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Evolution of cooperation in a particular case of the infinitely repeated prisoner's dilemma with three strategies

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Abstract We study a population of individuals playing the infinitely repeated prisoner's dilemma under replicator dynamics. The population consists of three kinds of individuals adopting the following reactive strategies: ALLD (individuals which always defect), ATFT (almost tit-for-tat: individuals which almost always repeat the opponent's last move) and G (generous individuals, which always cooperate when the opponent cooperated in the last move and have a positive probability q of cooperating when their opponent has defected). Our aim is studying in a mathematically rigorous fashion the dynamics of a simplified version for the computer experiment in Nowak and Sigmund (Nature 355:250-253, 1992) involving 100 reactive strategies. We see that as the generosity degree of the G individuals varies, equilibria (rest points) of the dynamics appear or disappear, and the dynamics changes accordingly. Not only we prove that the results of the experiment are true in our simplified version, but we also have complete control on the existence or non-existence of the equilbria for the dynamics for all possible values of the parameters, given that ATFT individuals are close enough to TFT. For most values of the parameters the dynamics can be completely determined.

Keywords Replicator dynamics \cdot Evolutionary game theory \cdot Nash equilibrium \cdot Tit-for-tat \cdot Generous tit-fot-tat

Mathematics Subject Classification 91A22 · 92D15 · 91C99 · 37N25

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1 Introduction

Although cooperation is ubiquitous in human societies and also in biological systems, cooperating individuals usually have to pay a cost for the benefit of other individuals. It is therefore an interesting question to understand how cooperation can evolve in the light of Darwinian natural selection. Sigmund, Nowak and collaborators have studied in several contributions the evolution of cooperation, see e.g. Nowak (2006a, b) for some basic information and more references.

The essence of the problem can be grasped by the famous prisoner's dilemma (PD) stated in different forms by Nowak (2012) and Sigmund (2010). In its *one-shot* version, individuals interact only once and each individual has only two strategies: cooperate (C) or defect (D). Whatever be the choice of his opponent, the pay-off for a defector is larger than for a cooperator. Using the jargon of game theory (Nowak 2006a), D is a strict Nash equilibrium, whereas C is not a Nash equilibrium. Rational individuals must choose D and cooperation cannot evolve in the one-shot PD (Nowak 2006a).

If individuals are given the opportunity of interacting many times before they receive their pay-offs, a reciprocity mechanism can favor cooperation. We are then in the realm of the repeated PD (RPD) and in this setting C and D are not the only possible strategies and we have the problem of selecting among a huge number of strategies combining the choice of C or D for each round of the game. In some cases, as in this paper, we may even repeat the PD infinitely, obtaining the so-called infinitely repeated PD (IRPD) (Akin 2012).

In the 1970's Axelrod (1984) studied strategies for the RPD. He organized two RPD tournaments, in which contestants could submit any conceivable strategies, and in both realizations the winning strategy was the simplest among all submitted strategies: *tit-for-tat* (TFT). TFT is the strategy which repeats the previous move of its opponent. After Axelrod's work much has been done in finding strategies with interesting properties for the RPD, as well as in other games. As the space of all available strategies is huge, many results were obtained in the subset of the so-called *memory-one* strategies (Akin 2012). The recent discovery (Press and Dyson 2012) of a new remarkable class of memory-one strategies for the IRPD—the so-called *zero-determinant* strategies—stimulated renewed interest in the field, as exemplified by Adami and Hintze (2013), Hilbe et al. (2013), Stewart and Plotkin (2013), Akin (2012), Stewart and Plotkin (2014) and Hilbe et al. (2015).

Game theory was introduced in Biology by Maynard Smith and coworkers, see Maynard Smith and Price (1973) and Maynard Smith (1974), creating the subject of evolutionary game theory. In evolutionary game theory pay-offs are viewed as biological fitness and population frequencies of individuals adopting strategies with larger pay-offs have the tendency to increase. The dynamics for the changing population frequencies is usually specified by a system of ordinary differential equations (ODEs) (Taylor and Jonker 1978) called *replicator equations*.

Reactive strategies (Nowak and Sigmund 1989), the ones considered in the present work, are the subset of the memory-one strategies in which the next move of an individual (C or D) is stochastically determined just by the last move of his opponent. A reactive strategy is characterized by a vector (p, q) such that p is the probability of playing C after the opponent played C and q is the probability of playing C after an

opponent's D. We may think of p as a *loyalty* parameter, q as a *forgiveness* parameter. Some simple strategies are recognized as reactive: ALLD, individuals which always defect, is denoted as (0, 0) and TFT is (1, 0). The pay-off for reactive strategy $s \equiv (p, q)$ against reactive strategy $s' \equiv (p', q')$ may be defined in the IRPD (Nowak and Sigmund 1990) if

$$(p-q)(p'-q') \neq 1.$$
 (1)

This paper originates with the seminal computer experiment performed in Nowak and Sigmund (1992). In that experiment the authors took 99 reactive strategies with (p, q) randomly chosen in the square $[0, 1] \times [0, 1]$. To that sample, suggested by Axelrod's results, they added by hand strategy (0.99, 0.01), an almost TFT (ATFT) strategy. TFT was not selected because (1) implies that the pay-off of TFT against itself is not well-defined in the IRPD. All 100 strategies were considered as having equal fractions at the initial time and then replicator dynamics was numerically evaluated. Results of this evolution—illustrated at one figure in Nowak and Sigmund (1992)—are described as follows:

- 1. Initially, strategies far from (0, 0) have their frequencies strongly depleted and it seems that the strategy closest to ALLD will extinguish all the others.
- 2. After some time the frequency of ATFT starts increasing, and it looks like it will be the ultimate winner.
- 3. After a much longer period the ATFT frequency decreases and a surprising strategy named *generous TFT* (GTFT) finally drives all other strategies to extinction. With the parameter values of the experiment, the winner was the strategy closest to $(1, \frac{1}{3})$.

GTFT seems to have been discovered in Molander (1985) and rediscovered precisely in Nowak (1990) and Nowak and Sigmund (1990), to reappear in Nowak and Sigmund (1992). Whereas TFT only reciprocates cooperation, GTFT does more than that, it is also forgiving. According to Molander (1985), GTFT defines an optimal level of generosity up to which it is safe to cooperate "without risk of exploitation by the other party".

The purpose of this paper is to provide precise mathematical arguments supporting the results found in Molander (1985) and in Nowak and Sigmund (1992). Molander's paper considers a situation in which there is no dynamics at all, only *pairwise* comparison between pay-offs obtained using different strategies in the IRPD. Furthermore, strategies considered in his paper are not reactive, but mixed strategies (Hofbauer and Sigmund 1998). Unable at this time to prove results for numbers of strategies as large as 100, we simplify the initial situation of the experiment in Nowak and Sigmund (1992) and consider the IRPD with only *the three more prominent strategies* in their experiment. Our results are valid for any suitable choice of the many parameters of the problem, not a fixed choice, and any initial condition for the population.

The replicator dynamics with three strategies is relatively easy for a fixed choice of the pay-offs, see e.g. the many examples treated in Hofbauer and Sigmund (1998). Despite that, we have seen no rigorous result in the literature as ours, dealing with many parameters and different dynamics according to the values of the parameters. An interesting and non-trivial example of a rigorous analysis with four strategies but

fixed parameters is Zeeman (1981). Although not completely rigorous, an interesting paper about three strategies with a flavor similar to ours is Adami et al. (2012).

More concretely, in this paper we consider a population of individuals under the replicator dynamics playing the IRPD with three reactive strategies:

- Strategy 1 is an arbitrary ATFT, i.e. strategy $(1 \epsilon_1, \epsilon_2)$, where ϵ_1 and ϵ_2 are positive and small enough. Differently of Nowak and Sigmund (1992), we need not consider $\epsilon_1 = \epsilon_2$.
- Strategy 2 is ALLD, i.e. (0, 0).
- Strategy 3, which will be called *Generous* (G), is (1, q), with $q > (\epsilon_1 + \epsilon_2)^{1/2}$, i.e. perfectly loyal individuals and more forgiving than the considered ATFT.

We prove the existence of a maximum amount of forgiveness q_{GTFT} and a region of initial conditions with positive area such that, as in Nowak and Sigmund (1992), only strategy 3 will survive after infinite time. But we will also see what happens for larger values of the forgiveness q of the G strategists and find out that if $q > q_{GTFT}$ we may still have some weaker form of cooperation evolution.

The methods used are exact calculations of the pay-off matrix for the IRPD with the mentioned three strategies and analysis of its entries. Some of the results depend on asymptotic analysis in parameters ϵ_1 and ϵ_2 . A combination of parameters G_1 , defined in (7), will appear naturally with its sign being a separator of different cases. For each q and sign of G_1 we will determine all equilibria of the replicator dynamics and find out the few phase portraits as in the classification in Zeeman (1980) or Bomze (1983) which are compatible with the existent equilibria and the dynamics at the boundary of the relevant region. In most cases only a single phase portrait of the complete table in Bomze (1983) is compatible. In such cases the dynamics will be completely determined. In some other cases we were unable to completely determine the dynamics, because more than one phase portrait in Bomze (1983) was found compatible with the information available to us. In such cases we formulate some conjectures about the dynamics.

The results of this work are summarized in Tables 1, 2 and 3, which state which of the equilibria exist for any value of q and sign of G_1 , and the corresponding type of cooperation evolution. In Sect. 2 we introduce the pay-off matrix, the replicator dynamics and define some important concepts and notations regarding the equilibria for the replicator dynamics. In Sect. 3 we prove some simpler properties of the entries of the pay-off matrix. Section 4 contains the most important results of this paper. There we prove existence and properties of the thresholds q_{AD} , q_{AG} , q_{DG} and q_{int} , which appear in the mentioned tables. In Sect. 5 we define the various types of evolution of cooperation, relate the existent equilibria for each value of q and sign of G_1 with the phase portraits in Bomze (1983) and use this information to conclude about the type of evolution of cooperation in each case. The paper is closed by a conclusions section.

2 Pay-off matrix and notations

In a game among *n* strategies, the pay-off matrix *A* is such that element a_{ij} is the payoff received by an individual playing strategy *i* confronted by an individual playing strategy $j, i, j \in \{1, 2, ..., n\}$. In the one-shot PD, if strategy 1 is C (cooperate) and strategy 2 is D (defect) then the pay-offs are

$$A_{os} = \begin{pmatrix} R & S \\ T & P \end{pmatrix},\tag{2}$$

where, by definition, entries satisfy inequalities

$$T > R > P > S. \tag{3}$$

We will also assume the following inequalities as hypotheses for the results in this paper:

$$P < \frac{S+T}{2} < R. \tag{4}$$

The upper bound for (S+T)/2 is a natural condition to ensure that alternating between C and D is not as good as a steady C for a pair of players, and has appeared at least since Molander (1985) in almost all works dealing with the RPD. The lower bound is a relatively novel condition, necessary for some of our proofs. We have seen it appearing only in Hilbe et al. (2015). As a consequence of this new assumption we will have in Proposition 1 that any amount of forgiveness in a reactive strategy will result in a pay-off larger than P for that strategy against itself.

Consider now the IRPD and reactive strategies s = (p, q) and s' = (p', q'). As moves of the players are stochastically determined by their states at the previous instant, then their successive states follow a Markov chain. If and only if (1) holds, a limit distribution independent of the initial state of the Markov chain exists (Nowak and Sigmund 1990), and the mean pay-off per move in the IRPD may be defined precisely using this limit distribution. It can be shown that

$$c = \frac{(p-q)q'+q}{1-(p-q)(p'-q')} \text{ and } c' = \frac{(p'-q')q+q'}{1-(p-q)(p'-q')}$$
(5)

are respectively the equilibrium probabilities that *s* cooperates with s' and vice-versa. As a consequence, in Nowak and Sigmund (1990) the IRPD pay-off E(s, s') of *s* against s' is written as

$$E(s, s') = G_1 cc' + (S - P)c + (T - P)c' + P,$$
(6)

where

$$G_1 = (R - T) + (P - S)$$
(7)

is a parameter which will have great importance in this work. Notice that inequalities (3) and (4) do not fix the sign of G_1 . The special case of the PD with $G_1 = 0$ is known as *donation game* (Hilbe et al. 2013).

Notice that, apart the unimportant case of the paradoxical strategies (Nowak 1990) s = s' = (0, 1), condition (1) is not satisfied only if s = s' = (1, 0), i.e. both players are TFT. It can be seen that pay-offs for TFT players must depend on their initial

moves and are also heavily affected by small amounts of noise, see Molander (1985) and also our Proposition 1. This is why ATFT—a noisy TFT—was naturally included in the experiment in Nowak and Sigmund (1992) and also in this work.

The pay-off matrix for the IRPD among the three strategies ATFT, ALLD and G numbered and specified in Sect. 1 may be calculated in a lengthy but straightforward fashion using (6) and (5). The result is

$$A_{IRPD} = \begin{pmatrix} F(\frac{\epsilon_1}{\epsilon_2}) & (1 - \epsilon_2)P + \epsilon_2 S & a_{13}(q) \\ (1 - \epsilon_2)P + \epsilon_2 T & P & (1 - q)P + qT \\ a_{31}(q) & (1 - q)P + qS & R \end{pmatrix}, \quad (8)$$

where

$$F(\rho) = \frac{P\rho^{2} + (S+T)\rho + R}{(1+\rho)^{2}},$$
(9)

$$a_{13}(q) = G_{1} \frac{\epsilon_{1}^{2}(1-q)}{[q+(1-q)(\epsilon_{1}+\epsilon_{2})]^{2}} - \frac{\epsilon_{1}}{q+(1-q)(\epsilon_{1}+\epsilon_{2})} \frac{2R-S-T+(T-R)(\epsilon_{1}+\epsilon_{2})}{1-\epsilon_{1}-\epsilon_{2}} + \frac{R(1-\epsilon_{2})-\epsilon_{1}S}{1-\epsilon_{1}-\epsilon_{2}}$$
(10)

and

$$a_{31}(q) = G_1 \frac{\frac{\epsilon_1^2}{1-\epsilon_1-\epsilon_2}}{[q+(1-q)(\epsilon_1+\epsilon_2)]^2} - \frac{\epsilon_1}{q+(1-q)(\epsilon_1+\epsilon_2)} \frac{2R-S-T-[\epsilon_1(T-P)+\epsilon_2(R-S)]}{1-\epsilon_1-\epsilon_2} + \frac{R(1-\epsilon_2)-\epsilon_1T}{1-\epsilon_1-\epsilon_2}.$$
(11)

We stress that the combination of parameters G_1 in (7) reappears in (10) and (11).

Let $\mathbf{x} = (x_1, x_2, x_3)$ denote the fractions of individuals in the population using strategies 1 to 3. The fitness of strategy *i*, see e.g. Nowak (2006a), Hofbauer and Sigmund (1998) or Sigmund (2010), is defined as

$$f_i(\mathbf{x}) = (A_{IRPD}\mathbf{x})_i,\tag{12}$$

the *i*-th element of a matrix product. The mean fitness of the population is then

$$\phi = \sum_{i=1}^{3} f_i(\mathbf{x}) x_i.$$
(13)

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The replicator dynamics (Taylor and Jonker 1978), which specifies how strategy frequencies change with time is

$$\dot{x}_i = (f_i(\mathbf{x}) - \phi) x_i, \tag{14}$$

i = 1, 2, 3. It can be shown (Hofbauer and Sigmund 1998) that the simplex

$$S_3 = \left\{ \mathbf{x} \in \mathbb{R}^3; x_i \ge 0, \sum_{i=1}^3 x_i = 1 \right\}$$

is invariant under the replicator dynamics.

Instead of studying the replicator dynamics in the simplex S_3 , in this paper we will project it onto the (x_1, x_2) plane. As the resulting dynamics will be well-defined everywhere in this plane, but we are only interested in its restriction to the projection of S_3 , we define the *biological region* as this projection, i.e. the closed triangle B with vertices $E_1 \equiv (1, 0), E_2 \equiv (0, 1)$ and $E_3 \equiv (0, 0)$. The sides of B will be denoted by L_1, L_2 and L_3 , where L_i is the side on which $x_i = 0$. Of course, because of a one to one natural correspondence between B and S_3 , B is invariant under the projected replicator dynamics.

For $i \neq j$ we denote

$$n_{ij} = \{(x_1, x_2) \in \mathbb{R}^2; f_i(x_1, x_2, 1 - x_1 - x_2) = f_j(x_1, x_2, 1 - x_1 - x_2)\}$$

the straight lines in which two fitnesses are equal. We will also denote P_{ijk} the point at which the line n_{ij} intercepts the $x_k = 0$ line. Notice that the coordinates for the P_{ijk} can be easily calculated in terms of the entries in the pay-off matrix (8).

From general arguments, see Hofbauer and Sigmund (1998), the equilibria for the replicator dynamics with three strategies can be:

- Points in which only one strategy is present, i.e. the vertices E_1 , E_2 and E_3 of B.
- Points in which one strategy is absent and the other two have the same fitness, i.e. P_{123} , P_{132} and P_{231} , whenever they lie in *B*.
- One point in which all three strategies have the same fitness. This is the intersection of the three lines n_{12} , n_{13} and n_{23} , whenever it lies in the interior of *B*, and will be denoted *Q*. Notice that if two among these lines cross at a point, then the third line must also pass through this point.

The following definition is given to rule out the cases when the above cited equilibria in the plane (x_1, x_2) do not correspond to points in the simplex S_3 :

Definition 1 We will say that equilibria P_{123} , P_{132} and P_{231} are *biological* whenever they lie in *B*, but not coincide with any of the vertices. We will say that equilibrium *Q* is *biological* whenever it lies in the interior of *B*.

As a mnemonic tool for dealing with the n_{ij} and the P_{ijk} equilibria, we will use A for strategy 1 (ATFT), D for strategy 2 (ALLD) and G for strategy 3. Thus n_{12} will be referred to as the AD-isocline, n_{13} will be the AG-isocline and n_{23} the DG-isocline.

Equilibrium P_{123} will be termed AD-equilibrium, P_{132} the AG-equilibrium and P_{231} the DG-equilibrium. Equilibrium Q will be simply called interior equilibrium.

We will always be interested in positive values for ϵ_1 and ϵ_2 . We define polar coordinates *r* and θ in the (ϵ_1 , ϵ_2) plane, so that

$$\epsilon_1 = r \cos \theta \quad \text{and} \quad \epsilon_2 = r \sin \theta.$$
 (15)

Throughout this paper, r and θ will always be used with this meaning.

Many times we will use ϵ to refer to vector (ϵ_1, ϵ_2) . We define the phrase "property P holds if ϵ is small enough" as meaning "there exists $r_0 > 0$ such that property P holds if $0 < r < r_0$ ".

The overwhelming majority of the intermediate and final results in this paper will hold if ϵ is small enough. From now on, as with (3) and (4), we will assume as a hypothesis for the rest of this paper that ϵ is small enough. In the beginning we will be explicit in stating this hypothesis, because we want the reader to be aware of it, but with time we will be increasingly more relapse in reminding it.

In some instances we will also use the notation $O(r^{\alpha})$ standard in asymptotic analysis. For definiteness, if f is some function depending on ϵ , we will write $f = O(r^{\alpha})$ if there exist $r_0 > 0$ and a constant K independent of r such that $|f/r^{\alpha}| < K$ for $0 < r < r_0$.

3 Some properties of the entries of the pay-off matrix

We start by considering the pay-off $F(\frac{\epsilon_1}{\epsilon_2})$ of strategy ATFT against itself, with function *F* being given by (9).

Proposition 1 (i) F(0) = R.

(ii) $\lim_{x\to\infty} F(x) = P$.

- (iii) *F* is a decreasing function in $[0, +\infty)$.
- (iv) There exist positive constants K_1 , K_2 such that

$$\frac{K_1}{r} \le \frac{F(\frac{\epsilon_1}{\epsilon_2}) - P}{\epsilon_2} \le \frac{K_2}{r}.$$
(16)

(v) There exist positive constants K_3 , K_4 such that

$$\frac{K_3}{r} \le \frac{R - F(\frac{\epsilon_1}{\epsilon_2})}{\epsilon_1} \le \frac{K_4}{r}.$$
(17)

Proof The first two items are direct consequences of (9). The third item follows easily by calculating the derivative of F and using both inequalities in (4).

Using polar coordinates (15) we get

$$\frac{F(\frac{\epsilon_1}{\epsilon_2}) - P}{\epsilon_2} = \frac{1}{r} \frac{(R - P)\sin\theta + (S + T - 2P)\cos\theta}{(\cos\theta + \sin\theta)^2}$$

By using (3) and (4) the function of θ in the right-hand side is clearly strictly positive and continuous in the compact $[0, \frac{\pi}{2}]$. Letting K_1 be its minimum and K_2 its maximum, assertion (iv) is proved.

Item (v) can be proved in an analogous way.

Items (i), (ii) and (iii) in Proposition 1 prove that the pay-off of an ATFT against another ATFT may be any number in (P, R) regardless of the smallness of ϵ .

If q = 0, strategy G becomes TFT. As a consequence of this, see Nowak and Sigmund (1990),

$$a_{13}(0) = a_{31}(0) = F\left(\frac{\epsilon_1}{\epsilon_2}\right). \tag{18}$$

Also at q = 1 both formulas for a_{13} and a_{31} simplify and we obtain

$$a_{13}(1) = R + (T - R)\epsilon_1$$
 and $a_{31}(1) = R - (R - S)\epsilon_1$. (19)

Other important properties of a_{13} and a_{31} are:

Proposition 2 (i) $a_{13}(q) > a_{31}(q) \forall q \in (0, 1].$

- (ii) $a_{13}(q) a_{31}(q)$ is an increasing function in [0, 1].
- (iii) If ϵ is small enough, then both $a_{13}(q)$ and $a_{31}(q)$ are increasing functions in [0, 1].
- (iv) $a'_{13}(0) \xrightarrow{r \to 0} \infty$ and $a'_{31}(0) \xrightarrow{r \to 0} \infty$.
- (v) $a'_{13}(1) \xrightarrow{r \to 0} 0$ and $a'_{31}(1) \xrightarrow{r \to 0} 0$.
- (vi) If ϵ is small enough, $a_{13}''(q)$ and $a_{31}''(q)$ are both negative in [0, 1].

Proof After some easy manipulations with (10) and (11), we obtain

$$a_{13}(q) - a_{31}(q) = \frac{\epsilon_1(T-S)q}{q + (1-q)(\epsilon_1 + \epsilon_2)},$$

which proves assertion (i). Differentiating the above equation proves (ii).

To prove (iii), we define first an auxiliary variable

$$x \equiv q + (1 - q)(\epsilon_1 + \epsilon_2) \tag{20}$$

which leads us to

$$a_{31}'(q) = \epsilon_1 \frac{2R - S - T - \epsilon_1(T - P) - \epsilon_2(R - S)}{x^2} - \frac{2G_1\epsilon_1^2}{x^3}.$$
 (21)

Notice then that $a'_{31}(q)/\epsilon_1$ is a continuous function of ϵ , positive at $\epsilon = 0$. As a consequence, $a'_{31}(q)$ is positive if $\epsilon_1 > 0$, provided that ϵ is small enough. Using (ii) the analog result is obtained for $a_{13}(q)$.

To prove (iv), we substitute q = 0, thus $x = \epsilon_1 + \epsilon_2$, in (21). Using polar coordinates and (7), we get

$$a'_{31}(0) = \frac{1}{r} \frac{(S+T-2P)\cos^2\theta + (2R-S-T)\sin\theta}{(\cos\theta + \sin\theta)^3} + O(1).$$

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As the function of θ multiplying 1/r is positive, then the result for $a'_{31}(0)$ is proved. Using again (ii), we prove the same for $a'_{13}(0)$.

The proofs of (v) and (vi) follow similar ideas.

Although formulas (10) and (11) are complicated, Proposition 2 tells a lot about these functions. In particular, properties (iv) and (v) show that both a_{13} and a_{31} grow very fast for q close to 0 and then saturate before q = 1.

To close this section, a simple and important

Corollary 1 If ϵ is small enough and $\alpha \in (F(\frac{\epsilon_1}{\epsilon_2}), R + (T - R)\epsilon_1)$, then equation $a_{13}(q) = \alpha$ has a unique root q in interval (0, 1). Analogously, if $\beta \in (F(\frac{\epsilon_1}{\epsilon_2}), R - (R - S)\epsilon_1)$, then $a_{31}(q) = \beta$ has a unique root in (0, 1).

4 Locating the equilibria

We start this section by studying the *AD*-equilibrium P_{123} , the simplest among the equilibria in which only two strategies coexist, because its location is independent of the variable q, as shown by the following result.

Proposition 3 The AD-equilibrium P_{123} is independent of q and always biological.

Proof Equating fitnesses f_1 and f_2 , given by (12), and writing $x_2 = 1 - x_1$, which is equivalent to $x_3 = 0$, we obtain

$$x_1(P_{123}) = \frac{1}{1 - \frac{T - P}{P - S} + \frac{1}{P - S} \frac{F(\frac{\epsilon_1}{\epsilon_2}) - P}{\epsilon_2}},$$
(22)

which is indeed independent of q. Using (iv) in Proposition 1 we see that the denominator in the above equation is dominated by a positive term of order 1/r. Thus $x_1(P_{123}) > 0$ and as small as we want if ϵ is small enough.

The next result will be important when showing that the interior equilibrium will become biological for some intervals in q, because it states that the intercepts of lines n_{12} , n_{13} and n_{23} appear always in the same order on L_3 . Notice the appearance for the first time of a hypothesis stating that forgiveness q of individuals adopting strategy 3 must not be too close to 0. This will happen in other parts of this section and has the clear meaning that strategy 3 must be more forgiving than strategy 1 for some of the results to be true. If it were otherwise, then what we are calling strategy 3 would be closer to TFT than strategy 1 and strategy 1 more generous than strategy 3, their names ATFT and G appearing reversed.

Lemma 1 (Order on L_3) If $q \in [(\epsilon_1 + \epsilon_2)^{1/2}, 1]$, then $0 < x_1(P_{123}) < x_1(P_{233}) < x_1(P_{133}) < 1$.

Proof For ease of comparison, we may rewrite all three quantities in the form $x_1(P_{ij3}) = \frac{1}{1+\tilde{c}_{ij}}$, where formulas for the \tilde{c}_{ij} will be presented. We will show that $0 < \tilde{c}_{13} < \tilde{c}_{23} < \tilde{c}_{12}$, from which the claim will be a trivial consequence.

An easy calculation leads to

$$\tilde{c}_{13} = \frac{a_{31}(q) - F(\frac{\epsilon_1}{\epsilon_2})}{q(P-S)}$$

and

$$\tilde{c}_{23} = \frac{a_{31}(q) - P - \epsilon_2(T - P)}{q(P - S)}$$

 \tilde{c}_{12} may be obtained in (22). As $a_{31}(q)$ is increasing and $a_{31}(0) = F(\frac{\epsilon_1}{\epsilon_2})$, then $\tilde{c}_{13} > 0$. If the ratio $\frac{\epsilon_1}{\epsilon_2}$ is fixed and ϵ is taken small enough, we obtain, using (ii) and (iii) in Proposition 1, that $F(\frac{\epsilon_1}{\epsilon_2}) > P + \epsilon_2(T - P)$, thus proving that $\tilde{c}_{13} < \tilde{c}_{23}$ for small enough ϵ and q > 0.

Using (19) and, again, the fact that $a_{31}(q)$ is increasing, we may see that, if $q > (\epsilon_1 + \epsilon_2)^{1/2}$,

$$\tilde{c}_{23} < \frac{R - (R - S)\epsilon_1 - P - \epsilon_2(T - P)}{(\epsilon_1 + \epsilon_2)^{1/2}(P - S)},$$

which increases as $r^{-1/2}$ when $r \to 0$. On the other hand, by (22) and (iv) in Proposition 1, we see that \tilde{c}_{12} increases as r^{-1} . We conclude that $\tilde{c}_{23} < \tilde{c}_{12}$ for small enough ϵ .

We may now define two important thresholds for q related to when the AG and DG equilibria become or cease to be biological:

Definition 2 According to Corollary 1,

$$a_{13}(q) = R$$

has a unique root in (0, 1). Let q_{AG} be this root.

Let also

$$q_{DG} = \frac{R - P}{T - P} \tag{23}$$

be the unique root of equation $a_{23} = R$.

With these definitions we prove an important general result:

Theorem 1 Let $q \in (\epsilon_2, 1]$. Then:

- The DG-isocline intercepts L_1 if and only $q \leq q_{DG}$ and intercepts L_2 if and only if $q \in [q_{DG}, 1]$. In particular, the DG-equilibrium is biological if and only if $q < q_{DG}$.
- The AG-isocline intercepts L_1 if and only $q \le q_{AG}$ and intercepts L_2 if and only if $q \in [q_{AG}, 1]$. In particular, the AG-equilibrium is biological if and only if $q > q_{AG}$.

Proof After easy calculations we get

$$x_2(P_{231}) = \frac{1}{1 + \frac{q(P-S)}{R - P - q(T-P)}},$$
(24)

$$x_1(P_{232}) = \frac{1}{1 - \frac{a_{31}(q) - P - \epsilon_2(T - P)}{R - P - q(T - P)}},$$
(25)

$$x_1(P_{132}) = \frac{1}{1 + \frac{a_{31}(q) - F(\epsilon_1/\epsilon_2)}{a_{13}(q) - R}},$$
(26)

and

$$x_2(P_{131}) = \frac{1}{1 - \frac{(q - \epsilon_2)(P - S)}{a_{13}(q) - R}},$$
(27)

all in the form 1/(1 + X), which will be in (0, 1) if and only if the corresponding X is positive. In all four cases the proof that the necessary X is positive if and only if the respective condition on q is satisfied is trivial. In the cases related to the AG-isocline, we must use item (iii) in Proposition 2.

Besides q_{DG} and q_{AG} we will define a threshold q_{AD} , which will signal the passage of the *AD*-isocline through the origin. In order to do that, let $\mu(q)$ be defined by

$$\mu(q) = a_{13}(q) - P - q(T - P).$$
⁽²⁸⁾

In terms of this new function we may easily obtain

$$x_2(P_{121}) = \frac{\mu(q)}{\mu(q) + \epsilon_2(P - S)}$$
(29)

and

$$x_1(P_{122}) = \frac{\mu(q)}{\mu(q) - [F(\epsilon_1/\epsilon_2) - P - \epsilon_2(T - P)]},$$
(30)

which show that the *AD*-isocline passes through the origin of the (x_1, x_2) plane whenever μ has a zero.

The following lemma proves existence and uniqueness of such a zero:

Lemma 2 Function μ defined by (28) has a single critical point \overline{q} and a single zero q_{AD} in (0, 1) such that $q_{AD} > \overline{q}$. Furthermore, \overline{q} is a maximum point, μ is positive in $(0, q_{AD})$ and negative in $(q_{AD}, 1]$.

Proof As $\mu'(q) = a'_{13}(q) - (T - P)$, then (iv) and (v) in Proposition 2 imply that $\mu'(0) > 0$ and $\mu'(1) < 0$ if ϵ is small enough. Then μ has at least a critical point $\overline{q} \in (0, 1)$. Item (vi) in the same proposition proves uniqueness for \overline{q} and that it must be a maximum point.

As $\mu(0) = F(\frac{\epsilon_1}{\epsilon_2}) - P > 0$, then $\mu(\overline{q}) > 0$. And as $\mu(1) = R - T - (T - R)\epsilon_1 < 0$, then μ has a unique zero in (0, 1) located in $(\overline{q}, 1)$. The assertion on the signs of μ follows from the fact $\mu'(q_{AD}) < 0$.

It is now time to start displaying important results in which the sign of G_1 defined in (7) plays an important role. The first thing to notice is that formula (10) for $a_{13}(q)$ is notably simplified when $G_1 = 0$. Solving equation $a_{13}(q) = R$ becomes then trivial and we get, for $G_1 = 0$,

$$q_{AG} = \frac{2R - S - T}{R - S}.$$

If we calculate the difference between this value and q_{DG} we discover the identity

$$\frac{2R-S-T}{R-S} - q_{DG} = \frac{G_1(T-R)}{(R-S)(T-P)},$$
(31)

which shows that q_{AG} and q_{DG} coincide when $G_1 = 0$. As $a_{13}(q_{AG}) = R$, we discover that $\mu(q_{AG}) = (q_{DG} - q_{AG})(T - P)$, from which we can deduce that q_{AD} also coincides with q_{AG} and q_{DG} when $G_1 = 0$.

If $G_1 \neq 0$, although more complicated, equation $a_{13}(q) = R$ leads only to a second-degree equation in q and a closed formula for q_{AG} can also be obtained. If we solve the equation in the auxiliary variable x defined in (20) and notice that q and x differ by O(r), we prove in general that

$$q_{AG} = \frac{2R - S - T}{R - S} - \frac{G_1(T - R)}{(R - S)(2R - S - T)}\epsilon_1 + O(r^2),$$
(32)

with the interesting consequence that the exact calculated value of q_{AG} for $G_1 = 0$ holds as a good approximation for q_{AG} even when $G_1 \neq 0$.

By using the ideas above we can easily prove

Theorem 2 (i) If $G_1 = 0$, then $q_{AG} = q_{DG} = q_{AD}$. (ii) If $G_1 < 0$, then $q_{AG} < q_{DG} < q_{AD}$.

(iii) If $G_1 > 0$, then $q_{AG} > q_{DG} > q_{AD}$.

Equation (32) will be useful later to guarantee that q_{AG} does not tend to 0 when $r \rightarrow 0$. We will also need to prove the same for q_{AD} . This is an easy consequence of the next result.

Proposition 4

$$q_{AD} = q_{DG} + O(r) \tag{33}$$

Proof Using (10) in (28), we may rewrite equation $\mu(q) = 0$ as

$$\frac{R(1-\epsilon_2)-\epsilon_1S}{1-\epsilon_1-\epsilon_2} - \frac{\epsilon_1[2R-S-T+(T-R)(\epsilon_1+\epsilon_2)+G_1\epsilon_1]}{1-\epsilon_1-\epsilon_2} \frac{1}{x} + \frac{G_1\epsilon_1^2}{1-\epsilon_1-\epsilon_2} \frac{1}{x^2} = P + \frac{x-\epsilon_1-\epsilon_2}{1-\epsilon_1-\epsilon_2} (T-P),$$

which solution x_{AD} in x will yield q_{AD} through (20). When $\epsilon_1 = \epsilon_2 = 0$, the solution is simply $x_{AD} = x_0 = q_{DG}$.

Substituting x_0 in the above equation, then x_{AD} is implicitly given by the solution of $g(x, \epsilon) = 0$, where

$$g(x,\epsilon) = -\frac{\epsilon_1 [2R - S - T + (T - R)(\epsilon_1 + \epsilon_2) + G_1\epsilon_1]}{1 - \epsilon_1 - \epsilon_2} \frac{1}{x} + \frac{G_1\epsilon_1^2}{x^2} + x_0 - x + \epsilon_1(T - S) + \epsilon_2(T - R).$$

As $g(x_0, 0) = 0$ with $\frac{\partial g}{\partial x}(x_0, 0) = -1 + O(r) \neq 0$ for small enough *r*, the implicit function theorem proves that in some neighborhood of $\epsilon = 0$ the root x_{AD} of $g(x, \epsilon) = 0$ is a differentiable function of ϵ . Differentiability implies that $x_{AD} = x_0 + O(r)$. Noticing that q_{AD} and x_{AD} differ by O(r) leads to (33).

The first result in the next lemma shows that if q does not tend to 0 as $r \rightarrow 0$, then the difference $a_{13}(q) - a_{13}(0)$ also remains large compared to r. The second result in the lemma shows that point P_{132} moves very slowly unless q is very close to 0.

Lemma 3 Let $q_0 \in (0, 1]$ be fixed and independent of ϵ . Then:

 $-a_{31}(q_0) - F(\frac{\epsilon_1}{\epsilon_2}) \text{ does not tend to } 0 \text{ when } r \to 0.$ - If $q \in [q_0, 1], \frac{d}{dq} x_1(P_{132}) = O(r).$

Proof Using variable x, defined in (20), and (11) we may write

$$a_{31}(q) - F\left(\frac{\epsilon_1}{\epsilon_2}\right) = R - F\left(\frac{\epsilon_1}{\epsilon_2}\right) + \frac{(R-T)\epsilon_1}{1-\epsilon_1-\epsilon_2} -\frac{\epsilon_1}{1-\epsilon_1-\epsilon_2} \frac{2R-S-T-[(T-P)\epsilon_1+(R-S)\epsilon_2]}{x} + \frac{G_1\epsilon_1^2}{(1-\epsilon_1-\epsilon_2)x^2}.$$

Remember that if q_0 is fixed, the corresponding *x* does not tend to 0 when $r \to 0$. So, except for the term $R - F(\frac{\epsilon_1}{\epsilon_2})$, the remaining terms in the right-hand side do tend to 0 when $r \to 0$. On the other hand, (v) in Proposition 1 proves that $R - F(\frac{\epsilon_1}{\epsilon_2})$ is positive and does not tend to 0. This proves the first part.

In order to prove the second part, notice that

$$\frac{d}{dq}x_1(P_{132}) = \frac{a_{13}'(q)\left(a_{31}(q) - F(\frac{\epsilon_1}{\epsilon_2})\right) + (R - a_{13}(q))a_{31}'(q)}{\left[a_{13}(q) - R + a_{31}(q) - F(\frac{\epsilon_1}{\epsilon_2})\right]^2}$$

If $q \ge q_0$, then (10) implies that $a_{13}(q) - R$ is O(r). Moreover, by the first part of this Lemma, $a_{31}(q) - F(\frac{\epsilon_1}{\epsilon_2})$ does not tend to 0 when $r \to 0$. Thus the denominator in the expression above does not tend to 0 when $r \to 0$. In the numerator both terms are O(r), as can be seen in (21) and its analog for a_{13} . As a consequence, the derivative of $x_1(P_{132})$ is O(r).

The following monotonicity result will also turn out to be fundamental ahead.

Proposition 5 *If* $q \in [q_{AD}, 1]$ *, then*

$$\frac{d}{dq}(x_1(P_{122}) - x_1(P_{132})) > 0.$$

Proof Formulas for $x_1(P_{122})$ and $x_1(P_{132})$ have already been given, see (30) and (26).

Equation (33) guarantees that q_{AD} does not tend to 0 as $r \rightarrow 0$. Then, by Lemma 3, using e.g. $q_0 = 1/2q_{DG} < q_{AD}$, we conclude that $\frac{d}{dq}x_1(P_{132})$ is O(r) in $[q_{AD}, 1]$. By an easy calculation, we have

$$\frac{d}{dq}x_1(P_{122}) = \frac{[(T-P) - a'_{13}(q)][F(\frac{\epsilon_1}{\epsilon_2}) - P - \epsilon_2(T-P)]}{[F(\frac{\epsilon_1}{\epsilon_2}) - P - \epsilon_2(T-P) - \mu(q)]^2}.$$
 (34)

It follows that

$$\frac{d}{dq} x_1(P_{122}) > \frac{(T-P) - a_{13}'(q_{AD})}{F(\frac{\epsilon_1}{\epsilon_2}) - P - \epsilon_2(T-P)}$$

because in $[q_{AD}, 1]$ we have $\mu(q) \le 0$, $a'_{13}(q) < a'_{13}(q_{AD})$ and $F(\frac{\epsilon_1}{\epsilon_2}) - P - \epsilon_2(T - P) > 0$. In this last expression $a'_{13}(q_{AD})$ is O(r) and the denominator does not tend to 0. So there exists a positive constant *C* independent of *r* such that $\frac{d}{dq}x_1(P_{122}) > C$.

We conclude that for small enough ϵ , $\frac{d}{dq}(x_1(P_{122}) - x_1(P_{132})) > 0$ for $q \in [q_{AD}, 1]$.

At this point we start separating the case $G_1 > 0$ of the other cases $G_1 = 0$ and $G_1 < 0$. Our first result is on the interior equilibrium:

Proposition 6 If $G_1 \ge 0$, the interior equilibrium is biological for all $q \in (q_{AD}, 1]$. If $G_1 > 0$ the conclusion extends also to $q = q_{AD}$.

Proof First of all, if $G_1 \ge 0$, by Theorem 2 we know that $q_{AD} \le q_{AG}$. For $q = q_{AD}$ we then know that the AG-isocline intercepts the sides L_3 (Lemma 1) and L_2 (Theorem 1) and then we must have $x_1(P_{132}) \le 0$ for $q = q_{AD}$. But $x_1(P_{122}) = 0$ at q_{AD} . By Proposition 5 we discover that $x_1(P_{122}) > x_1(P_{132})$ for all $q \in (q_{AD}, 1]$. Comparing this order in which the isoclines intercept side L_1 with the corresponding order on side L_3 given by Lemma 1, we see that the AD and AG isoclines must cross at the interior of B for all $q \in (q_{AD}, 1]$. If $G_1 = 0$ we already knew that the AD and AG isoclines crossed exactly at the origin for $q = q_{AD}$. But for $G_1 > 0, x_1(P_{132}) < 0$ already at $q = q_{AD}$, and the isoclines cross in the interior.

Our task is now to find out when the interior equilibrium first becomes biological and if it ever loses its biological status. We start with a general result:

Proposition 7 For any value of G_1 and $q = (\epsilon_1 + \epsilon_2)^{1/2}$ we have $x_2(P_{121}) > x_2(P_{131})$.

Proof The coordinates for the intercepts of the n_{ij} lines with $x_1 = 0$ may all be written as

$$x_2(P_{ij1}) = \frac{1}{1 + b_{ij}(q)}.$$

where, after easy calculations, we get

$$b_{12}(q) = \frac{\epsilon_2(P-S)}{\mu(q)}$$
 and $b_{13}(q) = \frac{(q-\epsilon_2)(P-S)}{R-a_{13}(q)}$. (35)

As $a_{13}((\epsilon_1 + \epsilon_2)^{1/2}) = R - O(r^{1/2})$ and $\mu((\epsilon_1 + \epsilon_2)^{1/2}) = R - P - O(r^{1/2})$, then by the above expressions our assertion is true.

The order just proved between $x_2(P_{121})$ and $x_2(P_{131})$ at $q = (\epsilon_1 + \epsilon_2)^{1/2}$ is reversed at $q = q_{AD}$ if $G_1 > 0$. In fact, if $G_1 > 0$ and $q = q_{AD}$, we have $x_2(P_{131}) > 0$, because $q_{AG} > q_{AD}$, and $x_2(P_{121}) = 0$. It turns out that the AG and AD isoclines must cross on L_1 for at least one $q \in ((\epsilon_1 + \epsilon_2)^{1/2}, q_{AD})$. We will show that this crossing is indeed unique, defining q_{int} . If $G_1 = 0$, we saw that the AG and AD isoclines crossed at $q = q_{AD}$. We will also show that no other crossing will happen if $q \in ((\epsilon_1 + \epsilon_2)^{1/2}, q_{AD})$.

If $x_2(P_{121}) - x_2(P_{131})$ were monotonic in $((\epsilon_1 + \epsilon_2)^{1/2}, q_{AD})$ the assertions in the preceding paragraph would be trivial. As this does not happen, we must work a bit harder, starting with

Proposition 8 Equation

$$\mu(q) = (\epsilon_1 + \epsilon_2)^{1/2}$$
(36)

has a single root $\tilde{q} \in [0, q_{AD}]$, which is asymptotically given by

$$\tilde{q} = q_{DG} - \frac{(\epsilon_1 + \epsilon_2)^{1/2}}{T - P} + O(r).$$
(37)

In particular, \tilde{q} does not tend to 0 as $r \rightarrow 0$.

Proof Let \overline{q} be the critical point of μ as in Lemma 2. As $\mu(0) > (\epsilon_1 + \epsilon_2)^{1/2}$ if ϵ is small enough, and μ is increasing in $[0, \overline{q}]$, then Eq. (36) has no solution in that interval. On the other hand, as μ is decreasing in $(\overline{q}, q_{AD}]$ with $\mu(q_{AD}) = 0$, then (36) must have one root exactly in (\overline{q}, q_{AD}) .

In order to obtain (37) we rewrite (36) using definition (28) along with (10) written in terms of variable x defined by (20). Putting $\epsilon_1 = \epsilon_2 = 0$ we obtain the approximate solution $x \approx q_{DG}$, which suggests us to define a new auxiliary variable y as $y = (x - q_{DG})r^{-1/2}$. Substituting $x = q_{DG} + r^{1/2}y$ in (36) and making several simplifications, we get that (36) is equivalent to H(r, y) = 0, where

$$H(r, y) = G_1 r^{3/2} \cos^2 \theta (1 - r^{1/2} y - q_{DG}) - \frac{r^{1/2} \cos \theta [2R - S - T - r \cos \theta (T - P) - r \sin \theta (R - S)]}{q_{DG} + r^{1/2} y} + r^{1/2} [(T - S) \cos \theta + (T - R) \sin \theta)] - (\cos \theta + \sin \theta)^{1/2} [1 - r(\cos \theta + \sin \theta)] - (T - P)y.$$

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Repeating the argument with the implicit function theorem as in the proof of Proposition 4 we obtain (37).

We now prove a monotonicity argument for $x_2(P_{121}) - x_2(P_{131})$, but restricted to (\tilde{q}, q_{AD}) :

Proposition 9 If $G_1 \ge 0$, $x_2(P_{121}) - x_2(P_{131})$ is a decreasing function of q in (\tilde{q}, q_{AD}) .

Proof

$$\frac{d}{dq}x_2(P_{131}) = -\frac{(q-\epsilon_2)(P-S)a'_{13}(q) + (R-a_{13}(q))(P-S)}{[R-a_{13}(q) + (q-\epsilon_2)(P-S)]^2}$$

shows that $\frac{d}{dq}x_2(P_{131})$ is negative and O(r) in (\tilde{q}, q_{AD}) . In order to conclude that, we are using the fact proved in Proposition 8 that \tilde{q} does not tend to 0 when $r \to 0$, which implies that both $R - a_{13}(q)$ and $a'_{13}(q)$ are O(r) for $q \ge \tilde{q}$. The denominator is of course O(1) due to the $(q - \epsilon_2)(P - S)$ term.

For $x_2(P_{121})$ we have

$$\frac{d}{dq}x_2(P_{121}) = \frac{\epsilon_2(P-S)\mu'(q)}{[\mu(q) + \epsilon_2(P-S)]^2} = \frac{\mu'(q)}{\epsilon_2(P-S)} \left[\frac{1}{1 + \frac{\mu(q)}{\epsilon_2(P-S)}}\right]^2$$

In $(\tilde{q}, q_{AD}), \mu'(q) = a'_{13}(q) - (T - P) < -\frac{1}{2}(T - P)$, where we are using again that $a'_{13}(q)$ is O(r). Also,

$$\frac{1}{1+\frac{\mu(q)}{\epsilon_2(P-S)}} > \frac{1}{1+\frac{\mu(\tilde{q})}{\epsilon_2(P-S)}} = \frac{\sin\theta}{\sin\theta + \frac{r^{-1/2}(\cos\theta + \sin\theta)^{1/2}}{P-S}}$$
$$> \frac{\sin\theta}{r^{-1/2}[\sin\theta + \frac{(\cos\theta + \sin\theta)^{1/2}}{P-S}]} \ge K\sin\theta r^{1/2},$$

where $K = \max_{\theta \in [0, \pi/2]} \left(\sin \theta + \frac{(\cos \theta + \sin \theta)^{1/2}}{P - S} \right) > 0.$ Finally, we obtain, for $q \in (\tilde{q}, q_{AD})$,

$$\frac{d}{dq}x_2(P_{121}) < -\frac{1}{2}\frac{T-P}{P-S}K^2\sin^2\theta,$$

from which it turns out that $\frac{d}{dq}(x_2(P_{121}) - x_2(P_{131})) < 0.$

Putting together all known facts, we can now prove

Theorem 3 (Interior equilibrium, $G_1 > 0$) If $G_1 > 0$ and $q \in ((\epsilon_1 + \epsilon_2)^{1/2}, 1]$, there is a single value $q_{int} \in (\tilde{q}, q_{AD})$ such that the AG, AD and DG isoclines cross on the border of B. Moreover, the crossing is on L_1 .

	AG	DG	Interior	Diagrams	Туре
$((\epsilon_1 + \epsilon_2)^{1/2}, q_{int})$		•		38R	F
(q_{int}, q_{DG})		•	•	9R	F
(q_{DG}, q_{AG})			•	15R	Ν
$(q_{AG}, 1]$	•		•	12, 12R, 13	N?

Table 1 The bullets indicate which equilibria are biological at each interval in the case $G_1 > 0$

The *AD*-equilibrium and vertices E_1 , E_2 and E_3 are biological at all intervals. Diagram, see Sect. 5, refers to numbers in the classification scheme in Bomze (1983), where a number followed by R means that the dynamics is given by the corresponding diagram with all orbits reversed. Possible evolution of cooperation types, see again Sect. 5, are F (full), P (partial), W (weak) or N (no). A type followed by a ? means a conjectured result

Proof By the properties of μ proved in Lemma 2, and noticing that

$$x_2(P_{121}) = \frac{1}{1 + \frac{\epsilon_2(P-S)}{\mu(q)}},$$

it is clear that the minimum of $x_2(P_{121})$ in $[0, \tilde{q}]$ is attained at one of the boundaries of the interval. But as $\mu(0) = O(1)$, and $\mu(\tilde{q}) = (\epsilon_1 + \epsilon_2)^{1/2}$, the minimum is attained at \tilde{q} and its value is thus $1 - O(r^{1/2})$.

An easy calculation shows that the derivative of $x_2(P_{131})$ is negative in $[(\epsilon_1 + \epsilon_2)^{1/2}, q_{AD})$. It can be seen also that $x_2(P_{131}) = 1 - O(1)$ at $q = (\epsilon_1 + \epsilon_2)^{1/2}$. Thus the maximum of $x_2(P_{131})$ is less than the minimum of $x_2(P_{121})$ in $[(\epsilon_1 + \epsilon_2)^{1/2}, \tilde{q}]$. This proves that the *AG* and *AD* isoclines do not cross on L_1 for $q \in [(\epsilon_1 + \epsilon_2)^{1/2}, \tilde{q}]$.

On the other hand, they do cross for q somewhere in (\tilde{q}, q_{AD}) because we have already seen that at $q = q_{AD} < q_{AG}$ we have $x_2(P_{131}) > 0 = x_2(P_{121})$. We have also just proved that the reverse holds at $q = \tilde{q}$. Uniqueness of this crossing in (\tilde{q}, q_{AD}) follows from Proposition 9. Uniqueness in $((\epsilon_1 + \epsilon_2)^{1/2}, 1]$ is a consequence of Proposition 6.

This result settles the question of the existence of a threshold q_{int} for the appearance of the interior equilibrium for $G_1 > 0$, and the fact that $q_{int} < q_{AD}$. We remember that the question of whether the other equilibria are biological or not is already solved in Proposition 3 and Theorem 1, and the order of the corresponding thresholds is established in Theorem 2. The results on which equilibria are biological for $G_1 > 0$, all justified, are summarized in Table 1. The two rightmost columns in that table (and in the other two tables) will still be the subject of the next section.

As in the case $G_1 > 0$, the results on the equilibria for the case $G_1 = 0$ (donation game) are summarized in Table 2. All we need for justifying these results was already proved. It remains for us just the task remembering the needed results. First of all, in the case $G_1 = 0$ we define q_{int} to be equal to the common value $q_{DG} = q_{AG} = q_{AD}$. We then have

Theorem 4 (Equilibria for $G_1 = 0$) If $G_1 = 0$, besides equilibria at the vertices of B and the AD-equilibrium, which are always biological, these are the biological equilibria at each interval:

	AG	DG	Interior	Diagrams	Туре
$\overline{((\epsilon_1+\epsilon_2)^{1/2},q_{int})}$		•		38R	F
q _{int}				45	F
$(q_{int}, 1]$	•		•	12, 12R, 13	W?

Table 2 The bullets indicate which equilibria are biological at each interval in the case $G_1 = 0$ (donation game)

The *AD*-equilibrium and vertices E_1 , E_2 and E_3 are biological at all intervals. Diagram, see Sect. 5, refers to numbers in the classification scheme in Bomze (1983), where a number followed by R means that the dynamics is given by the corresponding diagram with all orbits reversed. Possible evolution of cooperation types, see again Sect. 5, are F (full), P (partial), W (weak) or N (no). A type followed by a ? means a conjectured result

Table 3 The bullets indicate which equilibria are biological at each interval in the case $G_1 < 0$

	AG	DG	Interior	Diagrams	Туре
$((\epsilon_1 + \epsilon_2)^{1/2}, q_{AG})$		•		38R	F
(q_{AG}, q_{DG})	•	•		34R	Р
(q_{DG}, q_{int})	•			36	Р
$(q_{int}, 1]$	•		•	12, 12R, 13	W?

The *AD*-equilibrium and vertices E_1 , E_2 and E_3 are biological at all intervals. Diagram, see Sect. 5, refers to numbers in the classification scheme in Bomze (1983), where a number followed by R means that the dynamics is given by the corresponding diagram with all orbits reversed. Possible evolution of cooperation types, see again Sect. 5, are F (full), P (partial), W (weak) or N (no). A type followed by a ? means a conjectured result

- The DG-equilibrium is biological if and only $q \in [0, q_{int})$.
- If $q > (\epsilon_1 + \epsilon_2)^{1/2}$, the AG and interior equilibria are biological if and only if $q \in (q_{int}, 1]$.

Proof The assertions for the *DG* and *AG* equilibria were already proved in Theorem 1. In Theorem 6 we have already proved that the interior equilibrium is biological for $q \in (q_{int}, 1]$. The only thing remaining to be proved is that the *AG*, *AD* and *DG* isoclines do not cross on the border of *B* for $q \in ((\epsilon_1 + \epsilon_2)^{1/2}, q_{int})$.

In fact, by Proposition 7 and the same argument in the proof of Theorem 3, we show that there is no crossing for $q \in ((\epsilon_1 + \epsilon_2)^{1/2}, \tilde{q})$. No crossing for $q \in (\tilde{q}, q_{AD})$ is a consequence of Proposition 9. Finally, for $(q_{AD}, 1]$ the argument is Proposition 6. So the *AD*, *AG* and *DG* isoclines only cross at the origin for $q = q_{int}$.

The arguments necessary for proving validity of the equilibria results of the remaining case $G_1 < 0$ are similar and simpler than the ones used for the other two cases, so that we will leave them to the reader. The results are summarized in Table 3.

5 The dynamics

Zeeman (1980) studied the replicator dynamics for n strategies from the point of view of the theory of Dynamical Systems. He addressed mainly the robust cases, where

robust means cases in which the dynamics remains unchanged for arbitrarily small changes of parameters. In particular, for n = 3 Zeeman showed that it was possible to obtain the phase portraits of replicator dynamics by only knowing about the existence or not of equilibria at each face of the simplex S_3 , existence or not of an interior equilibrium, and the stability of each equilibrium. In this case the number of possible phase portraits was small enough so that each possibility could be shown. Bomze (1983) continued Zeeman's work including also the non-robust cases, thus obtaining a complete classification of all possible 47 phase portraits for the replicator dynamics with three strategies.

As we will also be interested in some non-robust cases, in this section we will refer to the classification by Bomze. In particular, we will see that, for most among the possible intervals and values of G_1 in Tables 1, 2 and 3, our knowledge up to now can associate a single diagram in Bomze (1983), thus fully determining the dynamics for that interval for q and sign for G_1 . The enumeration of the diagrams in our tables is the same as in Bomze (1983). In only one row in each table, because we were unable to determine whether the interior equilibrium was asymptotically stable, neutral or unstable, more than one diagram was found to be compatible. Of course, for fixed values of the parameters, it is straightforward to linearize the dynamics around the interior equilibrium, and by calculating eigenvalues of a 2 × 2 matrix, discover the missing stability information. But we found the exact expression for the eigenvalues depending on the many parameters too complicated for a rigorous analysis.

Another information necessary for reading our Tables 1, 2 and 3 is that the letter R in front of the number of a diagram in Bomze (1983) means that one should take the corresponding diagram with all arrows reversed. In fact, the reader should notice that replacing matrix A by -A in Eq. (14) has only the effect of reversing the orientation of all orbits.

The last column in each of the tables refers to the type of evolution of cooperation, a consequence of the dynamics for that case. We now define each of the possible types of evolution of cooperation.

Definition 3 We will say that the population admits

- full evolution of cooperation if equilibrium E_3 is asymptotically stable. In other words, if there is a region $R_G \subset B$ with positive area, such that for any initial condition in R_G only individuals adopting strategy G will survive after infinite time.
- *partial* evolution of cooperation if E_3 is unstable, but the AG-equilibrium P_{132} is biological and asymptotically stable.
- weak evolution of cooperation if E_3 is unstable, P_{132} is unstable or not biological and there is a region $R_{ADG} \subset B$ with positive area, such that for any initial condition in R_{ADG} individuals adopting all the three strategies will survive for infinite time.
- no evolution of cooperation if the dynamics leads to extinction of the G individuals for any initial condition in a region of total area contained in the triangle B.

We now start describing how we obtained the "Diagrams" column in each of the tables. In order to do that, we must know about the dynamics restricted to the sides of *B*. On each side of *B* one of the strategies is absent and we only need to study the one-dimensional replicator dynamics for two strategies. Results for this case are rather trivial, see e.g. (Nowak 2006a, p. 50), and only depend on the strategies being or not Nash equilibria. The results enumerated below are simple consequences of pairwise comparisons between elements of the pay-off matrix (6).

- 1. In the absence of strategy 3, strategies 1 and 2 are both strict Nash equilibria. Thus, for the replicator dynamics restricted to side L_3 , the *AD*-equilibrium is unstable. Moreover, for any $q \in ((\epsilon_1 + \epsilon_2)^{1/2}, 1]$ the fitness ranking is fixed, see Lemma 1, so we can divide this side in the following four regions:
 - In the region between E_2 and P_{123} , we have $f_2 > f_1 > f_3$.
 - In the region between P_{123} and P_{233} . we have $f_1 > f_2 > f_3$.
 - In the region between P_{233} and P_{133} . we have $f_1 > f_3 > f_2$.
 - In the region between P_{133} and E_1 , we have $f_3 > f_1 > f_2$.

In particular, between E_2 and P_{233} , f_3 is the smallest fitness. This implies that $f_3 < \phi$ in a neighborhood of P_{123} , with the consequence that orbits in the interior of *B* close to P_{123} must have $\dot{x}_3 < 0$, and flow towards L_3 , which makes P_{123} a saddle point. This property is particularly important, because in some cases it is necessary in order to discard some diagrams in Bomze (1983) otherwise compatible.

- 2. In the absence of strategy 1, we have two possibilities:
 - If $q < q_{DG}$, the *DG*-equilibrium is biological, and as strategies 2 and 3 are both strict Nash equilibria, then the *DG*-equilibrium is unstable if the dynamics is restricted to the L_1 side.
 - If $q \ge q_{DG}$, the *DG*-equilibrium is not biological, and only strategy 2 is a Nash equilibrium. Then all orbits on L_1 must flow into E_2 .
- 3. In the absence of strategy 2, we also have two possibilities:
 - If $(\epsilon_1 + \epsilon_2)^{1/2} < q \le q_{AG}$, then the *AG*-equilibrium is not biological, and between strategies 1 and 3, only 3 is a Nash equilibrium. All orbits on L_2 must flow into E_3 .
 - If $q > q_{AG}$, then the AG-equilibrium is biological. Because neither strategy 1, nor strategy 3 are Nash equilibria, then the AG-equilibrium is asymptotically stable when dynamics is restricted to L_2 .

Using an example we now explain how we have obtained all the results in the "Diagrams" column in the table. The example we take is the first line in all three tables, for its greater importance regarding understanding of the results in Nowak and Sigmund (1992). We know that for $(\epsilon_1 + \epsilon_2)^{1/2} < q < \min\{q_{AG}, q_{int}\}$, regardless of G_1 we will have as biological equilibria only the three vertices, and the *AD* and *DG* equilibria. By the above reasoning on the dynamics at the border of *B*, E_1 must be a saddle point, whereas E_2 and E_3 are attractors, the *AD*-equilibrium is a saddle with outgoing orbits on L_3 , and the *DG*-equilibrium has outgoing orbits on L_1 . Point *Q* is not in the biological region.

Among the diagrams in Bomze (1983) not a single one is compatible with the above situation. But if we reverse the orbits, then diagrams 37 and 38 become compatible. The only one which remains compatible when we take into account that interior orbits close to the *AD*-equilibrium must flow towards L_3 is 38R. In Fig. 1 we show a plot



Fig. 1 Phase portrait and graph of the fractions x_1, x_2 and x_3 as functions of time for a choice of parameters corresponding to the first row in Table 1: T = 5, R = 4, P = 2, S = 0, $\epsilon_1 = 0.05$, $\epsilon_2 = 0.10$, q = 0.40. The initial condition for the graphs is $(x_1, x_2) = (0.18, 0.76)$. Observe the full evolution of cooperation

of some numerically calculated orbits for a choice of parameters in one of the cases, the first row in Table 1, leading to diagram 38R. Notice that all orbits below the separatrix joining the DG and AD equilibria lead to survival only of strategy G. We have full evolution of cooperation, where R_G is the region below the mentioned separatrix. For orbits in R_G starting very close to the AD-equilibrium P_{123} we can see the occurrence of the phenomenon in the experiment of Nowak and Sigmund (1992): an initial population with majority of ALLD, some ATFT and a minority of G individuals evolves to a population where only the G individuals are present, after passing through a transient in which the ATFT comprise almost the entire population. The phenomenon is illustrated by the graphs of fractions x_1 , x_2 and x_3 as functions of time in Fig. 1.

All information about diagrams in our tables was obtained in a way similar to the example treated above.

As already mentioned, in the cases at the last line of each Tables 1, 2 and 3 we could not find a rigorous argument for proving which of diagrams 12, 12R and 13 is the correct one.

In the case $G_1 > 0$, we already know for interval (q_{DG}, q_{AG}) —see third row in Table 1—that the only compatible diagram is 15R, in which the interior equilibrium is unstable and, consequently, there is no evolution of cooperation. It is not reasonable that increasing q will foster cooperation. In fact, larger values of q will make the Gindividuals more susceptible to exploitation by ALLDs. Thus the natural conjecture is that if $G_1 > 0$ and $q \in (q_{AG}, 1]$ the interior equilibrium will still be unstable and no evolution of cooperation will happen. If this conjecture is true, then the associated diagram must be 12R. The conjecture is supported also by numerical calculation of the eigenvalues of the linearized dynamics around the interior equilibrium and by results in Fig. 2.

In the $G_1 < 0$ case (Table 3) we know that there is full evolution of cooperation until $q = q_{AG}$ and only partial evolution for $q_{AG} < q < q_{int}$, due to the AG-equilibrium



Fig. 2 Phase portrait and graph of the fractions x_1, x_2 and x_3 as functions of time for a choice of parameters corresponding to the last row in Table 1: T = 5, R = 4, P = 2, S = 0, $\epsilon_1 = 0.05$, $\epsilon_2 = 0.10$, q = 0.90. The initial condition for the graphs is $(x_1, x_2) = (0.40, 0.20)$. Observe that there is no evolution of cooperation for this set of parameter values



Fig. 3 Phase portrait and graph of the fractions x_1, x_2 and x_3 as functions of time for a choice of parameters corresponding to the last row in Table 3: T = 5, R = 3, P = 1, S = 0, $\epsilon_1 = 0.05$, $\epsilon_2 = 0.10$, q = 0.70. The initial condition for the graphs is $(x_1, x_2) = (0.10, 0.80)$. Observe the weak evolution of cooperation for this set of parameter values, with the interior equilibrium Q being asymptotically stable

entering the biological region and destabilizing E_3 . For larger values of q the interior equilibrium becomes biological and we have no knowledge on its stability. Numerical calculation of eigenvalues suggests that in the case $G_1 < 0$ the interior equilibrium is asymptotically stable and will attract all orbits in a region of positive area, which means weak evolution of cooperation and that the correct diagram should be 12. This conjecture is illustrated in Fig. 3.

Finally, in the $G_1 = 0$ case for $q > q_{int}$ we may expect a situation intermediate between the other two cases. Numerical calculations suggest that the real part of the eigenvalues of the linearized dynamics around the interior equilibrium may be null.



Fig. 4 Phase portrait and graph of the fractions x_1, x_2 and x_3 as functions of time for a choice of parameters corresponding to the last row in Table 2: T = 5, R = 3, P = 2, S = 0, $\epsilon_1 = 0.05$, $\epsilon_2 = 0.10$, q = 0.50. The initial condition for the graphs is $(x_1, x_2) = (0.40, 0.20)$. Observe the weak evolution of cooperation for this set of parameter values, with the interior equilibrium Q being possibly neutral

Numerically calculated orbits around the interior equilibrium seem to be closed. The correct diagram is conjectured to be 13, in which the interior equilibrium is a center, leading to weak evolution of cooperation. Figure 4 illustrates this conjecture.

6 Conclusions

We have proved that the results of the computer experiment in Nowak and Sigmund (1992) are true for a simplified version of the situation in which, instead of 100 reactive strategies, we only have the three more prominent ones in the experiment: ATFT, ALLD and G. More precisely, if we define

$$q_{GTFT} = \min\{q_{AG}, q_{DG}\}$$
(38)

then for $q \in ((\epsilon_1 + \epsilon_2)^{1/2}, q_{GTFT})$ there exists a region $R_G \subset B$ with positive area such that the orbit of the replicator dynamics for any initial condition in R_G will converge to E_3 , i.e. only the G individuals will survive. Using our Definition 3, we can rephrase this: we showed existence of a maximum forgiveness q_{GTFT} given by (38) such that if ϵ is small enough and $q \in ((\epsilon_1 + \epsilon_2)^{1/2}, q_{GTFT})$, irrespective of the sign of G_1 , we will have full evolution of cooperation in our version with three strategies for the situation in Nowak and Sigmund (1992).

In Molander (1985), the statement of Theorem 1 introduces q_{GTFT} as a value "arbitrarily close to"

$$\min\left\{\frac{2R-S-T}{R-S}, q_{DG}\right\}$$
(39)

for "low noise levels", i.e. for small ϵ . Although Molander was aware that the value in (39) should be corrected due to the noise, in his paper there is no expression such as (32) to quantify this correction.

In Nowak and Sigmund (1992), the same (39) appears as the definition of the GTFT strategy winner in their computer experiment. Although the arguments in the present paper cannot be naively extended to a case such as theirs with 100 strategies, we believe that the correct value for which the results in Nowak and Sigmund (1992) should hold is instead (38). For the parameters T = 5, R = 3, P = 1, S = 0 and $\epsilon_1 = \epsilon_2 = 0.01$, we find $q_{GTFT} \approx 0.339574$ by numerically solving equation $a_{13}(q) = R$. This value is, for the accuracy conditions of the experiment, indistinguishable of the 1/3 given by (39). Despite their possibly inexact definition in Nowak and Sigmund (1992), we should note that Nowak and Sigmund had been more precise in defining q_{GTFT} in their previous paper (Nowak and Sigmund 1990) (see e.g. their first Theorem at page 258), although no formula such as (38) was given.

If we understand q_{GTFT} as the maximum forgiveness such that there is full evolution of cooperation for *any* values of ϵ_1 and ϵ_2 in our simplified version of the experiment with only three strategies, then we are forced to take a limit of (38) when $\epsilon \rightarrow 0$ and (39) is recovered. If, on the other hand, we take a fixed *ATFT* strategy, i.e. fixed values of ϵ_1 and ϵ_2 , then (38) should be thought as the rigorous version of (39) for only three strategies as in this paper. If we have a situation as in Nowak and Sigmund (1992) with more than three strategies and a fixed ATFT, we do not know which among (38), (39) or some other number is the right value for the maximum forgiveness. We conjecture that our value (38) might be the correct one. A repetition of the experiment in Nowak and Sigmund (1992) having this question in mind might help in solving this puzzle.

We have also partially understood the population dynamics for values of q larger than q_{GTFT} . We have seen that in some cases some weaker forms of cooperation evolution will still hold, but we have also seen that if $G_1 > 0$ and $q \in (q_{DG}, q_{AG})$ no evolution of cooperation is possible, because for almost all initial conditions only ALLD individuals will survive. The same conclusion probably holds also for $q \ge q_{AG}$ and $G_1 > 0$.

As already stated in our Introduction section, much has changed in this field since the discovery of the so-called zero-determinant (ZD) strategies for the IRPD (Press and Dyson 2012). ZD strategies are memory-one strategies, a set which contains the reactive strategies considered in this study and much more. Among the various types of ZD strategies, extortion and generous strategies (Stewart and Plotkin 2013) deserve some mention here, because they seem to have roles similar respectively to ATFT and G when the evolutionary context is taken into account. According to Hilbe et al. (2013), extortion ZD strategies "can act as catalysts for the evolution of cooperation, similar to tit-for-tat, but ··· they are not the stable outcome of natural selection". On the other hand, in the context of all memory-one strategies, Akin (2012) defines *good* strategies, also called *partner* strategies in Hilbe et al. (2015). In a context different from ours, Stewart and Plotkin (2013) claim that good ZD strategies, which includes GTFT, "forgive defecting opponents but nonetheless dominate in evolving populations".

We feel that considering memory-one strategies would take us out of the original context of the reactive strategies as in the experiment in Nowak and Sigmund (1992). Moreover, it would also introduce technical difficulties, as formulas (5) and (6) would cease to be true. We believe that extending the results of this paper to the setting of

the more general memory-one strategies, including thus the ZD strategies, is another important task to be accomplished by researchers in the near future.

As the main tool used in this work for predicting the dynamics from knowledge on the equilibria is the two-dimensional classification in Bomze (1983), increasing the number of considered strategies from three to only four would imply rather difficult technical difficulties. We also expect that these technical barriers may be overcome by future researchers.

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