

# Sequential Sampling and Equilibrium

Duarte Goncalves

Discussed by Silvio Ravaioli

February 26, 2020

# Sequential Sampling (and) Equilibrium - Recap

- ▶ **How do individuals form beliefs about opponents' distribution of gameplay?**
- ▶ Stopping problem in individual and strategic environment
- ▶ Stopping: forward-looking wrt current beliefs and sampling c.
- ▶ Sampling: from the true DGP / steady-state distribution
- ▶ New equilibrium concept: SSE
- ▶ Properties (existence, convergence to NE, effect of incentives in DS games) and predictions (in simple strategic environment)

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- ▶ Better data deserve better models!
  - ▶ Timed stochastic data - Models that include time
- ▶ Interpretation of why incentives (scale of payoffs) matter in games
  - ▶ Focus on refinement of beliefs
  - ▶ Connection with a vast literature on individual DM
- ▶ Connection with experimental results (joint elicitation of beliefs and actions)
  - ▶ Friedman and Ward (19), Esteban-Casanelles and Goncalves (20)
- ▶ Model's assumptions - forward-looking sampling
  - ▶ Comparison with myopic sampling (Alaoui and Penta 2019)

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- ▶ An initial motivating evidence/puzzle
  - ▶ What fact is poorly captured in the existing literature?
  - ▶ Create demand for your model (e.g. joint distribution of action and response time)
- ▶ A clearer positioning in the theory literature
  - ▶ E.g. Osborne and Rubinstein (2003) with endogenous sampling?
  - ▶ Sequential sampling model + SSE - what is new in the DM problem? (why you need to start from there?)
- ▶ More insights on the connection with experimental results
  - ▶ Goeree and Holt (2001) *contra* Nash equilibrium [slide 20/22]
  - ▶ This may become the initial puzzle
- ▶ A recap of the testable predictions

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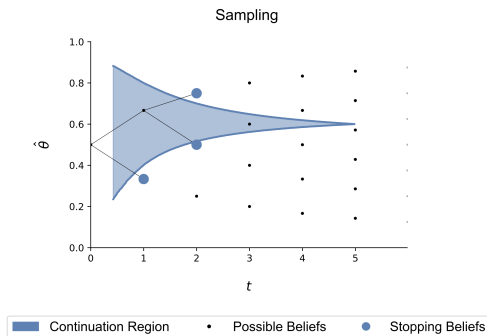
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# Testable predictions



Collapsing bounds under Beta prior - kindly from the author

- ▶ Assuming deterministic behavior (conditional on beliefs) we have strong predictions about observable action/timing
- ▶ How do these predictions differ from other (sampling) models?

# Further work

## ▶ **Introduce stochasticity**

- ▶ How does the introduction of stochasticity in beliefs and/or action affect the predictions?

## ▶ **Memory and Learning**

- ▶ How can we integrate the model in a learning setup?
- ▶ Additional constraints: limited storing capacity, leaky memory (forget the distant observations). Can we generate cycles?
- ▶ You could model interaction with feedback (sample from the true distribution), not suited for settings without feedback (sampling from own prior only)

## ▶ **Wishful sampling** (two possible directions)

- ▶ Integrate “motivated” sampling
- ▶ 1) Bias in the sampling probability (based on preferences)
- ▶ 2) Each sample has an additional cost/bonus based on the outcome (e.g. painful to sample “bad” distributions)

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