Supplement to "Best experienced payoff dynamics and cooperation in the centipede game"

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I. EXACT AND NUMERICAL CALCULATION IN MATHEMATICA

In this section, we describe the built-in Mathematica functions we use to prove exact (analytical) results and to obtain numerical evaluations of exact expressions.

I.1 Algebraic numbers and solutions to polynomial equations

To obtain our analytical results, we take advantage of Mathematica's ability to perform exact computations using algebraic numbers. As described in Strzeboński (1996, 1997), Mathematica represents algebraic numbers using Root objects, with Root [*poly*, k] designating one of the roots of the minimal polynomial *poly*. The index k is used to single out a particular root of *poly*, with the lowest indices referring to the real roots of *poly* in increasing order, and the higher indices referring to the complex roots in a more complicated way. Root objects also contain a hidden third element that specifies an *isolating set* for the root, meaning a set that contains the root of *poly* in question and no others.

The forms of isolating sets depend on whether roots are isolated using arbitraryprecision floating point methods or exact methods. If Mathematica's default settings are used, then roots are isolated using arbitrary-precision floating point methods based on the Jenkins–Traub algorithm (Jenkins (1969), Jenkins and Traub (1970a,b)), which is the workhorse numerical algorithm for this purpose. While in theory this algorithm always isolates all real and complex roots of *poly* in disjoint disks in the complex plane, flawless implementation of the algorithm is difficult; see Strzeboński (1997, p. 649).

If we instead use the setting

SetOptions[Root,ExactRootIsolation->True],

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then Mathematica isolates roots using exact methods—that is, methods that use only rational number calculations. Real roots of polynomials are isolated in disjoint intervals using the Vincent–Akritas–Strzeboński method, which is based on Descartes' rule of signs and a classic theorem of Vincent; see Akritas et al. (1994) and Akritas (2010). Complex roots are isolated in rectangles using the Collins and Krandick (1992) method.

Exact roots of univariate polynomials (and much else) can be computed using the Mathematica function Reduce. When computing the exact rest points of BEP dynamics, we apply Reduce to the output of the function GroebnerBasis, which is described next.

I.2 Algorithms from computational algebra

The Mathematica function GroebnerBasis is an implementation of a proprietary variation of the algorithm of Buchberger (1965, 1970).¹ Choosing the option Method -> Buchberger causes Mathematica to use the original Buchberger algorithm, which runs considerably more slowly than the default algorithm; however, there was only one case in which the default algorithm produced a Gröbner basis and the Buchberger algorithm failed to terminate.

The Mathematica function CylindricalDecomposition implements the Collins (1975) cylindrical algebraic decomposition algorithm with various improvements.² If this function is run in its default mode, it makes use of arbitrary-precision arithmetic. To force Mathematica to work with algebraic numbers, one uses the settings

SetOptions[Root,ExactRootIsolation->True]
SetSystemOptions["InequalitySolvingOptions"
 ->"CADDefaultPrecision"->Infinity].

Unfortunately, these settings cause CylindricalDecomposition to run extremely slowly, and in the case of BEP dynamics in centipede, it generates a result only in cases with two dimensions and, for some specifications of the dynamics, three dimensions. Even if arbitrary-precision arithmetic is permitted, the function generates a result for all BEP dynamics in cases with dimension 2 or 3, but not for higher dimensions.

I.3 Numerical evaluation and precision tracking

When Mathematica performs calculations using arbitrary-precision numbers x, it keeps track of the digits whose correctness it views as guaranteed. The function Precision [x] reports the number of correct base 10 significant digits of x: for instance, if $x = d_0.d_1d_2d_3d_4... \times 10^k$, the precision is the number of the correct digits in $d_0.d_1d_2d_3d_4...$ The function Accuracy [x] is the number of correct base 10 digits of x to the right of

¹An up-to-date presentation of Gröbner basis algorithms, including many improvements on Buchberger's algorithm, can be found in Cox et al. (2015).

 $^{^2} See \ reference. wolfram.com/language/tutorial/ComplexPolynomialSystems.html \ for \ details.$

the decimal point. Exact numbers in Mathematica (e.g., integers, rational numbers, and algebrnumbers) have Precision equal to ∞ .

To perform certain parts of our analysis (in particular, checking that an eigenvalue of a derivative matrix has a negative real part), we need to numerically evaluate exact numbers and expressions. We do so using the Mathematica function N. The function N[expr, n] evaluates *expr* as an arbitrary-precision number at guaranteed precision *n*. When Mathematica performs computations using arbitrary-precision numbers, it maintains precision and accuracy guarantees, the values of which can be accessed using the Precision and Accuracy functions.

While, in principle, Mathematica's precision tracking should not make mistakes, there are at least two reasons to exercise caution when using it in proofs. First, Mathematica's precision tracking is not based on *interval arithmetic*, which represents real and complex numbers using exact intervals (in \mathbb{R}) and rectangles (in \mathbb{C}) that contain the numbers in question, and which relies on theorems that define rules for performing arithmetic and other mathematical operations on these intervals and rectangles that maintain containment guarantees (Alefeld and Herzberger (1983), Tucker (2011)). Instead, Mathematica's precision bounds are sometimes obtained using faster methods of the Jenkins–Traub variety (see Section I.1), which work correctly in theory, but are difficult to implement perfectly. Second, Mathematica's precision tracking is a black box: the specific algorithms it employs are proprietary.

We contend with these issues by restricting our use of Mathematica's numerical evaluation and precision tracking to a few clearly delineated cases: the evaluation of algebraic numbers, and the basic arithmetic operations of addition, subtraction, multiplication, and division. In particular, we do not use Mathematica for precision tracking in the computation of matrix inverses or the solution of linear systems, operations for which interval arithmetic does not generally provide clean answers (Alefeld and Herzberger (1983)). While one could insist that interval arithmetic be used for all non-exact calculations, we chose not to do so.

II. THE BEP_CENTIPEDE.NB NOTEBOOK

In this section we describe the main functions from the BEP_Centipede.nb notebook, which contains all of the procedures we use to analyze BEP dynamics. Section II.1 describes functions used to prove analytical results, and Section II.2 describes the functions used in numerical analyses and in approximations with error bounds (cf. Appendix C). More details about the use of these functions are provided in the BEP_Centipede.nb notebook itself. Section II.3 explains the algorithms used to compute numerical values of rest points of the dynamics and eigenvalues of their derivative matrices.

Unless stated otherwise, the functions described below take a test-set rule $\tau \in \{\tau^{\text{all}}, \tau^{\text{two}}, \tau^{\text{adj}}\}$, a tie-breaking rule $\beta \in \{\beta^{\min}, \beta^{\text{stick}}, \beta^{\text{unif}}\}$, and a length *d* of the centipede game as parameters. All functions besides the last three are for BEP dynamics with number of trials $\kappa = 1$. The BEP_Centipede.nb notebook includes examples of the use of each of the functions.

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II.1 Exact analysis

The functions for exact analysis of BEP dynamics in centipede are as follows.

ExactRestPoints, which uses GroebnerBasis and Reduce to compute the exact rest points of the dynamic.

InstabilityOfVertexRestPoint, which conducts an analysis of the local stability of the vertex rest point ξ^{\dagger} . To do this, the function computes the derivative matrix $D\mathcal{V}(\xi^{\dagger})$ of the dynamic and the eigenvalues and eigenvectors of $DV(\xi^{\dagger})$, where $V: \operatorname{aff}(\Xi) \to T\Xi$ (see Appendix A). Finally, the function reports whether one can conclude that ξ^{\dagger} is unstable. The function was not used explicitly in our analysis. Instead, we used it to determine the form of the derivative matrix, eigenvalues, and eigenvectors for arbitrary values of d.

LocalStabilityOfInteriorRestPoint, which conducts an analysis of the local stability of the interior rest point ξ^* . To do this, the function computes a rational approximation ξ of the exact interior rest point ξ^* . The function then evaluates the eigenvalues of DV(ξ), evaluates a version of the perturbation bound from Proposition C.1, and reports whether one can conclude that ξ^* is asymptotically stable.

GlobalStabilityOfInteriorRestPoint, which conducts an analysis of the global stability of the interior rest point ξ^* . To do this, the function uses CylindricalDecomposition to determine whether the relevant Lyapunov function (see Section 3.3) is a strict Lyapunov function for the interior rest point ξ^* on domain $\Xi \setminus \{\xi^{\dagger}\}$.

II.2 Numerical analysis

The following functions from the BEP_Centipede.nb are used for numerical analysis and as subroutines for LocalStabilityOfInteriorRestPoint.

FloatingPointApproximateRestPoint, which computes a floating point approximation of the stable interior rest point of the BEP dynamic. See Section II.3 for details.

RationalApproximateRestPoint, which computes a rational approximation of the stable interior rest point of the BEP dynamic. See Section II.3 for details.

EigenvaluesAtRationalApproximateRestPoint, which computes the exact eigenvalues of $DV(\xi)$, where ξ is the rational approximation to the interior rest point obtained from a call to RationalApproximateRestPoint. See Section II.3 for details.

NEigenvaluesAtRationalApproximateRestPoint, which computes the eigenvalues of $DV(\tilde{\xi})$ using arbitrary-precision arithmetic, where $\tilde{\xi}$ is a 16-digit precision approximation to the rational point computed using RationalApproximate-RestPoint. See Section II.3 for details.

NumericalGlobalStabilityOfInteriorRestPointLyapunov Evaluates the time derivative $\dot{\Lambda}(\xi) = \nabla \Lambda(\xi)' V(\xi)$ at a floating-point approximation Λ of the appropriate candidate Lyapunov function L for the interior rest point ξ^* , reporting instances in which the time derivative is not negative, should any exist. The (presumably large number of) states ξ at which to evaluate $\dot{\Lambda}(\xi)$ is chosen by the user.

NumericalGlobalStabilityOfInteriorRestPointNDSolve, which computes numerical solutions to the BEP dynamic from initial conditions provided by the user,

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and reports whether any of these numerical solutions fails to converge to a neighborhood of the interior rest point ξ^* .

NDSolveMeanDynamics, which uses Mathematica's NDSolve function to compute a numerical solution to the BEP dynamic from an initial condition provided by the user. The solution is computed until the time at which the norm of the law of motion is sufficiently small, where what constitutes sufficiently small can be chosen by the user. The function also graphs the components of the state as a function of time, and reports the terminal point and the time at which this point is reached.

FloatingPointApproximateRestPointTestAllMinIfTieManyTrials, which uses Mathematica's FindRoot function to compute a floating point approximation of a rest point of the BEP(τ^{all} , κ , β^{min}) dynamic, where the number of trials κ is specified by the user. The function returns only one rest point. When there is more than one rest point, the one that is computed depends strongly on the initial condition given to the function as an input. This function was used to produce Figures 3 and 4 in the main paper and to compute the saddle points shown in Table S5 herein.

NDSolveMeanDynamicsTestAllMinIfTieManyTrials, which uses Mathematica's NDSolve function to compute a numerical solution of the BEP(τ^{all} , κ , β^{min}) dynamic, where the number of trials κ and the initial condition of the solution are specified by the user. The solution is computed until the time at which the norm of the law of motion is sufficiently small, where what constitutes sufficiently small can be chosen by the user. The function also graphs the components of the state as a function of time, and reports the terminal point and the time at which this point is reached. The function was used in the production of Figure 5.

EstimateSizeOfBasinOfAttractionOfVertexTestAllMinIfTieManyTrials, which provides an estimate of the size of the basin of attraction of the vertex rest point ξ^{\dagger} under the BEP($\tau^{\text{all}}, \kappa, \beta^{\text{min}}$) dynamic. To do so, it discretizes the set of population states Ξ into a grid whose mesh is chosen by the user, and solves the dynamic with these grid points as initial conditions using Mathematica's NDSolve function. It returns the set of initial conditions from which the solution converges to ξ^{\dagger} and the set of all their neighbors in the grid. See Section IV for details.

II.3 More on computation of approximate rest points and eigenvalues

The BEP_Centipede.nb notebook computes approximate rest points of BEP(τ , 1, β) dynamics using the Euler method: $\{\xi_t\}_{t=0}^T$ is computed starting from an initial condition ξ_0 by iteratively applying

$$\xi_{t+1} = \xi_t + h \,\mathcal{V}(\xi_t),\tag{S1}$$

where $\mathcal{V} : \mathbb{R}^s \to \mathbb{R}^s$ is the (extended) law of motion of the dynamics and *h* is the step size of the algorithm. This algorithm is run in two sequential stages, which we describe next.

When one of the first two FloatingPointApproximateRestPoint... functions from Section II.2 is called, algorithm (S1) is run using IEEE 754 Standard doubleprecision floating-point arithmetic. The step size of the algorithm is set to $h = 2^{-4}$ by default, and the initial condition is $\xi_0 = (x_0, y_0) \in \Xi = (X, Y)$, where x_0 and y_0 are the

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barycenters of simplices *X* and *Y* by default. Several thousand iterations of (S1) are run, and the output of each iteration is projected onto Ξ to minimize the accumulation of roundoff errors from the floating-point calculation.

The floating-point numbers obtained in this way are very close to the exact quantities they approximate, but their digits (i.e., the values of the d_i in $x = d_0.d_1d_2d_3d_4... \times 10^k$) may all be wrong, especially in small numbers, since many of the exact numbers we aim to approximate lie outside the range of IEEE 754 double-precision.³

To address this issue, the function RationalApproximateRestPoint begins with a call to FloatingPointApproximateRestPoint and then uses the output of this procedure to create the initial condition for a second stage that employs rational arithmetic. This initial condition is the rational point in Ξ that lies closest to the floatingpoint output of the first stage. The step size h is set to 1 by default in the second stage, since overshooting is no longer a problem in the neighborhood of the exact rest point. Increment (S1) is executed repeatedly using rational arithmetic until it locates a rational point ξ_T^* that is an approximate fixed point of (S1) in the sense that ξ_T and $\xi_{T+1} = \xi_T + \mathcal{V}(\xi_T)$ agree with six digits of precision for numbers greater than or equal to 10^{-4} , or three digits of precision for smaller numbers. This agrees with the format we use to report rest points in Section III.

The function NEigenvaluesAtRationalApproximateRestPoint computes the eigenvalues of $DV(\tilde{\xi})$ using arbitrary-precision arithmetic, where $\tilde{\xi}$ is a 16-digit precision approximation to the rational point computed by calling RationalApproximateRestPoint. The use of arbitrary precision allows us to keep track of the precision of the computed eigenvalues. Proposition C.1 provides a bound on the distances between the eigenvalues of $DV(\xi)$ and the eigenvalues of $DV(\xi^*)$. In Section III, the reported eigenvalues, which are arbitrary-precision approximations to the (algebraic-valued) eigenvalues of $DV(\xi)$, are shown with five digits of precision for numbers greater or equal to 1, four digits of precision for numbers.

III. NUMERICAL EVALUATION OF THE INTERIOR REST POINT

Table S1 presents approximate components of the unique interior rest point of the BEP($\tau^{all}, 1, \beta^{min}$) dynamic in centipede games of lengths up to d = 20.

Table S2 shows approximate eigenvalues of the derivative matrix $DV(\xi^*)$ at the interior rest point ξ^* of $BEP(\tau^{all}, 1, \beta^{min})$ dynamics in centipede games of lengths up to d = 20.

IV. Estimates of the basin of attraction of ξ^{\dagger} for BEP $(\tau^{all}, \kappa, \beta^{min})$ dynamics in centipede of length d = 4

In this section, we provide estimates of the basin of attraction of the backward induction state ξ^{\dagger} in centipede games of length d = 4 under BEP $(\tau^{\text{all}}, \kappa, \beta^{\text{min}})$ dynamics. We do so

³For example, note that the IEEE 754 double-precision representation of numbers such as 3.78×10^{-681} and $2.18 \times 10^{-20,413}$ (both of which appear in Table S1) is 0, since both numbers are well below $2^{-1074} \approx 4.94 \times 10^{-324}$, which is the smallest positive IEEE 754 double-precision number.

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р	[6]	[5]	[4]	[3]	[2]	[1]	[0]
3	_	_	_	_	_	0.618034	0.381966
4	_	_	_	_	0.113625	0.501712	0.384663
5	-	-	-	_	0.113493	0.501849	0.384658
6	-	_	_	3.12×10^{-9}	0.113493	0.501849	0.384658
7	_	_	_	3.12×10^{-9}	0.113493	0.501849	0.384658
8	-	-	8.23×10^{-137}	3.12×10^{-9}	0.113493	0.501849	0.384658
9	-	-	8.23×10^{-137}	3.12×10^{-9}	0.113493	0.501849	0.384658
10	-	7.75×10^{-3403}	8.23×10^{-137}	3.12×10^{-9}	0.113493	0.501849	0.384658
11	-	7.75×10^{-3403}	8.23×10^{-137}	$3.12 imes 10^{-9}$	0.113493	0.501849	0.384658
12	$1.06 \times 10^{-122,476}$	7.75×10^{-3403}	8.23×10^{-137}	3.12×10^{-9}	0.113493	0.501849	0.384658
:	:	:	:	:	:	÷	÷
20	$1.06 imes 10^{-122,476}$	7.75×10^{-3403}	8.23×10^{-137}	3.12×10^{-9}	0.113493	0.501849	0.384658
q	[6]	[5]	[4]	[3]	[2]	[1]	[0]
$\frac{q}{3}$	[6]	[5]	[4]	[3]	[2] .381966	[1] .381966	[0] .236068
$\frac{q}{3}$	[6] _ _	[5] _ _	[4] _ _	[3] _ _	[2] .381966 0.337084	[1] .381966 0.419741	[0] .236068 0.243175
$\frac{q}{3}$ $\frac{4}{5}$	[6] _ _ _	[5] _ _ _	[4] _ _ _	[3] 0.001462	[2] .381966 0.337084 0.335672	[1] .381966 0.419741 0.419706	[0] .236068 0.243175 0.243160
$\frac{q}{\begin{array}{c}3\\4\\5\\6\end{array}}$	[6] - - - -	[5] - - - -	[4] - - - -	[3] 0.001462 0.001462	[2] .381966 0.337084 0.335672 0.335672	[1] .381966 0.419741 0.419706 0.419706	[0] .236068 0.243175 0.243160 0.243160
$ \frac{q}{\begin{array}{c}3\\4\\5\\6\\7\end{array}} $	[6] - - - -	[5] - - - - -	[4] - - - 9.53 × 10 ⁻³⁵	[3] - 0.001462 0.001462 0.001462	[2] .381966 0.337084 0.335672 0.335672 0.335672	[1] .381966 0.419741 0.419706 0.419706 0.419706	[0] .236068 0.243175 0.243160 0.243160 0.243160
<i>q</i> 3 4 5 6 7 8	[6] - - - - -	[5] - - - - - -	[4] - - - 9.53×10^{-35} 9.53×10^{-35}	[3] - 0.001462 0.001462 0.001462 0.001462	[2] .381966 0.337084 0.335672 0.335672 0.335672 0.335672	[1] .381966 0.419741 0.419706 0.419706 0.419706 0.419706	[0] .236068 0.243175 0.243160 0.243160 0.243160 0.243160
<i>q</i> 3 4 5 6 7 8 9	[6] - - - - - - - - - -	[5] - - - - 3.78 $\times 10^{-681}$	$[4]$ $-$ $-$ $-$ 9.53×10^{-35} 9.53×10^{-35} 9.53×10^{-35}	[3] - 0.001462 0.001462 0.001462 0.001462 0.001462	[2] .381966 0.337084 0.335672 0.335672 0.335672 0.335672 0.335672	[1] .381966 0.419741 0.419706 0.419706 0.419706 0.419706 0.419706	[0] .236068 0.243175 0.243160 0.243160 0.243160 0.243160 0.243160
$ q \\ 3 \\ 4 \\ 5 \\ 6 \\ 7 \\ 8 \\ 9 \\ 10 $	[6] - - - - - - - - - - - - -	[5] - - - - 3.78 $\times 10^{-681}$ 3.78 $\times 10^{-681}$	$[4]$ $-$ $-$ $-$ $-$ $-$ 9.53×10^{-35} 9.53×10^{-35} 9.53×10^{-35} 9.53×10^{-35}	[3] - 0.001462 0.001462 0.001462 0.001462 0.001462 0.001462 0.001462	[2] .381966 0.337084 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672	[1] .381966 0.419741 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706	[0] .236068 0.243175 0.243160 0.243160 0.243160 0.243160 0.243160 0.243160
q 3 4 5 6 7 8 9 10 11	[6] - - - - 2.18 × 10 ^{-20,413}	[5]	$\begin{bmatrix} 4 \end{bmatrix}$ $\begin{bmatrix} - & - & - \\ - & - & - \\ - & - & - \\ - & - &$	[3] - 0.001462 0.001462 0.001462 0.001462 0.001462 0.001462 0.001462 0.001462	[2] .381966 0.337084 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672	$\begin{bmatrix} 1 \end{bmatrix}$ $.381966$ 0.419741 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706	[0] .236068 0.243175 0.243160 0.243160 0.243160 0.243160 0.243160 0.243160 0.243160
$ \frac{q}{3} 4 5 6 7 8 9 10 11 12 $	[6] - - - - - 2.18 × 10 ^{-20,413} 2.18 × 10 ^{-20,413}	[5]	$\begin{bmatrix} 4 \end{bmatrix}$ $-$ $-$ $-$ $-$ $-$ 9.53×10^{-35}	[3] - 0.001462 0.001462 0.001462 0.001462 0.001462 0.001462 0.001462 0.001462 0.001462	[2] .381966 0.337084 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672	$\begin{bmatrix} 1 \end{bmatrix}$ $.381966$ 0.419741 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706	[0] .236068 0.243175 0.243160 0.243160 0.243160 0.243160 0.243160 0.243160 0.243160 0.243160 0.243160
$ \begin{array}{c} q \\ \hline 3 \\ 4 \\ 5 \\ 6 \\ 7 \\ 8 \\ 9 \\ 10 \\ 11 \\ 12 \\ \vdots \end{array} $	[6] - - - - 2.18 × 10 ^{-20,413} 2.18 × 10 ^{-20,413} :	[5]	$\begin{bmatrix} 4 \end{bmatrix}$ $\begin{bmatrix} - & - & - & - \\ - & - & - & - \\ - & - &$	[3] - 0.001462	[2] .381966 0.337084 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672 0.335672	[1] .381966 0.419741 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 0.419706 	[0] .236068 0.243175 0.243160 0.243160 0.243160 0.243160 0.243160 0.243160 0.243160 0.243160 .243160 .243160

Note: The *p* denotes the penultimate player and the *q* denotes the last player. The dashed lines separate exact ($d \le 6$) from numerical ($d \ge 7$) results.

TABLE S1. The interior rest point of the BEP(τ^{all} , 1, β^{min}) dynamic for centipede of lengths $d \in \{3, ..., 20\}$.

for numbers of trials ranging from $\kappa = 5$, the smallest number for which ξ^{\dagger} is asymptotically stable (see Proposition 4.1), to $\kappa = 34$ and for selected larger values.

We estimated the size of the basin by numerically computing solutions to the BEP(τ^{all} , κ , β^{min}) dynamics from points in a grid of initial conditions of mesh $\frac{1}{50}$ in the set of population states Ξ . This grid contains a total of $\binom{52}{50}^2 = 1,758,276$ points, so an exhaustive exploration is not feasible. The algorithm we used to decide which points in the grid to explore aims at "growing" the basin of attraction from ξ^{\dagger} outward. Specifically, we start at the vertex ξ^{\dagger} and extend outward, recursively visiting all neighboring points in the grid until we obtain a "boundary" that is two-grid-points thick in which no solution converges to ξ^{\dagger} .

For $\kappa \in \{5, ..., 34\}$, Table S3 presents all of the grid points from which solutions of BEP($\tau^{\text{all}}, \kappa, \beta^{\text{min}}$) dynamics converge to ξ^{\dagger} . Table S4 presents the total number of such

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d = 3	-1 ± 0.3820	-1					
d = 4	$-1.1411 \pm 0.3277i$	$-0.8589 \pm 0.3277i$					
d = 5	$-1.1355 \pm 0.3284i$	$-0.8645 \pm 0.3284 \mathrm{i}$	-1.				
d = 6	$-1.1355 \pm 0.3284 i$	$-0.8645 \pm 0.3284 i$	$-1.\pm9.74\times10^{-5}\mathrm{i}$				
d = 7	$-1.1355 \pm 0.3284i$	$-0.8645 \pm 0.3284i$	$-1.\pm9.74 \times 10^{-5}i$	-1.			
d = 8	$-1.1355 \pm 0.3284i$	$-0.8645 \pm 0.3284 \mathrm{i}$	$-1.\pm9.74\times10^{-5}i$	-1.	-1.		
d = 9	$-1.1355 \pm 0.3284 i$	$-0.8645 \pm 0.3284 \mathrm{i}$	$-1.\pm9.74\times10^{-5}i$	-1.	-1.	-1.	
d = 10	$-1.1355 \pm 0.3284 i$	$-0.8645 \pm 0.3284 i$	$-1.\pm9.74\times10^{-5}\mathrm{i}$	-1.	-1.	-1.	
:	:	÷	:	:	÷	÷	
d = 20	$-1.1355 \pm 0.3284 i$	$-0.8645 \pm 0.3284 i$	$-1.\pm9.74\times10^{-5}i$	-1.	-1.	-1.	

Note: The symbol "-1." is used as a shorthand for -1.0000. The dashed lines separate exact ($d \le 6$) from numerical ($d \ge 7$) results.

TABLE S2. Approximate eigenvalues of $DV(\xi^*)$ for the BEP $(\tau^{all}, 1, \beta^{min})$ dynamic.

Condition on κ	x_1	<i>x</i> ₂	<i>x</i> ₃	<i>y</i> 1	<i>y</i> ₂	<i>y</i> ₃
	1	0	0	1	0	0
$\kappa \ge 6$	1	0	0	0.98	0.02	0
$\kappa = 7 \text{ or } \kappa \ge 9$	1	0	0	0.96	0.04	0
$\kappa \ge 9$	1	0	0	0.94	0.06	0
$\kappa \ge 10$	1	0	0	0.98	0	0.02
$\kappa = 10 \text{ or } \kappa \ge 12$	1	0	0	0.96	0.02	0.02
$\kappa = 10 \text{ or } \kappa \ge 12$	1	0	0	0.92	0.08	0
$\kappa \ge 12$	1	0	0	0.94	0.04	0.02
$\kappa = 12, 13 \text{ or } \kappa \ge 15$	1	0	0	0.9	0.1	0
$\kappa \ge 15$	1	0	0	0.92	0.06	0.02
$\kappa = 15, 16 \text{ or } \kappa \ge 18$	1	0	0	0.88	0.12	0
$\kappa = 15, 16, 17, 18 \text{ or } \kappa \ge 20$	1	0	0	0.96	0	0.04
$\kappa \ge 17$	1	0	0	0.9	0.08	0.02
$\kappa = 17 \text{ or } \kappa \geq 20$	1	0	0	0.94	0.02	0.04
$\kappa = 18, 19 \text{ or } \kappa \ge 21$	1	0	0	0.88	0.1	0.02
$\kappa = 18 \text{ or } \kappa \geq 21$	1	0	0	0.86	0.14	0
$\kappa \ge 20$	1	0	0	0.92	0.04	0.04
$\kappa = 20 \text{ or } \kappa \geq 25$	1	0	0	0.94	0	0.06
$\kappa = 21$ or $\kappa \ge 24$	1	0	0	0.86	0.12	0.02
$\kappa = 22 \text{ or } \kappa \geq 24$	1	0	0	0.9	0.06	0.04
$\kappa = 24$ or $\kappa \ge 27$	1	0	0	0.84	0.16	0
$\kappa \ge 26$	1	0	0	0.88	0.08	0.04
$\kappa = 27 \text{ or } \kappa \geq 30$	1	0	0	0.92	0.02	0.06
$\kappa = 27 \text{ or } \kappa \geq 30$	1	0	0	0.84	0.14	0.02
$\kappa \ge 30$	1	0	0	0.86	0.1	0.04
$\kappa = 30 \text{ or } \kappa \geq 33$	1	0	0	0.82	0.18	0
$\kappa \ge 32$	1	0	0	0.9	0.04	0.06
$\kappa = 33$	1	0	0	0.82	0.16	0.02

Note: The initial conditions from which solutions of $BEP(\tau^{all}, \kappa, \beta^{min})$ dynamics converge to ξ^{\dagger} ($\kappa \in \{5, ..., 34\}$).

TABLE S3. Initial conditions in a grid of mesh $\frac{1}{50}$.

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к	# In-basin points	# In-basin points and their out-of-basin neighbors
5	1	5
6	2	9
7	3	13
8	2	9
9	4	17
10	7	27
11	5	20
12	9	34
13	9	34
14	8	30
15	12	44
16	12	44
17	13	46
18	15	54
19	13	47
20	16	56
21	18	63
22	18	63
23	17	60
24	20	70
25	20	69
26	21	72
27	24	82
28	22	76
29	22	76
30	26	89
31	25	85
32	26	88
33	28	95
34	27	92
50	35	116
100	51	166

Note: The number of initial conditions from which solutions of BEP(τ^{all} , κ , β^{min}) dynamics converge to ξ^{\dagger} , and the total number of such points and their neighbors.

TABLE S4. Conditions in a grid of mesh $\frac{1}{50}$.

points as well as the sum of the number of such points and the number of neighbors of such points; these numbers provide lower and upper bounds on the size of the basin.

We make two observations about these results. First, Table S3 shows that state ξ^{\dagger} is not at all robust to changes in the behavior of population 1. This point is reinforced in Table S5, which shows that the saddle points of the dynamics all place mass of at least .998 on strategy 1. Second, Table S4 shows that the estimated size of the basin is very small. For instance, for $\kappa = 100$, the lower and upper estimates of the size of the basin are 51 and 166 grid points, out of the total of 1,758,276 grid points.

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	<i>x</i> ₁	<i>x</i> ₂	<i>x</i> ₃		<i>y</i> 1	<i>y</i> 2	<i>y</i> 3
5	0.999417	0.000333	0.000250	5	0.994197	0.002904	0.002899
6	0.999374	8.23×10^{-6}	0.000617	6	0.992520	0.003747	0.003733
7	0.999093	$6.76 imes 10^{-5}$	0.000839	7	0.987382	0.006326	0.006292
8	0.999474	3.20×10^{-5}	0.000494	8	0.991613	0.004201	0.004186
9	0.999649	$1.93 imes 10^{-7}$	0.000351	9	0.993702	0.003154	0.003144
10	0.998505	0.000137	0.001358	10	0.970561	0.014810	0.014629
11	0.998889	$9.75 imes 10^{-5}$	0.001013	11	0.975875	0.012124	0.012001
12	0.998404	$4.76 imes 10^{-5}$	0.001549	12	0.962408	0.018963	0.018629
13	0.998759	$3.35 imes 10^{-5}$	0.001207	13	0.968257	0.015991	0.015752
14	0.998926	$3.65 imes 10^{-5}$	0.001038	14	0.970372	0.014917	0.014711
15	0.998396	3.72×10^{-5}	0.001567	15	0.953015	0.023757	0.023228
16	0.998629	$3.45 imes 10^{-5}$	0.001337	16	0.957068	0.021686	0.021246
17	0.998367	0.000180	0.001453	17	0.946117	0.027235	0.026647
18	0.998551	$1.69 imes 10^{-5}$	0.001432	18	0.949167	0.025733	0.025100
19	0.998578	$3.19 imes 10^{-5}$	0.001390	19	0.947422	0.026621	0.025958
20	0.998447	0.000109	0.001444	20	0.939865	0.030463	0.029672
21	0.998540	1.58×10^{-5}	0.001444	21	0.940517	0.030176	0.029308
22	0.998380	$6.61 imes 10^{-5}$	0.001554	22	0.931278	0.034908	0.033814
23	0.998535	$6.48 imes 10^{-5}$	0.001400	23	0.934926	0.033024	0.032050
24	0.998484	$2.03 imes 10^{-5}$	0.001495	24	0.929859	0.035671	0.034470
25	0.998484	$4.05 imes 10^{-5}$	0.001476	25	0.927065	0.037100	0.035835
30	0.998544	$1.69 imes 10^{-5}$	0.001439	30	0.916397	0.042658	0.040945
35	0.998612	4.21×10^{-5}	0.001345	35	0.907601	0.047209	0.045190
40	0.998669	$2.03 imes 10^{-5}$	0.001310	40	0.899161	0.051657	0.049182
45	0.998726	1.04×10^{-5}	0.001264	45	0.891781	0.055554	0.052664
50	0.998782	$2.29 imes 10^{-5}$	0.001195	50	0.885579	0.058794	0.055627
100	0.999169	$2.75 imes 10^{-6}$	0.000828	100	0.847323	0.079244	0.073433
150	0.999368	$5.23 imes 10^{-7}$	0.000632	150	0.827851	0.089787	0.082362
200	0.999487	$2.93 imes 10^{-7}$	0.000513	200	0.815327	0.096613	0.088061

TABLE S5. Saddle points of BEP(τ^{all} , κ , β^{min}) dynamics for centipede of length d = 4.

V. Saddle points of BEP($\tau^{all}, \kappa, \beta^{min}$) dynamics in centipede of length d = 4

Table S5 presents approximate components of saddle points of BEP($\tau^{\text{all}}, \kappa, \beta^{\text{min}}$) dynamics for centipede games of length d = 4 for various κ .

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