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Discussion of "Inattentive Valuation and Reference-Dependent Choice" by Mike Woodford

Jennifer La'O

June 16, 2012

The Shaw & Shaw Experiment

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The Experiment

- a letter $\{T, V\}$ is flashed on the screen in 2 locations $\{H, L\}$
- example:

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Formalization of Experiment

- states of the world $x_{ij} \in X$
- nature
 - draws location $i \in \{H, L\}$ from dist (π_H, π_L)
 - draws letter $j \in \{T, V\}$ from dist. (1/2, 1/2)

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Formalization of Experiment

- states of the world $x_{ij} \in X$
- nature
 - draws location $i \in \{H, L\}$ from dist (π_H, π_L)
 - draws letter $j \in \{T, V\}$ from dist. (1/2, 1/2)
- agents are asked to correctly identify the letter

$$\min \sum \mathbb{I}\left(k \neq j\right)$$

where $k \in \{T, V\}$ is agent's response

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Shaw & Shaw Results

- $(\pi_H, \pi_L) = (.5, .5)$
 - same fraction of errors made in both locations

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Shaw & Shaw Results

• $(\pi_H, \pi_L) = (.5, .5)$

• same fraction of errors made in both locations

•
$$(\pi_H, \pi_L) = (.9, .1)$$

- fraction of errors different across locations
- greater fraction of errors made in L location

Rational Inattention

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Rational Inattention: General Setup (Sims)

primitives

- $x \in X$ states of the world
- $\pi(x)$ prior
- agent's payoffs (preferences)

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Rational Inattention: General Setup (Sims)

primitives

- $x \in X$ states of the world
- $\pi(x)$ prior
- agent's payoffs (preferences)
- agent chooses information channel s.t. constraint
 - $s \in S$ signals (perceived states)
 - p(s|x) conditional probabilities

Rational Inattention: the Shaw & Shaw Experiment

- for simplicity, assume agents can perfectly observe location *i*
- agents observe some signal k ∈ {T, V} of letter j, but signal has error:

$$p(ij|ij) = 1 - e_i$$

 $p(ik|ij) = e_i$ for $k \neq j$

• agent optimally chooses probability of error $\mathbf{e} = \{e_H, e_L\}$

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Rational Inattention Problem

• objective

$$\min_{\mathbf{e}}\sum_{i}\pi_{i}\boldsymbol{e}_{i}+\boldsymbol{\theta}\boldsymbol{I}\left(\mathbf{e}\right)$$

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Rational Inattention Problem

objective

$$\min_{\mathbf{e}}\sum_{i}\pi_{i}e_{i}+\theta I\left(\mathbf{e}\right)$$

• mutual information

$$I(\mathbf{e}) \equiv H(x) - H(x|k)$$

is reduction in entropy (measure of uncertainty)

$$H(x) \equiv -\sum_{x \in X} p(x) \log p(x)$$

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Rational Inattention Problem

mutual info

$$I = \underbrace{-\left(\sum_{i} \pi_{i} \log \pi_{i} + \log \frac{1}{2}\right)}_{H(x)} - \underbrace{\sum_{i} \pi_{i} h\left(e_{i}\right)}_{H(x|k)}$$

• $h(e_i)$ is conditional entropy within location i

$$h\left(e_{i}
ight)=-\left(1-e_{i}
ight)\log\left(1-e_{i}
ight)-e_{i}\log e_{i}$$

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Rational Inattention Solution

objective

$$\min_{\mathbf{e}}\sum_{i}\pi_{i}\mathbf{e}_{i}+\theta\left(H\left(x\right)-\sum_{i}\pi_{i}h\left(\mathbf{e}_{i}\right)\right)$$

• FOC

$$\pi_i = \theta \pi_i h'(e_i)$$

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Rational Inattention Solution

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$$\min_{\mathbf{e}}\sum_{i}\pi_{i}\mathbf{e}_{i}+\theta\left(H\left(x\right)-\sum_{i}\pi_{i}h\left(\mathbf{e}_{i}\right)\right)$$

 $1=\theta h'\left(e_{i}\right)$

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Rational Inattention Solution

• FOC $1 = \theta h'(e_i)$ implies

$$e_i = \bar{e}, \quad \forall i$$

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Rational Inattention Solution

• FOC $1 = \theta h'(e_i)$ implies

$$e_i = \bar{e}, \quad \forall i$$

- solution incompatible with Shaw & Shaw results
- why? letter *j* is the only payoff relevant variable
 - cost/benefit same across locations
 - no need to add additional info of location

Woodford's Alternative Formulation

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Alternative Formulation

• rational inattention problem

$$\min_{\mathbf{e}}\sum_{i}\pi_{i}e_{i}+\theta I\left(\mathbf{e}\right)$$

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Alternative Formulation

rational inattention problem

$$\min_{\mathbf{e}}\sum_{i}\pi_{i}e_{i}+\theta I\left(\mathbf{e}\right)$$

$$\min_{\mathbf{e}} \sum \pi_{i} e_{i} + \theta C (\mathbf{e})$$
$$C (\mathbf{e}) \equiv \max_{\pi} I (\mathbf{e}; \pi)$$

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Woodford's Cost Function

• for given prior, $I(\mathbf{e})$ is *actual* reduction in entropy

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Woodford's Cost Function

- for given prior, $I(\mathbf{e})$ is *actual* reduction in entropy
- $C(\mathbf{e})$ is *potential* reduction in entropy over any possible prior

$$C(\mathbf{e}) \equiv \max_{\pi} I(\mathbf{e}; \pi)$$

• given channel e, choose prior to maximize reduction in entropy

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Alternative Formulation

rational inattention problem

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Alternative Formulation

rational inattention problem

$$\min_{\mathbf{e}}\sum_{i}\pi_{i}\boldsymbol{e}_{i}-\theta\sum_{i}\pi_{i}\boldsymbol{h}\left(\boldsymbol{e}_{i}\right)$$

$$\min_{\mathbf{e}} \sum \pi_i e_i + \theta C(\mathbf{e})$$
$$C(\mathbf{e}) \equiv \max_{\pi} I(\mathbf{e}; \pi)$$

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Alternative Formulation

rational inattention problem

$$\min_{\mathbf{e}}\sum_{i}\pi_{i}\mathbf{e}_{i}-\theta\sum_{i}\pi_{i}h\left(\mathbf{e}_{i}\right)$$

$$\min_{\mathbf{e}}\sum_{i}\pi_{i}e_{i}+\theta\log\left(\sum_{i}\exp\left(-h\left(e\right)\right)\right)$$

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Results of Woodford's formulation

• FOC

$$\pi_{i} = \tilde{\theta} \exp\left(-h\left(e_{i}\right)\right) h'\left(e_{i}\right)$$

RHS decreasing in e_i

• thus, e_i^* inversely related to π_i

$$e_i^* = g\left(\pi_i\right) \qquad g' < 0$$

- compatible with Shaw & Shaw results!
 - in fact, Woodford calibrates θ and predictions fit quite well

Comments

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Interpreting Woodford's Cost Function

Woodford's new cost function

$$C(\mathbf{e}) \equiv \max_{\pi} I(\mathbf{e}; \pi)$$

represents greatest potential entropy reduction from channel e

why max? could have prior μ over priors

$$C\left(\mathbf{e}
ight)=\int I\left(\mathbf{e};\mathbf{\pi}
ight)\mu\left(\mathbf{\pi}
ight)d\mathbf{\pi}$$

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Interpreting Woodford's Cost Function

- need: cost/benefit to differ in π_i
 - isomorphic to rational inattention problem with θ_i
 - could have chosen arbitrary cost function C

Interpreting Woodford's Cost Function

- need: cost/benefit to differ in π_i
 - isomorphic to rational inattention problem with θ_i
 - could have chosen arbitrary cost function C
- however, Woodford's formulation more elegant
 - retains properties of Shannon measure of info
 - more restrictive than just choosing θ_i or C_i
 - explains experimental anomomalies (stochastic choice, focusing effects, choice-set effects, reference dependence, etc.)

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Interpreting Woodford's Cost Function

$$C\left(\mathbf{e}\right)\equiv\max_{\mathbf{\pi}}I\left(\mathbf{e};\mathbf{\pi}
ight)$$

- possible interpretation: sequential game
 - first stage. agent chooses channel e
 - second stage. evil nature chooses prior π to max $I(\mathbf{e}; \pi)$
- possible interpretation: robust control

$$\min_{\mathbf{e}} \sum \pi_i e_i + \theta \left\{ \max_{\pi} I(\mathbf{e}; \pi) \right\}$$

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Exogenous Coding/Channel matters

- rational inattention \rightarrow only payoff relevant variables matter
 - underlying shocks out in the world
 - we choose our perception of them
 - depends only on: curvature of payoffs, volatility of shocks
- but exogenous information channels matter
 - newspapers, own sales, competitors' prices, word-of-mouth