# Fatal Attraction: Salience, Naïveté, and Sophistication in Experimental "Hide-and-Seek" Games

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"Hide-and-seek" games are zero-sum two-person games in which one player wins by matching the other's decision and the other wins by mismatching. Although such games are often played on cultural or geographic "landscapes" that frame decisions nonneutrally, equilibrium ignores such framing. This paper reconsiders the results of experiments by Rubinstein, Tversky, and others whose designs model nonneutral landscapes, in which subjects deviate systematically from equilibrium in response to them. Comparing alternative explanations theoretically and econometrically suggests that the deviations are well explained by a structural nonequilibrium model of initial responses based on "level-k" thinking, suitably adapted to nonneutral landscapes. (JEL C72, C92)

Any government wanting to kill an opponent... would not try it at a meeting with government officials.

—Comment on the poisoning of Ukrainian presidential candidate (now president) Viktor Yushchenko, quoted in C. J. Chivers (2004)

... in Lake Wobegon, the correct answer is usually "c."

—Garrison Keillor (1997) on multiplechoice tests, quoted in Yigal Attali and Maya Bar-Hillel (2003)

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Game theorists have been intrigued by hideand-seek games—zero-sum two-person games in which one player wins by matching the other's decision and the other wins by mismatching—for more than 50 years (John von Neumann 1953). These games cleanly model a strategic problem that is central to many economic, political, and social settings, as well as the obvious military and security applications. Examples include entry games where entry requires a differentiated product, and blocking it requires matching the entrant's design; election campaigns in which a challenger can win only by campaigning in different areas from those of the incumbent; and fashion games in which hoi polloi wish to mimic the elite but the elite prefer to distinguish themselves.

Although zero-sum two-person games are one of game theory's success stories, equilibrium analysis of hide-and-seek games is not very helpful as a guide to prediction or decision making. There seem to be two main reasons for this, both illustrated by our epigraphs: hide-and-seek games are often played without clear precedents, so equilibrium depends on strategic thinking rather than learning; but such thinking may not follow the fixed-point logic of equilibrium. A game theorist would reply to our first epigraph, "But if investigators thought that way, a meeting with government officials is precisely where a government would try to kill an opponent." Further, hide-and-seek games are usually played on naturally occurring cultural

or geographic "landscapes" that are nonneutral across locations in framing and/or payoffs. Equilibrium ignores such landscapes except as they affect payoffs, but nonequilibrium thinking may respond to them.

Both reasons are also well illustrated by the experimental results of Rubinstein and Tversky (1993; "RT") and Rubinstein, Tversky, and Dana Heller (1996; "RTH"); see also Rubinstein (1999; "R"). RT, RTH, and R (collectively "RTH") elicited subjects' initial responses to hide-and-seek games. RTH explained the games as "stories," probably increasing subjects' comprehension. In a leading example, R told seekers: "You and another student are playing the following game: Your opponent has hidden a prize in one of four boxes arranged in a row. The boxes are marked as follows: A, B, A, A. Your goal is, of course, to find the prize. His goal is that you will not find it. You are allowed to open only one box. Which box are you going to open?" Hiders were told an analogous story. Thus, the entire structure, including the order and labeling of locations, was publicly announced.1

This story makes the framing of locations nonneutral in two ways. The "B" location is distinguished by its label, and so is salient in one of Thomas Schelling's (1960) senses. And the two "end A" locations, though not distinguished by their labels, may be inherently salient, as RT and RTH argue, citing Nicholas Christenfeld (1995). As RT note, these two saliencies interact to give the remaining location, "central A," its own brand of uniqueness as "the least salient location." This aspect of their designs is important as a tractable abstract model of a naturally occurring landscape.

Figure 1 translates RTH's story into a payoff matrix. Because the seeker chooses without observing the hider's choice, their choices are strategically simultaneous. If the seeker chooses the same location as the hider, he wins a payoff normalized here to one; if not, the hider wins that payoff. This game has a unique equilibrium

<sup>1</sup> RT's and RTH's subjects' payments appeared sufficient to motivate them, and the binary-lottery structure of the payoff function implies under standard assumptions that players maximize expected money payoffs, without regard to risk preferences. Note, however, that in R's experiments, subjects were not paid or screened for exposure to game theory

in mixed strategies, in which both players randomize uniformly across locations, independent of their framing. Because the seeker can choose only one of the four locations, he is at a disadvantage in equilibrium, finding the prize only 25 percent of the time. Despite this clear equilibrium prediction, RTH's publicly announced order and labeling of locations create a potential for framing effects, and their subjects deviated systematically from equilibrium in ways that were highly sensitive to framing.<sup>2</sup> Table 1 gives the aggregate choice frequencies for the "RTH-4" treatment described above and RTH's most closely related other treatments. (Table A1 in the Web Appendix, available at http://www.e-aer.org/data/ dec07/20050133\_app.pdf, gives frequencies from less closely related treatments.) In RTH-4, central A was the strongly modal choice for both hiders and seekers, and was even more prevalent for seekers than hiders. As a result, assuming independence, seekers could expect to find the prize 32 percent of the time, substantially more than the 25 percent equilibrium predicts. These qualitative patterns extend, properly interpreted, to the other five treatments in Table 1, which we shall argue are closely analogous to RTH-4. They also extend with minor exceptions to a very large sample from more recent Internet experiments (Rubinstein, private communication).

Like the beliefs that underlie our epigraphs, these patterns are an intriguing puzzle: If hiders and seekers are equally intelligent, on average, why don't hiders tempted to hide in central A realize that seekers will also be tempted to look there? Why do hiders allow seekers to find

<sup>&</sup>lt;sup>2</sup> The p-values from chi-square tests for significant differences from equilibrium in hiders' and seekers' choice frequencies in RTH's six treatments are shown in Table 1. Although in this game any strategy, pure or mixed, is a best response to equilibrium beliefs, systematic deviations of aggregate choice frequencies from equilibrium probabilities must (with high probability) have a cause that is partly common across players, and are therefore indicative of systematic deviations from equilibrium. Other studies of framing effects in different kinds of games include Jörn Scharlemann et al. (2001), who studied trust games in which otherwise anonymous players were "labeled" by photographs; and Judith Mehta, Chris Starmer, and Robert Sugden (1994) and Nicholas Bardsley et al. (2006), who studied coordination games in which decisions had naturally occurring labels, as in Schelling's (1960) classic experiments.

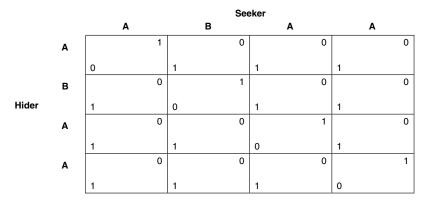


FIGURE 1. RTH'S HIDE-AND-SEEK GAME

them 32 percent of the time when they could hold it down to 25 percent via the equilibrium mixed strategy? The puzzle is deepened by the patterns' robust asymmetry across player roles. Why do seekers choose central A more often than hiders? Although the payoff structure is asymmetric, this asymmetry is not explained by noisy generalizations of equilibrium such as Richard McKelvey and Thomas Palfrey's (1995) quantal response equilibrium (QRE), which coincides with equilibrium in RTH's games.

RTH took their subjects' deviations from equilibrium as prima facie evidence that the subjects did not think strategically; and with one exception, explained below, they did not consider alternative explanations of their results.<sup>3</sup> But in our view, such robust patterns of behavior are unlikely to lack a coherent explanation; and given the simplicity of the strategic question hide-and-seek games pose, the explanation is unlikely to be nonstrategic. On the contrary, deviations from equilibrium in games where its rationale is especially strong seem to offer a particularly promising opportunity to explore

alternative strategic theories of initial responses to games.

In this paper we propose an explanation of RTH's and related results using a nonequilibrium model of initial responses to games based on "level-k" thinking, building on Bacharach and Stahl's (1997a) analysis of a simplified version of RTH's games.4 Level-k models were introduced by Stahl and Paul Wilson (1994, 1995) and Rosemarie Nagel (1995) and further developed by Teck-Hua Ho, Colin Camerer, and Keith Weigelt (1998), Costa-Gomes, Crawford, and Bruno Broseta (2001), Crawford (2003), Camerer, Ho, and Juin Kuan Chong (2004), Costa-Gomes and Crawford (2006), and Crawford and Iriberri (2007). They have strong experimental support, which should allay the concern that once one relaxes equilibrium, anything is possible. Like RTH, we focus on hide-and-seek and related games played on landscapes that are nonneutral in the framing of locations but neutral with regard to payoffs.<sup>5</sup> Although learning may

<sup>&</sup>lt;sup>3</sup> In RT's words, "The finding that both choosers and guessers selected the least salient alternative suggests little or no strategic thinking." In RTH's words, "... the players employed a naïve strategy (avoiding the endpoints), that is not guided by valid strategic reasoning. In particular, the hiders in this experiment either did not expect that the seekers too, will tend to avoid the endpoints, or else did not appreciate the strategic consequences of this expectation."

<sup>&</sup>lt;sup>4</sup> Bacharach and Stahl's (1997a) analysis of hide-andseek games did not appear in the published version of their paper, Bacharach and Stahl (2000). Bacharach and Stahl (1997b), whose title suggests a more detailed version of their hide-and-seek analysis, is no longer available. The relationship between their analysis and ours is explained below.

<sup>&</sup>lt;sup>5</sup> Robert Rosenthal, Jason Shachat, and Mark Walker (2003), and papers cited therein, report experiments on hide-and-seek games with nonneutral payoffs but neutral framing. Camerer, Ho, and Chong (2004, 883) show that level-*k* models can explain subjects' responses to such

converge to equilibrium over time, we also follow RTH in studying subjects' initial responses, which reveal their strategic thinking most clearly. Our goals are to resolve a long-standing behavioral puzzle; to explore the specification of level-k models for games played on nonneutral landscapes; and to establish a link between RTH's results and experimental work on strategic thinking, and so bring new evidence to bear on modeling initial responses to games.

Our level-k model allows behavior to be heterogeneous, but it assumes that each player follows a rule drawn from a common distribution over a particular hierarchy of decision rules or *types*. Type Lk for k > 0 anchors its beliefs in a nonstrategic L0 type and adjusts them via thought-experiments with iterated best responses: L1 best responds to L0, L2 to L1, and so on. L1 and higher types have accurate models of the game and they are rational in that they choose best responses to beliefs. Their only departure from equilibrium is replacing its assumed perfect model of others' decisions with simplified models that avoid the complexity of equilibrium analysis.

In applications, the population type frequencies are usually estimated from the current dataset or translated from previous work. The estimated distribution tends to be stable across games and hump-shaped, with most weight on L1, L2, and L3. Thus, the anchoring L0 type exists mainly in the minds of higher types. Even so, its specification is the main issue that arises in defining a level-k model for games with nonneutrally framed locations, and the key to its explanatory power.

We show that a level-k model with an L0 that is insensitive to payoffs and symmetric across player roles, but sensitive to framing in that L0 is constrained to favor salient locations, as seems plausible for a payoff-insensitive anchoring type,

games. Crawford, Uri Gneezy, and Yuval Rottenstreich (2007) propose a level-k explanation along the lines suggested here of coordination experiments in which subjects respond strongly to both labeling and salience created by payoff perturbations, which opposes label salience in one player role but reinforces it in the other. Von Neumann (1953) characterized equilibria in hide-and-seek games whose payoffs vary with location, including a two-dimensional game in which a hider hides in a matrix and a seeker guesses the hider's row or column.

allows a simple explanation of RTH's and related results. Estimating the model with population type frequencies and L0's choice probabilities constrained to be equal across roles yields a type distribution like those previously estimated for other games, though with somewhat more weight on higher types than usual, perhaps due to the transparency of the strategic question hideand-seek games pose. The estimated mixture of types' best responses to such an L0 explains subjects' robust, role-asymmetric deviations from equilibrium, with no difference in behavioral assumptions for hiders and seekers.

Although our proposed level-k model yields a plausible resolution of the puzzle posed by RTH's results, its large number of parameters and the freedom to specify L0 raise concerns about overfitting within RTH's sample and portability, the extent to which estimating the model for RTH's games helps to predict behavior in other games. We address these concerns by comparing it with four alternatives: two level-k models that relax the constraints that L0favors salience and/or is role-symmetric; and two equilibrium models as close as possible to the mainstream, with "hard-wired" payoff perturbations that can describe an instinctive attraction to salience for seekers and an instinctive aversion for hiders, one with their magnitudes (but not signs) restricted to be the same for hiders and seekers and one with their magnitudes unrestricted. The Web Appendix extends these equilibrium comparisons to QRE with perturbations, which never performs better than equilibrium with perturbations, and sometimes performs worse. The alternative models can also explain RTH's results, usually with a small likelihood advantage over our proposed model. But they, too, have large numbers of parameters, and they raise similar concerns about overfitting and portability.

We test for overfitting within RTH's sample by using each model to compute estimates separately for each of their six treatments and using each estimated model to "predict" the results of the other five treatments. Overall, our proposed level-k model fits slightly worse than all four alternatives. But the proposed model has a lower mean squared prediction error (MSE) than each alternative except the level-k model that relaxes the constraint that L0 is role-symmetric, whose error is 10 percent lower.

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RTH-4	A	B 36 percent 31 percent	A	A
Hider (53; $p = 0.0026$ )	9 percent		40 percent	15 percent
Seeker (62; $p = 0.0003$ )	13 percent		45 percent	11 percent
RT-AABA-Treasure	A	A	B 19 percent 21 percent	A
Hider (189; $p = 0.0096$ )	22 percent	35 percent		25 percent
Seeker (85; $p = 9E-07$ )	13 percent	51 percent		15 percent
RT-AABA-Mine	A	A	B	A
Hider (132; $p = 0.0012$ )	24 percent	39 percent	18 percent	18 percent
Seeker (73; $p = 0.0523$ )	29 percent	36 percent	14 percent	22 percent
RT-1234-Treasure	1	2	3	4
Hider (187; $p = 0.0036$ )	25 percent	22 percent	36 percent	18 percent
Seeker (84; $p = 3E-05$ )	20 percent	18 percent	48 percent	14 percent
RT-1234-Mine	1	2	3	4
Hider (133; $p = 6E-06$ )	18 percent	20 percent	44 percent	17 percent
Seeker (72; $p = 0.149$ )	19 percent	25 percent	36 percent	19 percent
R-ABAA	A	B	A	A
Hider (50; $p = 0.0186$ )	16 percent	18 percent	44 percent	22 percent
Seeker (64; $p = 9E-07$ )	16 percent	19 percent	54 percent	11 percent

*Notes:* Sample sizes and *p*-values for significant differences from equilibrium in parentheses; salient labels in italics; order of presentation of locations to subjects as shown.

We evaluate portability by using each model to "predict" subjects' initial responses in Barry O'Neill's (1987) and Amnon Rapoport and Richard Boebel's (1992) experiments, whose games are strategically close to RTH's games but with more complex win-loss patterns, different framing, and in one case five locations. The equilibrium with perturbations models are easily adapted to O'Neill's game using the same general notions of salience as for RTH's games; but in each case the perturbations estimated under the natural constraints regarding how players react to salience are 0, reducing the model to an equilibrium model, which predicts O'Neill's subjects' initial responses poorly. The level-k models adapt just as easily and predict well. For O'Neill's game our proposed level-k model with a role-symmetric L0 that favors salience has lower MSE than any of the alternative models. The level-k models with role-symmetric L0 adapt easily to Rapoport and Boebel's more complex game; but there is no plausible, parsimonious way to adapt a model with a roleasymmetric L0 or the equilibrium with perturbations models to that game. Our proposed model has total MSE slightly lower than equilibrium or a level-k model with a role-symmetric L0 that avoids salience. The analysis traces our

proposed model's advantage in portability to its reliance on general principles of strategic behavior that are not overly sensitive to the details of the structure.

The rest of the paper is organized as follows. Section I explains the analogies among RTH's six treatments and the case for pooling their data the way we do. Sections II and III describe our equilibrium with perturbations and level-*k* models. Section IV reports econometric estimates, Section V discusses overfitting, and Section VI discusses portability. Section VII concludes.

# I. Analogies Across RTH's Treatments

This section describes the five other RTH treatments in Table 1 and explains the senses in which they are analogous to the RTH-4 treatment. We then argue that, properly interpreted, the patterns of deviations from equilibrium in RTH-4—that central A was modal for both hiders and seekers, and even more prevalent for seekers—extend to the five other treatments. We also test whether the choice frequencies in RTH's six treatments can be pooled in the econometric analysis.

In RTH-4, the hider hid a desirable "prize," which we call a "treasure" as in RTH (1996). The five other treatments include three more treasure treatments, RT-AABA-Treasure, RT-1234-Treasure, and R-ABAA. They also include two "mine" treatments, RT-AABA-Mine and RT-1234-Mine, identical to the corresponding treasure treatments except that the hidden object is undesirable, so that hiders' and seekers' 0-1 payoffs are interchanged. This yields an equivalent normal form with players' roles reversed, leaving equilibrium predictions unchanged.

However, because hiders inherently move first, even though seekers do not observe their choices, mine treatments have different extensive forms than treasure treatments with reversed roles. RTH, suspecting that this difference might make it easier for seekers to mentally simulate hiders' choices, used mine treatments to test whether it explains why seekers in treasure treatments did better than equilibrium predicts. But the mine treatments yielded results very close to the treasure treatments with roles reversed, which suggests that the seekers' advantage was somehow driven by subjects' responses to the normal-form structure, as in all of the models considered here.

In the three ABAA or AABA Treasure treatments and the AABA Mine treatment, central A was modal for both hiders and seekers. This pattern extends to the 1234 Treasure and Mine treatments if we follow RT's suggestion that "the least salient response...may correspond to 3, or perhaps 2" and take 2 as analogous to B and 3 to central A. Given this correspondence, central A was more prevalent for seekers in all four treasure treatments and more prevalent for hiders in both mine treatments. Thus, if hiders in treasure and seekers in mine treatments are treated as equivalent, this pattern is also the same in all six treatments. Further, the frequencies with which seekers found a treasure or a mine exceeded 25 percent, so that seekers (hiders) had higher (lower) expected payoffs than in equilibrium in treasure treatments, and vice versa in mine treatments.

From now on, we build in these analogies by treating 2 as equivalent to B, and treating mine treatments as equivalent to treasure treatments with reversed player roles. To avoid unnecessary repetition, we use "central A" to refer to either a central A or a 3 location, and so on; and we refer

to mine treatments as if they were treasure treatments with reversed roles. No theory of which we are aware could predict these equivalences across different frames; their justification is that they allow us to use a more general theory of strategic behavior to interpret the patterns in the data.

After transforming the data accordingly, chisquare tests for differences in subjects' aggregate choice frequencies reveal no significant difference for seekers (*p*-value 0.4836) or hiders (*p*-value 0.1635) across the six treatments. We therefore pool the data, except as noted. The pooled sample includes 624 hiders and 560 seekers, with the aggregate choice frequencies in Table 3.6

# II. An Equilibrium with Payoff Perturbations Model of RTH's Games

To fix ideas, we begin with an explanation of RTH's results as close as possible to the mainstream, an equilibrium model with hardwired payoff perturbations that can describe an instinctive attraction to salience for seekers and an instinctive aversion for hiders. Because the end As' frequencies are almost equal in the data, we set their perturbations equal for simplicity. Thus, we assume that seekers gain an additional payoff of e for an end A location or f for the B location; and we further assume that hiders lose the same payoffs for those choices, yielding the perturbed matrix in Figure 2. Given the signs of the perturbations, intuition suggests that e, f > 0; but we do not assume this here.

First, restrict the magnitudes of e and f to be the same for hiders and seekers as in Figure 2. If -1 < (f - 2e), (2e - 3f), (2e + f) < 3, the perturbed game has a unique, symmetric, totally mixed equilibrium, with hiders and seekers both playing A, B, A, A with probabilities 1/4 - e/2 + f/4, 1/4 + e/2 - 3f/4, 1/4 + e/2 + f/4, and 1/4 - e/2 + f/4. Both hiders and seekers

<sup>&</sup>lt;sup>6</sup> We made minor adjustments to RTH's published data to reconcile reported frequencies and sample sizes (see the Web Appendix). Pairwise tests suggest that RTH-4 has somewhat higher frequencies of B (as well as central A) for both hiders and seekers. Although this difference is intriguing, we focus on explaining the more robust patterns discussed in the text.

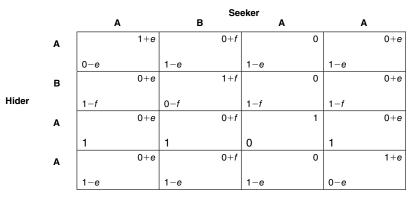


FIGURE 2. RTH'S HIDE-AND-SEEK GAME WITH PAYOFF PERTURBATIONS

play central A with probability 1/4+e/2+f/4, which is greater than 1/4 when 2e + f > 0. A seeker finds the treasure with probability

(1) 
$$\left(\frac{1}{4} - \frac{e}{2} + \frac{f}{4}\right)^2 + \left(\frac{1}{4} + \frac{e}{2} - \frac{3f}{4}\right)^2$$

$$+ \left(\frac{1}{4} + \frac{e}{2} + \frac{f}{4}\right)^2 + \left(\frac{1}{4} - \frac{e}{2} + \frac{f}{4}\right)^2$$

$$= \frac{1}{4}\left(1 + (2e - \sqrt{3}f)^2 + 4(\sqrt{3} - 1)ef\right),$$

which is greater than 1/4 for e, f > 0. Thus, equilibrium with perturbations of equal magnitudes but opposite signs for hiders and seekers can explain why central A is modal for both roles if 2e + f > 0, but not its greater prevalence for seekers. It can explain the role-asymmetry in RTH's results only by invoking differences in the magnitudes of e and f, with 2e + f nearly twice as large for hiders as for seekers (Table 3, p. 1741). There is no logical reason why the game's roleasymmetric payoffs should not evoke instinctive reactions that differ this way, but neither to our knowledge is there any plausible theory to explain such differences. Without such a theory, perturbations of unrestricted magnitudes give the model enough flexibility to explain virtually any pattern of behavior, raising concerns about overfitting; and the lack of a theory also raises concerns about portability. (These issues are discussed in more detail in the Web Appendix.)

In RTH's unperturbed game, QRE coincides with equilibrium for any value of its precision parameter. But because QRE explains deviations

from equilibrium in some other experiments, and it normally responds to payoff asymmetries, it is natural to hope that QRE with perturbations can explain RTH's results without unexplained differences in the magnitudes of the perturbations.7 We consider this possibility in the Web Appendix, focusing on the popular logit specification and assuming e, f > 0 in Figure 2, which seems compelling. With perturbations of equal magnitudes, QRE, like equilibrium, can explain why central A is modal for hiders and seekers, but it robustly predicts that central A is more prevalent for hiders, the opposite of what RTH found. Perturbations of unrestricted magnitudes yield an effectively infinite estimate of QRE's precision parameter, reducing it to equilibrium with unrestricted perturbations. Thus, QRE is unhelpful in this setting.

## III. A Level-k Model of RTH's Games

This section introduces our proposed level-k model for RTH's games and alternative level-k models. Each player follows one of five types, L0, L1, L2, L3, or L4, with given probabilities in each role r, s, t, u, and v. Type Lk for k > 0 anchors its beliefs in type L0 and adjusts them via thought experiments with iterated best responses: L1 best responds to L0, L2 to L1, and

<sup>&</sup>lt;sup>7</sup> Rosenthal, Shachat, and Walker (2003) find that QRE gives a reasonable explanation of the qualitative features of subjects' role-asymmetric deviations from equilibrium in 2x2 hide-and-seek games with neutral framing but varying payoffs.

so on.<sup>8</sup> For k > 0, these responses determine types' normal choices, with ties broken uniformly randomly.

For econometric reasons (see Section IV), we assume r = 0, so the anchoring type L0 exists only in the minds of higher types, as the starting point for their strategic thinking. Even so, L0 is the key to the model's explanatory power. We also assume that L0 is payoff-insensitive as in most previous level-k analyses; this choice is discussed below. In games with symmetric framing and sets of decisions like those we study, it is plausible to assume that a payoff-insensitive L0 is symmetric across player roles. We further assume that L0 probabilistically favors salient locations: B and the end As in RTH's games. Because the end A frequencies are almost equal in the data, we set their choice probabilities for L0 (and so for higher types) equal for simplicity. Thus, in RTH's games, L0 hiders and seekers both choose A, B, A, A with probabilities p/2, q, 1 - p - q, p/2, where p > 1/2 and q > 1/4.

When r=0, the model's implications apart from errors are determined by L1 hiders' and seekers' best responses to L0, which determine the normal choices of L2, L3, and L4, as well as L1, and by the type frequencies s, t, u, and v. Table 2 lists types' normal choice probabilities when p>1/2 and q>1/4, distinguishing the cases p<2q—in which L0 responds more strongly to the salience of a B than an end A location—and p>2q. L1 hiders choose central A to avoid L0 seekers, and L1 seekers avoid central A in their searches for L0 hiders, choosing B if p<2q or the end As (with equal probabilities) if p>2q. For similar reasons, L2 hiders

choose central A with probability 1/3 or 1/2 and L2 seekers choose it with probability 1; L3 hiders avoid central A and L3 seekers choose it with probability 1/3 or 1/2; and L4 hiders and seekers avoid central A.<sup>10</sup>

These choice patterns allow the model to explain RTH's results with behaviorally plausible type frequencies. Table 2's bottom lines give the population choice probabilities as functions of the type frequencies and the error rate  $\varepsilon$ . Section IV's econometric analysis (Table 3) confirms that a role-symmetric L0 with p > 2qand a population with 19 percent L1, 32 percent L2, 24 percent L3, and 25 percent L4 players in each role closely matches RTH's hiders' and seekers' choice frequencies. This almost humpshaped type distribution is like those estimated for other settings (Stahl and Wilson 1994, 1995; Costa-Gomes, Crawford, and Broseta 2001; Camerer, Ho, and Chong 2004; Costa-Gomes and Crawford 2006). It is, however, shifted upward somewhat, perhaps due to the transparency of the strategic question hide-and-seek games pose.11

Imagine, more concretely, that in the situation of our first epigraph there are four meetings at which the government could try to poison Yushchenko. Meeting "B" is with government officials; but none of the others is salient the way RTH's end locations are. As the only salient location, B is the modal choice for L0 poisoners and investigators. L1 poisoners avoid B, but L1 investigators choose it. L2 poisoners and investigators both avoid B. L3 poisoners choose B, but L3 investigators avoid it. L4 poisoners and investigators both choose B. Thus, our first epigraph may reflect the reasoning of an L1 poisoner, or equivalently of an L2 investigator reasoning about an L1 poisoner.

<sup>&</sup>lt;sup>8</sup> Costa-Gomes and Crawford (2006) summarize the experimental evidence for the level-k model, and give support for our assumptions that L2 best responds to an LI without decision errors, and to LI alone rather than a mixture of LI and LO, etc., unlike in Stahl and Wilson (1994, 1995) or (in the latter case) Camerer, Ho, and Chong (2004). In RTH's games, L5's choice probabilities (but not its expected payoffs) are the same as LI's, so L5 is equivalent to LI, L6 to L2, and so on.

<sup>&</sup>lt;sup>9</sup> One might argue that the framing isn't completely role-symmetric because the roles have different labels, but RTH's failure to find significant differences between the behavior of hiders in treasure treatments and seekers in mine treatments, and vice versa (Section I), suggests that role-asymmetric framing is not what is driving subjects' behavior.

<sup>&</sup>lt;sup>10</sup> These choices remain the same whenever p + 2q > 1 and 3p + 2q > 2; we maintain p > 1/2 and q > 1/4 for simplicity.

<sup>&</sup>lt;sup>1</sup> This shift hints at the possibility of a more general theory that relates the type frequencies to the transparency and cognitive difficulty of the game. In contrast to RTH's interpretation of their results as evidence of strategic naïveté, using our level-*k* model to explain their results implies *lower* bounds on the population's sophistication in that, for central A to be more prevalent for seekers than hiders, there must be sufficiently more *L2* and *L3* than *L1* subjects.

Table 2—Types' Expected Payoffs and Choice Probabilities in RTH's Games when p > 1/2 and q > 1/4

Hider	Expected payoff	Choice probability	Expected payoff	Choice probability	Seeker	Expected payoff	Choice probability	Expected payoff	Choice probability
	p < 2q	p < 2q	p > 2q	p > 2q		p < 2q	p < 2q	p > 2q	p > 2q
LO(Pr. r)					L0  (Pr.  r)				
A	-	p/2	_	p/2	A	_	p/2	_	p/2
В	-	q	_	q	В	_	q	_	q
A A	_	1-p-q	_	1-p-q	A	_	1-p-q	_	1-p-q
	_	<i>p</i> /2	_	<i>p</i> /2		_	<i>p</i> /2	_	<i>p</i> /2
L1 (Pr. $s$ )	1 /0 < 2/4	0	1 /0 - 2/4	0	L1 (Pr. s) A	0 > 1/4	0	10 > 1/4	1./2
A B	1 - p/2 < 3/4 1 - q < 3/4	. 0	1 - p/2 < 3/4 $1 - q < 3/4$	0	B	p/2 > 1/4 q > 1/4	0 1	p/2 > 1/4 q > 1/4	1/2 0
A	p + q > 3/4	1	p + q > 3/4	1	A	q > 1/4 1-p-q < 1/4		q > 1/4 1-p-q < 1/4	
A	1 - p/2 < 3/4		1 - p/2 < 3/4		A	p/2 > 1/4	0	p/2 > 1/4	1/2
I 2 (D., .)	P		P = 0		12(D. 4)	P		F	
L2 (Pr. t) A	1	1/3	1/2	0	L2 (Pr. t)	0	0	0	0
В	0	0	1	1/2	B	0	0	0	0
A	1	1/3	1	1/2	A	1	1	1	1
A	1	1/3	1/2	0	A	0	0	0	0
<i>L3</i> (Pr. <i>u</i> )					L3 (Pr. u)				
A	1	1/3	1	1/3	A	1/3	1/3	0	0
В	1	1/3	1	1/3	В	0	0	1/2	1/2
A	0	0	0	0	A	1/3	1/3	1/2	1/2
A	1	1/3	1	1/3	A	1/3	1/3	0	0
L4 (Pr. v)					L4 (Pr. v)				
A	2/3	0	1	1/2	A	1/3	1/3	1/3	1/3
В	1	1	1/2	0	В	1/3	1/3	1/3	1/3
A	2/3	0	1/2	0	A	0	0	0	0
A	2/3	0	1	1/2	A	1/3	1/3	1/3	1/3
Total	<i>p</i> <	2q	p >	2q	Total	p <	2q	p >	2q
A	$rp/2+(1-\varepsilon + (1-\varepsilon))$		$rp/2+(1-\varepsilon)+(1-r)$		A	$rp/2+(1-\varepsilon + (1-\varepsilon))$		$rp/2+(1-\epsilon + (1-\epsilon))$	$)[s/2+v/3]$ $r)\varepsilon/4$
В	$rq+(1-\varepsilon)+(1-\varepsilon)$		$rq+(1-\varepsilon)[+(1-r)]$		В	$rq+(1-\varepsilon +(1-\varepsilon +($		$rq+(1-\varepsilon)$ $+(1-\varepsilon)$	
A	r(1-p-q)+(1-p-q)+(1-p-q)		r(1-p-q)+(1+q)		A	r(1-p-q)+( +(1-		r(1-p-q)+(1-	
A	$rp/2+(1-\epsilon + (1-\epsilon))$		$rp/2+(1-\varepsilon)+(1-r)$		A	$rp/2 + (1-\epsilon + (1-\epsilon))$		$rp/2+(1-\epsilon + (1-\epsilon))$	

The game referred to in our second epigraph, between a test-taker trying to guess the answer and a test-maker trying to minimize a guesser's chances, is exactly like RTH's games if location "c" is treated as equivalent to central A. Thus, our second epigraph may reflect the reasoning of an *L1* test-maker, or an *L2* guesser reasoning about an *L1* test-maker. Attali and Bar-Hillel (2003) present intriguing field evidence on this game, from the Israeli analog of the US Scholastic Aptitude Test.

Like equilibrium with perturbations, our level-k model is quite flexible, and the freedom to specify L0 makes it even more flexible. Our payoff-insensitive L0 assumes that a player processes the game's decisions and framing before its payoffs. We show in Section IV that two alternative level-k models fit RTH's data slightly better than our proposed model: one that merges those processing steps as in Bacharach and Stahl's (1997a) payoff-sensitive, role-asymmetric L0 in which seekers favor salience and hiders

avoid it; and one with a payoff-insensitive, role-symmetric *L0* that *avoids* salience.<sup>12</sup> Section II's equilibrium with unrestricted perturbations model fits RTH's data best of all the models discussed here, but still only slightly better than our proposed model.

Despite our proposed model's slightly worse fit in RTH's dataset, we find its explanation of their results more convincing because its assumptions seem behaviorally more plausible and it does not rely on unexplained role differences in behavior or payoffs. To our knowledge, only a levelk model with a role-symmetric L0 can explain the robust patterns in RTH's data without unexplained differences in behavioral assumptions across roles. A payoff-insensitive L0 that avoids salience seems perverse, given that it responds only to decisions and framing. And a payoff-sensitive, role-asymmetric L0 suffers from the same overflexibility and lack of theory to guide its specification as equilibrium with perturbations. The analyses in Sections V and VI give support for these subjective judgments by showing that our proposed model has advantages in overfitting and portability. (These issues are discussed in more detail in the Web Appendix.)

#### IV. Econometric Analysis

This section describes our econometric specification and then separately estimates the equilibrium with perturbations model and each possible level-k model econometrically, using the pooled data from RTH's six treatments. We compare our proposed level-k model, which has a role-symmetric L0 that favors salience, with level-k alternatives that relax the constraint that L0 is role-symmetric, that L0 favors salience, or both. Our goal is to illustrate the models' possibilities, not to take a definitive position on the behavioral

parameters. Estimating the models rather than calibrating them constrains our discretion and yields likelihoods that provide an objective criterion by which to compare models.

Our econometric model is a mixture model as in Stahl and Wilson (1994, 1995) or Costa-Gomes, Crawford, and Broseta (2001), with one type for equilibrium with perturbations and up to four for the level-k models. Let  $X_{ij}$  be the total numbers of hiders or seekers (with i = h, s) who choose location j (with A, B, A, A denoted 1, 2, 3, 4). Let  $\pi_k$  be the probability that a given subject is type k, and  $\rho_{ikj}$  be the probability that a hider or seeker of type k chooses j. The full-sample likelihood can be written

(2) 
$$L \equiv \prod_{i=h,s} \prod_{j=1,2,3,4} \left[ \sum_{k} \pi_k \rho_{ikj} \right]^{X_{ij}}.$$

The equilibrium with perturbations models have  $ho_{ikj}$  as in Section II's analysis. Because the equilibrium that best fits RTH's results is totally mixed, errors would be redundant in this case. In the level-k models, a player's type determines his normal choices as in Section III's analysis, with ties broken uniformly randomly, thus with  $\rho_{ikj}$  as illustrated for our proposed model in Table 2. To avoid specification bias, we use the simplest possible error structure: with probability  $\varepsilon$ , a player makes an error, in which case he chooses his location uniformly randomly; errors are independent across players. The population choice probabilities are determined as functions of the behavioral parameters as in Table 2, with  $\pi_0 = r$ ,  $\pi_1 = s$ ,  $\pi_2 = t$ ,  $\pi_3 = u$ , and  $\pi_4 = v$  in Section III's notation.

In the estimation, we rule out knife-edge (p,q) combinations that make LI hiders or seekers indifferent between locations, because they implicitly allow LI to randomize, risking specification bias.<sup>13</sup> We further constrain r = 0. This constraint is not binding for our proposed model,

<sup>&</sup>lt;sup>12</sup> Bacharach and Stahl (1997a) analyze a simplified version of RTH's game with three locations, one clearly salient and one less clearly salient. They give an evolutionary justification for their role-asymmetric *L0*: "For early humans, 'looking' problems were more generic and 'hiding' problems more strategic" (their footnote 13). Such a model can explain the main patterns in RTH's results with only types *L0*, *L1*, and *L2*, if there are more *L2* than *L0* subjects. This type distribution seems lower and therefore closer to previous estimates than ours; but the difference is largely semantic because the behavior of their *L0* is similar to that of our *L1*, and their *L1* to that of our *L2*, and so on.

 $<sup>^{13}</sup>$  We distinguish between ties that occur because two location choices are expected to yield the same outcome, which must be broken randomly in any consequentialist theory, and ties that exist only for knife-edge (p,q) combinations. With a role-symmetric L0, the likelihood is occasionally maximized at such combinations because they make LI randomize in a way that happens to fit the data better than our (deliberately naïve) error structure. We view such

TABLE 3—PARAMETER	ESTIMATES AND	I IKELIHOODS FOR THE	LEADING MODELS	N RTH'S GAMES
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Model	Ln L	Parameter estimates	Obs	served or p	redicted cho	oice freque	ncies	MSE
			Player	A	В	A	A	
Observed frequencies (624 hiders, 560 seekers)			H S	0.2163 0.1821	0.2115 0.2054	0.3654 0.4589	0.2067 0.1536	-
Equilibrium without perturbations	-1641.4		H S	0.2500 0.2500	0.2500 0.2500	0.2500 0.2500	0.2500 0.2500	0.00970
Equilibrium with restricted perturbations	-1568.5	$e_H \equiv e_S = 0.2187$ $f_H \equiv f_S = 0.2010$	H S	0.1897 0.1897	$0.2085 \\ 0.2085$	0.4122 0.4122	0.1897 0.1897	0.00084
Equilibrium with unrestricted perturbations	-1562.4	$e_H = 0.2910, f_H = 0.2535$ $e_S = 0.1539, f_S = 0.1539$	H S	0.2115 0.1679	0.2115 0.2054	0.3654 0.4590	0.2115 0.1679	0.00006
Level-k with a role-symmetric L0 that favors salience	-1564.4	p > 1/2 and $q > 1/4$ , $p > 2q$ , r = 0, $s = 0.1896$ , $t = 0.3185$ , $u = 0.2446$ , $v = 0.2473$ , $\varepsilon = 0$	H S	0.2052 0.1772	0.2408 0.2047	0.3488 0.4408	0.2052 0.1772	0.00027
Level-k with a role- asymmetric L0 that favors salience for seekers and avoids it for hiders	-1563.8	$p_H < 1/2$ and $q_H < 1/4$ , $p_S > 1/2$ and $q_S > 1/4$ , r = 0, $s = 0.66$ , $t = 0.34$ , $\varepsilon = 0.72$ ; $u \equiv v \equiv 0$ imposed	H S	0.2117 0.1800	0.2117 0.1800	0.3648 0.4600	0.2117 0.1800	0.00017
Level-k with a role-symmetric L0 that avoids salience	-1562.5	p < 1/2 and $q < 1/4$ , $p < 2q$ , r = 0, $s = 0.3636$ , $t = 0.0944$ , $u = 0.3594$ , $v = 0.1826$ , $\varepsilon = 0$	H S	0.2133 0.1670	0.2112 0.2111	0.3623 0.4549	0.2133 0.1670	0.00006

but without it many of the alternative models have identification problems and those with a role-asymmetric L0 can achieve a near-perfect fit with r=1, "explaining" the data by tabulating them. <sup>14</sup> Given r=0, estimating a level-k model amounts to choosing the (p,q) combination for L0, or equivalently the implied normal choices for L1 seekers and hiders, such that the L1 choices and the choices they imply for higher types maximize the likelihood, given the

maxima as spurious because it is implausible that there are very many subjects with such knife-edge combinations.

restrictions imposed. Figure 3 graphs the regions in (p,q)-space for which L0 hiders or seekers yield each possible combination of choices for L1 hiders and seekers, numbered 1 through 6. In the most general level-k model, with no restriction on the role-symmetry of L0 or its response to salience, L0 hiders and seekers can be independently assigned to regions 1 through 6, or equivalently (Figure 3) L1 seekers' and hiders' choices can be chosen independently from {end As, central A, B}, which yields 9 possible cases. 15 With a role-symmetric L0 but no restriction on its response to salience, L0 hiders' and seekers' regions must be the same but can otherwise be chosen freely, which yields six possible cases. In our proposed model, with a role-symmetric L0 that favors salience, this joint choice is restricted to regions 1 and 2, in which L1 hiders choose central A and L1 seekers choose either B

<sup>&</sup>lt;sup>14</sup> We say only "near-perfect" because our models restrict L0's choice probabilities to be the same for end A locations within each player role, so their predicted frequencies are also the same, which is not quite true in the data. Equilibrium with perturbations imposes an analogous restriction, so this should not bias the comparisons. Without the r=0 constraint, all maximum-likelihood estimates for models with a role-asymmetric L0 are equivalent to r=1. Our proposed model estimates r=0 because, while a role-asymmetric L0 cannot fit their different choices as well as higher types can. Our finding that there are no L0 subjects is consistent with the common finding that people underestimate others' sophistication relative to their own (Georg Weizsäcker 2003).

<sup>&</sup>lt;sup>15</sup> The most general level-k model falls short of full generality only because we define the types as discussed in footnote 8, restrict L0's choice probabilities to be the same for end A locations within each player role, impose r=0, and rule out (p,q) combinations that make L1 hiders or seekers indifferent between locations.

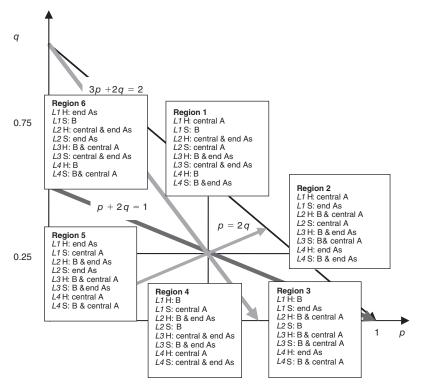


FIGURE 3. L1's THROUGH L4's CHOICES IN RTH'S GAMES AS FUNCTIONS OF L0'S CHOICE

(region 1, p < 2q) or end As (region 2, p > 2q). The  $\rho_{ikj}$  in these regions can be read, for given type frequencies and error rate, from Table 2 with r=0; and the  $\rho_{ikj}$  in other regions can be deduced from Figure 3. <sup>16</sup>

Table 3 summarizes the parameter estimates, likelihoods, and predicted choice frequencies for all models, with the observed frequencies for comparison. All the models are flexible enough to fit RTH's data very well.<sup>17</sup> Equilibrium with

unrestricted perturbations fits best. Next best is a level-k model with a role-symmetric L0 that avoids salience, with L0 hiders and seekers both in region 5. This model is equivalent when estimated to the most general level-k model, with L0 hiders in region 4 or equivalently 5 and L0 seekers in region 6 or 5. Next is a model with a role-asymmetric L0 with seekers favoring salience, in region 1 or 2, and hiders avoiding it, in region 4 or 5, as in Bacharach and Stahl (1997a). Next

 $^{16}$  If the regions defined by p and q for hiders and seekers are each viewed as a single, discrete parameter, the most general level-k model has six independent parameters: a region each for hiders and seekers, three independent type frequencies, and an error rate. Restrictions on L0's response to salience do not affect this, while a restriction to a role-symmetric L0 as in our proposed model reduces it to five. Equilibrium with unrestricted perturbations, with no error rate, has four parameters; and equilibrium with restricted perturbations has two.

<sup>17</sup> The likelihood gap is larger than it may appear, because the log-likelihood associated with perfect prediction of the

choice frequencies is not 0 but –1561.7—negative because in these models even perfect prediction is only probabilistic.

<sup>18</sup> In this model, subscripts H and S distinguish L0 hiders' and seekers' choice probabilities. This model is unidentified even when r=0, because there are linear dependencies among types' choice probabilities that are the same for hiders and seekers. We report an estimate constraining u=v=0 (ruling out L3 and L4), following Bacharach and Stahl (1997a) in including only the lowest types, on the grounds that they are behaviorally more plausible. This choice has no substantive implications in RTH's dataset, but it matters in Section VI's analysis of portability.

is our proposed model with a role-symmetric L0 that favors salience, with L0 hiders and seekers both in region 2, which fits only slightly worse than the three previous models. Equilibrium with restricted perturbations fits worst of all.<sup>19</sup>

The estimated payoff perturbations in the equilibrium models have the expected positive signs, with unrestricted magnitudes nearly twice as large for hiders as for seekers. The estimated type distribution in our proposed level-k model is behaviorally plausible, with the characteristic hump-shape of previous estimates but a shift toward higher, more sophisticated types (Section III). In this case, the restriction r=0 is nonbinding, so the model also reaffirms previous findings that L0 exists mainly in the minds of higher types. L0, in region 2, responds more to the salience of an end A than a B location. As  $\varepsilon=0$ , types L1 to L4, taken together, explain the data better than uniform errors.

The estimates for the alternative Bacharach and Stahl–style model, with a role-asymmetric L0 with seekers favoring salience and hiders avoiding it, are somewhat perverse, with plausible type frequencies but an error rate of  $\varepsilon = 0.72$ , and identification problems even when r = 0 (footnote 18).

The estimates for the best-fitting alternative level-k model, with a role-symmetric L0 that avoids salience, are similar to those for our proposed model, again with  $\varepsilon = 0$  but with an implausible type distribution of 36 percent L1, 9 percent L2, 36 percent L3, and 18 percent L4 players, far from the typical hump shape. Ultimately, this alternative model will stand or fall on the plausibility of a payoff-insensitive L0 that avoids salience and on its overfitting and portability performance.

## V. Overfitting

This section tests for overfitting by using each model to compute separate estimates for each of RTH's six treatments and using the reestimated models to "predict" the choice frequencies in the other five treatments. We evaluate the models by their MSEs.

Table 4 gives the MSEs, and Table A2 in the Web Appendix reports the estimates on which they are based. Even though our proposed level-*k* model fits slightly worse than each alternative, it has a lower MSE than each alternative but the Bacharach and Stahl–style level-*k* model with a role-asymmetric *LO* with seekers favoring salience and hiders avoiding it, whose error is 10 percent lower.

#### VI. Portability

This section takes up the issue of portability, the extent to which estimating the model for RTH's games helps to predict behavior in other games. We use each model, with the parameters estimated for RTH's games, to "predict" subjects' initial responses in the closest analogs of RTH's experiments we know of, O'Neill's (1987) card-matching experiment and Rapoport and Boebel's (1992) closely related experiment. (Their data for subjects' initial responses are included in our Data Appendix, available at http:// www.e-aer.org/data/dec07/20050133\_data.zip, with permission.) Their games provide a good test of portability, raising the same strategic issues as RTH's games but with different framing, in one case five locations, and more complex win-loss patterns (Figures 4 and 5).

O'Neill, and Rapoport and Boebel, presented their games to subjects as stories, with locations ordered as in Figures 4 and 5. Rapoport and Boebel's subjects were also given a matrix like Figure 5, but with Ws or Ls for wins or losses.<sup>21</sup>

<sup>&</sup>lt;sup>19</sup> We strongly reject the restrictions of equal magnitudes across roles (*p*-value 0.0022). We focus below on equilibrium with unrestricted perturbations, which is equivalent in RTH's games to QRE with unrestricted perturbations.

 $<sup>^{20}</sup>$  Without payoff perturbations, our uniform errors are perfectly confounded with the equilibrium mixed strategies. Thus  $\varepsilon=0$  also suggests the absence of subjects who play equilibrium strategies, and it allows us to reject explanations in which some of the population choose locations with given probabilities (like L0), and the rest, like the Sophisticated type in Crawford (2003), play equilibrium in a game among themselves, taking those probabilities into account.

<sup>&</sup>lt;sup>21</sup> O'Neill's story (2708) was: "Each player has four cards—Ace, two, three, and a joker .... [Player 1] wins if there is a match of jokers (two jokers played) or a mismatch of number cards (two, three, for example). [Player 2] wins if there is a match of number cards (three, three, for example) or a mismatch of a joker (one joker, one number card)." This wording leaves room for doubt whether Ace was also a "number" card, but his practice rounds made it clear to the subjects that it was. O'Neill had only one treatment,

TABLE 4—MSEs Treatment by Treatment in RTH's Games

			Predicted	treatment		
Estimated treatment	RTH-4	RT-AABA– Treasure	RT-AABA- Mine	RT-1234– Treasure	RT-1234– Mine	R-ABAA
	Level-k with sym	metric L0 that favo	ors salience: Over	all MSE 0.0034	<b>1</b> 1	
RTH-4	0.0020	0.0032	0.0098	0.0031	0.0019	0.0032
RT-AABA-Treasure	0.0070	0.0014	0.0029	0.0011	0.0004	0.0048
RT-AABA-Mine	0.0132	0.0042	0.0011	0.0029	0.0023	0.0085
RT-1234-Treasure	0.0072	0.0016	0.0029	0.0007	0.0002	0.0037
RT-1234-Mine	0.0054	0.0017	0.0035	0.0009	0.0000	0.0034
R-ABAA	0.0040	0.0023	0.0073	0.0016	0.0010	0.0023
	Equilibrium wi	th unrestricted per	turbations: Overal	1 MSE 0.00418		
RTH-4	0.0002	0.0088	0.0156	0.0079	0.0050	0.0087
RT-AABA-Treasure	0.0089	0.0001	0.0039	0.0013	0.0017	0.0022
RT-AABA-Mine	0.0153	0.0034	0.0005	0.0031	0.0032	0.0070
RT-1234-Treasure	0.0076	0.0009	0.0031	0.0005	0.0004	0.0025
RT-1234-Mine	0.0053	0.0018	0.0037	0.0009	0.0000	0.0036
R-ABAA	0.0085	0.0019	0.0071	0.0027	0.0032	0.0004
	Level-k with sym	metric L0 that avo	ids salience: Over	all MSE 0.0035	59	
RTH-4	0.0035	0.0062	0.0081	0.0050	0.0029	0.0054
RT-AABA-Treasure	0.0091	0.0001	0.0040	0.0012	0.0018	0.0020
RT-AABA-Mine	0.0148	0.0033	0.0005	0.0028	0.0029	0.0067
RT-1234-Treasure	0.0069	0.0008	0.0028	0.0007	0.0003	0.0031
RT-1234-Mine	0.0054	0.0017	0.0035	0.0010	0.0001	0.0041
R-ABAA	0.0073	0.0008	0.0054	0.0021	0.0023	0.0010
	Level-k	with asymmetric I	0: Overall MSE	0.00306		
RTH-4	0.0077	0.0016	0.0026	0.0009	0.0005	0.0025
RT-AABA-Treasure	0.0086	0.0007	0.0038	0.0007	0.0010	0.0023
RT-AABA-Mine	0.0085	0.0028	0.0017	0.0017	0.0007	0.0057
RT-1234-Treasure	0.0081	0.0009	0.0029	0.0005	0.0005	0.0026
RT-1234-Mine	0.0079	0.0014	0.0021	0.0007	0.0003	0.0034
R-ABAA	0.0096	0.0024	0.0068	0.0025	0.0031	0.0006

O'Neill's experiment had 25 subjects per role and Rapoport and Boebel's had 10. Subjects played the games repeatedly in fixed pairs, with feedback after each play. We focus on subjects' first-round choices, interpreting them as initial responses.<sup>22</sup>

while Rapoport and Boebel had two, which differed only in the scaling and expected magnitudes of payoffs in ways that do not affect the predictions of the theories considered here. There is a statistically significant difference between Rapoport and Boebel's treatments for player 2s (*p*-value 0.087) but not for player 1s (*p*-value 0.8557). We keep their treatments separate in both player roles.

<sup>22</sup> Rapoport and Boebel's subjects played first in one player role, then the other. We use only a given subject's first response to the game, in either role. Even so, interpreting first-round choices as initial responses is less straightforward here than for RTH's subjects, who played a game only once or in a series without feedback, because with feedback it is theoretically possible for first-round choices to influence future play (even with random pairing, via

Tables 5 and 6 give the games' unique equilibrium mixed strategies and subjects' aggregate first-round choices. Equilibrium reflects the payoff-symmetry of actions A, 2, and 3 in O'Neill's game and of actions F, I, and O in Rapoport and Boebel's game. Equilibrium is also symmetric across player roles, as in RTH's games. We keep symmetric actions separate because equilibrium with perturbations and the level-*k* models break the symmetries in response to differences in salience. Relative to equilibrium, O'Neill's subjects have a large, positive Joker ("J") effect for both players, with J even more prevalent for player 2s.<sup>23</sup> Rapoport and Boebel's subjects have

<sup>&</sup>quot;contagion"). Nonetheless, future influences do not seem to have been an important source of distortion in this case.

<sup>&</sup>lt;sup>23</sup> Discussions of O'Neill's data have been dominated by a small, positive "Ace effect" when the data are aggregated

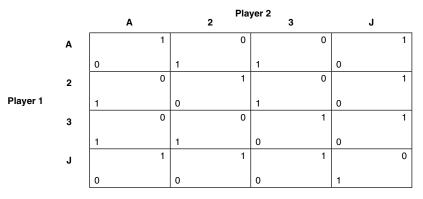


FIGURE 4. O'NEILL'S CARD-MATCHING GAME

				Player 2		
		С	L	F	1	0
	С	0	1	1	1	1
		1	0	0	0	0
	L	1	1	0	0	0
		0	0	1	1	1
Player 1	F	1	0	1	1	0
		0	1	0	0	1
	I	1	0	1	0	1
		0	1	0	1	0
	0	1	0	0	1	1
		0	1	1	0	0

FIGURE 5. RAPOPORT AND BOEBEL'S GAME

a large, positive I effect for player 1s in both treatments; a large, positive C effect for player

over all rounds (player 1s and 2s played A 22.0 percent and 22.6 percent of the time, versus the equilibrium 20 percent); see, for example, McKelvey and Palfrey (1995, 20). The Joker effect for initial responses, which is an order of magnitude larger, came as a surprise—a fortunate one for us because an Ace effect for player 1s is hard to square with a plausible level-k model (Table A3 in the Web Appendix). Although O'Neill speculated that "players were attracted by the powerful connotations of an Ace," our analysis suggests that the aggregate Ace effect is due to learning, not salience.

2s in treatment 1; and a large, positive L effect for player 2s in treatment 2.<sup>24</sup>

In adapting the equilibrium model's perturbations to O'Neill's and Rapoport and Boebel's games, we use the same general notions of salience and players' instinctive reactions to it as for RTH's games. Although O'Neill's game is not a hide-and-seek game, player 1 (row) can be viewed as a hider when he chooses one of

<sup>&</sup>lt;sup>24</sup> We put less weight on Rapoport and Boebel's effects than on O'Neill's Joker effect because of Rapoport and Boebel's smaller sample sizes and the large differences in choice frequencies across their two treatments.

TADIE 5	-COMPARISON OF THE I	EADING MODELS IN	JO'NEILL'S GAME

Model	Parameter estimates	Observ	Observed or predicted choice frequencies					
		Player	Α	2	3	J		
Observed frequencies		1	0.0800	0.2400	0.1200	0.5600	_	
(25 Player 1s, 25 Player 2s)		2	0.1600	0.1200	0.0800	0.6400	-	
Equilibrium without		1	0.2000	0.2000	0.2000	0.4000	0.0120	
perturbations		2	0.2000	0.2000	0.2000	0.4000	0.0200	
Level-k with a role-symmetric	a > 1/4 and $j > 1/4$	1	0.0824	0.1772	0.1772	0.5631	0.0018	
L0 that favors salience	3j - a < 1, a + 2j < 1	2	0.1640	0.1640	0.1640	0.5081	0.0066	
Level-k with a role-symmetric	a > 1/4 and $j > 1/4$	1	0.0000	0.2541	0.2541	0.4919	0.0073	
L0 that favors salience	3j - a < 1, a + 2j > 1	2	0.2720	0.0824	0.0824	0.5631	0.0050	
Level-k with a role-symmetric	a < 1/4 and $j < 1/4$	1	0.4245	0.1807	0.1807	0.2142	0.0614	
L0 that avoids salience		2	0.1670	0.1807	0.1807	0.4717	0.0105	
Level- <i>k</i> with a role-asymmetric <i>L0</i> that	$a_1 < 1/4, j_1 > 1/4;$							
favors salience for locations for which	$a_2 > 1/4, j_2 < 1/4$	1	0.1804	0.2729	0.2729	0.2739	0.0291	
player is a seeker and avoids it for locat for which player is a hider	ions $3j_1 - a_1 < 1$ , $a_1 + 2j_1 < 1, 3a_2 + j_2 > 1$	2	0.1804	0.1804	0.1804	0.4589	0.0117	

the number cards A, 2, and 3 and a seeker when he chooses J; and player 2 can be viewed as the reverse. The end positions of A and J, and J's unique role in the payoff structure, reinforce the salience of their labels. We assume a player choosing a salient card for which he is a seeker receives an additional payoff of  $\alpha$  for A and  $\iota$  for J; and one choosing a salient card for which he is a hider loses analogous payoffs (Figure 6). We constrain  $\alpha$ ,  $\iota \ge 0$ , so players favor salient cards for which they are seekers and avoid salient cards for which they are hiders. We also allow  $\alpha$  and  $\iota$  to differ across roles, but we suppress this for ease of notation.

If  $3\alpha - \iota < 1$  and  $\alpha + 3\iota < 2$ , the perturbed O'Neill game has a unique, symmetric, totally mixed equilibrium in which player 1s and player 2s both play A, 2, 3, and J with probabilities  $(1-3\alpha+\iota)/5$ ,  $(1+2\alpha+\iota)/5$ ,  $(1+2\alpha+\iota)/5$ , and  $(2-\alpha-3\iota)/5$ , with obvious changes if  $\alpha$  and  $\iota$  differ across roles. Either way, the probability of J is maximized subject to  $\alpha$ ,  $\iota \ge 0$  when  $\alpha = \iota = 0$ , which yields an equilibrium J probability of 0.4, well below the observed frequency in each role. Thus, equilibrium with perturbations, even with new estimates of the perturbations for O'Neill's game, cannot explain his subjects' initial responses better than equilibrium without perturbations, which explains them poorly.

In adapting level-k models to O'Neill's game, we define L0 using the same notions of salience and players' responses to it as for RTH's games, and the same estimated type frequencies. Thus, in our proposed model with a role-symmetric L0 that favors salience, L0 chooses A, 2, 3, J with probabilities a, (1-a-j)/2, (1-a-j)/2, j (treating 2 and 3 equally), where a > 1/4 and j > 1/4. The model with a role-symmetric L0 that avoids salience is the same, but with a < 1/4 and j < 1/4. The Bacharach and Stahl–style model with a role-asymmetric L0 has  $a_1 < 1/4$  and  $j_1 > 1/4$  for player 1s (hiders when they choose A, seekers when they choose J) and  $a_2 > 1/4$  and  $j_2 < 1/4$  for player 2s. 2s

 $^{25}$  Our proposed model's choices remain the same whenever 3a+j>1, even if a<1/4 or j<1/4, with similar relaxations for the alternative model with a role-symmetric L0 that avoids salience and the alternative Bacharach and Stahl-style model with a role-asymmetric L0 that favors salience for seekers but avoids it for hiders. Figure A3 in the Web Appendix, like Figure 3 for RTH's games, graphs the regions in (a,j)-space for which L0 yields each possible choice for L1 player 2s or 1s. For each model, we choose the region that is consistent with its constraints and that yields the best fit, given the type frequencies estimated for that model from RTH's data. In our proposed model, a>1/4 and j>1/4 (or the weaker condition 3a+j>1) restrict L1 player 1s and 2s to one of three choice combinations: J

TABLE 6—COMPARISON OF THE I	LEADING MODE	LS IN RAPOPORT	AND BOEBEL'S	GAME
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Model Parameter estimates		О	Observed or predicted choice frequencies						MSE, Tr. 2
		Player	С	L	F	I	0		
Observed frequencies, Treatment 1 (10 Player 1s, 10 Player 2s)		1 2	0.1000 0.8000	0.0000	0.2000 0.0000	0.6000 0.1000	0.1000 0.1000	_	_
Observed frequencies, Treatment 2 (10 Player 1s, 10 Player 2s)		1 2	0.1000 0.2000	0.1000 0.6000	0.1000 0.2000	0.6000 0.0000	0.1000 0.0000	- -	_ _
Equilibrium without perturbations		1 2	0.3750 0.3750	0.2500 0.2500	0.1250 0.1250	0.1250 0.1250	0.1250 0.1250		0.0650 0.0380
Level- <i>k</i> with a role-symmetric <i>L0</i> that favors salience	m > 2/5, n > 1/5 3m/2 + n > 1	1 2	0.3085 0.4657	0.3488 0.1593	0.0612 0.0618	0.2204 0.2514	0.0612 0.0618	0.0660 0.0331	
Level- <i>k</i> with a role-symmetric <i>L0</i> that favors salience	m > 2/5, n > 1/5 3m/2 + n < 1	1 2	0.3796 0.4107	0.4369 0.2204	0.0612 0.1230	0.0612 0.1230	0.0612 0.1230		0.0970 0.0449
Level- <i>k</i> with a role-symmetric <i>L0</i> that avoids salience	m < 2/5, n < 1/5 2m + 3n < 1	1 2	0.0944 0.4864	0.5420 0.1812	0 0.1213	0.3636 0.0898	0 0.1213	0.0799 0.0293	0.0543 0.0573
Level- <i>k</i> with a role-symmetric <i>L0</i> that avoids salience	m < 2/5, n < 1/5 2m + 3n > 1	1 2	0.1843 0.4565	0.5462 0.1371	0.0898 0.1355	0.0898 0.1355	0.0898 0.1355		0.0933 0.0642

Table 5 summarizes the observed choice frequencies and the alternative models' predicted frequencies and MSEs for O'Neill's game, with equilibrium (without perturbations) as the best-fitting equilibrium model, and using Table 3's RTH estimates of s, t, u, v, and  $\varepsilon$  for the level-k models. Our proposed level-k model with a role-symmetric L0 that favors salience has lower MSE than any of the alternatives. This model makes J modal for player 1s and 2s and in one case reproduces its greater prevalence for 2s, so the same behavioral assumptions we used to explain the prevalence of central A and its greater prevalence for seekers in RTH's experiments explain O'Neill's Joker effect.

for player 1s and A for player 2s (when 3j - a > 1); 2,3 for player 1s and A for player 2s (when 3j - a < 1 and a + 2j > 1); or 2,3 for player 1s and J for player 2s (when a + 2j < 1, which given 3a + j > 1 implies 3j - a < 1). In the model with a role-symmetric L0 that avoids salience, L1 player 1s and 2s are similarly restricted to A for player 1s and J for player 2s. In the Bacharach and Stahl—style model, L1 player 1s' and 2s' choices can be chosen independently from  $\{A; 2,3\}$  for player 1s and  $\{A; 2,3; J\}$  for player 2s.

<sup>26</sup> Tables A3 and A4 in the Web Appendix, like Table 2 for RTH's games, give types' expected payoffs and choice probabilities for our proposed model in O'Neill's game in the leading regions.

Adapting the equilibrium with perturbations model to Rapoport and Boebel's game raises new difficulties. Although their game is very close in structure to the games of RTH and O'Neill games, it no longer makes a player unambiguously a hider or seeker for all choices, and so allows no plausible, parsimonious parameterization of perturbations.27 We could use a more flexible parameterization and just "let the data speak." But this would take us farther from the general notions of instinctive reactions to salience we used to adapt the perturbations from RTH's to O'Neill's game, and even a parameterization as tight as we used for those games tends to overfit (Section V). The prospects for a useful equilibrium with perturbations analysis of Rapoport and Boebel's results seem dim.

In adapting level-k models to Rapoport and Boebel's game, we assume that their L0s respond to salience qualitatively as in RTH's and O'Neill's games. We assume that the abstract labels C, L, F, I, O are not salient per se, but

<sup>&</sup>lt;sup>27</sup> Player 1 (2) is a seeker (hider) for location C. When C is eliminated, player 1 (2) is a hider (seeker) for location L. But even when L and C are eliminated, the player roles for location F cannot be classified this way.

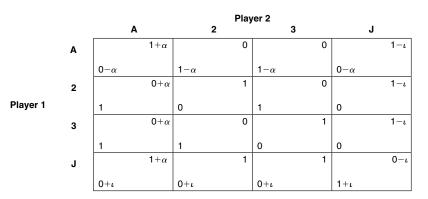


FIGURE 6. O'NEILL'S CARD-MATCHING GAME WITH PAYOFF PERTURBATIONS

that the end and center locations are inherently salient (Attali and Bar-Hillel 2004). Thus, in our proposed model with a role-symmetric L0 that favors salience, L0 player 1s and 2s both choose C, L, F, I, O with probabilities m/2, (1-m-n)/2, n, (1-m-n)/2, m/2 (again treating end locations equally), with m > 2/5 and n > 1/5. The alternative model with a role-symmetric L0 that avoids salience is the same, but with m < 2/5 and n < 1/5. <sup>28</sup> However, specifying a Bacharach and Stahl–style model with a payoff-sensitive, role-asymmetric L0 raises difficulties like those for equilibrium with perturbations, in that there are no natural restrictions on m and n.

Table 6 summarizes the observed choice frequencies and the alternative models' predicted frequencies and MSEs for Rapoport and Boebel's game, with equilibrium (without perturbations) as the best-fitting equilibrium model, and using Table 3's estimates of s, t, u, v, and  $\varepsilon$  for the level-k models, choosing among regions as for O'Neill's game (footnote 25). None of the models fits well, which may reflect the large variation in player 2s' frequencies of C and L across their treatments. Our proposed level-k model has MSEs lower than equilibrium and the level-k model that avoids salience except for player 2s in treatment 2, which are best captured

by equilibrium. Our proposed model reproduces a small fraction of the I effect for player 1s in both treatments and the C effect for player 2s in treatment 1, but it completely misses the L effect for player 2s in treatment 2.

#### VII. Conclusion

This paper has compared alternative explanations of the systematic deviations from equilibrium in RTH's experiments with hide-and-seek games with nonneutral framing of locations, and in O'Neill's and Rapoport and Boebel's experiments with closely related games. Our analysis explores the issues that arise in specifying level-k and alternative models for games played on nonneutral landscapes. It then shows that a structural nonequilibrium model of initial responses based on "level-k" thinking, with a payoff-insensitive anchoring L0 type, can explain RTH's results, including their puzzling role-asymmetries, without assuming differences in behavior across roles.

Our proposed model fits RTH's data slightly worse than some of the alternatives, but we find its explanation of their results more convincing because its assumptions seem behaviorally more plausible and it (alone) does not rely on unexplained role differences in behavior or payoffs. Our analyses of overfitting and portability give support for these subjective judgments. They also trace the model's advantages to two features. First, it is based on general decision rules or "types" that apply to any game, whose population frequencies tend to be stable across

<sup>&</sup>lt;sup>28</sup> In each case, *L1* player 1s' and 2s' choices remain the same under weaker conditions. Table A5 in the Web Appendix gives types' expected payoffs and choice probabilities for our proposed model in Rapoport and Boebel's game in the leading regions.

different games. Second, its L0 is based on simple principles—how salience is determined by the set of decisions and their framing, and how people respond to it—for which there is strong support, whose simplicity facilitates transfer to new games, just as the sensitivity to the details of the structure of alternative specifications of L0 or the payoff perturbations in an equilibrium model inhibit transfer.

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