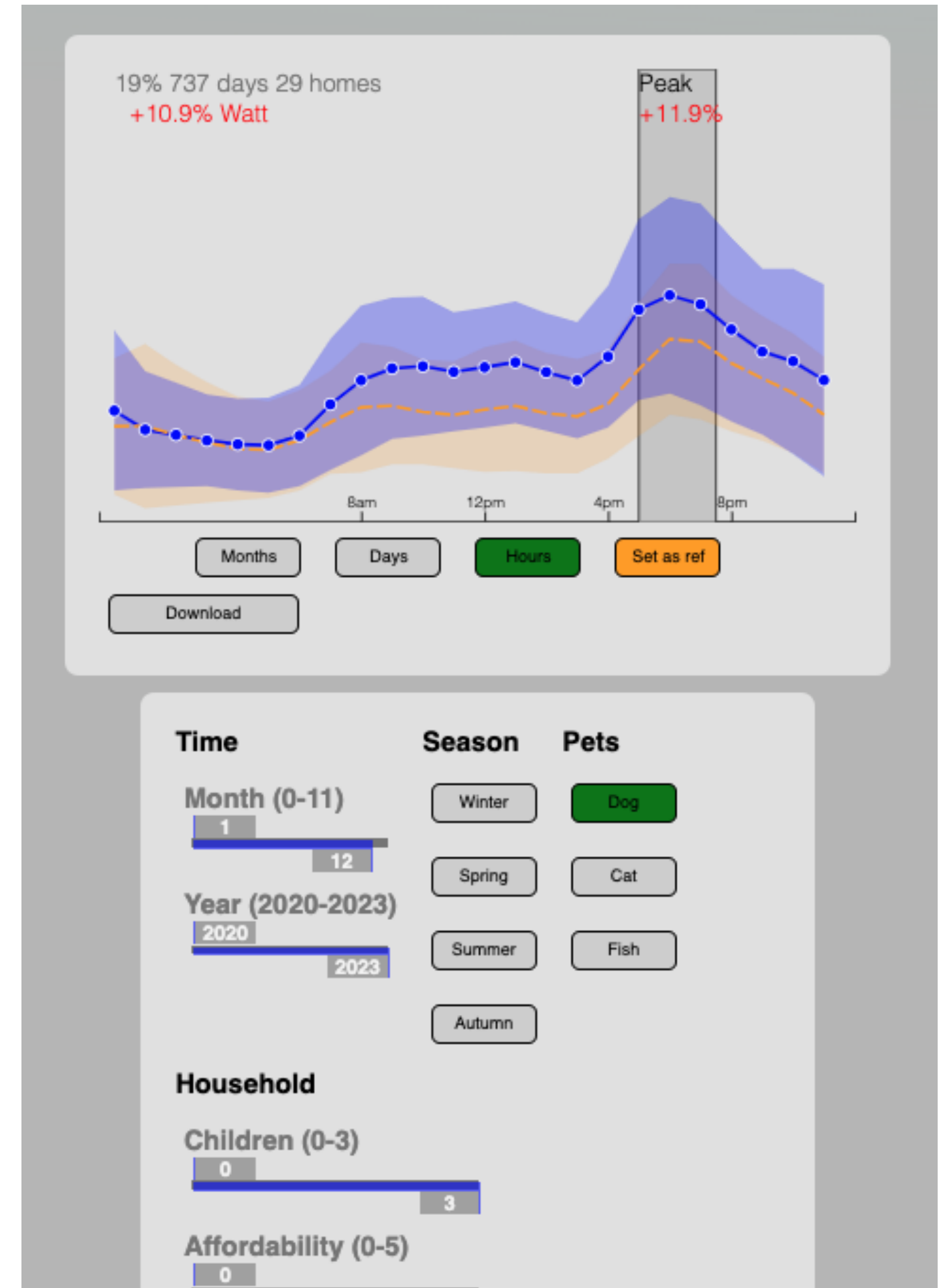


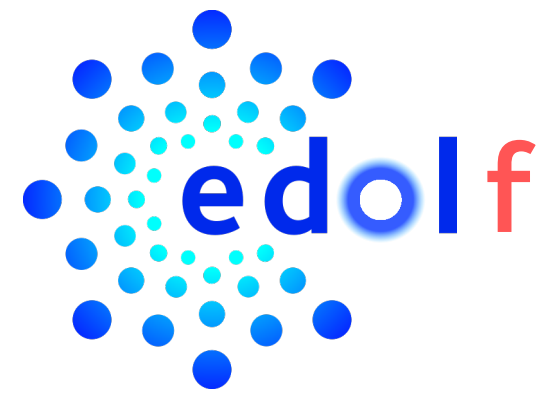
"Understanding human behaviour isn't rocket science  
– it's harder"

*Edward Tufte*

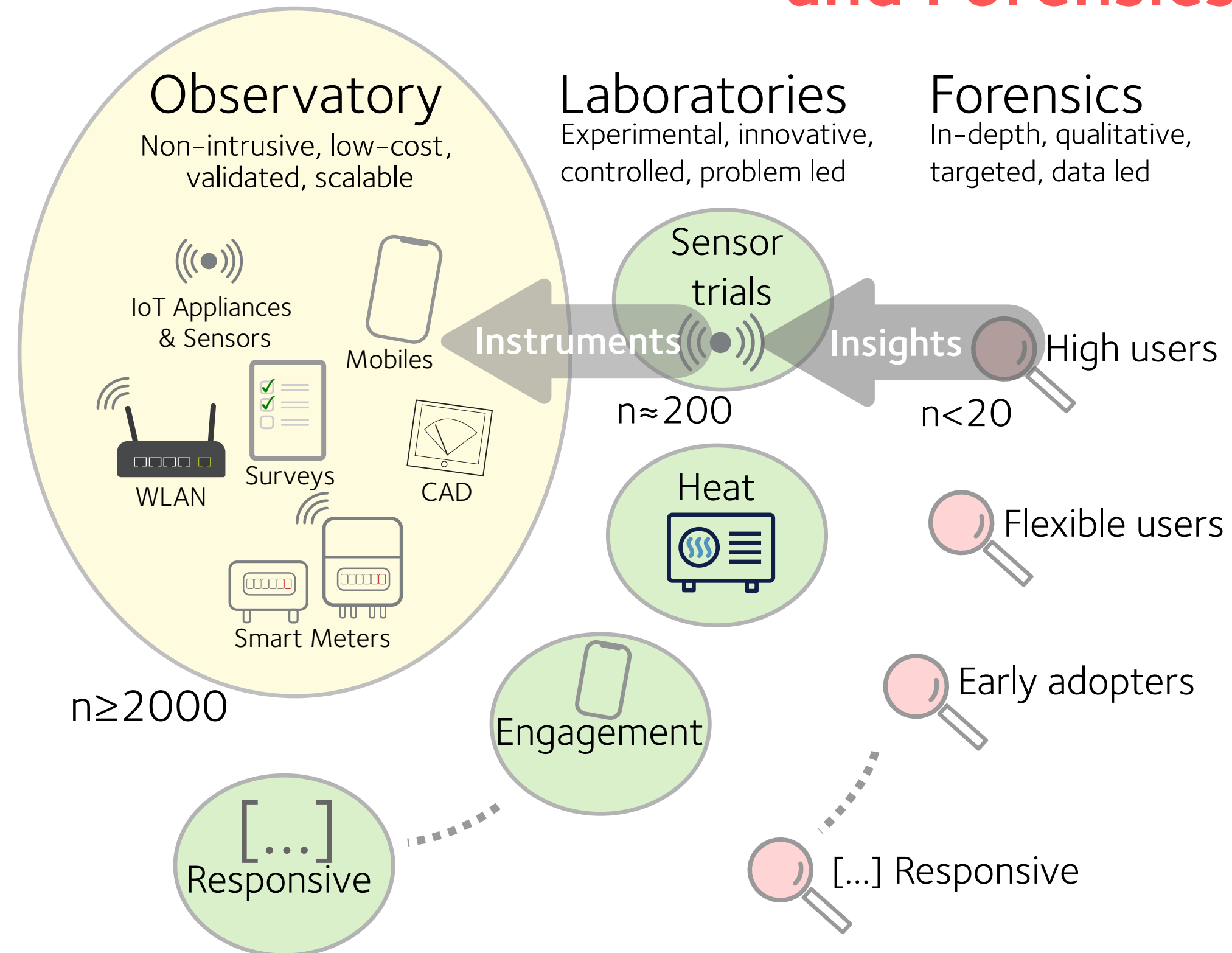


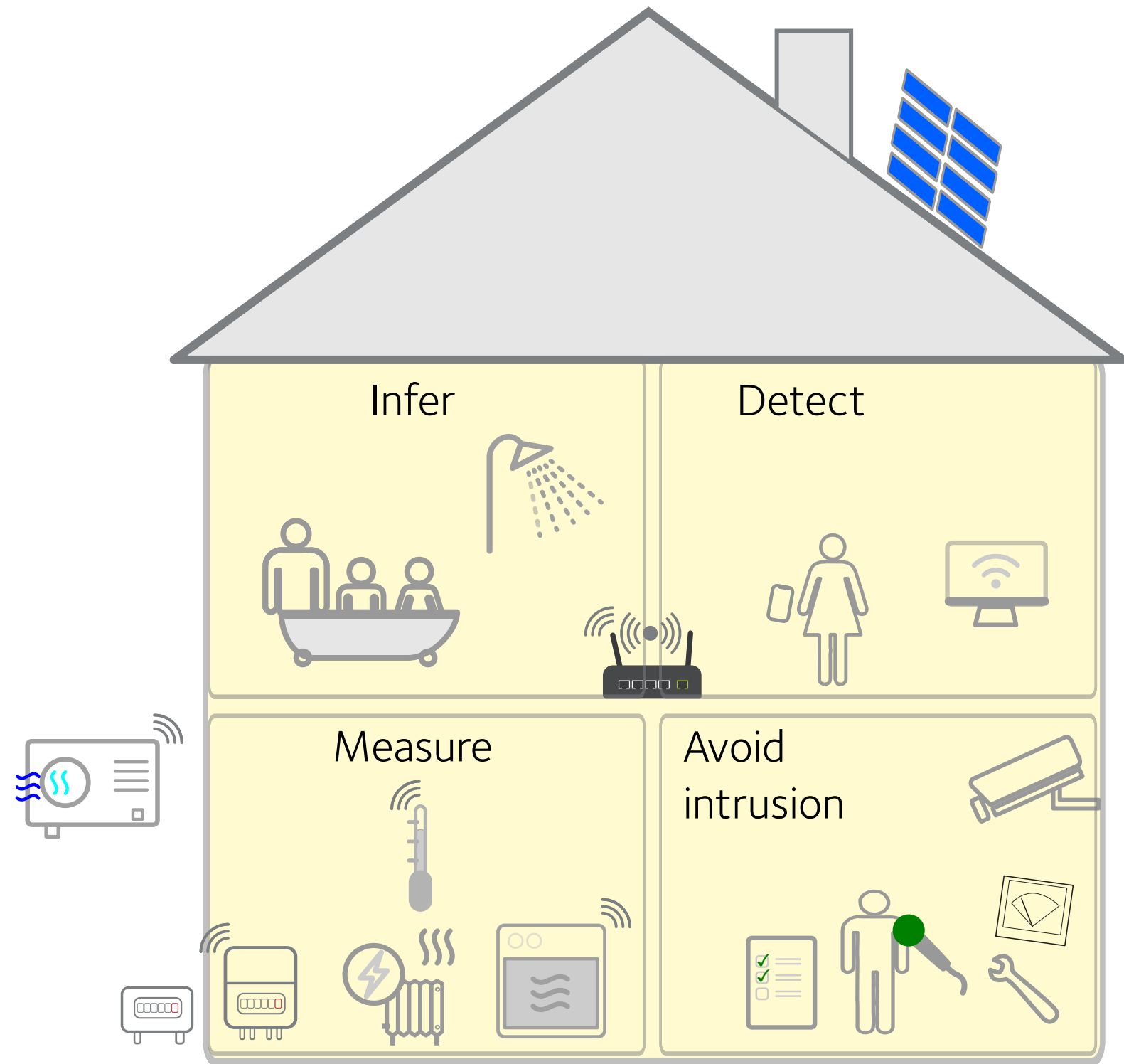
Power explorer:  
[energy-use.org/data](https://energy-use.org/data)





# Energy Demand Observatory and Laboratory and Forensics





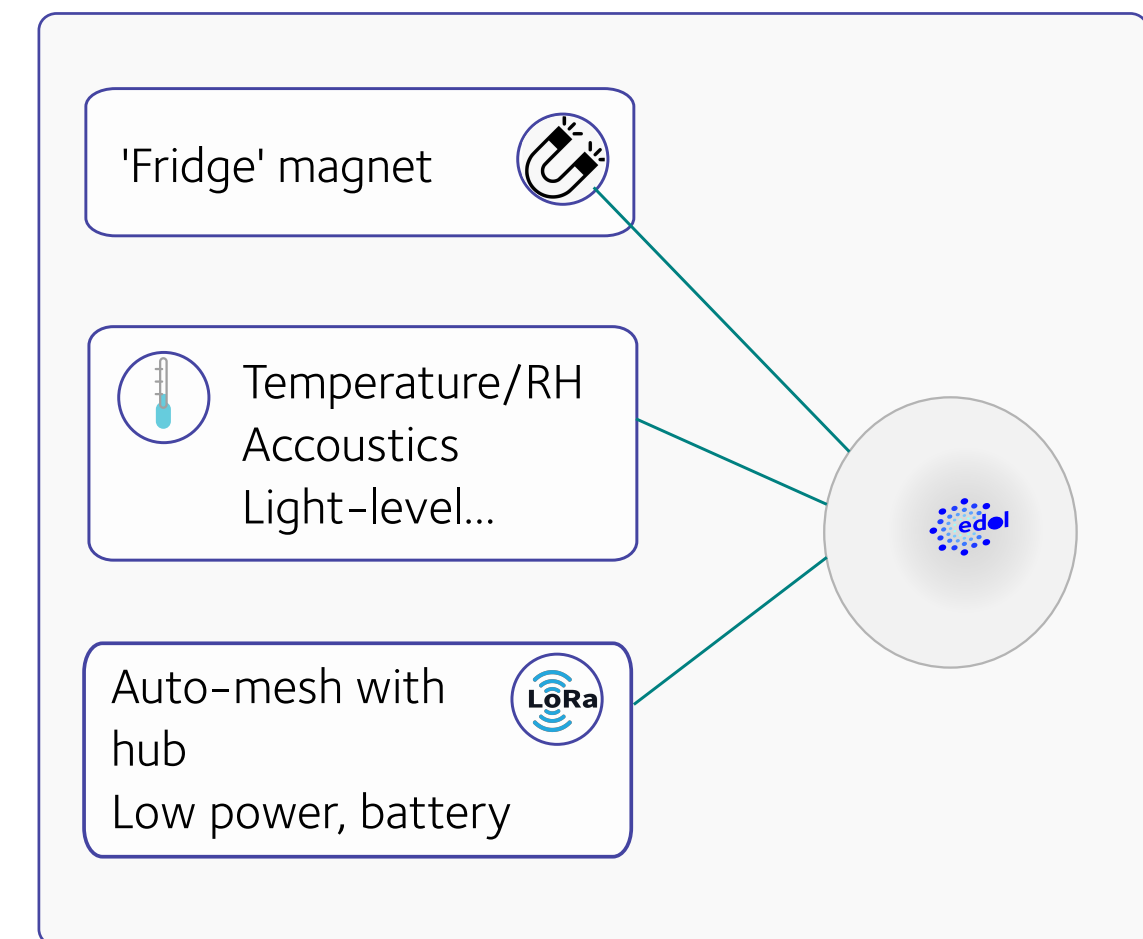
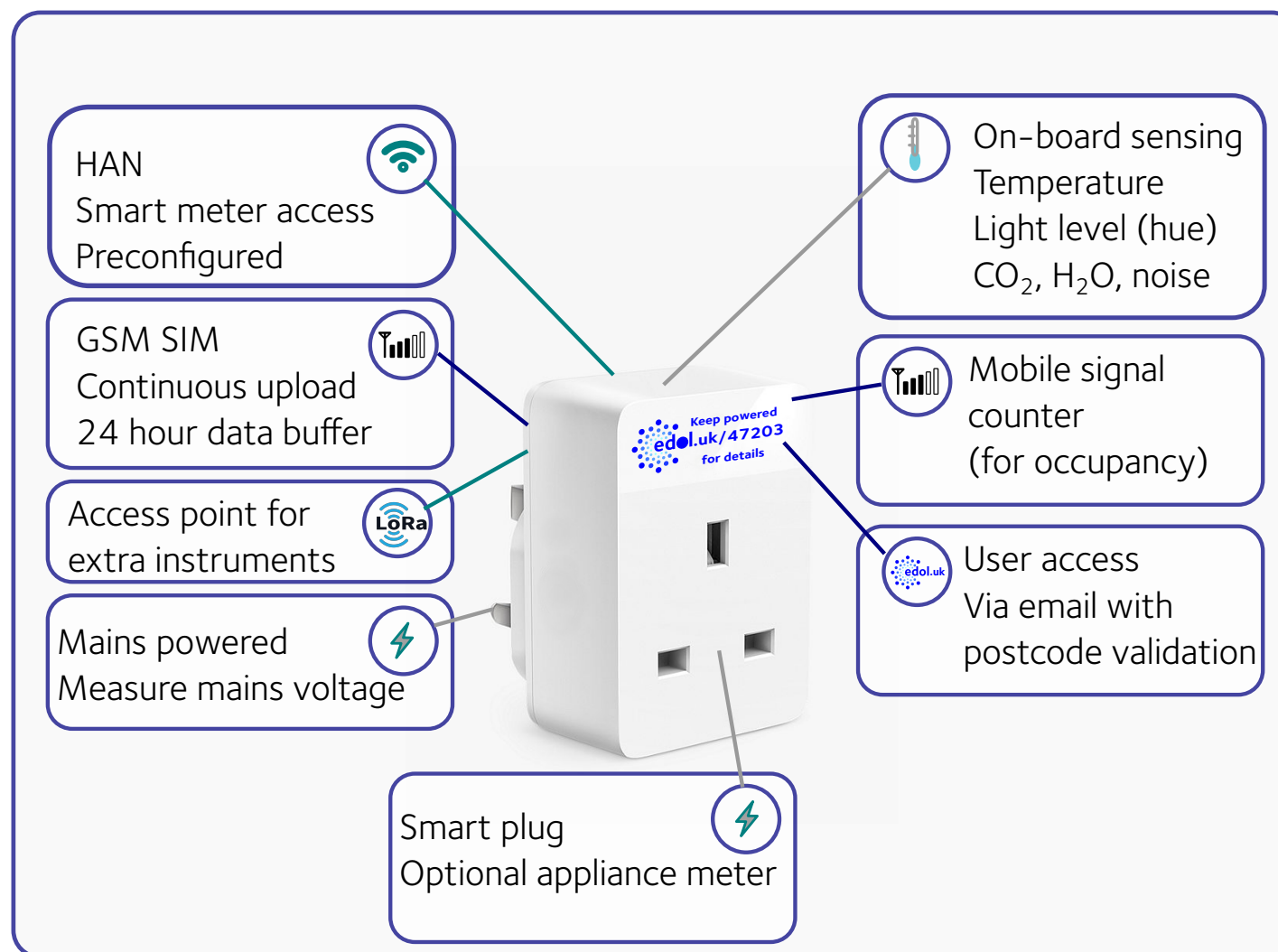
## Key development steps

- 1) Identify and validate technology options
- 2) Minimise the need for hardware and intrusion
- 3) Use accessible sources of data





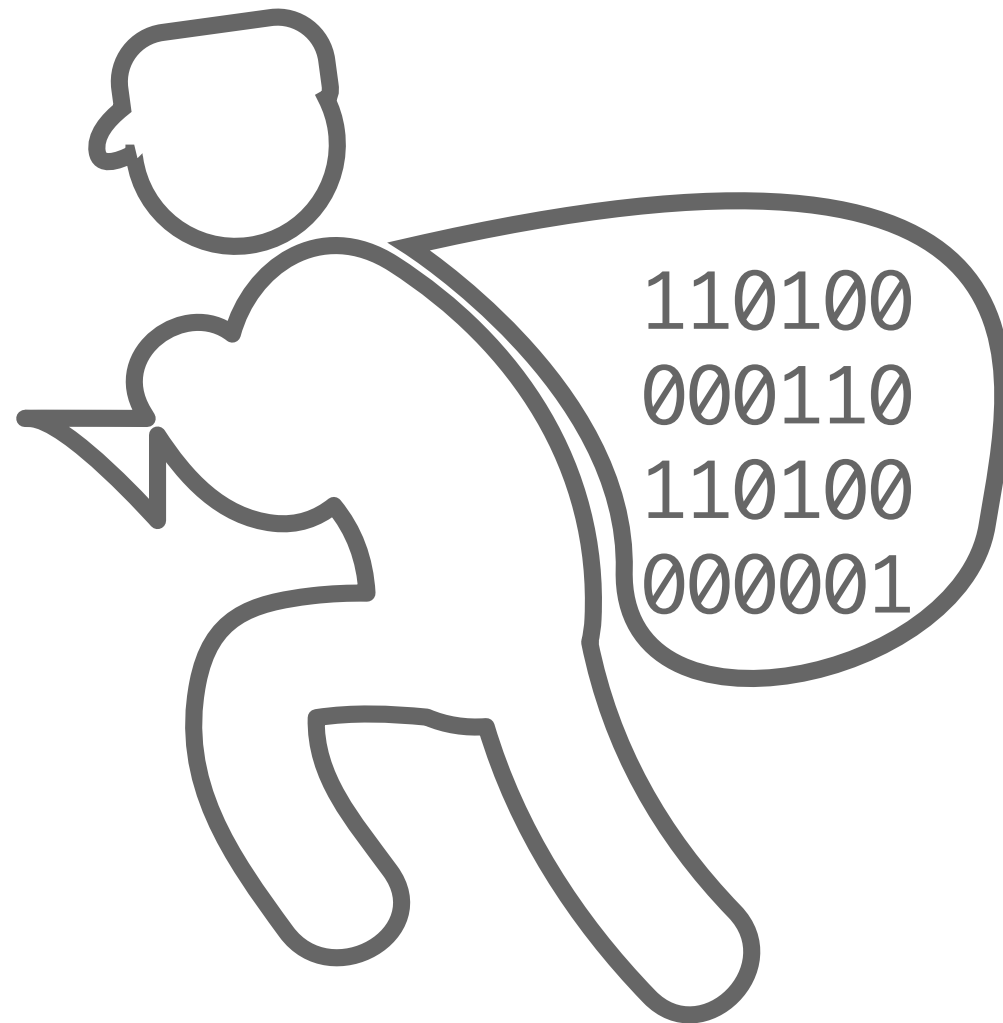
# EDOL Dream Data Instrument (EDDI)



# Is this what informed consent looks like?



# It is unclear what is sensitive and why



Energy use?

EPCs are public

Occupancy?

Lights and windows  
are visible to all

Privacy?

Spying spouses

Practices?

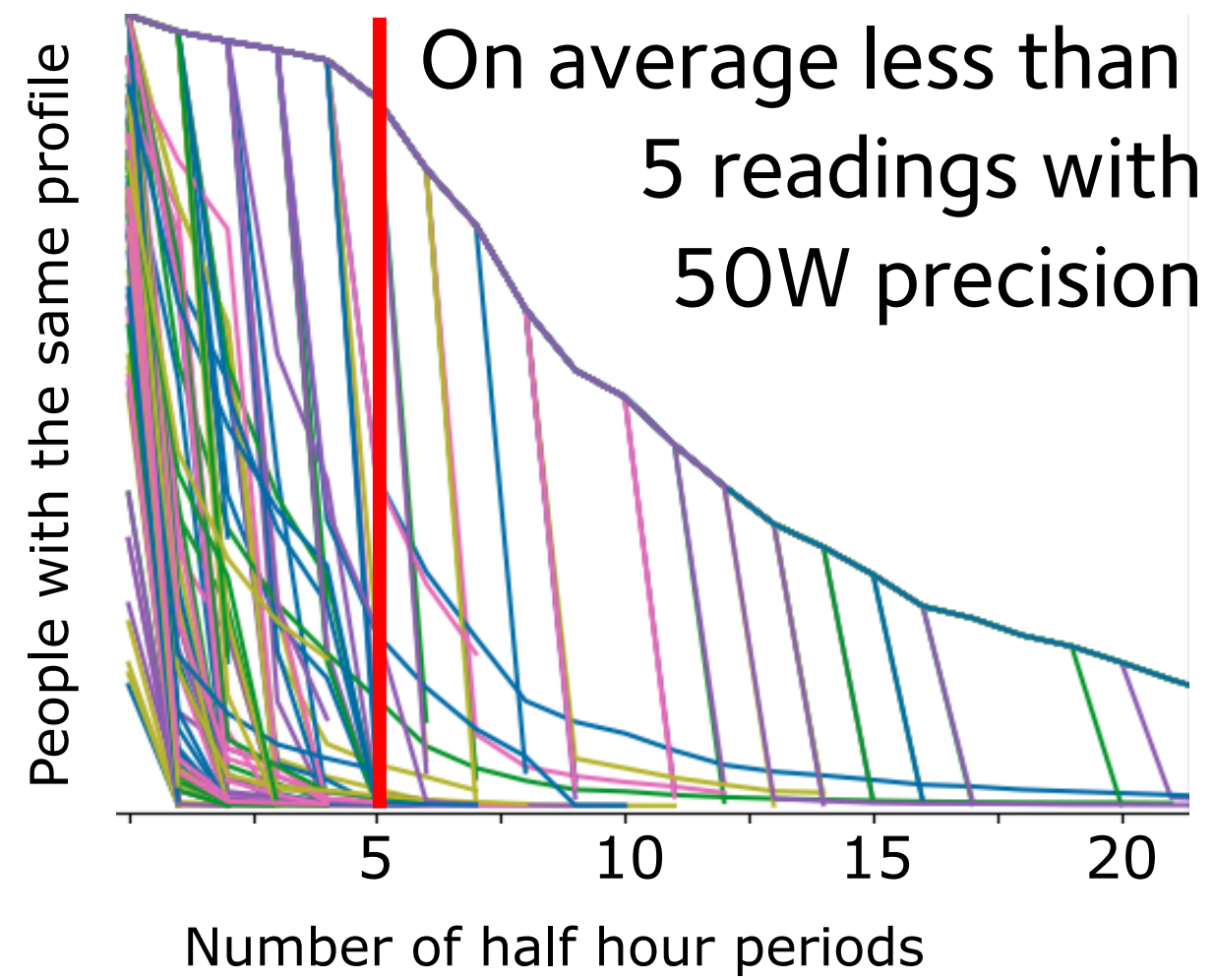
Profiles reveal faith

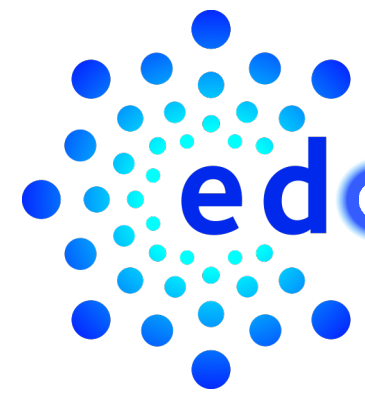
Identity?

How unique is the data

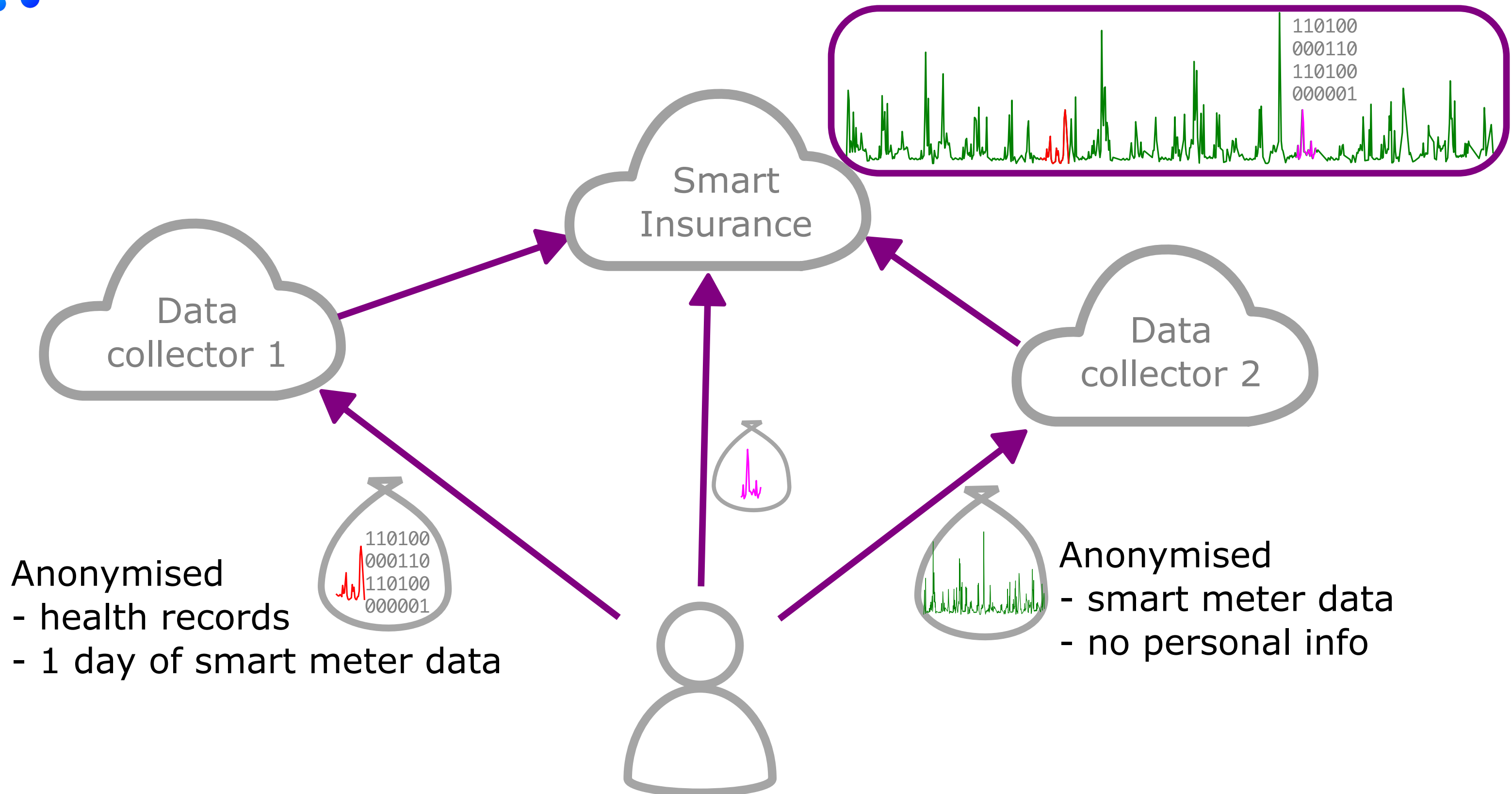


How much smart meter data does it take to uniquely identify **you**?





# Linking can turn harmless data into revealing data



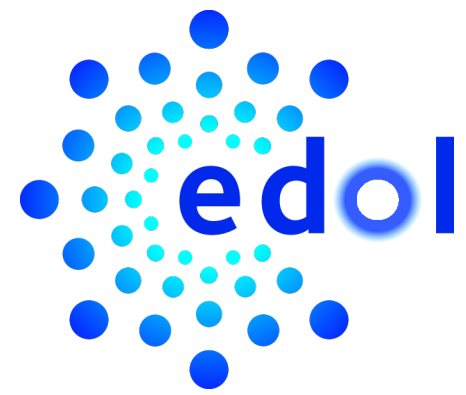


# **We need to de-identify data while maintaining data integrity**

## **Approaches**

- 1) Aggregate      Rule of '10' (or 3?) – arbitrary, defusing and unreliable
- 2) Cluster        Maintains some relevant features (e.g. heat pump cluster)
- 3) Synthesise    Allows to generate even hypothetical profiles





# Interested?

## Get in touch!



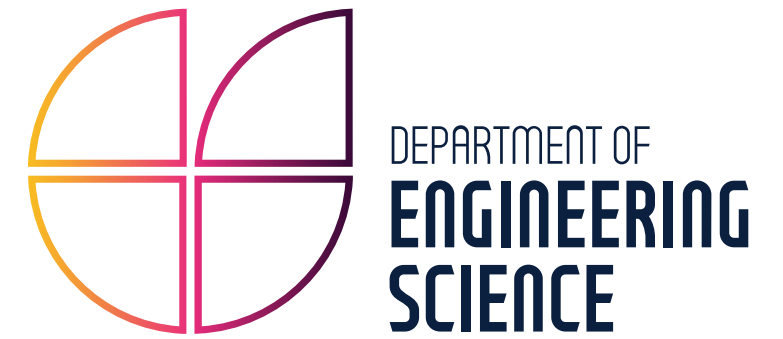
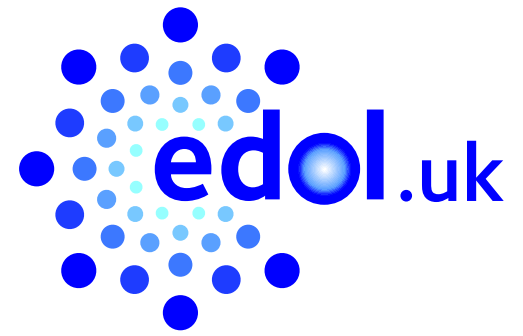
### Fully funded\* DPhil in Energy Data Privacy

Energy equity, security and decarbonisation can benefit from ethical uses of personal data. Oxford has access to large personal data sets. Apply machine learning tools to synthesise and share them responsibly.

Start October 2024 – see [edol.uk/dphil](https://edol.uk/dphil)

\*for home students





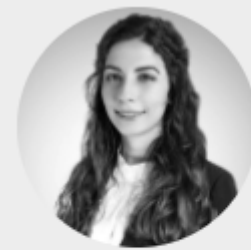
# Thank you



**Dr Phil  
Grünewald**



**Dr Tina  
Fawcett**



**Dr Zeynep  
Duygu Tekler**



**Dr Marina  
Topouzi**



**Prof. Christian  
Brand**



**Dr Dominic  
Shaw**



**Prof. Charlie  
Wilson**

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