

Big Data, Model Selection, Aggregation-Indexing, Oracles

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- ① Big Data and Big Models
 - Big Data-Micro; Big Data Macro/Time series!
 - Mostly variable selection: Multiple Indicators, **Latent Objects**.

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- Well-being; Happiness, Permanent Income, Expectations.
- What about Data Generation Process (DGP) as a “Latent Object”?

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③ Common Themes

- More Variables than Observations $p \gg n$
- RELATED: Shrinkage, Penalization, Averaging, Model Selection, model uncertainty, Misspecification

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- ① Outcome Y , Target T , Variable Set X of p vars
 - WRITE THE model. formulae here with definitions.
 - This is typically a linear “MODEL”!
 - Estimation and Big Data strategies: Shrinkage, LASSO, Other Penalization methods.

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- Asymptotic Inference, especially for $p > n$.
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- Ridge Regression; Stein; shrinkage estimation and forecasting in systems of equations; LASSO

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- ② “Bayesian” Interpretation; Extraneous Statistical “Information” (important);
 - Model selection and uncertainty.
 - What do we want to learn or do? (KEY question)
 - “Causal”? Policy analysis/decision making needs this.
 - Treatment effect and Program/policy evaluation

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 - Aggregate-“average” all Xs. Not “causal”
 - What is “average”? An “INDEX”
 - Classic Index Number Problem
 - Aggregation-Averaging of Models is related, but not the same

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- ② Models for Mechanism Learning
 - Many Moments Paradigm (GMM)
 - Empirical Likelihood-Information Theory
 - Hopeless!? All models are Misspecified
 - The Map allegory!

① Machine learning, Deep Learning, Ridge, Adaptive LASSO..... (Brief)

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Aggregation-Indexing

- Multiple Indicators of Well-Being
- Maasoumi (1986. Econometrica)
- TODAY: Model Averaging as Indexing, when all are misspecified
- Gospodinov-Maasoumi (2018)