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Steal the Show

Payoff Effect on Accuracy of Behavior-Prediction in Real High-Stake Dilemmas

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Abstract:

Our study explores the ability to predict players' behavior in a Prisoner's Dilemma (PD) type of game. We use "Split or Steal" video clips – a televised game show depicting a (very) high stake version of PD-esque game. Based on relevant psychological and economic literature, our main hypothesis is that motivated observers will predict the players' decisions more accurately than non-motivated observers. In order to examine the effect of incentives on prediction accuracy, we vary the reward for correct predictions; we conjecture that the bigger the reward, the more accurate the prediction. In addition, we explore correlations between the observers' accuracy and the players' decisions. We hypothesize that observers will more readily believe the players and consider them cooperators than assume that they will defect.

Introduction:

The idea that people can predict others' intentions or decisions from their behavior is rooted in several decades of research regarding verbal and nonverbal behavior. Studies have shown that observers are able to distinguish between cooperators and cheaters in social situations, and in particular in the Prisoner's Dilemma (PD). In our paper, we utilize video clips taken from a televised PD-type game show involving very high stakes. It has been shown that highly significant situations produce more emotions and thus make intentions more predictable. Hence, game shows provide an excellent study opportunity for the ability to deduce decisions. Specifically, we explore whether observers' motivation to predict these decisions correctly influences their accuracy de facto. The rest of the paper shall proceed as following:

In Section 1 we will review the relevant literature. Section 1.1 will consider evidence regarding differences in behavior between liars and truth-tellers. Section 1.2 and 1.3 will review the body of research examining the ability to detect lies and cheaters. These studies typically find that people are not able to discern intention or judge veracity very well or even above-chance. However, this result seems to depend on the methodology used and the questions asked. In section 1.4, we mention a related body of research examining the detection of altruists.

We feel the study of social dilemmas, or "games" in the game theoretic sense, can be beneficial and informative in answering the question of discerning intentions or decisions from behavior – particularly so the PD game. In Section 1.5 we elaborate on the PD game, both theoretically and empirically. A significant fraction of players are conditionally cooperative; they cooperate only to the extent their opponent reciprocates. This, to us, relates the importance of interpreting and predicting behavior in such settings. We discuss this in light of evolutionary models showing that cooperation is reasonable only when encounters between players are not random, due to selection or signaling. Section 1.6 presents studies that examined behavior prediction in such a setting. We also review studies demonstrating higher recall or identification rates for cheaters' faces in a PD game compared to other faces when forming immediate impressions.

Section 1.7 considers the effect that motivation has on behavior and physical attributes, and on their predictability. The importance or consequences of behavior affects its presentation, and this is especially evident when the stakes are high. Players' emotional state and behavioral changes become more apparent the bigger the stakes they face. The influence of motivation on observers is less clear, and might depend on situation characteristics.

In light of all the above, we claim that high stake social dilemmas provide an excellent opportunity to study behavior – and its predictability. We claim further that game shows are an example of such a high stake situation, allowing us to observe behavior and predictions that occur in the real world and are of high significance. In section 1.8 we review statistical analysis of PD-type game show data. There appears to be a significant correlation between players' decision and their opponents' decision, implying above-chance distinction between cooperators and cheaters. We also present a study examining observers' predictions and their updating in such a setting.

In section 2 we shall elaborate our hypotheses, concerning observers' accuracy rate in predictions, and the effect of incentives on accuracy. Our main hypothesis is that motivation will lead to more accurate predictions. We hypothesize also that predictions will be biased towards cooperation. This hypothesis entails that accuracy rates for predicting defection will be higher than for predicting cooperation, as going against a cooperation bias requires (we suppose) perceiving distinctive behavioral attributes of defection.

The experimental design and the results are presented in section 3. We presented our participants with four video clips of the PD-esque "Split or Steal" game and asked them to predict the players' decisions. We manipulated the participants' motivation by promising them a high reward if they correctly predicted one of the two players in each clip, and a low reward for the other. The high-payoff ("Critical") player was introduced before the participants watched the clip; participants were asked about the low-payoff ("Non-critical") player only after watching the clip and predicting the Critical player's decision. This procedure enables testing the influence of incentives or motivation on accuracy within-subject, as well as influences of the players' decisions.

The results confirmed our hypotheses. Participants' responses demonstrate a cooperation bias; the frequency of cooperation predictions is twice that of defection predictions (while target decisions in the actual data had an opposite bias, with a slight majority of defectors). Accuracy rates of participants' predictions matched the pattern suggested by our hypotheses: We found that the accuracy rate for targets who chose to cooperate was significantly higher than participants' accuracy rate for defectors. We observed also that participants were correct most of the times they predicted a target will defect, compared to their below-chance accuracy rates when predicting cooperation (which is to be expected considering the hypothesized – and observed – response bias). This pattern of results implies that while people lean towards believing what they see or are told, they have some intuition as to who is lying or will behave anti-socially that enables correct distinction between different types of behavior.

Our hypothesis concerning the effect of motivation on the prediction accuracy was only partially supported by the data. Incentives indeed increased the participants' accuracy rate when predicting the targets' decisions, but this effect was mediated by the targets' decision de facto: Only when observing defectors (those who subsequently chose to defect) did the motivated participants succeed more than the unmotivated participants. When looking at cooperators, motivation had no influence on the participants' accuracy. Interestingly, unmotivated participants, who received only a small reward for accuracy, predicted the same rate of cooperation for both (de facto) cooperators and defectors. High motivation, via a high accuracy reward, led to a decrease in predicted cooperation for targets who chose to defect. That is, the targets' actual decisions influenced the participants' predictions only when the targets were important to the participants. These results imply that the (monetary) significance of prediction positively affects its accuracy. However, the effect of incentives is observed only when regarding defectors (cheaters). This seems to imply that prediction accuracy can be increased only where there are clues that, when noticed, reveal information that change the prediction from the default alternative.

We discuss these and further results, as well as a few caveats to our experiment in section 4. We also suggest future research directions.

Section 1: Related Literature:

1.1 What's in a Lie?

In an ideal world, people do not lie; they always tell the truth, so there is no need for special skills that enable cheating or lie detection. However, on second thought it seems that society as we know it would not exist without certain types of lies (e.g. "white lies", "tact" or "manners"). People lie or fib about numerous subjects, with varying intentions and distance from the truth. Lies can be about actions, opinions, feelings or thoughts, objective facts, intentions and so forth. These differ not only in content, but also in structure, in the emotions they trigger and the amount of mental effort demanded to produce them, as well as the behavior exhibited – facial expressions and body movement, and the semantic, syntactic and verbal aspects of the message. Ekman (1985/2001) proposes two criteria that define a lie. The first is intent – the speaker consciously intends to deceive his listeners. The second is the listeners being unaware of deceit; a magician is not a liar as his crowd is aware of his trickery.

Numerous studies examined the markers and clues that enable discerning truth tellers from liars (e.g. Ekman, 1989; DePaulo & Morris, 2004; Vrij & Mann, 2004; Vrij, Akehurst, Soukara & Bull, 2004; DePaulo, Lindsay, Malone, Muhlenbruck, Charlton & Cooper, 2003). There exist some behavioral patterns that discriminate between lies and truth, which can be observed in most situations - if you know what to look for. Studies have found different and conflicting behavioral patterns, which could result from differences between lie types, the amount of cognitive effort they impose, the risks in getting caught versus the reward of getting away with it, and so forth (Vrij, 2008). But there are consistent findings across studies: When lying, people are more tense and nervous – and this manifests in their behavior as well as physical characteristics, e.g. pupil size, tone of voice, and a stronger tendency to purse lips compared to truth tellers; Fake emotional facial expressions (e.g. smile, surprise) are different from their spontaneous counterparts (Ekman, 1989). People will often try to control their behavior, body language and voice, as they are aware of the leakage of their true emotions and thoughts (Ekman & Friesen, 1969). However, this control can also backfire, making liars appear more rehearsed and less natural or spontaneous (Vrij & Mann, 2004). Liars tend to speak less than truth tellers: Interactions are shorter, contain less words and detail, and are less logical or plausible. Liars relate less to themselves while conversing, tend to repeat themselves, and are less eloquent (Ekman, 1989; DePaulo & Morris, 2004). In contrast, Vrij & Mann (2004) claim that liars explicitly tend to be less repetitive and be more eloquent, which makes them sound too rehearsed or planned, as normal speech usually contains certain errors and pauses. Liars, unlike truth-tellers, usually do not admit errors or correct themselves while talking, or admit to faulty memory (Vrij, Mann & Fisher, 2006; Vrij, 2008). Interestingly, certain behavior patterns like gaze aversion or fidgeting, that are considered to be clues for deception, have not been found to discriminate between liars and truth tellers in research.

Vrij & Mann (2004) coded the behavior of lying and truth telling subjects in video clips, and found that by using behavioral – verbal and nonverbal – characteristics, their model could discriminate between truths and lies with a 80% accuracy level. Similar results have been found by Vrij et al (2004), who conducted their research on children as well as adults. Vrij et al found that while some behavioral patterns that distinguish between liars and truth-tellers differ between children and adults, there are some attributes which consistently predict veracity – with an accuracy level of up to 88% (slightly higher than that of the polygraph; National Research Council, 2003).

1.2 Lie Detection

It seems clear that in daily life, people are not detection machines, nor do they explicitly attune to cues that may aid in the detection of deception. In fact, even if they know what cues to attend to, they may not want to detect lies (Vrij, 2008; Ekman, 1996). Many studies explored the existence of an ability to discriminate lies and truth (see Bond & DePaulo, 2006, for a comprehensive review). In most of these, participants view video clips of others telling either lies or truths, and asked to judge the message veracity. Contrary to intuition and the abundance of cues, it has been ubiquitously found that most people cannot detect lies above the 50% chance level. Bond & DePaulo's meta-analysis of 206 studies, with subject pools encompassing both students and people who are accustomed and supposedly good at this detection such as law officers and psychologists, found an accuracy rate of 54%. This result did not depend on familiarity of the speaker, lie type or on the risks or incentives associated with lying. However, findings concerning participants' profession or their experience with lie detection differ: Some observed a somewhat positive effect of training or experience on accuracy (Ekman & O'Sullivan, 1991; Porter, Woodworth &

Birt, 2000), yet others have found no effect (Bond & DePaulo, 2006; Hartwig, Granhag, Stromwall & Vrij, 2004), or even a negative effect (Kassin, 2004).

It appears that people tend not to consider valid behavioral cues, and not only that, but they do rely on other patterns and behaviors which have no discriminative value (Ekman, Friesen O'Sullivan & Scherer, 1980; Akehurst, Kohnken, Vrij, and Bull, 1996; Vrij, 2008). Bond & DePaulo (2006) also observed that facial expressions did not help accurate detection – in accordance with leakage theory, which claims that it is easier to control the face than other behavioral aspects (Ekman & Friesen, 1969). Auditory cues slightly increased accuracy compared to when using only nonverbal information (concurring with Ekman, Friesen, O'Sullivan & Scherer, 1980).

Interestingly, Bond & DePaulo (2006) found that the correct identification rate of true messages is higher than that of false messages: People tend to classify more true messages than false messages correctly. This corresponds to Spinoza's (1677) idea that claims are automatically perceived as real and true, and tend to remember them as such regardless of their known veracity while coding; Falsifying, or even checking veracity, is done only when the perceiver has the mental ability and motivation to do so (Gilbert, Tafarodi & Malone, 1993). Support for this claim comes from a study done by Ekman, O'Sullivan & Frank (1999), which included professional lie detectors - policemen, investigators and clinical psychologists. They found that experience did matter, but even so, accuracy rates did not significantly differ (agreeing with previous research). The differences between experience groups was found to be due to differences in accuracy rates in classifying lies, not truths: All groups were similar in their accuracy rates when viewing true messages, but the experienced groups were better at discerning lies (a finding that could be due to an increased tendency to report messages as lies). This data pattern was replicated by Meissner & Kassin (2002) and Kassin, Meissner & Norwick (2005).

1.3 Different Methods, Different Results

Reviewing detection literature, it appears the success or accuracy rate depends on the method being used to extract subjects' opinions. Participants in most studies are asked to provide an explicit and conscious judgement as to the veracity of statements. Although this methodology seems to be reasonable, not unlike police investigations, psychological assessment, jury decisions and so forth, the matter is not so simple. Nonverbal behavior is mostly non-deliberate and unconscious – clues as to thoughts, expectations and emotions are very subtle and quick, difficult to pinpoint explicitly (Vrij & Mann, 2004; Ambady, Bernieri & Richeson, 2000).

In this line of thought, researchers have examined the ability to judge and discriminate lies both explicitly and implicitly, comparing the accuracy rates between these two methods or methodologies (DePaulo, Rosenthal, Green & Rosenkrantz, 1982; DePaulo, Jordan, Irvine & Laser, 1982; Hurd & Noller, 1988; Anderson, DePaulo & Ansfield, 1999). It has been observed that asking for judgements regarding mental effort, stress or emotion (ambivalence, empathy) leads to better discrimination between false and true messages than asking for direct veracity judgements (DePaulo, Rosenthal et al, 1982; Vrij, Edward & Bull, 2001). DePaulo, Jordan et al (1982) found that these indirect judgements also allow differentiation between lies and truth from a younger age.

Hurd & Noller (1988) asked participants to think aloud while viewing true and false messages, and while accuracy of explicit judgements was no higher than chance, participants were more likely to consider the message false when it was false de facto. Anderson et al (1999) similarly found that while participants' accuracy rates in making explicit judgements were not higher than chance, they indicated using different behavioral cues when viewing false and true messages. These studies thus imply that while there is some intuition or implicit detection of lying, it does not come into play when making explicit decisions.

Albrechtsen, Meissner & Susa (2009) examined the intuitive ability to discern lies by decreasing participants' mental resources or the amount of time spent on detection. In one experiment, participants were shown either full or short sliced video clips, with the sliced clips supposedly causing more intuitive processing (Ambady & Rosenthal, 1992), and asked about message veracity. Participants in the thin slice condition were found to be more accurate in their judgements than the full video group – and only the thin slice group performed better than chance. In another experiment, only interrupted participants, who had less mental resources to dedicate to the lie detection task (compared to two control groups), performed better than chance. This group was also more inclined to believe messages and judge them as truthful, much like the aforementioned observed truth bias (Bond & DePaulo, 2006; Ekman et al, 1999; Gilbert et al, 1993).

1.4 Altruist Detection

The notions of altruism and cooperation are closely related to those of lying or cheating (while not complementary). A number of studies explored the ability to identify altruists (Brown, Palameta & Moore, 2003; Oda, Yamagata, Yabiku & Matsumoto-Oda, 2009). Brown et al (2003) conducted three experiments designed to explore the ability to recognize and distinguish altruists from others. In their studies, Brown et al classified people as altruists and non-altruists using a self-report questionnaire, and taped them while telling a story, introducing themselves or playing a game with a member of the other group. Participants were asked to judge the taped individuals on a number of behavioral and personality related variables. There was above-chance accuracy level in identifying altruists, who were perceived as being more helpful and expressive than non-altruists. Altruists were also found to produce more genuine smiles (shorter, more symmetric), as well as more head nods and concern expressions (a pattern observed also by Mehu, Grammer & Dunbar, 2007; Schug, Matsumoto, Horita, Yamagishi & Bonnet, 2010). Oda et al (2009) conducted a study similar to that of Brown et al, and corroborated their results. The above-chance distinction between altruists and non-altruists seems to derive from differences in impression; altruists appear to be judged by their propensity to take part in social interactions and be helpful in them.

Research about impression formation supplies additional evidence to the influence of facial expressions and appearance on trust or the perception of cooperation (Todorov, 2008; Oosterhof & Todorov, 2008; Todorov & Duchaine, 2008; Todorov, Pakrashi & Oosterhof, 2009). Judgements of face trustworthiness can help infer intentions and consequent behavior even when there are no obvious emotional cues available, and are correlated with overall valence judgements of the face (Todorov, 2008; Oosterhof & Todorov, 2008). It appears that such trustworthiness recognition is immediate, and may even happen subliminally: Discrimination between trustworthy-and untrustworthy-looking faces occurs even after a 33ms exposure; it increases with exposure time, but does not improve with exposures longer than 167ms (Todorov, 2008; Todorov et al, 2009). Todorov & Duchaine (2008) additionally show that even prosopagnostic participants, impaired in processing and identifying faces, are able to judge trustworthiness of faces – agreeing with healthy control participants.

Interestingly, research examining detection of cooperation seems to demonstrate a significant ability to differentiate or distinguish between different types of behavior.

This is encouraging, especially compared to aforementioned studies concerning lie detection. Nevertheless, it should be noted that both of these abilities – to detect lies or cooperation – are more critical in social settings, and should be explored in such. The next section deals with this issue.

1.5 Interaction and Social Situations

Identification of behavior – anti-social or pro-social – is especially important in social context. In contrast to the settings in most studies described above, lies and altruism usually occur and are significant in interactions.¹

A way to solve this issue arises from social dilemmas, studied extensively in game theory as well as social psychology and experimental economics (e.g. Dawes, 1980; Dawes & Messick, 2000; Camerer, 2003). Social dilemmas are situations where each player has an obvious preferred action ("defection"), yet if this action is to be taken by all the players, the outcome will be sub-optimal: All players will lose or gain less compared to when all the players choose the dominated action ("cooperation"). Examples of social dilemmas are salient in daily life as well as in research. A ubiquitous example is the PD game, which can be represented by the payoff matrix depicted in table 1.1.

In this game, it is beneficial for each player individually to defect rather than cooperate; this reasoning naturally leads to the mutual defection outcome, inferior for both players to the mutual cooperation outcome. The best outcome for each player is the one where they defect and their partner cooperates. Game theoretic analysis, when assuming narrow rationality (players are selfish and only care about their own reward) thus predicts a 100% defection rate.

Table 1.1: PD payoff matrix									
		Play	ver 2						
		Cooperate	Defect						
Dlovon 1	Cooperate	B,B (e.g. 3,3)	0,A (e.g. 0,4)						
Player 1	Defect	A,0 (e.g. 4,0)	C,C (e.g. 1,1)						
Payoffs are ordered: A>B>C>0									

The behavior observed in PD games (in labs or in the field) contradicts the selfishness or individually-rational assumption (see Dawes, 1980; Camerer, 2003): Cooperation rates are significantly higher than the predicted null, across populations,

¹ A related criticism was noted by Frank (2005): Judging taped communications does not in fact mimic most natural situations involving lying; lies are told to a specific person in a specific setting – not to anonymous people who are not even present in the situation.

experimental conditions and payoffs. It has been observed that a large fraction of players are conditionally cooperative, that is, choose to cooperate if and only if their opponent cooperates (Axelrod, 1984; Fischbacher, Gachter & Fehr, 2001).

It seems that this correlation or dependence between players' decision implies that interpretation of intentions or communication is crucial. This claim is supported by evolutionary models showing that a cooperative strategy (which benefits players only if they both choose it) can exist in a population – even thrive – only if encounters between its members are not random (Eshel & Cavalli-Sforza, 1982; Guth, 1995; Fehr & Fischbacher, 2005; Janssen, 2008). That is, when individuals have some (active) selection process which leads them to meet some but not other types of individuals, as defined by their strategies. Hence, cooperative players will benefit only to the extent that they can distinguish and select other cooperative players. Eshel & Cavalli-Sforza (1982) comment also that a correlation between the tendency to cooperate and the ability to select or identify others is natural, given there is evolutionary feedback.

1.6 Prediction in Interaction

When players can interact with each other, and especially when such interaction is non-binding ("cheap talk"; see Farrell & Rabin, 1996), it becomes a real and crucial advantage for the individual to correctly guess or estimate their opponent's intentions. In light of the aforementioned literature we assume this can be done (at least partially) through interpretation of physical and behavioral cues.

Research seems to support this claim (Frank, Gilovich & Regan, 1993; Yamagishi, Kikuchi & Kosugi, 1999; Brosig, 2002). Frank et al (1993) had participants communicate with each other before playing a PD game. After the "cheap talk" phase and before play, participants were asked to predict what the two others would choose, and decide on their own course of action. The predicted cooperation rate was 81%, quite close to the actual rate of 73%. Thus, the accuracy rate of cooperation predictions was 81%, while 57% of defection predictions were correct – both significantly higher than chance. Brosig (2002) replicated these results, finding a predicted cooperation rate of 74%, with 67% accuracy. Cooperative participants were also more accurate predictors than individualists (corroborating the expected patterns discussed in section 1.5). It should be noted that participants who chose to cooperate were more likely than individualists to predict cooperation (81% vs. 70%). Similarly, Yamagishi et al (1999) found that more trusting people (via self report) are more accurate – compared to low trusters – in predicting their opponent's decision in a PD. This effect was independent of whether the decision was to cooperate or defect.

Yamagishi, Tanida, Mashima, Shimoma & Kanazawa (2003) photographed people playing a PD game, and classified them as cooperators or defectors by their decisions. Defectors' faces were recognized more than cooperators'. They were also more likely to be falsely recognized, that is, participants believed that they recognized them even when they have not seen the faces before. Chiappe, Brown, Dow, Koontz, Rodrigues & McCulloch (2004) found that defectors were rated as more important to remember, and were looked at longer than cooperators. A similar result was found by Vanneste, Verplaetse, van Hiel & Braeckman (2007), in that unfamiliar defectors' faces attracted more automatic attention (in a dot probe design) than those of cooperators. This effect was more pronounced when the photographs were taken in a PD game with monetary gain. Accordingly, Verplaetse, Vanneste & Braeckman (2007) observed that participants were able to distinguish between cooperators and defectors only when photographs were taken during decision making in an incentivized round, and not in a practice round or prior to playing.

It appears that people are able to distinguish between different types of behaviors – specifically cooperation and defection (cheating) – when these occur in social settings; this is true when viewing multi-faceted behavior as well as when viewing still photographs. It may be the case that this distinction is at least partially due to the significance of these situations to the observer and the players. The next section shall elaborate on the effects of significance and payoff on the ability to discern intentions.

1.7 Motivation and Incentives

Studies concerning emotional expression have consistently shown that motivation (or importance of a task or situation to the individual) is critical. The stakes of the game or situation do not only affect the state of mind, but also the emotional state and behavior. High stake situations, where the individual has a lot to lose or gain – monetary or otherwise – induce strong emotions; these can and typically do leak through the individual's behavior, facial expressions, body movements and various other attributes (DePaulo et al, 2003; DePaulo, Kirkendol, Tang & O'Brien, 1988; Ekman & Friesen, 1969).

However, most experimental settings are not highly consequential for participants, and thus it is difficult to infer natural lie (or cooperation) detection abilities from them (Frank, 2005; Ekman, 1996). Most messages and particularly lies in such experiments are artificial and told to the request of experimenters. Participants have little to no motivation to succeed in their deception; they do not much benefit from successful deception or suffer from failure, if at all. This problem is accentuated by studies such as those of Vanneste et al (2007) and Verplaetse et al (2007) mentioned above, where the differentiation of cooperators from defectors was observed only in incentivized games, implying an impact of stakes on behavior and facial expressions.

Frank & Ekman (1997) argue further that not only are high stake situation different from small stake ones, but that the ability to identify lies could be generalized across situations when the stakes are high: While behavioral cues differ and are situation-specific when the stakes are small, high-stake situations induce similar responses regardless of specific details. In their study, Frank & Ekman taped participants in two somewhat-high-stake situations, and asked others to make binary decisions of message veracity. Accuracy scores were similar across scenarios, and a significant correlation was found between the scores for the two scenarios, lending support to the research hypothesis.

In contrast with the well documented influence of motivation on participants involved in social interactions or dilemmas, evidence as to the effect of incentives on observers seems to be mixed. Some experiments found that motivation increased prediction accuracy (Klein & Hodges, 2001; Biesanz & Human, 2010). Klein & Hodges (2001) examined men and women's empathic accuracy. Participants of both genders did significantly better when rewarded monetarily for correct guesses. Interestingly, the influence of incentives also nullified the gender difference. Biesanz & Human (2010) observed that motivated observers are indeed more accurate in their judgements of others, and captured more distinctive attributes (rather than normative ones), than did non-motivated observers. Other studies found an adverse effect of incentives on performance, when simply rewarding or not rewarding enough led to poorer accuracy rates (Porter, McCabe, Woodworth & Peace, 2007; Forrest & Feldman, 2000): Motivating participants significantly decreased their accuracy rate in a lie detection task akin to those detailed in section 1.2.

Forrest & Feldman (2000) suggest that nonverbal cues rather than verbal ones are those which are more likely to indicate lies. As nonverbal cues are interpreted unconsciously, motivation may decrease detection accuracy by causing over-thinking or second-guessing (Ambady et al, 2000; Patterson, 1995; Tracy & Robins, 2008; Dunning & Stern, 1994). This claim has support in a different line of research, examining unconscious thought: In certain situations, it seems, people make better decisions when they are not attuned to the task at hand, or are distracted while asked to perform it, e.g. think about the possible choice alternatives (Dijksterhuis, 2004; Lassiter, Lindberg, Gonzalez-Vallejo, Bellezza, & Phillips, 2009; Dijksterhuis, Bos, van der Leij & van Baaren, 2009; Waroquier, Marchiori, Klein & Cleeremans, 2010).

Gilbert & Krall (1988) claim that these conflicting results may be caused by processing differences: While verbal processing requires controlled processes, perception of nonverbal cues is more automatic, perhaps even done unconsciously. They observed that participants with less cognitive resources tended to rely on nonverbal cues rather than verbal ones. Hall, Blanch, Horgan, Murphy, Rosip & Schmid Mast (2009) correspondingly found no effect of motivation (monetary or otherwise) on participants' emotional sensitivity when asked to interpret nonverbal cues, concurring with its supposed unconscious nature. In contrast, motivation had a positive effect when the task required verbal (controlled) processing.

The aforementioned results highlight the interest in studying whether – and how – motivation (incentives) affects observers' predictions in situations where there are both verbal and nonverbal attributes. This is especially intriguing when these two informational channels are very strong and apparent, and contain contradictory messages – as in cases of "leaking" liars. Hence, we suggest that the ability to detect deception, as well as a motivational effect, be tested in significant situations; in these cases, nonverbal information is particularly salient and consistent. That is, prediction accuracy should be in a setting involving definite and distinct behavioral patterns.

1.8 Games in Game Shows

High stakes can be found in various circumstances, although it can be argued that most daily life involves small stakes and situations of little importance. High stake situations can, for example, involve big amounts of money that can be gained, earned or lost, depending on the individual's behavior – as well as the behavior of those around them, on interactions that take place and interpretation of behavior. While participants in some laboratory experiments are paid for their effort, and do indeed

take their payoffs seriously, it cannot be regarded as a situation where a lot is at stake. At least, not in the way game shows are.

We feel that using game show data provides an excellent opportunity to test high stakes, social interactions and behavior. As well as involving very large amounts of money (the magnitude of which is enviable by most research institutions), game shows are less controlled and sterile than lab experiments, and their participant-population more diverse. In this paper, we shall utilize episodes of the British game show "Golden Balls", and specifically its final stage "Split or Steal" which is much akin to a PD game.² The game consists of two contestants playing on a jackpot determined by randomly picking balls with monetary amounts written on them. The jackpot is to be distributed according to the two contestants' decisions in the following way: If both choose "Split", the jackpot is split equally between them; if both choose "Steal" gets the entire jackpot while the other receives nothing. The payoff matrix is presented in table 1.2 with "x" marking the jackpot amount.

Table 1.2: Split or Steal payoff matrix									
		Play	yer 2						
Split Steal									
Dlovor 1	Split	x/2, x/2	0, x						
I layer I	Steal	x, 0	0, 0						
This payoff matrix is relevant also to the American and Dutch games, "Friend or Foe" and "Deelt ie 't of deelt ie 't niet".									

In the original PD game, the non-cooperative alternative is strongly dominant and guarantees the player a higher payoff than the cooperative alternative, regardless of the opponent's decision. In contrast, the non-cooperative choice in this PD-esque game is only weakly dominant: Regardless of the other player's decision, choosing to steal will guarantee no less (not strictly more) than choosing to split.

The game theoretic analysis of this game is quite similar to that of the original PD game, as detailed in section 1.5 above. As previously mentioned, behavior in the lab does not follow the game theoretic rationale for selfish players (i.e. players that care only about their own monetary incentives). It is especially interesting, then, to review similar behavioral statistics with regard to game show data. While it may seem trivial or negligible to discard half of the jackpot in order to be benevolent or cooperative

² Similar versions to the British "Split or Steal" game have been produced in the US ("Friend or Foe?") and in the Netherlands ("Deelt ie 't of deelt ie 't niet", translating to "Will they share or not?")

when the jackpot is small, will people still choose to do so when they have a lot (say, 100,000£) at stake?

List (2006) looked at 39 episodes of "Friend or Foe" (also represented by table 1.2). In this game, the contestants get to choose their partners, with whom they will play during the show and participate in the final PD-type stage in order to determine jackpot distribution. Cooperation rate was 50%, with a higher rate found among female contestants (56% compared to 48% for males). White contestants cooperated more than non-whites, and older contestants cooperated more than young ones, regardless of their partner. Cooperation rate was found to depend also on partner characteristics: Cooperation rate was higher for teams where both contestants were old, all-white, or those who were selected by each other. Two-female teams were a little more likely to reach the mutual cooperation outcome than mixed gender teams. There was no effect of jackpot size on cooperation, although partners' attributes influenced both jackpot size and contestants' decisions. Kalay, Kalay & Kalay (2003), Oberholzer-Gee, Waldfogel & White (2004), and Kalist (2004) analyzed "Friend or Foe" data and found similar patterns. Parallel results have been found in analyses of the Dutch "Deelt ie 't of deelt ie 't niet" game (Belot, Bhaskar & van de Ven, 2006) and the British "Split or Steal" game (Coffey, 2010).

Overall, it seems that the gender, age and race of the player play an important role in guiding the decisions. Evidence regarding the effect of opponents' characteristics on players' decisions is mixed. Some studies found no correlation between players' decisions (Belot et al, 2006; List, 2006), yet others found significant dependency (Oberholzer-Gee et al, 2004; Kalay et al, 2003). Oberholzer-Gee et al (2004) observed that in the second season of the show, players tend to condition their decision on their opponent's, using the opponent's characteristics to predict their decision. That is, there appears to be a tendency to play cooperatively against those who are expected to cooperate (women, older players, non-white), and to defect when matched with those more likely to defect. Correspondingly, the rate of coordinated play - mutual cooperation and mutual defection – increased, and players with cooperative attributes earned more compared to those who were assumed to be defectors. Kalay et al (2003) found that of all games, 21% ended in the mutual cooperative outcome, while 37.1% resulted in mutual defection, and 42% in the asymmetrical Cooperate-Defect outcome. This pattern implies a dependency between players' decisions, where a player choosing to defect is more likely to meet another defector (or induce their opponent to play in such a way). This evidence concurs with Oberholzer-Gee et al, and seems to lend support to models like those presented in section 1.5.

In order to testing the hypothesis that there exist some characteristics, attributes or behavior that enable discerning intentions of players (distinguishing cooperative from defective types), Belot, Bhaskar & van de Ven (2008) examined observers' predictions. They used clips from "Deelt ie 't of deelt ie 't niet", with particular interest in participants' updating of their predictions. Predictions were reported on a cooperation-probability scale (motivating them to be as accurate as possible) at 3 stages: Prior to viewing the clips, before the communication phase ("interim") and after it ("final"). Belot et al examined how the participants' predictions change based on their prior belief and the signals they receive (i.e. the video they watch). Analyses found a prior belief of 43% cooperation (identical to the actual average of 43%). This rate increased to 52% when predicting during watching the video. The predictions were influenced by the players' gender and their contribution to the jackpot, but the magnitude of these effects was smaller than that found in the actual game data (Belot et al, 2006). Importantly, the players' actual decision to cooperate had a significant positive effect on the predicted rate of cooperation. This effect was more pronounced when players explicitly and voluntarily committed to cooperation. It is interesting to note that the participants could differentiate between cooperators and defectors discern subsequent decisions – when the players' statements were made involuntarily (when they were explicitly asked by the host), but not when they stated cooperation voluntarily.³

We believe the question of the ability to perceive and interpret clues to deception or defection is of high significance. Studying observers' predictions and their updating conditional on communication, as is done by Belot et al (2008) can and do indeed seem to support the aforementioned claims as to existence of such an ability (e.g. Brosig, 2002; Eshel & Cavalli-Sforza, 1982; Vanneste et al, 2007). In our experiment we thus attempt to examine it further. Our study, while similar to Belot et al (2008) in its tools and stimuli, differs in a few important aspects. First, we ask our participants for one prediction only for each player (compared to 2-3 predictions in Belot et al's study), given after watching the whole relevant segment of the show. We believe that

³ This seems to point to an ability to discern intentions when players were forced to express their opinion, or forced to lie – further supporting the claim that artificial lies do not have much external validity as to natural differences between lies and truth, liars and truth-tellers (Frank, 2005).

this assessment may be closer to participants' first impression; it does not require or encourage second-thought or over-thinking, that could hinder automatic information processing and interpretation (Patterson, 1995; Tracy & Robins, 2008; Dunning & Stern, 1994). Second, the predictions given by our participants are binary choices. Belot et al asked their participants to report belief on a probability scale, which has been found to lead to different choices than binary scales, and not necessarily provide more accurate preferences or beliefs – even when participants are motivated to report their true opinions (Cronbach, 1946).

A different issue that was not covered by Belot et al is that of the motivation or incentives given to the observers. As discussed in section 1.7, varying incentives may affect observers' accuracy when they are asked to judge behavior, and particularly when regarding verbal behavior (Hall et al, 2009). We feel this potential influence is crucial to our understanding of the ability to predict decisions in a multi-faceted environment; we aim to examine it – and its correlation with other variables – in our study, detailed in the next sections.

Section 2: Hypotheses

<u>Hypothesis 1</u>: The more motivated the observers, the more accurate their predictions.

Cooperators and defectors differ in some behavioral attributes, which become especially evident in high stake situations causing strong emotional responses (DePaulo et al, 2003). We assume that the task of predicting players' decisions in the PD game, as well as in its version we use, is one of lie detection: All the players say or imply they intend to split (and indeed, they have a strong motive to convince their opponent of just that). We hypothesize that a higher reward for accuracy will cause observers to focus on and be more aware of players' behavior. If so, motivated observers will be better at seeing and interpreting these differences – and use them to predict players' decisions.

<u>Hypothesis 2</u>: Individuals will be biased towards predicting cooperation.

Literature suggests a truth bias (Gilbert et al, 1993; Bond & DePaulo, 2006), in that there exist an automatic propensity to believe people and statements. Only when there is sufficient contradictory evidence, or when suspicion is raised, then individuals will consider alternate versions. If people are biased towards believing players' statements, then they will be biased towards assuming cooperation. This hypothesis implies two hypotheses regarding the correlation between players' decisions and observers' predictions:

Hypothesis 2a: Prediction accuracy for cooperators will be higher than for defectors.

Higher prediction accuracy for cooperators is naturally derived from a cooperation bias; in the most extreme case, predicting only cooperation, it is clear that prediction accuracy rate for cooperators will be 100%, and 0% accuracy for defectors.

<u>Hypothesis 2b</u>: Prediction accuracy when predicting defection will be higher than when predicting cooperation.

In light of relevant literature, we assume that individuals tend not to predict defection unless they have some reason to do so. Such reasons include verbal and nonverbal behavioral clues, as stated above. Assuming there is indeed a cooperation bias, it can be assumed that a prediction of defection is based on strong enough evidence suggesting the player is lying and not about to cooperate.

Section 3: "Split or Steal" Experiment

Subjects: 48 students participated in the study in 4 sessions. Of the subjects, 23 were male and 25 female, mean age of 24.3 years (sd=5.38). They registered to the experiment through the lab webpage, and indicated that they agreed to participate. For their participation, subjects received a base amount of 10NIS, and an additional amount that was to be determined by the choices they made throughout the experiment.

Materials: The experiment was shown on PC computers with a screen resolution of 1024*768 pixels, to which a QWERTY keyboard and a headset were attached.

4 video clips were used, showing the "Split or Steal" part from the UK "Golden Balls" game show. Each clip showed the host explaining the game, and two contestants ("targets") engaging in cheap talk prior to making their decision. The money amounts varied from 17,810 to 100,130GBP. In 3 of the clips, the two targets were female, and in the other one, there was one male and one female. In 3 clips, the outcome was "Split"/"Steal", and in the 4th – "Steal"/"Steal". Mean length of the clips was 2:30 minutes, and they were shown at a screen resolution of 640*480 pixels.

We used a trust questionnaire adapted from Yamagishi & Yamagishi (1994) in order to evaluate participants' level of trust in others and society.

Design: The main dependent variable is the percentage of correct identifications or guesses subjects made regarding targets' choices. The independent variable is the motivation or the attention subjects allocated to the target: a target could be "<u>critical</u>" – subjects would get a large payoff (10NIS) for correctly guessing target's choice – or "<u>non-critical</u>" – a correct guess provides a small payoff (2NIS) to the subject. It is important to note that subjects were told they would have to guess for the non-critical target only after watching the first clip. Each target was critical for half of the subjects, and non-critical for the other half – which allows us to test for motivation effect on each target's decision predictability.

Subjects were asked to guess the decisions for all 8 targets. In each clip, one target was said to be critical and the other non-critical, which means each subject guessed for 4 critical targets and 4 non-critical targets. This permits testing the independent variable within-subject, regardless of individual predicting ability, as well as between subjects on targets' predictability.

Clip order was randomized between subjects. Half of the critical targets for each subject were on the right of the screen, the other half on the left.

Procedure: Subjects were led into the lab in groups of 12, and asked to sit at individual computer stations. They were instructed by the experimenter to sit quietly and not talk among or to themselves during the experiment. Subjects put on their headsets and began the experiment. The instructions were shown on the screen at an individually set pace, explaining the "Split or Steal" game and payoff structure. They were told that for each clip, they would have to guess the decision for one target, presented to them by his or her position on screen (right or left) – for a correct guess they would get 10NIS.

The clips were described as "part of episode number X", and the jackpot amount was presented. After viewing each clip, subjects were asked to indicate the choice they thought the (critical) target would make – Split or Steal – by pressing the corresponding key on the keyboard, as well as their confidence level for this judgement (on a 1-7 scale). After this, they were told they will now be asked to guess the other (non-critical) target's choice, and will be awarded 2NIS for a correct guess. Again, subjects marked their guess and confidence level. Between videos there was a 5 second break.

After completing the questions for all 4 clips, subjects were asked to indicate how much of the dialogs they understood (1-5 scale), how much they relied on different

verbal and nonverbal cues (1-7 scale) and completed the Yamagishi & Yamagishi (1994) trust scale. Subjects were also asked for a few demographic details and whether they knew the "Split or Steal" clips or the PD game beforehand.

After all subjects in each session finished the experiment, they were debriefed by the experimenter, and entered another room one by one to receive their payment.

Results:

Three out of 48 participants (three females, in different sessions) indicated they knew the "Split or Steal" game beforehand, and were excluded from data analysis. The average reward was 36.4 NIS per participant (including a 10 NIS show-up fee), with actual payoffs ranging from 22 to 44 NIS for 30 minutes of participation.

Correct identification (accuracy) rates were computed for each target, for each Criticality condition separately. This data is shown in figure 3.1, and in figure A.1 in appendix A. Analysis found no significant effect of criticality for any individual target except D1, who chose to steal (F(1,43)=5.4, p=.025).⁴

Subject sex did not have any effect on accuracy rates, and neither did the session the subject participated in, so we collapsed the data across these variables.

Results from the first clip shown to each subject were compared to those from the 3 subsequent clips. This was done to check whether subjects' knowledge of the noncritical targets' existence is influential. Analysis revealed no significant differences (F(1,178)=.007, p>.9). This result seems to imply there is no (or little) learning throughout the experiment (which is to be expected as subjects are given no feedback regarding their accuracy).

Predictably, accuracy rates differ not only between subjects, but also between targets – ranging from .26 to .78. This can be explained by looking at target choices: accuracy rates for targets who chose to split ("Splitters"; m=.704, sd=.268) are higher than those for targets who chose to steal ("Stealers"; m=.422, sd=.246). It must be noted, however, that a direct parametric comparison between these is not possible, due to the asymmetry of the number of targets (3 splitters and 5 stealers).

⁴ t statistics: : $t_{A1}(43)=-.722$, p>.4; $t_{A2}(43)=1.037$, p>.3; $t_{B1}(43)=.732$, p>.4; $t_{B2}(43)=.732$, p>.4; $t_{C1}(43)=-.078$, p>.9; $t_{C2}(43)=-1.056$, p>.2; $t_{D1}(43)=2.318$, p=.025; $t_{D2}(43)=.831$, p>.4



Targets who chose to split are marked in yellow and those who stole are in grey.

* Criticality effect was significant at .05 level.

Figure	Figure 3.2: Frequencies of Subject Choices by Criticality and Target Decision											
Critical Target Non-critical Target Total Target										get		
		Split	Steal	Total	Split	Steal	Total	Split	Steal	Total		
Subject	Split	47	59	106	48	71	119	95	130	225		
Choice	Steal	20	54	74	20	41	61	40	95	135		
Choice	Total	67	113	180	68	112	180	135	225	360		
In total,	In total, 190 of 360 choices were correct (Split-Split or Steal-Steal: marked in dark grev).											

Response Bias: Hypothesis 2, assuming a cooperation bias, was supported by the data – as can be seen in figure 3.2. Participants certainly predicted more split than steal (225 split versus 135 steal decisions). This trend remained similar when dividing by target criticality. Conducting a Chi-squared test on choice data revealed a significant correlation between target- and participant choice ($\chi^2(1)=5.8$, p=.016): Participants tended to predict "Split" rather than "Steal", and this tendency was more pronounced when the target chose to split.⁵

Splitters versus Stealers: Dividing participants' predictions by target decision – Split or Steal – enables us to test hypotheses 2a and 2b.

In order to verify hypothesis 2a, we examine prediction accuracy rates for splitters and for stealers separately. The accuracy rate for splitters was 70.37%, versus 42.22% accuracy for stealers. This result was supported by a within-subject analysis as well.

⁵ It should be noted that these analyses does not take into account the possible correlation between predictions made by the same participant.

We again averaged predictions over targets, and tested the accuracy difference when predicting for splitters versus stealers within-subject. Due to the different number of splitters and stealers (3 splitters and 5 stealers, with 3 Split-Steal outcomes and one Steal-Steal), we looked only at predictions for the 3 Split-Steal clips. Accuracy rates for splitters were higher than those of stealers (Split: m=.704, sd=.268; Steal: m=.452, sd=.294; Paired-t(44)=3.799, p<.001). Importantly, accuracy rates for these 3 stealers did not differ significantly from accuracy rates for the 2 stealers who competed against each other (m=.378, sd=.387; Paired-t(44)=1.074, p>.2).

Hypothesis 2b requires looking at the data by participant choice. Out of 225 predictions of Split, only 95 (42.22%) were correct. In contrast, 95 (70.37%) out of the 135 Steal predictions were correct.

These results seem to support our hypotheses: Participants tend to "trust" targets, in a way, or simply are more conservative or cautious in predicting a target will steal (supporting hypothesis 2a); nevertheless, when participants do decide to predict Steal, they are usually right (supporting hypothesis 2b).

The difference between splitters and stealers was not affected by subject sex (F(1,43)=.650, p>.4) or the counterbalance variable (indicating which targets were critical) (F(1,43)=.650, p>.4).

Criticality: Our main hypothesis assumes that "money makes the world go round": The more motivated subjects are to make a correct prediction, the better they will do. In order to test this, we computed two proportions for each participant: Accuracy rate for critical targets and accuracy rate for non-critical targets. These are presented as the last 3 bars in figure 3.1, as well as in the last column of figure A.1 in appendix A. These variables allow testing the effect of criticality within-subject, across different targets. Using a within-subject paired t-test, we observe significantly higher accuracy rates for critical targets than for non-critical (Critical: m=.56, sd=.2; Non-critical: m=.47, sd=.21; Paired-t(44)=1.735, p=.045). There was no significant effect of sex (F(1,43)=.061, p>.8) or counterbalance (F(1,43)=.375, p>.5).

The data thus supports our hypothesis: Criticality seems to increase prediction accuracy. However, since we collapse across targets, this measure ignores the effect of target decision, which was found to be significant. This interaction between criticality and target decision shall be the focus of the following section.



Choices and Criticality: There was a significant 3-way interaction of criticality *participant-choice*target-choice ($\chi^2(4)=8.7$, p=.069). This can be explained by separating the data by criticality: There is a significant correlation between target- and participant choice only for critical targets ($\chi^2(1)=5.7$, p=.017), and not for non-critical targets ($\chi^2(1)=.99$, p>.3). That is, target decision influenced predictions only when participants received a high reward for their accuracy.

Another interesting observation appears when separating the data by target decision: Criticality increased prediction accuracy only when participants predicted for stealers ($\chi^2(1)=2.89$, p=.089), and not when viewing splitters ($\chi^2(1)=0$, p=1). This can be seen also by looking at figure 3.2: Criticality induces different prediction rates for Split / Steal, as well as different accuracy rates. Figures 3.3a and 3.3b display these two correlated results. Figure 3.3b presents average accuracy rates by target decision and criticality. In figure 3.3a we show Split prediction rate, instead of correct response rate (Split for splitters, Steal for stealers). We transformed stealers' scores in order to directly compare participants' responses across target decisions.

Looking at figure 3.3a, it appears that for non-critical targets, participants predict the same Split rate regardless of target decision (Sign test: Z=1.078, p>.28). The effect of target decision appears only when it is critical. In this case, Split prediction rate is significantly lower for stealers than for splitters (Z=2.373, p=.018). Analysis demonstrated a significant difference of Split rates between critical and non-critical stealers (Z=1.905, p=.057), and no difference between critical and non-critical splitters (Z=.567, p>.5). That is, the effect of criticality on predictions appears only for stealers. Figure 3.3b highlights the issue of prediction accuracy. As mentioned, the effect of criticality on participant choice was significant only for stealers: Looking at targets who stole, participants were more likely to get it right if these were critical.

Confidence: Participants marked their confidence level in each prediction, on a 1-7 scale. The descriptive statistics can be found in figure A.3 in appendix A. Confidence level is significantly correlated to prediction accuracy (Pearson's r=.097, p=.066). Accordingly, we found a significant effect of participants' predictions on their confidence level (F(1,43)=5.204, p=.023). We found no effect of criticality (F(1,43)=1.569, p>.2), target decision (F(1,43)=.062, p>.8), or any interaction effects.

In light of the correlation between confidence and accuracy, and the previously mentioned differences in accuracy between splitters and stealers, we divided the data by target decision. This revealed interesting effects: Only when predicting stealers, criticality, prediction and the interaction affect confidence levels (Criticality: F(1,224)=3.89, p=.05; Prediction: F(1,225)=5.76, p=.017; Interaction: F(1,224)=2.98, p=.085). These do not affect confidence levels when predicting for splitters.

Other Variables:

<u>Trust</u>: Literature suggests individual differences in trust or altruism may have an influence on the ability to associate such attributes with the behavior of others (e.g. Yamagishi et al, 1999). In our study, participants were asked five questions pertaining to their trust in other people's integrity and fairness (Yamagishi & Yamagishi, 1994; 1-7 scale). We averaged scores across questions for each participant, revealing a mean score of 3.66 and a median of 3.8 (sd=.59). Subject pool was divided by the median score in order to check a possible influence of this trust variable on accuracy rates. No significant effect was found on any accuracy rate variable – for critical targets (t(43)=.32, p>.7) or non-critical (t(43)=1.62, p>.11); splitters (t(43)=.991, p>.3) or stealers (t(43)=.644, p>.5).

<u>Dialog</u>: Targets in our clips conversed in English (some with a thick accent), which is not our participants' first language. After viewing all 4 videos, participants were asked how much of the dialog they understood, on a 1-5 scale (1=understood all; 5=didn't understand). Most (35 of 45) subjects indicated they understood the entire dialog, 6 others indicated they understood most of the dialog, 3 others marked the middle point of the scale, and one indicated they did not understand most of the dialog (overall mean=1.33, sd=.707). Entering dialog understanding into the analysis did not produce any significant differences. Dividing our participants by the mean or median

result did not show any effect on the accuracy rate for critical (t(43)=0.196, 0>.8) or non-critical targets (t(43)=0.329, p>.7), for splitters (t(43)=0.491, p>.6) or for stealers (t(43)=0.032, p>.9).

<u>Target Attributes</u>: Participants were asked which attributes, if any, they took into account when making their predictions. They were asked to mark their perceived importance of six attributes (1-7 scale where 1 is the highest score): Appearance, facial expressions, eye contact between targets, body movement, tone of voice and verbal content. ANOVA analyses showed no effect of any of the six attributes or their average on accuracy scores for each target or for any of the average accuracy rates – for splitters, stealers, critical or non-critical targets, or any other variable.

Reaction Time:

An additional set of results we analyzed is that concerning participants' reaction time (RT), that is, the time it took them to make their predictions. Since RT has been found to be significantly influenced by language understanding, we excluded 10 participants who marked less than the maximum on the dialog-understanding scale. Figure 3.4 presents this data. Exact statistics can be seen in figure A.2 in appendix A.

<u>Criticality</u>: There was a significant effect of criticality on participants' RT for 4 out of 8 targets: B1, C1, D1 and D2 (all but C1 chose to steal).⁶ A repeated measures analysis within-subject found a significant difference in RT when subjects were asked to guess for critical versus non-critical targets, with RT for critical targets being almost twice that of non-critical targets (F(1,34)=15.182, p<.001). However, it is important to note these differences do not necessarily reflect the effect of incentives: Critical targets were always predicted first and non-critical targets second. This order affects RT (e.g. Corballis, 1967) – and might interact or cancel an incentive effect.

<u>Target Decision</u>: We collapsed RT data above the 3 Split-Steal clips by target decision (similarly to the analysis described in the "Splitters versus Stealers" section above). Participants were slower when they were asked about stealers (m=5.79 secs, sd=3.36) than splitters (m=4.32, sd=2.43), a difference which was found significant in a repeated measures analysis (F(1,34)=13.26, p=.001). The mean RT for the other two targets (stealing against each other) was similar to the RT for the 3 stealers above (2 stealers: m=5.6, sd=3.91; Paired-t(34)=0.245, p>.8).

⁶ t statistics: $t_{A1}(34)=1.226$, p>.2; $t_{A2}(34)=1.326$, p>.1; $t_{B1}(34)=1.964$, p=.065; $t_{B2}(34)=0.650$, p>.5; $t_{C1}(34)=2.766$, p=.011; $t_{C2}(34)=0.798$, p>.4; $t_{D1}(34)=2.518$, p=.019; $t_{D2}(34)=3.393$, p=.003

The difference in RT between splitters and stealers was not affected by participant sex (F(1,33)=0.006, p>.9) or counterbalance (F(1,33)=0.761, p>.3). Dividing the subject pool by the median trust score did not have a significant effect on any RT variable, including the difference between splitters and stealers (t(33)=0.178, p>.8).

<u>Choices and Criticality</u>: A within-subject mixed model analysis on RT found main effects of criticality (F(1,34)=12.359, p=.001) and target decision (F(1,34)=3.812, p=.052), and significant interaction effects between criticality and target decision (F(1,34)=2.995, p=.085), and between participant choice and criticality (F(1,34)=4.91, p=.028). Participant choice did not significantly affect RT (F(1,34)=0.01, p>.9), and neither did its interaction with target decision (F(1,34)=0.147, p>.7). It seems that criticality (or order) had the most influence on RT, but this effect was also mediated by target decision. RT statistics by these variables are presented in table 3.5.

<u>Dialog</u>: While we observed a significant RT difference between participants who understood the entire dialog and those who didn't (t(43)=2.111, p=.041), analyzing the data for the entire subject pool did not significantly change the result pattern.



Figure	Figure 3.5: RT (sec) by Subject Choice, Criticality and Target Decision											
Subject	Cr	itical Tar	get	Non-critical Target			Total					
Choice	Split	Steal	Total	Split	Steal	Total	Split	Steal	Total			
Split	5.64	8.09	6.99	2.68	3.33	3.06	4.16	5.5	4.93			
Spiit	(4.17)	(8.24)	(6.8)	(2.66)	(4.15)	(3.62)	(3.78)	(6.76)	(5.71)			
Steel	4.49	6.81	6.52	4.95	4.62	4.72	4.72	5.84	5.52			
Stear	(2.49)	(5.42)	(6.92)	(7.61)	(4.66)	(5.66)	(5.57)	(5.18)	(5.29)			
Total	5.32	7.49	6.68	3.31	3.8	3.61	4.31	5.65	5.15			
Total	(3.79)	(7.05)	(6.12)	(4.63)	(4.49)	(4.45)	(4.33)	(6.14)	(5.56)			

Section 4: Summary and Discussion

Our experiment was conducted using real game show data from the British "Golden Balls" series. Contestants play a version of the Prisoner's Dilemma game and so have a strong incentive to lie and hide their intentions, as well as to discern others' intentions. In light of literature concerning lie detection and statistical analyses of game show data (see sections 1.5, 1.6 and 1.8 above) we tested whether observers, and not only the players themselves, are able to discriminate between cooperators and defectors.

The main research question regarded the effect of motivation on accuracy. Specifically, we hypothesized that the higher the incentive given to participants to predict correctly, the better they will do. We manipulated this using two pay levels for accuracy, 10 and 2 NIS. The "criticality" variable was found to have a significant effect on accuracy, in the presumed direction: Participants were more accurate in their predictions when they were to receive more money if these predictions were correct.

Our second hypothesis was that participants will be biased towards believing players will cooperate. This hypothesis is related to the truth or belief bias found in many studies (Bond & DePaulo, 2006; Ekman et al, 1999; Meissner & Kassin, 2002; Gilbert et al 1993), in that the propensity to trust or believe is automatic and only occasionally people dedicate time and effort to try and disprove the content. This bias implies that prediction accuracy rate for cooperators will be higher than that of defectors (hypothesis 2a). Also, it suggests that prediction of defection will be more accurate than that of cooperation (hypothesis 2b): If biased towards predicting cooperation, people will tend to shift only when there is strong evidence to the contrary. We found such tendencies in our study: Predicted Split rate was almost twice the predicted Steal rate; correspondingly, accuracy rate for splitters was significantly higher than accuracy rates for stealers, as suggested by hypothesis 2a. Testing hypothesis 2b, we found that when predicting Split, participants were far less accurate compared to when predicting Steal.

Interestingly, we found that the effect of criticality exists only when predicting decisions of targets who chose to defect ("Steal"); when predicting cooperators' behavior, participants had the same accuracy rate regardless of promised payoff. We did not anticipate this result. This result, pending replication in future studies, may shed light on the differences between lies and truth, and lend support to both of our

hypotheses – perhaps also implying their conjunction. We assumed that motivational differences will lead to higher accuracy rate in predictions, as motivated observers are more likely to be attentive to the targets and their behavior. However, this attentional difference is likely to increase accuracy only to the extent that there exist (behavioral) clues for targets' decision and that they are noticed and interpreted correctly. In light of lie detection literature, we assume that targets exhibit specific behavioral pattern when they lie (and intend to defect) than when they tell the truth (and intend to cooperate) (Ekman, 1989; DePaulo & Morris, 2004; Vrij & Mann, 2004). Thus, motivation – via attention – will increase accuracy when there is indeed something to pay attention to; only for liars there exist telling behavior, and for them it may be possible to elevate prediction accuracy.

Our data points to a difference between the two accuracy rewards. However, it could be said that our 2 or 10 NIS incentives did not much differ from one another, and that the observed pattern is a result of the order of questions: The 10 NIS target was always presented first, before the video rather than after it (as was the 2 NIS target). Our participants seemed very engaged during the entire experiment, both before and after viewing each clip, and were happy about their payment. In addition, after viewing the first video clip, predicting the critical target and perhaps surprised by having to predict the non-critical target, it is very likely participants were aware that they would be asked to predict both decisions. In this case, had the incentives not been different from one another, we would not find the observed differences in accuracy for the last 3 videos. That said we recognize the need to further examine the effect of primacy or recency of a target on prediction accuracy rates, regardless of payoff. Further research should manipulate the presentation order of targets and payments, as well as their temporal position relative to participants' viewing of the video clip.

It is important to note that there are certain caveats to using game show data. Since the shows are taped in front of an audience and aired, players know that they are observed and expected to make certain decisions. Frank (2005) made this criticism regarding lie detection studies conducted in labs, and we feel it is fitting here as well. A similar claim was made by List (2006), in that the game show setting transforms the one-shot PD-esque game into a repeated interaction game, as it is also played with the audience, in a sense – players' choices are scrutinized by audience members, and might affect his future outcomes. Additionally, it can be argued that players are not

representative of the general population; they might be better actors (liars?), more or less extroverted and so forth. We do not attempt to extrapolate from our results and claim they apply to all situations. Nevertheless, we believe that our findings can shed some light on the ability to interpret behavior in various situations, and not only in this very specific and limited setting – a claim reinforced by Frank & Ekman (1997).

There are two other important caveats regarding our stimuli and experimental design.. First, in our stimuli material, the female/male target ratio was very unbalanced, with only one target being male. Thus, our results probably cannot be generalized above target gender – the observed accuracy rates and differences found are possibly characteristic only for females. This matches findings by DePaulo, Stone & Lassiter (1985b) suggesting that females might be more motivated to appear as though telling the truth, therefore being more inadvertently obvious about their lies (in accordance with DePaulo et al, 2003; DePaulo, Kirkendol, Tang & O'Brien, 1988; Ekman & Friesen, 1969). However, data pattern for the male target did not significantly differ from the overall pattern, and there was no interaction between target- and participant gender. Nevertheless, we feel target gender should be examined thoroughly in a more balanced design; further research should also regard what effect, if any, does an interaction of target gender and decision have on observers' predictions (a related effect has been observed in Belot et al, 2008).

Second, target decision, and especially its interaction with the criticality variable, was unbalanced as well, as our clips included 3 "Split" choosers and 5 "Steal" choosers. Moreover, it should be noted that 3 out of the 4 videos ended in the asymmetric Split-Steal result, and the remaining video ended in mutual-Steal. This made some statistical tests impossible or difficult, as discussed in the results section above. We coped with this issue first by using non-parametric tests, averaging across participants rather than testing within-subject. We also examined the predictions and accuracy rates separately for each outcome, and found no differences between the 3 Split-Steal clips and the one clip depicting the mutual-Steal outcome. We thus think that these methodological problems did not influence the observed patterns to a large extent. However, we encourage future research to use stimuli with various outcomes and more equal Split/Steal ratios to test this claim.

In the scope of this paper, we could not possibly aim to answer all the intriguing questions accompanying such a broad topic. Such questions, in our opinion, include observers' reliance on different aspects of behavior: Research has shown differences in both processing and interpreting verbal compared to nonverbal behavior (Hall et al, 2009). We asked our participants which aspects they used while making their predictions, but it would be interesting to examine this in a setting where it is not possible to rely on certain aspects. These may include muted video clips, sound clips without visual data, or videos where targets are conversing in a language entirely alien to the observers (Ekman, 1989).

One should note that there might be cultural differences in the attributes that signal lying or cheating, or conversely, pro-social behavior (Bond, Omar, Mahmoud & Bonser, 1990); it could be said that one should look only at lie detection within a specific culture and not – as we did – take video clips depicting people from a different culture. Nevertheless, while there is an in-group accuracy advantage (Elfenbein & Ambady, 2002), it seems that stress signals are quite universal, and many behavioral clues to deception are consistent across cultures (Elfenbein & Ambady, 2002; Bond & Atoum, 2000; Cheng & Broadhurst, 2005).

Another issue which we think to be worth examination is the predictors' role in the game – whether they are objective observers, or whether their payoff is dependent on players' actions. In our study, participants' reward depended on the players' decision only to the extent that participants predicted correctly; one could devise a similar setting where participants decide on their own course of action against one of the players, as well as predict players' decisions – thus participants' payoff would be a conjunction of his own decision and the predicted player's decision. It may be argued that participants in this alternative setting would be more motivated to correctly discern the player's intent, as they are interested in the final outcome and not only their accuracy (i.e. their accuracy affects their own actions).

In conclusion, our study attempted to incorporate social dilemmas – particularly those occurring outside psychology and economics laboratories – and lie detection research (which has used almost exclusively stimuli acted and taped in labs). We believe it is worthwhile to use game show data as an example of a real-life high-stake cheater detection task, and think our study, while preliminary, provides an important opening for future studies.

Figure A.1: Accuracy Rates by Target											
Target	A1	A2	B1	B2	C1	C2	D1*	D2	Total		
Critical	.59	.57	.36	.74	.77	.48	.59	.39	.56		
Non- critical	.70	.41	.26	.64	.78	.64	.26	.27	.49		
Total	.64 (.48)	.49 (.51)	.31 (.47)	.69 (.47)	.78 (.42)	.56 (.5)	.42 (.5)	.33 (.48)	.53 (.5)		

Appendix A: Additional Data

Targets A1, A2 played each other in clip A, B1 and B2 in clip B and so forth. Participants saw either targets numbered with 1 as critical, or targets numbered with 2. Targets who chose to steal are marked in grey, and those who split are in white. * Criticality effect was significant at .05 level.

Figure A.2: RT (sec) by Target and Criticality											
Target	A1	A2	B1*	B2	C1*	C2	D1*	D2*	Total		
Critical	4.59	5.97	8.21	4.78	6.59	7.52	7.83	7.94	6.68		
Cilical	(2.85)	(3.05)	(1.1)	(3.16)	(5.18)	(6.75)	(6.78)	(5.98)	(6.12)		
Non-	3.53	3.98	3.05	3.58	2.81	5.73	3.45	2.79	3.61		
critical	(2.34)	(5.6)	(1.76)	(7.18)	(2.59)	(6.72)	(2.91)	(2.41)	(4.46)		
Total	4.06	4.98	5.63	4.18	4.7	6.62	5.64	5.36	5.25		
Total	(2.62)	(4.56)	(8.18)	(5.5)	(4.47)	(6.7)	(5.6)	(5.2)	(5.9)		

Targets who chose to steal are marked in grey, and those who split are in white.

* Criticality effect on RT is significant at .05 level.

Figure	Figure A.3: Confidence Levels by Criticality and Target Decision											
Cri					N	on-critic	Total					
			Target		Target				Target			
		Split	Steal	Total	Split	Steal	Total	Split	Steal	Total		
	Split	3.65	3.79	3.73	3.2	3.34	3.28	3.42	3.54	3.49		
	Spnt	(1.58)	(1.66)	(1.62)	(1.73)	(1.59)	(1.65)	(1.66)	(1.64)	(1.65)		
Subject	Stool	3.81	3.53	3.6	3.36	4.42	4.06	3.58	3.91	3.81		
Choice	Stear	(1.46)	(1.47)	(1.54)	(1.86)	(1.57)	(1.65)	(1.67)	(1.58)	(1.61)		
	Tatal	3.69	3.67	3.68	3.25	3.72	3.55	3.47	3.69	3.61		
	Total	(1.53)	(1.67)	(1.63)	(1.76)	(1.58)	(1.64)	(1.66)	(1.62)	(1.64)		

Appendix B: Experiment Design

ברוכים הבאים לניסוי "לחלוק או לגנוב"!

ברוכים הבאים לניסוי בקבלת החלטות. אתם מתבקשים לשמור על השקט לאורך כל הניסוי. אם יש לכם שאלות, אנא הרימו את ידכם, ואחד הנסיינים ייגש אליכם. לחיצה על מקש "רווח" תעביר אתכם למסך הבא, כל עוד לא כתוב אחרת.

בניסוי זה תתבקשו לצפות במספר קטעי וידיאו ולענות על מספר שאלות. תמורת ההשתתפות בניסוי תקבלו תשלום בסיס בסך 10 ₪ ותשלום נוסף שייקבע על פי תשובותיכם לשאלות (אופן החישוב יוסבר בהמשך).

הכסף שתרוויחו בניסוי ישולם לכם מיד בסיום הניסוי במזומן, באופן אנונימי.

קטעי הוידיאו שאתם עומדים לראות לקוחים מתוך שעשועון אנגלי הנקרא "Golden Balls". בכל קטע מופיעים שני משתתפים אשר השיגו סכום כסף במהלך המשחק בהתמודדות זה מול זה, וכעת עליהם להחליט על אופן חלוקת הכסף ביניהם:

"Split or Steal" ,"לחלוק או לגנוב",

לכל משתתף שני כדורים זהובים, שבתוך אחד רשומה המילה "לחלוק" ("spiit"), ובתוך האחר "לגנוב" ("steal"). כל משתתף צריך לבחור כדור אחד מבלי לדעת איזה כדור בחר המשתתף השני. הכסף מחולק בהתאם לכללים הבאים:

- אם שני המשתתפים בוחרים "לחלוק", כל אחד מקבל מחצית מסכום הכסף.
- אם משתתף אחד בוחר "לחלוק" והאחר "לגנוב", זה שבחר לגנוב לוקח את כל הכסף.
 - אם שני המשתתפים בוחרים "לגנוב", שניהם יוצאים מהמשחק בידיים ריקות.

לפני ההחלטה המשתתפים מקבלים מספר דקות שבהן הם יכולים לדבר זה עם זה. כעת יוצגו בפניכם מספר קטעים, אשר בכל אחד מהם מוצגת השיחה בין השחקנים בפרק אחר בתכנית.

אנא התבוננו בקטעים בעיון – לאחר הצגת כל שיחה, תתבקשו לנחש איזו החלטה קיבל אחד מן שחקנים, אשר זהותו תיקבע בהמשך.

הקטע שאתם עומדים לראות הינו מתוך שלב הסיום של פרק 7 בתכנית. המשתתפות משחקות זו מול זו על סכום של 61,060 ליש"ט.

עליכם לנחש את ההחלטה של המשתתפת מימין.

- 🛛 אם תנחשו נכון, תקבלו 10 ₪ בנוסף לסכום שצברתם.
 - אם תנחשו לא נכון, לא תקבלו סכום נוסף.

-- קטע וידיאו

מה הניחוש שלכם לגבי ההחלטה של המשתתפת מימין?

- לגנוב Steal
- לחלוק Split

כמה אתם בטוחים בתשובתכם לגבי ההחלטה של המשתתפת מימין?

1	2	3	4	5	6	7
בטוח לגמרי						לא בטוח כלל

כעת תתבקשו לנחש גם את ההחלטה של המשתתפת האחרת (משמאל). אם תנחשו נכון את ההחלטה של משתתפת זו, תקבלו 2 ₪ נוספים.

מה הניחוש שלכם לגבי ההחלטה של המשתתפת משמאל?

- Steal לגנוב
- Split לחלוק

כמה אתם בטוחים בתשובתכם לגבי ההחלטה של המשתתפת משמאל?

1 בטוח לגמרי	2	3	4	5	6	7 לא בטוח כלל	

-- הצגת הקטע והשאלות לעיל מופיעים לגבי 3 קטעים נוספים. סדר הקטעים אקראי, ויש רנדומיזציה של השחקן הקריטי (ימין/ שמאל) --

				ד כמה הבנתם את הדיאלוגים בין המשתתפים?
1	2	3	4	5
הבנתי הכל				בכלל לא

מראה הפנים	7 כלל לא התחשב	6 תי	5	4	3	2 התחי	1 ושבתי מאוד
הבעות הפנים	7 כלל לא התחשב	6 תי	5	4	3	2 התחי	1 ושבתי מאוד
קשר עין בין השחקנים	7 כלל לא התחשב	6 תי	5	4	3	2 התחי	1 ושבתי מאוד
תנועות גוף	7 כלל לא התחשב	6 תי	5	4	3	2 התחי	1 ושבתי מאוד
טון דיבור	7 כלל לא התחשב	6 תי	5	4	3	2 התחי	1 ושבתי מאוד
תוכן הדברים	7 כלל לא התחשב	6 תי	5	4	3	2 התחי	1 ושבתי מאוד

בשאלות הבאות, אנא ציינו כמה השתמשתם או התחשבתם במאפיינים שונים בעת ניחוש החלטות השחקנים בהם צפיתם.

אנא ציינו את המידה בה אתם מסכימים או מתנגדים לכל אחת מהאמרות הבאות, תוך שימוש באפשרויות התשובה הבאות:

1	2	3	4	5
מתנגד בהחלט	מתנגד במידה מועטה	מסכים ומתנגד במידה שווה	מסכים במידה מועטה	מסכים בהחלט

רוב האנשים ישקרו אם הם עשויים להרוויח מכך

1	2	3	4	5
מתנגד בהחלט	מתנגד במידה מועטה	מסכים ומתנגד במידה שווה	מסכים במידה מועטה	מסכים בהחלט

אנשים נדיבים לעיתים קרובות מנוצלים על ידי אחרים

1	2	3	4	5
מתנגד בהחלט	מתנגד במידה מועטה	מסכים ומתנגד במידה שווה	מסכים במידה מועטה	מסכים בהחלט

השגה של מטרות חברתיות לעיתים קרובות נכשלת בגלל העדר שיתוף פעולה מצד אנשים אנוכיים

1	2	3	4	5
מתנגד בהחלט	מתנגד במידה מועטה	מסכים ומתנגד במידה שווה	מסכים במידה מועטה	מסכים בהחלט

רוב האנשים הם הוגנים באופן בסיסי

1	2	3	4	5
מתנגד בהחלט	מתנגד במידה מועטה	מסכים ומתנגד במידה שווה	מסכים במידה מועטה	מסכים בהחלט

אם הביטוח הל<u>אומי ירחיב את הקריטריונים לתמיכה כספית בקבוצות שאינן עובדות, יותר אנשים יבחרו שלא לעבוד</u>

1	2	3	4	5
מתנגד בהחלט	מתנגד במידה מועטה	מסכים ומתנגד במידה שווה	מסכים במידה מועטה	מסכים בהחלט

לסיום, אנא מלאו מספר פרטים דמוגרפיים:

מין: ז / נ

גיל: האם המשחק "Split or Steal" היה מוכר לך לפני הניסוי? כ / ל האם המושג "דילמת האסיר" מוכר לך? כ /

תודה!

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