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1 Background & motivation

The IPB98(y,2) scaling law was derived in 1999 [1].

$$\tau_E^{\text{IPB98}(y,2)} = 0.056 I_p^{0.93} B_t^{0.15} \bar{n}_e^{-0.41} P_{l,th}^{-0.69} R_{geo}^{1.97} \kappa^{0.78} \epsilon^{0.58} M_{eff}^{0.19}$$

Some 23 years later, an updated regression on the expanded version of the same database showed [2]:

$$\tau_E^{\text{ITPA20}} \propto R_{geo}^{1.71 \pm 0.32} \quad \tau_E^{\text{ITPA20-IL}} \propto R_{geo}^{1.19 \pm 0.27}$$

The size exponent α_R **weakened**.

Two candidate explanations were investigated:

- (i) Statistical artefacts, in particular multicollinearity
- (ii) Physical properties of the additional discharges

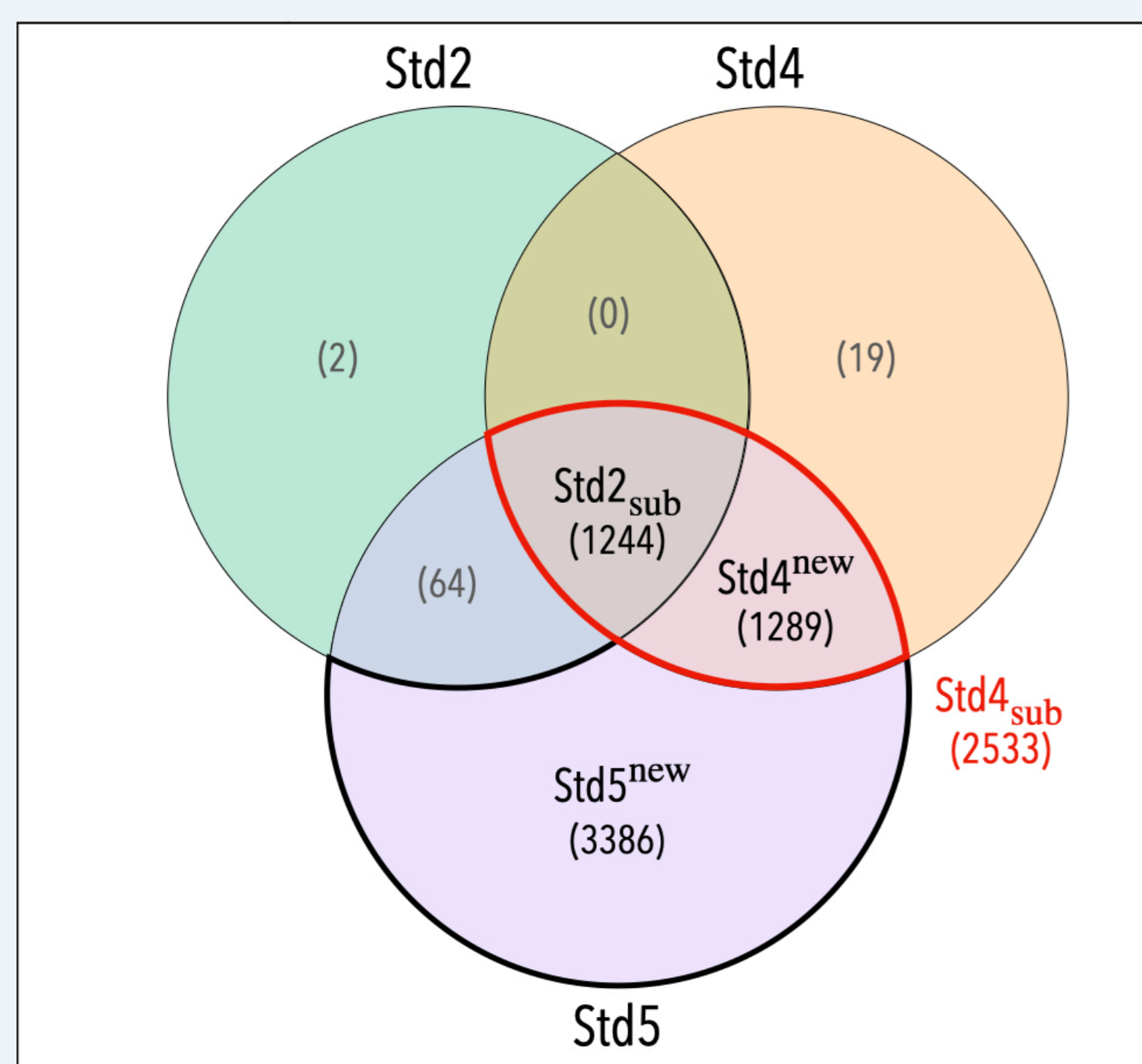
2 ITPA H-mode database

Three database iterations are used:

$$\text{Std2}_{\text{sub}}: 1244 \text{ pts (8 machines)} \quad \alpha_R = 1.7 \quad (2.1) \quad [1]$$

$$\text{Std4}_{\text{sub}}: 2533 \text{ pts (13 machines)} \quad \alpha_R = 1.4 \quad (2.0) \quad [3]$$

$$\text{Std5}: 5919 \text{ pts (14 machines)} \quad \alpha_R = 1.3 \quad (1.6) \quad [2]$$



Spherical devices excluded (distinct transport physics).

Leading to a reduced range in ϵ

Hence, ϵ was removed from the regression model.

3 Multicollinearity diagnostics

Each regression coefficient has an associated standard deviation which is governed by:

- The model
- Predictors range
- Multicollinearity
- Measurement uncertainty

$$\sigma_i \equiv \sqrt{\text{Var}(\hat{\beta}_i)} = \sqrt{\frac{\sigma_e^2}{SS_i} \cdot \text{VIF}_i}, \quad i = 1, \dots, p$$

Variation inflation factors (VIF)

Variable	Std2 _{sub}	Std4 _{sub}	Std5
I_p	7.0	6.9	7.8
R_{geo}	5.1	5.0	6.6

VIF > 5 are indicative of strong multicollinearity

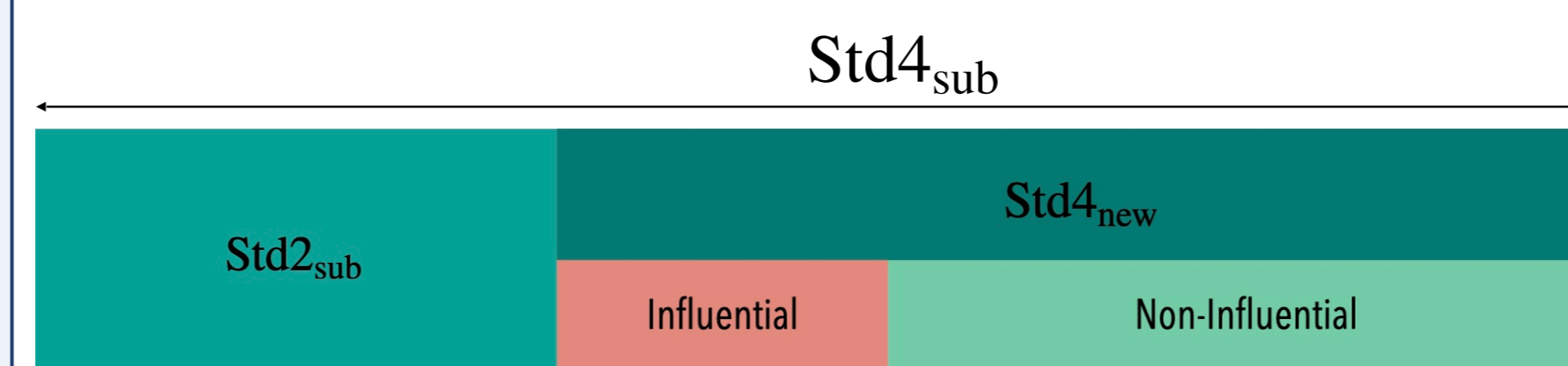
- While multicollinearity is pronounced, the effect on coefficient variance remains limited

- **We deduce that multicollinearity is not the sole cause of reduced size scaling.**

4 Identification of the Influential Set

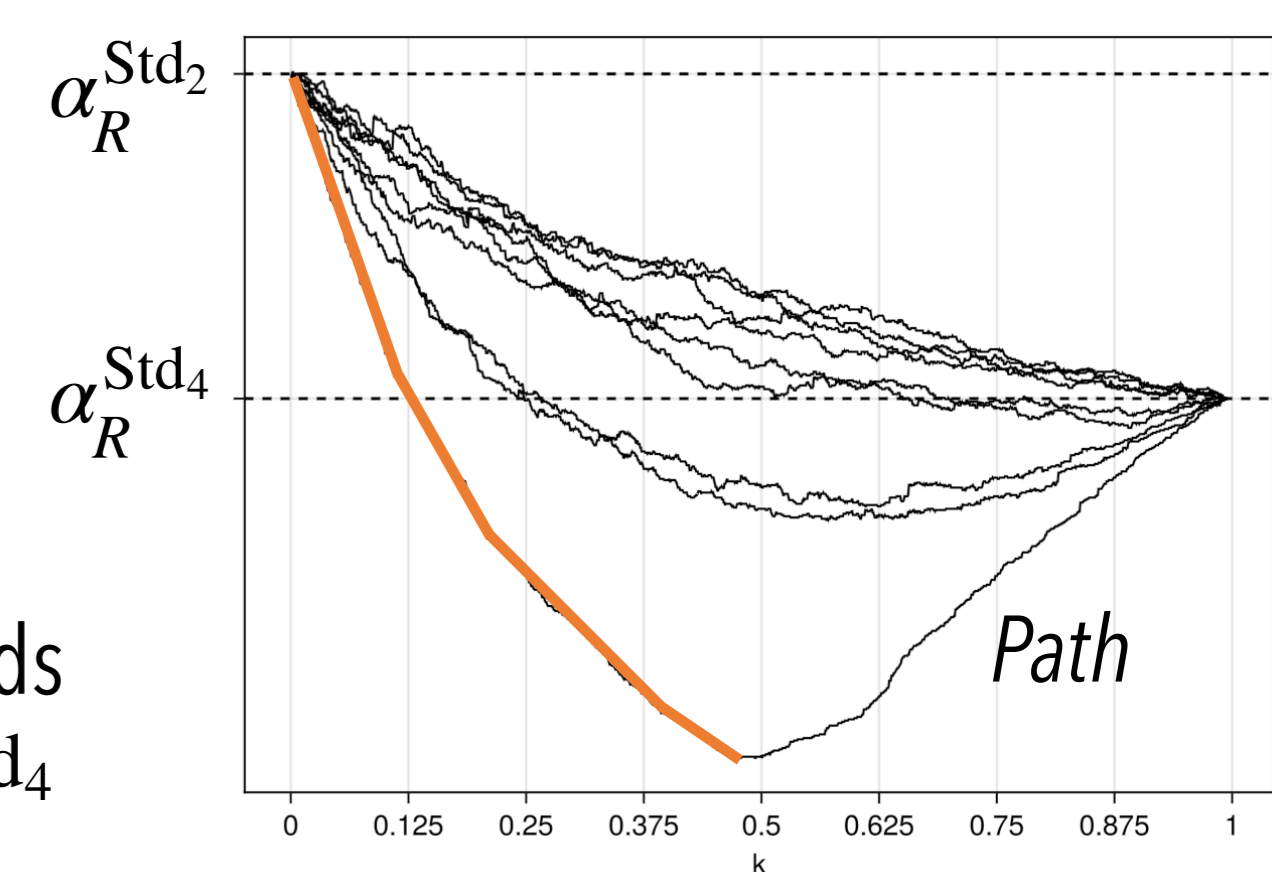
To avoid confusion of abstraction: we explain the optimisation procedure by focusing on the example of the transition from Std2_{sub} to Std4_{sub}. The transition of Std4_{sub} to Std5 follows analogously.

1 ORDER



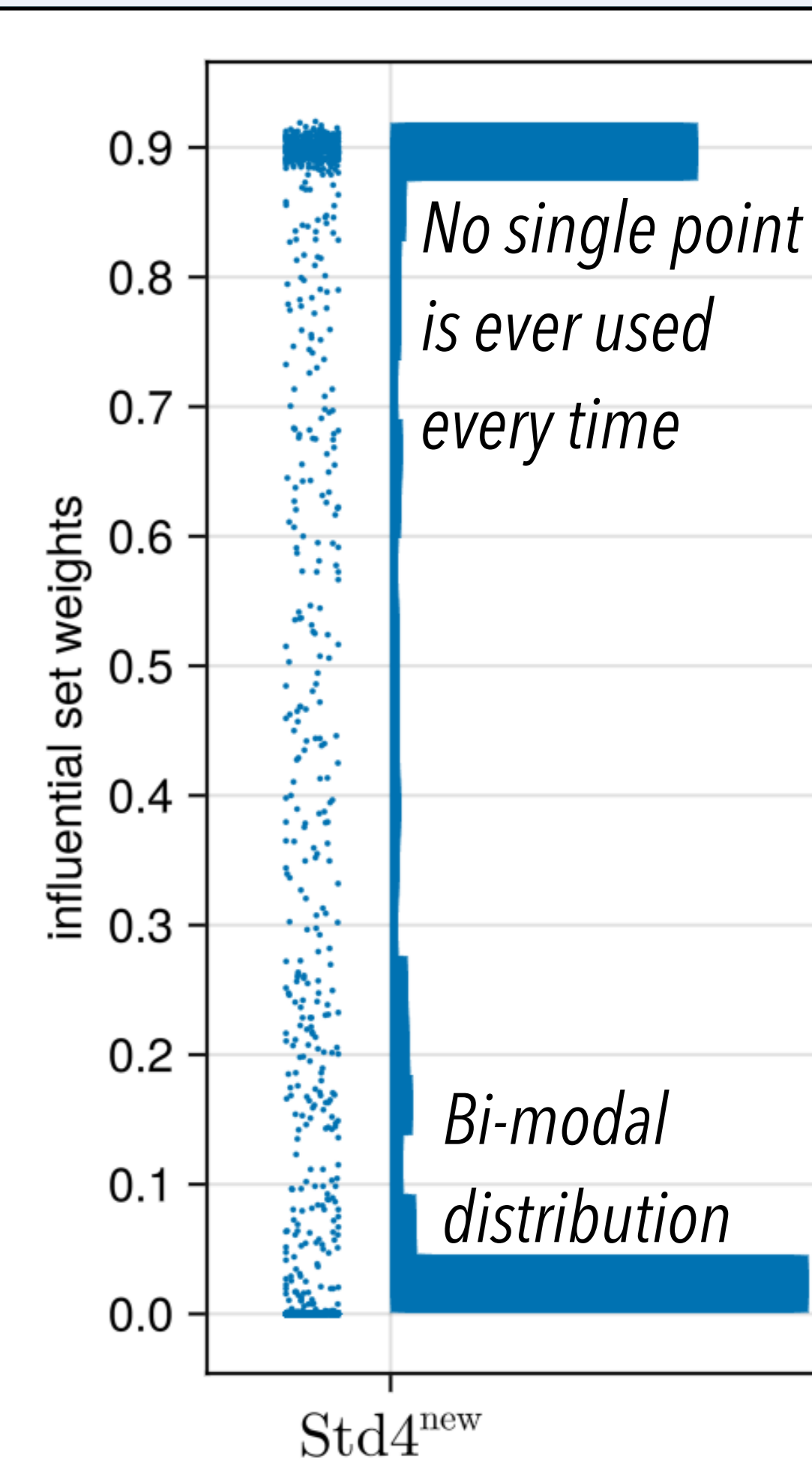
- Aim: determine the smallest subset of Std4_{new} that results in the largest reduction in α_R (influential set)

- Iteratively add points from Std4_{new} into Std2_{sub}
- Perform a regression in each instance, recording α_R
- Optimal ordering of points leads to an intermediate $\alpha_R < \alpha_R^{\text{Std4}}$

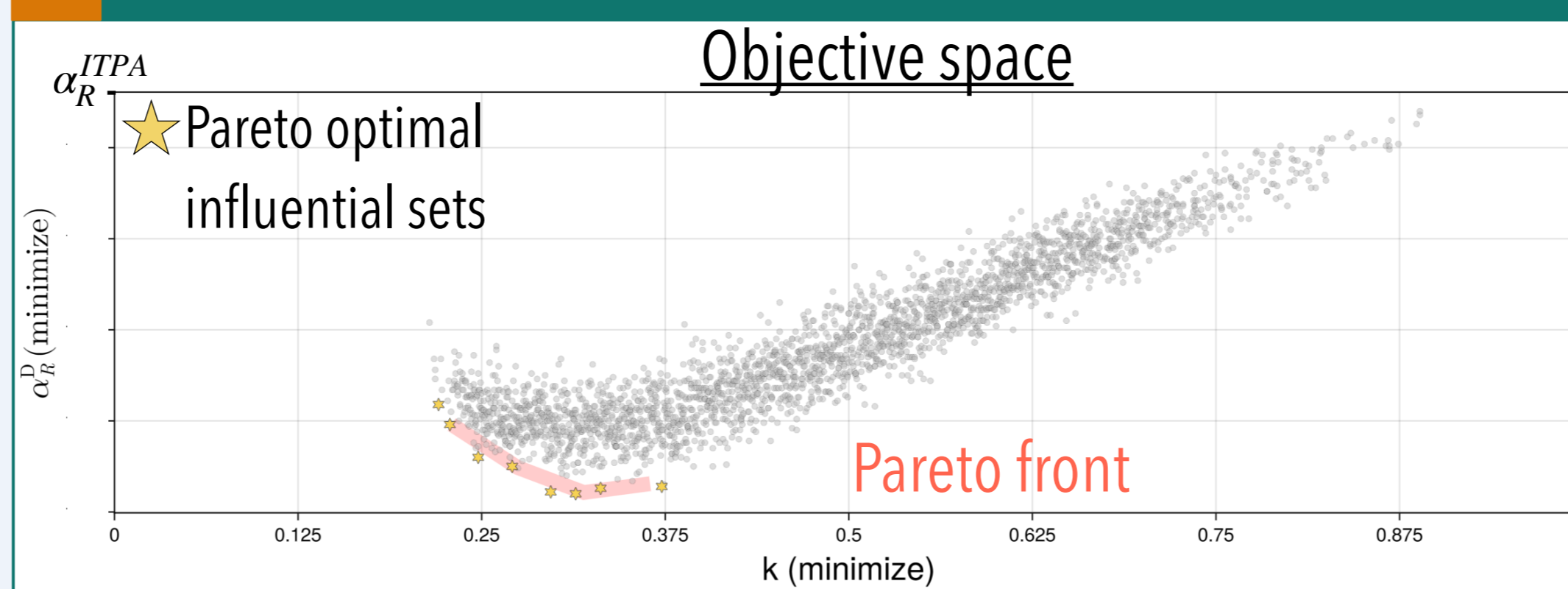


2 Quantify

- For each path generated
 - Assign 1 to each point leading to the minimum of the path (highlighted in orange)
 - Assign 0 otherwise
- Average over the number of paths generated
- Consider the mean value of each data-point a probability of inclusion in the influential set

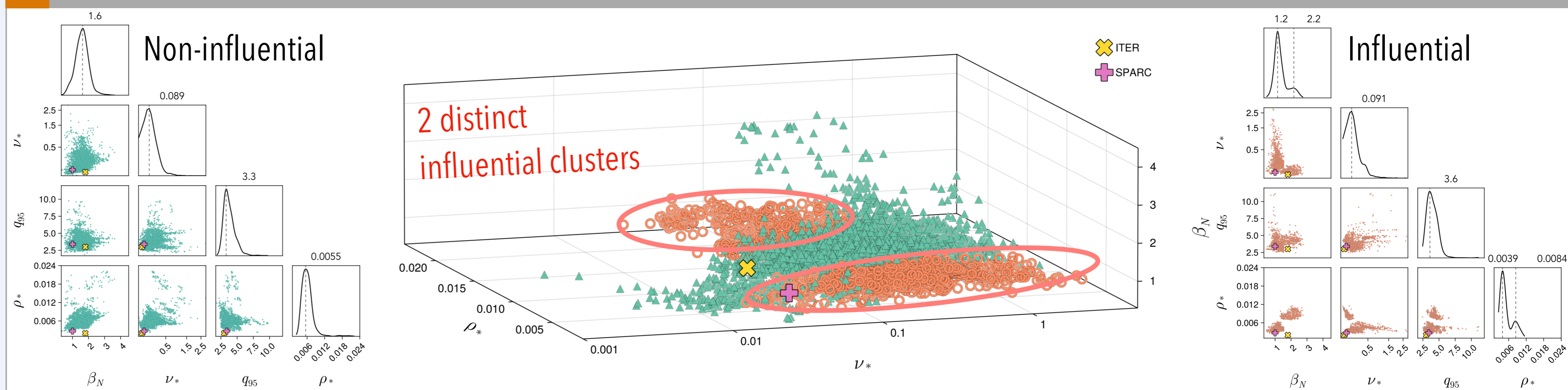


3 Optimise



- Extract subsets of size k through weighted sampling.
- Evaluate based on α_R^D and subset size, k.

4 Classify



5 Two distinct scaling laws

Non-Influential Scaling ($\alpha_R = 1.7$)

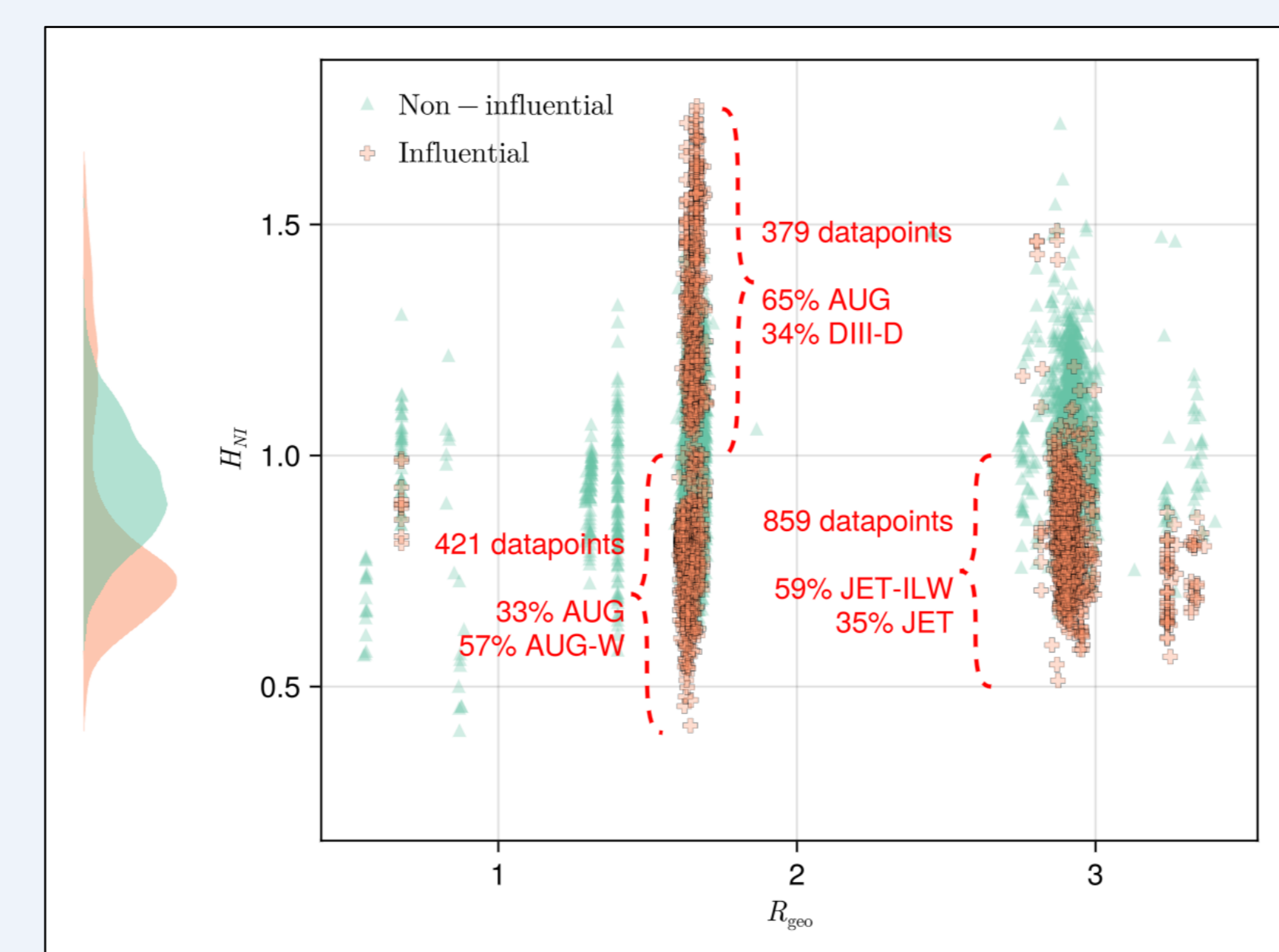
$$\tau_{E,th}^{\text{NI}} = 0.04 I_p^{1.1} B_t^{0.065} \bar{n}_e^{-0.35} P_{l,th}^{-0.71} R_{geo}^{1.7} \kappa^{0.77} M_{eff}^{0.14}$$

RMSE = 0.14 - Regained size scaling - Negligible field scaling ($\alpha_B = 0.065$) - Strong power degradation $\alpha_p = -0.71$

Influential Scaling ($\alpha_R = 0.56$)

$$\tau_{E,th}^{\text{I}} = 0.177 I_p^{1.5} B_t^{-0.25} \bar{n}_e^{-0.19} P_{l,th}^{-0.62} R_{geo}^{0.56} \kappa^{0.73} M_{eff}^{0.54}$$

RMSE = 0.15 - Weak size scaling - Negative density exponent ($\alpha_n = -0.19$) - Descriptive role only



6 Conclusions

- 1 Multicollinearity is present but cannot solely account for α_R reduction
- 2 Maximally influential set has been determined with an optimisation procedure
- 3 Influential set well localised in dimensionless ($\rho^* \cdot \nu^* \cdot \beta_N \cdot q_{95}$) space, forming two clusters
- 4 Virtually all observations excluded from the database to form the ITER-like subset used for deriving ITPA20-IL scaling are assigned to the non-influential subset
- 5 Non-influential scaling recovers IPB98-like size dependence $\alpha_R = 1.7$.

ITER & SPARC: 84% non-influential probability
→ NI scaling is the relevant prediction

Tokamak	$\tau_{E,th}^{\text{I}}(s)$	$\tau_{E,th}^{\text{NI}}(s)$	$\tau_{E,th}^{\text{reference}}(s)$
ITER	1.9	3.8	3.6
SPARC	0.46	0.88	0.77

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