Lecture 4: Cognitive Imprecision and Strategic Interaction

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A Short Course on Cognitive Imprecision Northwestern University November 19, 2025

- We have discussed in detail the idea that decisions are made in a
 way that is only imprecisely matched to the situation that
 someone is in (and the incentives provided by that situation)
 - and that **random noise** in cognitive processing gives choices a **stochastic** element, even conditional on a complete description of the situation and the DM's goals
- But we have so far mainly discussed individual decision problems — in which there may be uncertainty about the consequences that will follow from an action choice, but due to objective randomness in the external situation (and the probabilities may be explicitly stated by an experimenter)

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- Today: discuss the consequences of cognitive imprecision when payoffs from action also depend on others' action choices
- Introduces a new reason for decisions to be complex: generally won't be trivial to decide how others will choose, even when you know their objective situation
 - and can't quantify this uncertainty using probabilities stated
 by an experimenter
- Also introduces a further reason (beyond those discussed in Lecture 1) for it to matter whether cognitive noise is "early noise" or "late noise"

Does the Nature of Cognitive Noise Matter?

- In (even very simple) **strategic** settings, there is an important difference between the two types of cognitive noise:
 - only comparison noise ⇒ no problem recognizing the decision situation ⇒ should be **common knowledge** what the game is [if no "private information"]
 - noisy representation of situation ⇒ breaks common knowledge, **complicating coordination** of behavior, even when taken for granted that decision rules are **optimal**

A Simple (Linear-Quadratic-Gaussian) Example

- Consider a game with a continuum of players, who each simultaneously choose an action p (arbitrary real number, perhaps log of price set for individual differentiated good)
 - each player's payoff depends on own action p, average action \bar{p} chosen by all players, and an exogenous "fundamental" s

A Simple (Linear-Quadratic-Gaussian) Example

Suppose that each player's payoff is equal to

$$u(p,\bar{p}) = -\frac{1}{2}(p-s)^2 - \frac{\gamma}{2}(p-\bar{p})^2,$$

where parameter $\gamma > 0$ measures the degree of **strategic** complementarity

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 Unique Nash equilibrium (with common knowledge of the fundamental s):

$$p = s$$
 for all players

regardless of the size of γ

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 - even in games like this, where Nash equilbrium would not require **mixed strategies**
- The most common approach to modeling such behavior has been "quantal response equilibrium" (McKelvey and Palfrey, 1995)
 - instead of assuming that each player chooses a probability distribution over actions that is **optimal** (in the sense of maximizing expected payoff) given the prob. dist. over actions chosen by the **other** players [the requirement for **Nash** equilibrium], each player chooses each possible action with a probability that is an **increasing function** of the expected payoff from that action, given the prob. dist. over actions chosen by the other players

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- Has been successfully used to explain systematic discrepancies between observed play and NE predictions, in a variety of types of experimental games (Goeree et al., 2016)

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- Has been successfully used to explain systematic discrepancies between observed play and NE predictions, in a variety of types of experimental games (Goeree et al., 2016)
- But allowance only for comparison noise is not an innocuous assumption

- A common quantitative implementation of QRE: assume a multinomial logit model of choice by each player
 - **probability** of playing any action a in equilibrium is proportional to $e^{\lambda u(a)}$, where $\lambda > 0$ measures the (finite) precision of choice, and u(a) is evaluated using the equilibrium probabilities of play by the other players

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 - **probability** of playing any action a in equilibrium is proportional to $e^{\lambda u(a)}$, where $\lambda > 0$ measures the (finite) precision of choice, and u(a) is evaluated using the equilibrium probabilities of play by the other players
- In our example, this implies that each player's action *p* will be a random variable with distribution

$$p \sim \exp(\lambda[-\frac{1}{2}(p-s)^2 - \frac{\gamma}{2}(p-\bar{p})^2])$$

• Or equivalently:

$$p \sim N(\frac{s + \gamma \bar{p}}{1 + \gamma}, \frac{1}{\lambda(1 + \gamma)})$$

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Unique QRE distribution of actions:

$$p \sim N(s, \frac{1}{\lambda(1+\gamma)})$$

— strategic complementarity (γ) affects the **dispersion** of individual actions, but not the **aggregate** response to changes in s

 Suppose instead that each player must base their action on an individual-specific noisy internal representation of the publicly-observable state s

$$r = s + \epsilon, \qquad \epsilon \sim N(0, \nu^2)$$

and that s is drawn from a **prior** [to which we will assume individuals' decision rules have adapted]

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• If in equilibrium, aggregate response is given by a function $\bar{p}(s)$, these specifications define a **joint distribution** for (s, r, \bar{p}) , and the **optimal decision rule** for an individual in this environment will satisfy

$$p(r) = \frac{1}{1+\gamma} \mathbb{E}[s|r] + \frac{\gamma}{1+\gamma} \mathbb{E}[\bar{p}(s)|r] \forall r$$

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$$p(r) = \frac{1}{1+\gamma} E[s|r] + \frac{\gamma}{1+\gamma} E[\bar{p}(s)|r] \quad \forall r$$

• Consistency then requires that $\bar{p}(s) = \mathrm{E}[p(r)\,|s] \,\,\, \forall s$

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- If we conjecture a solution of the form $\bar{p}(s)=p_0+\xi s$, the optimal decision rule must be

$$p(r) = \frac{1+\gamma\xi}{1+\gamma}[\mu+\beta(r-\mu)] + \frac{\gamma}{1+\gamma}p_0$$

where

$$\beta \equiv \frac{\sigma^2}{\sigma^2 + \nu^2} < 1$$
, so that

$$\bar{p}(s) = \frac{1+\gamma\xi}{1+\gamma}[\mu+\beta(s-\mu)] + \frac{\gamma}{1+\gamma}p_0$$

• Equating coefficients, we obtain a unique solution for p_0 and ξ , implying that

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- Thus an optimal adaptation to "early noise" implies **reduced sensitivity** of the aggregate action \bar{p} to variation in s, relative to the NE prediction [another example of "behavioral attenuation"]
 - moreover, the attenuation is **greater** (ξ is smaller) the greater the degree of **strategic complementarity** (i.e., the larger is γ)

• A possible interpretation of the game: s represents exogenous variation in (the log of) **aggregate nominal spending**, p is (the log of) each producer's **price**, and $u(p, \bar{p})$ indicates how the producer's profits depend on its own price and the prices of other differentiated goods

- A possible interpretation of the game: s represents exogenous variation in (the log of) aggregate nominal spending, p is (the log of) each producer's price, and $u(p,\bar{p})$ indicates how the producer's profits depend on its own price and the prices of other differentiated goods
- In the NE, prices p all perfectly track variation in s ⇒ no real effects of monetary disturbances that cause nominal spending to vary
 - and introducing noise via QRE **doesn't change this** (prices are dispersed, but each increases by exactly the amount of any increase in s)

- "Early noise" instead allows monetary shocks to have real effects (especially if strong SC)
 - get "hump-shaped" response to a permanent increase in nominal spending, in a dynamic extension of the model (Woodford, 2003; Melosi, 2014)

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- Unlike the imperfect-info model of Lucas (1972), this model doesn't require that the monetary shock not be publicly observable, a particular problem for explaining persistent real effects using the Lucas model

Coordination in the Lab

• Game studied experimentally by Frydman and Nunnari (2025):

	leave	stay
leave	(θ, θ)	$(\theta, 47)$
stay	$(47,\theta)$	(63, 63)

- each of two players must **simultaneously** make a binary decision
- payoffs for each depend on their joint decision
- ullet parameter heta is different on different trials

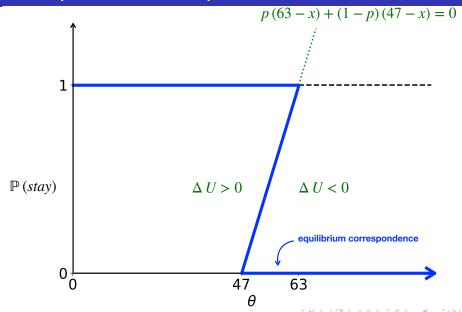
Nash Equilibrium

- We look for an equilibrium in **decision rules**, specifying each player's action (or probability distribution over actions) as a function of the state θ on that trial
 - each player's decision rule is a **function** $p(\theta)$ indicating prob(stay $|\theta)$

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 - each player's decision rule is a **function** $p(\theta)$ indicating prob($stay \mid \theta$)
- First step: consider the **correspondence** consisting of all pairs (θ, p) with the property that when the state is θ , $\operatorname{prob}(stay) = p$ is a **best response** to $\operatorname{prob}(stay) = p$ on the part of the other player

The Equilibrium Correspondence



Equilibrium Decision Rules

• In a **symmetric** equilibrium $[p(\theta)]$ the same for both players, $p(\theta)$ must be a **selection** from the equilibrium correspondence, with single value for each θ

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Equilibrium Decision Rules

- In a symmetric equilibrium $[p(\theta)]$ the same for both players, $p(\theta)$ must be a selection from the equilibrium correspondence, with single value for each θ
 - not possible unless $p(\theta)$ contains at least one **discontinuous** jump
- Thus theory predicts that behavior should change discontinuously with changes in the state
 - moreover, the location of the jump (or jumps) is **indeterminate**
- Equilibrium in threshold strategies (p=1 for all $\theta \leq \theta^*$, p=0 for all $\theta > \theta^*$): this is a symmetric eq'm for any $\theta^* \in [47,63]$

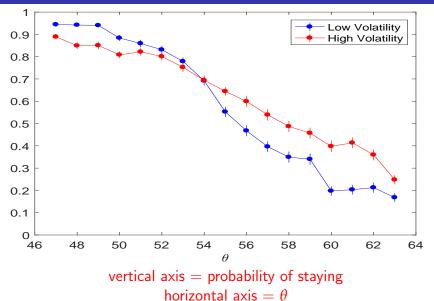
Experimental Evidence

- Experiments (e.g., Heinemann et al., 2004, 2009; Frydman and Nunnari, 2025):
 - $p(\theta)$ not always either **zero** or **one** instead, wide range of values of θ for which behavior appears to be **probabilistic**

Experimental Evidence

- Experiments (e.g., Heinemann et al., 2004, 2009; Frydman and Nunnari, 2025):
 - $p(\theta)$ not always either **zero** or **one** instead, wide range of values of θ for which behavior appears to be **probabilistic**
 - no obvious **jumps** in action probability as state varies instead, prob. of staying gradually declines for larger θ
 - intermediate probabilities are lower for larger θ , rather than increasing in θ as would be required for a selection from the EC

Frydman and Nunnari (2025)



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A Model of Financial Crises?

- It is sometimes thought to be a virtue of this kind of model that
 it implies that equilibrium should be indeterminate so that
 it is consistent with eq'm behavior for collective behavior to shift
 abruptly, without any change in economic "fundamentals"
 having had to occur
 - offered as an explanation for the **sudden onset** of financial crises [e.g., "second-generation" models of speculative attack on a currency peg (Obstfeld, 1996)]

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 - offered as an explanation for the **sudden onset** of financial crises [e.g., "second-generation" models of speculative attack on a currency peg (Obstfeld, 1996)]
- But the model doesn't explain fact that deteriorating fundamentals **do** seem important for predicting when crises occur (Gorton, 1988, 2012), as opposed to the two NE being equally possible **anywhere** in a wide range of values for θ

Another Problem with the NE Prediction

- In above analysis, the eq'm correspondence is the same regardless of the **distribution** from which θ is drawn on different occasions
 - hence no reason for the **equilibrium strategy** $p(\theta)$ to differ across environments associated with different ranges of variation in θ

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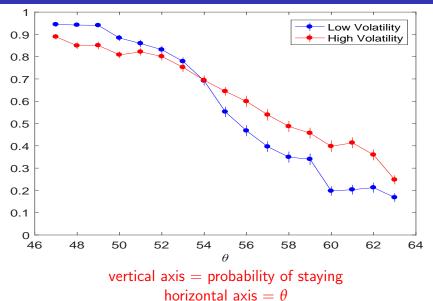
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- But in Frydman and Nunnari (2025) experiment: two different treatments ["high volatility" and "low volatility"] that differ only in the variance of the distribution from which θ is drawn (independently on each trial)
 - mean of θ is same in both cases: 55, the midpoint of the "indeterminacy range" on the NE correspondence

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 - observed $p(\theta)$ differs across the two treatments

Frydman and Nunnari (2025)



Allowing for Cognitive Imprecision

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Allowing for Cognitive Imprecision

- What difference does cognitive noise make? Consider first QRE
- If we define the expected payoff differential from staying vs. leaving, as a function of the other player's prob. p of staying,

$$\Delta(p) \equiv u^{\text{stay}}(p) - u^{\text{leave}} = (47 - \theta) + 16p$$
,

then for the game defined by any value of θ , a symmetric **Nash** equilibrium is a probability of staying p^* (for both players) with the property that

$$(\Delta(p^*), p^*) \in \mathcal{C}^{Nash}$$

where \mathcal{C}^{Nash} is the correspondence of values (Δ, p) such that p is an optimal choice in the case of expected payoff differential Δ [graphed as black segments on slide 28]

• Introducing **comparison noise** simply changes the correspondence C^{Nash} to C^{QRE} , the graph of the function

$$p^* = \Phi(\Delta(p^*))$$

indicating the probability of staying as an increasing function of expected payoff differential

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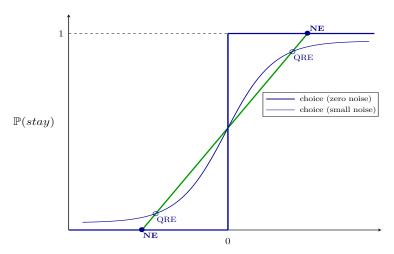
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• Thus a symmetric QRE corresponds to a point of intersection of the sigmoid curve $p^* = \Phi(\Delta)$ and the green line $\Delta = \Delta(p^*)$ in the figure on the next slide

QRE Compared to NE (for given θ)



net expected reward from stay

green line: graph of $\Delta(p)$

- In the case of small enough noise [e.g., large enough ϕ in the parametric model of comparison noise proposed here], the graph of \mathcal{C}^{QRE} will be close to \mathcal{C}^{Nash} , and hence will intersect the green line at points close to each of the intersections between the green line and \mathcal{C}^{Nash}
- Hence in the case of small enough noise, there will again be a multiplicity of equilibria

• If we consider now the **equilibrium correspondence** graphing all QRE in the $p-\theta$ plane: in the case of small enough noise, shape will be a **backward S shape** — not too different from the Z-shaped correspondence on slide 18

- If we consider now the **equilibrium correspondence** graphing all QRE in the $p-\theta$ plane: in the case of small enough noise, shape will be a **backward S shape** not too different from the Z-shaped correspondence on slide 18
- Again any selection $p(\theta)$ from the EC must involve at least one discontinuous jump
 - not possible for $p(\theta)$ to gradually decline with increases in θ , as observed in experiments
 - and a broad range over which changes in "fundamentals" don't have any necessary implication for probability of a jump from high to low p

- In addition, the set of QRE associated with each value of θ are independent of the distribution from which θ may be drawn on different occasions
 - hence no reason for the function $p(\theta)$ to differ across the two different treatments of Frydman and Nunnari (2025)

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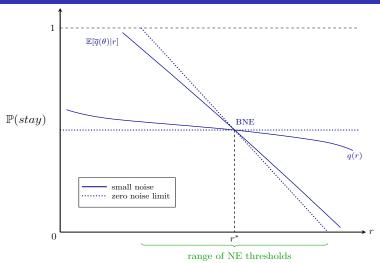
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• Equilibrium: each player leaves if and only if $r > r^*$ (for them), where each player's threshold r^* is the point at which expected payoff from leaving is exactly equal to expected payoff from staying [given other player's decision rule, and optimal Bayesian decoding of the noisy representation r]

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Determination of Equilibrium r^*



 $ar{q}(heta)=$ required prob. other stays, to make it optimal to stay (if state heta) $q(r)=\mathrm{P}[r_{-i}< r\,|r_i=r]$

Determination of Equilibrium r^*

- In the limit as cognitive noise of this kind becomes negligible:
 - q(r) approaches constant value 1/2 for all r [horizontal dashed line in figure: other's internal state equally likely to be above or below one's own]
 - $E[\bar{q}(\theta) | r_i = r]$ approaches $\bar{q}(\theta(r))$ [downward sloping straight line, as shown, if $m(\theta)$ is linear]

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 - $E[\bar{q}(\theta) | r_i = r]$ approaches $\bar{q}(\theta(r))$ [downward sloping straight line, as shown, if $m(\theta)$ is linear]
- Hence in the case of small enough cognitive noise of this kind, the intersection must be unique, as shown
 - set of solutions for r^* as $v \to 0$ [single point labeled BNE] not the same as the set of solutions for r^* in the zero-noise model [entire interval marked by the curly bracket]

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- Result: if cognitive noise is small enough (though non-zero),
 there will be unique equilibrium strategies
 - unique threshold r^* such that r^* is optimal choice for a player, given that other uses threshold r^*
- Moreover, the unique equilibrium prediction is that the probability that players stay should be a **decreasing function of** θ [even for values of θ in the range where there are multiple NE]
- This prediction of sensitivity to fundamentals is more consistent with behavior observed in laboratory experiments, and arguably with what is observed in real-world financial crises

 This uniqueness result [in the limiting case of negligible, but non-zero, noise variance] has been stressed in the literature on "global games" (Morris and Shin, 1998, 2003)

- This literature generally supposes that, instead of players observing the state θ , they each only have (independent) "private signals" about its value
 - result is that even when each agent's private signal is extremely (but not perfectly) precise, one gets uniqueness; taken to imply fragility of the full-information analysis

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 - result is that even when each agent's private signal is extremely (but not perfectly) precise, one gets uniqueness; taken to imply fragility of the full-information analysis
- But literature has stressed that result relies on assumption that there are not also "public signals" and that there should continue to be multiple equilibria as long as public signals (while also imperfect) are sufficiently informative relative to the informativeness of the private signals (e.g., Angeletos and Werning, 2006; Hellwig et al., 2006)

- This discussion assumes that people perfectly observe whatever is visible to them — and that they can be sure that others also perfectly observe whatever they know that those others can see, and so on
 - imperfect observability of θ must reflect a fact about the structure of the external world

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 - imperfect observability of θ must reflect a fact about the structure of the external world
- If instead the imprecise internal representation r represents a **cognitive constraint**, the mere existence of a variable (e.g., a market price) that everyone can observe does not create a "public signal" in the sense assumed in this literature
 - there will not be **common knowledge** that everyone else must observe the "public signal" in exactly the same way that you do

Explaining Context-Dependence

 In symmetric eq'm, the players' probability of staying should be given by:

$$\operatorname{Prob}(\operatorname{stay}|\theta) = \operatorname{Prob}(r_i < r^*|\theta) = \Phi\left(\frac{r^* - m(\theta)}{\nu}\right),$$

where now $\Phi(z)$ is the CDF of the standard normal distribution.

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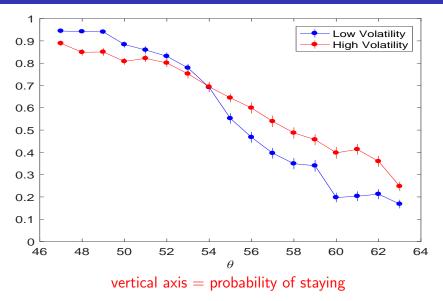
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- This should be a decreasing function of θ (as in F&N data).
- And if when the range of values of θ in the support of the prior is **wider**, the encoding function $m(\theta)$ must be **flatter** [range normalization], then the function $\text{Prob}(\text{stay} \mid \theta)$ should also be a **flatter** function of θ (also as in F&N data).

Frydman and Nunnari (2025)



• Can the kind of **context-dependence** of the degree of sensitivity of players' behavior to variations in θ that F&N document be explained by a Sims-style model of rational inattention?

- Can the kind of context-dependence of the degree of sensitivity of players' behavior to variations in θ that F&N document be explained by a Sims-style model of rational inattention?
- No Yang (2015) analyzes eq'm in this kind of game with RI players, and shows that for any small enough information cost parameter,
 - equilibrium is **indeterminate**: even if one restricts attention to symmetric equilibria in which $p(\theta)$ is monotonically decreasing, there is a continuum of such equilibria
 - and any equilibrium necessarily involves a discontinuous jump
 — the location of which can be any value of θ over a wide interval

- Why the difference? RI doesn't imply the kind of noisy internal representation assumed by F&N (or the global games literature)
 - according to RI, efficient representation conveys no more information than **which action is optimal** given the current value of θ [and opponent's decision rule]
 - internal representation is a binary state, and conditional probability of the "stay" state jumps discontinuously at some critical value θ^*

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 - internal representation is a binary state, and conditional probability of the "stay" state jumps discontinuously at some critical value θ^*
 - equilibrium concept allows the two players to coordinate on the location of this jump (as in the full-info NE analysis)

• Not obviously realistic to assume that it is **possible** for conditional probabilities of internal representations to vary **discontinuously** with the external state θ , as the RI analysis allows (and requires, for an eq'm solution)

- Not obviously realistic to assume that it is **possible** for conditional probabilities of internal representations to vary **discontinuously** with the external state θ , as the RI analysis allows (and requires, for an eq'm solution)
- Instead, F&N assume that internal representation is optimized only within a more restrictive class of possibilities motivated by efficient coding models from computational neuroscience [for related proposals, see also Hébert and Woodford, 2021; Morris and Yang, 2022; Aridor et al., 2025]
 - this arguably leads to more realistic conclusions in this economic application

Summary

- The hypothesis that decisions are based on noisy internal representations of the presented data can explain phenomena that a mere assumption of comparison noise (or more generally, response noise) cannot
 - especially when the hypothesis of noisy coding is combined with the further assumptions of efficient coding and Bayesian decoding [often used in the literature on perceptual errors]

Summary

- The hypothesis that decisions are based on noisy internal representations of the presented data can explain phenomena that a mere assumption of comparison noise (or more generally, response noise) cannot
 - especially when the hypothesis of noisy coding is combined with the further assumptions of efficient coding and Bayesian decoding [often used in the literature on perceptual errors]
- This doesn't mean that there may not also be comparison noise
 - only that a hypothesis of comparison noise **by itself** doesn't adequately capture the role of cognitive noise in decision making

Summary

- The hypothesis that decisions are based on noisy internal representations of the presented data can explain phenomena that a mere assumption of comparison noise (or more generally, response noise) cannot
 - especially when the hypothesis of noisy coding is combined with the further assumptions of efficient coding and Bayesian decoding [often used in the literature on perceptual errors]
- This doesn't mean that there may not also be comparison noise
 - only that a hypothesis of comparison noise **by itself** doesn't adequately capture the role of cognitive noise in decision making
- Another illustration of how study of cognitive noise in perceptual domains can help to improve economic modeling

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