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# ABSENT-MINDED DRIVERS IN THE LAB: TESTING GILBOA'S MODEL

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This note contributes to the discussion of decision problems with imperfect recall from an empirical point of view. We argue that, using standard methods of experimental economics, it is impossible to induce (or control for) absent–mindedness of subjects. Nevertheless, it is possible to test Gilboa's (1997) agent–based approach to games with imperfect recall. We implement his model of the absent–minded driver problem in an experiment and find, if subjects are repeatedly randomly rematched, strong support for the equilibrium prediction which coincides with Piccione and Rubinstein's (1997) *ex ante* solution of the driver's problem.

Keywords:

## 1. Introduction

In a provocative paper Piccione and Rubinstein (1997a, henceforth P&R) reinstated the topic of imperfect recall on the agenda of game theory. The response to their paper was overwhelming and led to a special issue of *Games and Economic Behavior* containing next to P&R's paper several responses and discussions by eminent theorists.<sup>a</sup> There was, however, one question neither of these papers (and none of those that were published at other places) addressed — the question of whether and how models of imperfect recall can be *tested*. This note offers a first investigation into this matter and provides data from an experimental study.

Much of the theoretical discussion focussed on a toy game with which P&R introduced their treatment of imperfect recall, the absent-minded driver game. The absent-minded driver starts his journey at node X where he can either *exit* or *continue* to Y where he faces the same choice. The payoffs (as given in Fig. 1) are 1.5 after exiting at X, 8 after exiting at Y and 3 after continuing at Y.

<sup>&</sup>lt;sup>a</sup>Games and Economic Behavior, Vol. 20, No. 1, 1997.

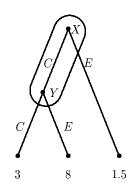


Fig. 1. The absent-minded driver problem.

The driver suffers from imperfect recall insofar as he cannot distinguish X and Y, i.e., he cannot remember whether he already passed one of the nodes. P&R claimed the driver were facing a paradoxical problem. They argued that the driver's reasoning before he starts his journey (the "planning stage") were inconsistent with his reasoning once he reaches a decision node (the "action stage"). Others did not share P&R's view. In the same issue Aumann, Hart and Perry (1997, henceforth AH&P), for example, let the paradox disappear by observing that the driver can only control his *current* action while considering the rest of his play as *fixed*. P&R assumed that the driver, deciding at one node about a probability with which to exit, can simultaneously control his behavior at the other node and they defended this view — as one among many reasonable approaches — in their synthesis (Piccione and Rubinstein 1997b) that appeared at the end of the special issue.

In this note we do not want to go into further detail about the theoretical controversy. Rather we want to explore whether and how any theoretical prediction for the problem at hand can be empirically tested. As it turns out "whether and how?" cannot be easily answered.

Usually, it is more or less straightforward to implement a game in an experimental environment. So why not the absent-minded driver game? The answer is that exactly the same feature that makes it theoretically interesting also makes it (almost) impossible to implement. *Experimenters cannot induce imperfect recall of subjects.* That is, at least experiments adhering to the standard rules and procedures of experimental economics. Of course, one could think about deceiving subjects or perhaps about narcotizing them without their prior consent. In fact, we are convinced that the latter would certainly do the trick. Alas, we prefer not to.

Nevertheless we did test an absent-minded driver model, namely the one suggested by Gilboa (1997, also in the special issue). Gilboa argued, somewhat similar to AH&P, that the correct modeling approach to the problem would be to assume two identical agents of the driver, who each only face one decision node along a path. More specifically, he assumes the structure shown in Fig. 2. There are two agents, 1 and 2. The first move is by nature deciding (with equal probabilities)

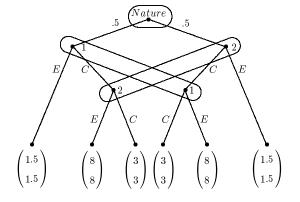


Fig. 2. The agent–based version of the absent–minded driver problem.

which of the two agents will decide at the first decision node. Then, if necessary, nature calls the other agent upon to act at the second decision node. Since both agents represent the same driver, they receive at each terminal node the same payoffs. And though modeling a situation of imperfect recall, the game itself is one of perfect recall.<sup>b</sup>

As Gilboa shows, this approach lets P&R's inconsistency disappear. The game has a unique symmetric equilibrium in which the agents choose the same probabilities for exit as P&R's driver would before starting his journey (in the "planning stage"). There are, however, two further asymmetric equilibria of this game. But Gilboa (p. 29) argues: "Since we have a compelling theoretical reason to focus on symmetric equilibria, we should simply do so."

To some extent, our study examines the (empirical) legitimacy of this view.<sup>c</sup> Our main finding is that it appears indeed legitimate — provided that subjects (a) have time to learn and (b) are constantly rematched with different partners. If they are not, i.e., if they play Gilboa's game with the same partner over and over again, they eventually learn to coordinate their actions on one of the Pareto–superior asymmetric equilibria.

<sup>&</sup>lt;sup>b</sup>This has led various colleagues to criticize the study at hand. They argue that we do not test a model of imperfect recall and that, in fact, the title of this paper would be inappropriate. In our view this is an extreme position. Of course, Gilboa's game, which we implement in the laboratory, is a game of perfect recall. But, as Gilboa and others argue, it adequately *represents* the absent-minded driver's problem. In this respect, P&R's original game is no different. It, too, is merely a representation of a certain problem. Hence, if one accepts Gilboa's position, one should also be willing to accept our claim that we do test the absent-minded driver's problem. But, of course, there are theorists who disagree with Gilboa's view. (See also the next footnote.)

<sup>&</sup>lt;sup>c</sup>Note that Binmore (1997) — although appreciating the result to which Gilboa's approach leads — casts doubts on the appropriateness of "modeling players as teams of agents with identical preferences" (p. 60). He argues "that the right way or ways to proceed will remain mysterious until we have satisfactory *algorithmic* models of the players we study" (p. 61). However, as argued above, we think that Gilboa's approach to games with imperfect recall seems to be the only one that can be tested in the lab.

The remainder of the paper is organized as follows. Section 2 presents theory and the experimental design. The results of the experiments are reported in Secs. 3 and 4 concludes.

## 2. Theory and Experimental Design

Our experiment is based on the game in Fig. 2. This game has two asymmetric Nash equilibria in pure strategies, namely (E, C) and (C, E). They are supported by the following beliefs: Whereas the agent playing E believes with equal probability to be at each node in his information set, the agent playing C believes with certainty to be at the node following nature's move. In addition, the game has a symmetric equilibrium in mixed strategies in which both agents play E with probability .35 which is also the ex ante optimal strategy for a single player (at "the planning stage") in P&R's game with accordingly modified payoffs. For each agent the symmetric equilibrium is supported by the belief to be with probability 20/33 at the node following nature's move.<sup>d</sup> Whereas the expected payoff for both players is 4.75 in the asymmetric equilibria, it is 3.6125 in the symmetric equilibrium.

The experiments were computerized<sup>e</sup> and conducted at Humboldt University from October 1999 to January 2000. Subjects were students of economics or business administration. Upon arrival in the lab they were assigned a computer screen and received written instructions. After reading them, questions could be asked which were answered privately. There were two treatments. In treatment FIX subjects were once matched in pairs and then interacted repeatedly. In treatment RAND subjects were (in groups of six) randomly rematched in each period. Both treatments lasted over 60 periods. Whereas in the former treatment 20 subjects participated, we conducted six sessions for the latter treatment. Thus, altogether 56 subjects participated in the experiments. The number of periods to be played was known in both treatments.

In the instructions (see Appendix) subjects were informed that they (and another subject with whom they are matched) had to decide between two options: the option to go "left" and the option to go "right". The computer would then — with equal probability — decide who were to move first. The payoff consequences of the decisions were explained both graphically and verbally (see Appendix). Subjects were informed, however, that they had to choose between left and right without knowing whether they will go first or second.

Furthermore, subjects were told that each of the 60 periods would consist of 100 rounds. In each period they would have to make *one* decision governing their behavior in *all* 100 rounds. Basically, this allowed us to elicit mixed strategies in a rather natural way. Subjects were asked to imagine an urn with 100 balls. They were told that they could determine the composition of the urn, i.e., how many of

<sup>&</sup>lt;sup>d</sup>Given the agents mixed strategies and using Bayes' rule, agent 1's conditional probability to be at the node following the move by nature equals  $0.5/(0.5 + 0.5 \times 0.65) = 20/33$ .

<sup>&</sup>lt;sup>e</sup>We used the software tool kit z-Tree, developed by Fischbacher (1999).

the balls would represent "going to the left" and how many "going to the right". Once the composition of the urn was decided, the urn would be relevant for 100 runs. The instructions then explained how these runs would be carried out by the computer (see Appendix A for details). At the beginning of each period, subjects were asked to enter their mixture of left and right balls into two boxes.

At the end of a period, subjects were informed about: (i) how many times they went first respectively second in this period; (ii) for each of these two cases, how many times they earned respectively 1.5, 3, or 8 points (along with the relative frequencies of these cases); and (iii) the payoff in this period and the accumulated payoff so far.

Subjects were informed that the sum of all profits accumulated during the 6.000 rounds (60 periods with 100 rounds) would determine their final monetary payoff. The exchange rate was Points 900 = DM 1. Average earnings in treatment FIX (which lasted for about 50 minutes) were DM 25.50 and DM 24.30 in treatment RAND (which lasted for about 70 minutes).

### 3. Results

Figure 3 displays the distribution of probabilities with which E (xit) was chosen. On the left– (right–) hand side the results of treatment FIX (RAND) are shown. On each side, the top panel shows the choices across all periods and the middle (bottom) panel the choices in the first (second) half of the experiment (in each case aggregated over all groups). Tables 1 and 2 report summary statistics of the two treatments both on the aggregate (all data, first and second half) and the group level.

Let us first consider treatment FIX. As shown in Table 1, the median of prob(E)choices equals .40 for all data and increases from .40 in the first half to .50 in the

	Aggr. Data				Group Data								
	All	1st H.	2nd H.	F 1	F 2	F 3	F 4	F 5	F 6	F7	F 8	F 9	F 10
Median	.40	.40	.50	.29	.34	.40	.50	.38	.35	.45	.38	.40	.15
Mean	.46	.42	.49	.48	.46	.46	.50	.45	.47	.44	.43	.46	.40
Std. Dev.	.42	.37	.47	.40	.44	.42	.50	.40	.47	.19	.43	.47	.43
Ν	1200	600	600	120	120	120	120	120	120	120	120	120	120

Table 1. Summary statistics of treatment FIX.

Table 2. Summary statistics of freatment frands.											
	All	1st H.	2nd H.	R 1	R $2$	R 3	$\mathbf{R} 4$	R 5	R 6		
Median	.35	.35	.35	.49	.35	.25	.35	.37	.35		
Mean	.40	.40	.40	.47	.36	.36	.39	.41	.42		
Std. Dev.	.32	.31	.33	.38	.22	.32	.32	.33	.31		
Ν	2160	1080	1080	360	360	360	360	360	360		

 Table 2.
 Summary statistics of treatment RAND.

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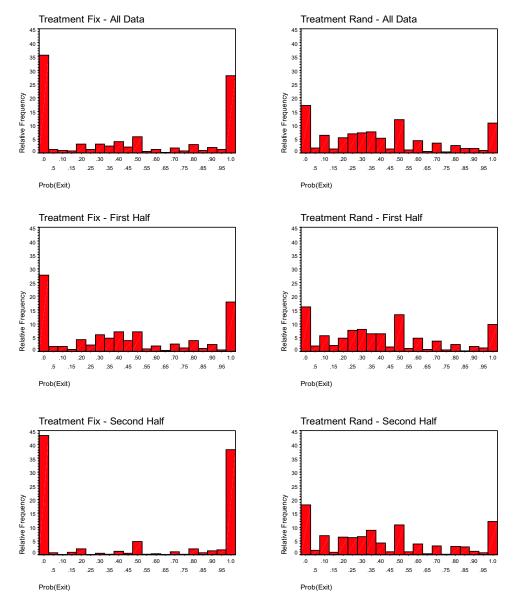


Fig. 3. Frequency distribution (Left: Treatment FIX; Right: Treatment RAND).

second half. The mean equals .46 for all data and increases from .42 in the first half to .49 in the second half. This clear change over time is corroborated by comparing the distribution of choices in the second half of the experiment with the one in the first half.

Means and medians, however, only tell half the story as can be seen in Fig. 3. The most important feature of the data is that the frequency of the pure-strategy

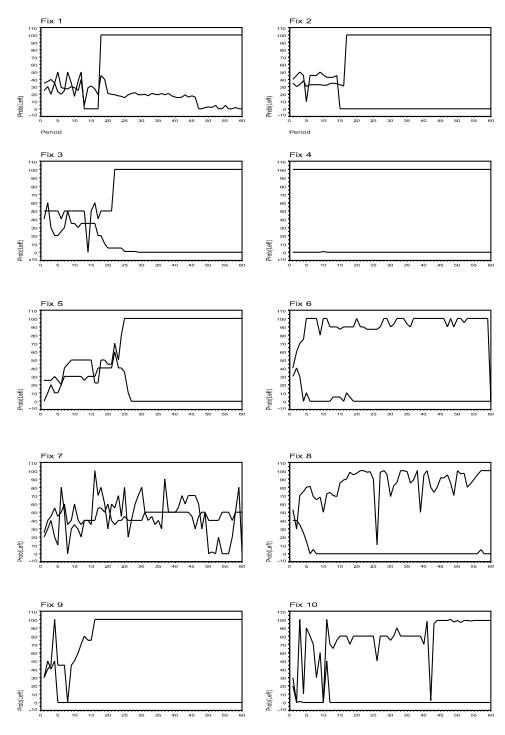


Fig. 4. Evolution of strategy combinations in the individual groups of treatment Fix.

choices (and choices very close to .0 and 1.0) increases over time. Whereas the choice of the strategies in these two categories<sup>f</sup> count for 45.5% of all cases in the first half, they count for 81.3% of all cases in the second half of the experiment. In fact, five groups in treatment FIX reach perfect coordination on an asymmetric equilibrium (see panels Fix 2–5 and Fix 9 in Fig. 4). Whereas one of these groups (Fix 4) is — surprisingly — coordinated from the very start, the other groups need some more time and are coordinated by the end of period 30. Four further groups are eventually very close to perfect coordination (see panels Fix 1, 6, 8 and 10 in Fig. 4). Note, however, that in group Fix 8 coordination is achieved not before period 56.<sup>g</sup> Only group Fix 7 does not manage to coordinate their actions. Summarizing these results we formulate the following

**Result 1.** When subjects play Gilboa's game repeatedly with the same partner they (almost always) manage to coordinate themselves on one of the Pareto–optimal asymmetric equilibria.

Next consider treatment RAND. Strikingly, the median of  $\operatorname{prob}(E)$ -choices across all groups equals exactly the equilibrium probability of .35 in both halves of the experiment! (See Table 2.) The mean equals .40 without changing over time.<sup>h</sup> The equilibrium prediction also does well against average observed data of individual groups. As can be seen from Table 2, the median is equal (or very close) to .35 in four of the six groups. Figure 5 shows the evolution of strategy combination in the six individual groups of treatment RAND. To read any given panel in Fig. 5, note that the time axis is the vertical one whereas the two choices that were matched with each other are represented horizontally. Thus, a panel consists of sixty "layers" (one on top of the other) and one should read it from bottom to top to follow the evolution of strategy combination as time unfolds.

Although aggregate behavior is in line with the mixed equilibrium prediction, Figs. 3 and 5 reveal that subjects in treatment RAND do also choose (almost) pure strategies. But it is important to note that, in contrast to treatment FIX, there is not much of a time trend.<sup>i</sup> For instance, the relative frequency of (almost) pure strategy choices (see footnote f) increases from 25.8% in the first half to only 30.2% in the second half of the experiment. On the other hand, the relative frequency of

<sup>&</sup>lt;sup>f</sup>For categories 0 and 1.0 we included choices in the interval [0, 0.025) and [0.975, 1.0] respectively (as shown in Fig. 3).

 $<sup>^{</sup>g}$  This is true although one of the players might be imagined as awaiting desparately the other player to finally understand what should be "his part" in the playing of this game.

 $<sup>^{\</sup>rm h}{\rm Note}$  that, due to the bounded strategy space, one would expect the mean to exceed the median with most random error models.

<sup>&</sup>lt;sup>i</sup>Due to the matching procedure in treatment RAND, it is not meaningful to work with the time patterns of pairwise strategy combinations as they depend on the actual matching. Therefore, we will continue to concentrate on individual strategy choices in treatment RAND as summarized on the right hand side of Fig 3. Note, however, that the results that will be presented in the following do not change if we base the tests on actual strategy combinations.

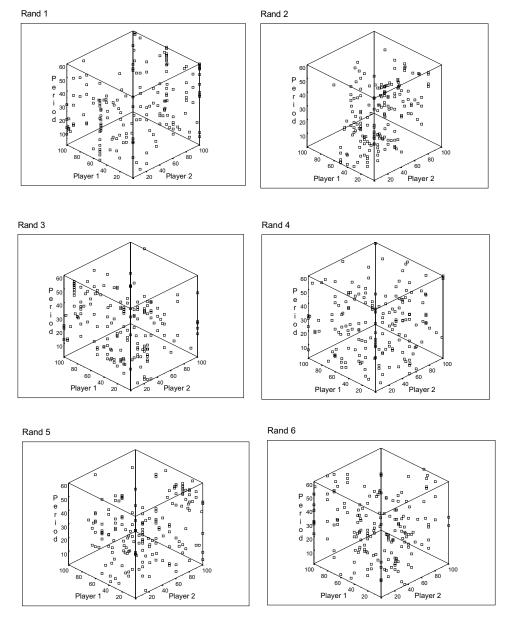


Fig. 5. Evolution of strategy combinations in the individual groups of treatment RAND.

the mixed equilibrium choice<sup>j</sup> rises slightly from 6.4% in the first half to 8.8% in the second half of the experiment. To test whether these changes are statistically significant, we counted for each of the six groups separately how often (almost) pure

 $^{\rm j}{\rm We}$  include choices in the intervall  $[0.325,\,0.375]$  as shown in Fig. 3.

strategies and (almost) mixed equilibrium strategies, respectively, were chosen in the two halves of the experiment. Applying a two-tailed Wilcoxon test to these two sets of paired numbers, it turns out that the differences mentioned above are statistically insignificant: p = 0.345 for (almost) pure strategies and p = 0.463 for (almost) mixed equilibrium strategies. Thus it seems fair to say that there is no significant time trend in the data of treatment RAND.

To compare the strategy choices across the two treatments, note that the distribution in treatment RAND is concentrated on lower prob(E)-choices (with the mean closer to the mixed equilibrium prediction of .35) than in treatment FIX. The latter fact can be statistically validated. Taking the mean of prob(E)-choices of each group as an independent observation, we conclude that the mean in treatment RAND is significantly smaller than in treatment FIX (at p = .023; Mann-Whitney U-test, two-tailed).

The findings for treatment RAND are summarized in

**Result 2.** When subjects play Gilboa's game repeatedly with randomly matched partners the symmetric mixed equilibrium predicts aggregate behavior very well.<sup>k</sup>

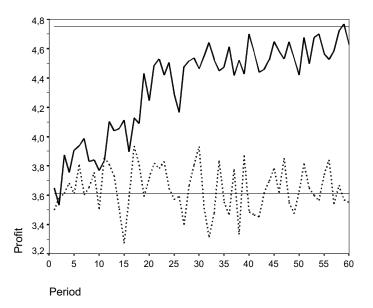
Finally, let us consider the evolution of profits in the two treatments. Figure 6 shows the time path of average individual payoffs in the two treatments along with the payoff levels predicted by the asymmetric equilibria and the symmetric equilibrium, respectively. As shown above, most pairs in treatment FIX learn over time to coordinate on a (high-payoff) asymmetric equilibrium. This shows up nicely in Fig. 6 as the solid line, representing average individual profits in treatment FIX, shows a clear upward trend. In fact, toward the end of the experiment profits are close to the prediction of the asymmetric equilibria in pure strategies (4.75). In contrast, in treatment RAND subjects could not coordinate on an asymmetric equilibrium. This is reflected in Fig. 6 as the dashed line, indicating average individual profits in treatment Rand, oscillates around a level of 3.6125 — the payoff associated with the symmetric equilibrium in mixed strategies.

Let us end this section by comparing average individual payoffs across treatments: Whereas subjects in treatment FIX earn on average a payoff of 4.34 Points, subjects in treatment RAND get on average 3.64 Points. Using a two-tailed Mann-Whitney U-test, based on per-session averages of individual payoffs, it turns out that this difference is statistically highly significant at p = 0.007.

### 4. Conclusion

This note contributes to the discussion of decision problems with imperfect recall from an empirical point of view. We argue that, using standard methods of experimental economics, it is impossible to induce (or control for) absent–mindedness

 $^{\rm k}{\rm This}$  is in line with the population interpretation of mixed equilibrium (see, for example, Oechssler 1997).



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Fig. 6. Time path of average individual payoffs (Treatment FIX: solid line; Treatment RAND dashed line) Note: The two horizontal lines indicate the payoffs in the asymmetric (above) and the symmetric (below) equilibrium.

of subjects. Thus, even the simple absent-minded driver game, as originally introduced by Piccione and Rubinstein (1997a), cannot be directly tested. Hence, the theoretical dispute about how such games should be treated remains a theoretical dispute. Regardless, which predictions are made they cannot be falsified.

However, Gilboa's (1997) approach to problems with imperfect recall, which splits the decision maker into two (or more) identical agents, is genuinely testable. In some sense, this might also be seen as an advantage his approach has over others. Moreover, we find that the symmetric equilibrium prediction he emphasizes is strikingly accurate — provided that subjects act in an environment that resembles the one–shot nature of the theoretical model and also gives opportunities for learning. In case of repeated interaction we find, however, that most subjects eventually manage to coordinate on one of the Pareto–superior asymmetric equilibria.

The question which of the two treatments captures the theoretical problem more accurately is ambiguous. On the one hand, one might argue that the randommatching treatment is more accurate as it reflects the one-shot nature of the game. On the other hand, the fixed-pairs treatment might be more appropriate with respect to the multiple-selves interpretation. (The other selves I am playing with in reality always remain identical.)

Nevertheless, we conclude that the modelling approach suggested by Gilboa allows to make testable and — in the light of the result with random matching — reliable predictions.

#### Acknowledgment

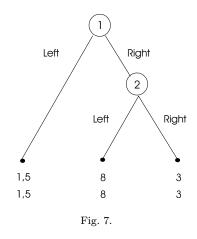
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### Appendix A. Translated instructions of treatment FIX

Please read these instructions carefully! Do not speak to your neighbors and keep quiet during the entire experiment! In case you have questions give notice. We will then come to your place.

In our experiment you will repeatedly make a decision. By doing that you can earn money. How much money you will earn depends on your decision and on the decisions made by another participant you are matched with. All participants have identical instructions. The situation in which you have to decide is simple.

You and the other participant you are matched with must choose between two options: the option to go "left" and the option to go "right". Then it will be randomly decided who of you goes first. The following picture illustrates how many points you can earn depending on what happens.



- If the one who goes first (in the picture denoted by "1") decided to go left, both of you get 1.5 points.
- If the one who goes first decided to go right then it depends on what the other (in the picture denoted by "2") did:
  - If he decided to go left, both of you get 8 points.
  - If he also decided to go right, both of you get 3 points.

(Thus, both of you always get the same number of points.)

The problem, however, is that when you have to decide between "left" and "right", you don't know whether you go first or second. This will be randomly determined *after* you have decided. The odds are 50:50.

So far the main rules. Now the exact procedure.

Each of 60 periods will consist of 100 rounds in which the situation will be carried out once. In each period you decide as follows. Imagine an urn with 100 balls. You can determine how many of these balls stand for "going to the left" and "going to the right". In each run the computer randomly decides who of you goes first. Of the chosen participant the computer then randomly draws one ball from the urn (and puts it back afterward). If it is a ball showing "left" then this round stops and both participants get 1.5 points. In case the ball shows "right" then the computer also chooses a ball from the urn of the other participant. Depending on what kind of ball it is you get payoffs as described above.

This procedure makes it possible for you not to do always the same in the 100 rounds (within one period). However, if you always want to do the same, you can do that by providing your urn only with "left" or "right" balls. If on the other hand you want to go on average "so and so often" to the left or to the right, respectively, you can do that by a mixture of "so and so many" left and right balls.

Please keep the following in mind: Since in each round chance decides, it can happen that you go first in less than 50 rounds. Furthermore, it can happen, that you go left (or right) more often than the number of Left balls (Right balls) you put in the urn.

On the Screen you will see two boxes (one for left one for right). In each of them you will enter a number. The sum of the numbers must be 100.

At the end of a period, you will get to know what happened in the 100 rounds of this period. Thereby you will get to know how many points you have earned. Then a new period starts which will be conducted following the same rules as the first. Altogether there will be sixty such periods.

The sum of your points you earned in the 6.000 rounds (60 periods times 100 rounds) determine your payoff in DM. Here you get 1 DM for every 900 points immediately after the experiment.

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