

Arnold Diffusion in Fictitious Play Dynamics

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- Mathematically, the systems of interest are nonsmooth flows on S^3 , with global sections whose first return maps are
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 - 3 area-preserving.
- Among other interesting features of this class of nonsmooth dynamics we are particularly interested in different forms of coexistence of quasi-periodic and stochastic behaviour.

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- 1 Static Games
- 2 Dynamics in Games: Fictitious Play
- 3 Fictitious Play in Zero-Sum Games
- 4 The Induced Flow on S^3
- 5 Numerical Experiments
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The payoff functions can be represented by a bimatrix (A, B) , $A, B \in \mathbb{R}^{n \times n}$:

$$u_1(i, j) = A_{ij} = e_i^T A e_j \quad \text{and} \quad u_2(i, j) = B_{ij} = e_i^T B e_j.$$

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$$BR_1(y) = \{x \in \Sigma_1 : u_1(x, y) \geq u_1(x', y) \forall x' \in \Sigma_1\},$$

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- Nash (1950): Every game has at least one Nash Equilibrium.

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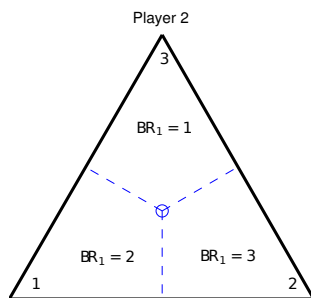
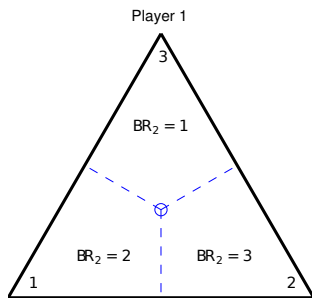
$$A = \begin{pmatrix} 0 & 0 & 1 \\ 1 & 0 & 0 \\ 0 & 1 & 0 \end{pmatrix}, \quad B = \begin{pmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ 1 & 0 & 0 \end{pmatrix}.$$

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The space of mixed strategies can be visualized like this:



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Definition

Let (x_n, y_n) denote the (pure) strategies played at time $n \in \mathbb{N}$. Then **discrete-time Fictitious Play** is given by the rule

$$x_{n+1} \in \mathcal{BR}_1 \left(\frac{1}{n} \sum_{i=1}^n y_i \right) \quad , \quad y_{n+1} \in \mathcal{BR}_2 \left(\frac{1}{n} \sum_{i=1}^n x_i \right).$$

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(Continuous-time) Fictitious Play Dynamics (FP)

$$\dot{p} \in \frac{1}{t} (\mathcal{BR}_1(q) - p) \quad , \quad \dot{q} \in \frac{1}{t} (\mathcal{BR}_2(p) - q)$$

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- Solutions for any initial conditions exist for all times $t \geq 0$ (by general theory: \mathcal{BR} upper semi-continuous, has closed convex sets as values).
- Under genericity assumptions on (A, B) , (FP) defines a *unique, continuous flow* for all $t \geq 0$ for a set of initial conditions which has full Lebesgue measure, is open and dense (van Strien et al., 2008).

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- (FP)-orbits converge to the set of Nash Equilibria in various specific classes of games, but generally this is not the case (example of (3×3) -game with a stable limit cycle due to Shapley, 1964).
- In a zero-sum game ($A + B = 0$), (FP)-orbits converge to the set of Nash Equilibria (Brown, 1951). The converse statement is an open conjecture (Hofbauer, 1995).

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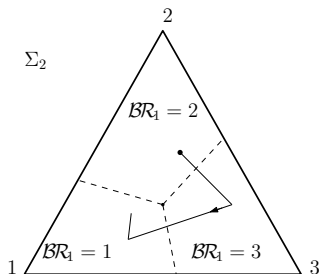
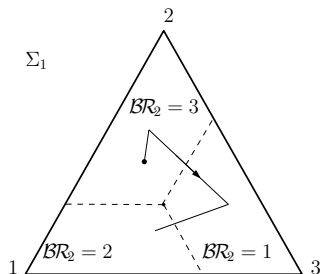
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Example piece of orbit:



Non-equilibrium solution trajectories consist of straight line segments.

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Theorem (van Strien, 2011)

In this setting (FP) induces a unique continuous flow on all of $\Sigma_1 \times \Sigma_2$.

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H is a Lyapunov function for (FP) (Brown, 1951)

Let (A, B) be zero-sum with unique Nash Equilibrium (E^A, E^B) . Then

- 1 $H(p, q) \geq 0$ and $H(p, q) = 0$ if and only if $(p, q) = (E^A, E^B)$;
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- For $A + B = 0$, the motion defined by (FP) is a product of radial motion towards the Nash Equilibrium and motion on H -level sets.
- This induced flow on $H^{-1}(1) \approx S^3$ is subject of our further interest.

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Ψ_t the induced flow on $H^{-1}(1) \approx S^3$, i.e. π maps orbits of ϕ_t to orbits of Ψ_t

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$$A = -B = \begin{pmatrix} 1 & 0 & \beta \\ \beta & 1 & 0 \\ 0 & \beta & 1 \end{pmatrix}, \quad \beta = \frac{\sqrt{5} - 1}{2} \approx 0.618 \text{ (golden mean)}$$

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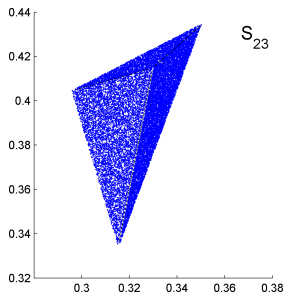
Types of Dynamics for Zero-Sum Games

For different zero-sum games, numerical experiments seem to suggest several possible types of induced dynamics on S^3 . The following types were (numerically) observed in (O., van Strien, 2011):

Types of Dynamics for Zero-Sum Games

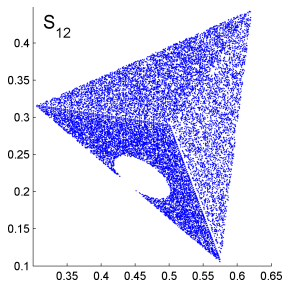
For different zero-sum games, numerical experiments seem to suggest several possible types of induced dynamics on S^3 . The following types were (numerically) observed in (O., van Strien, 2011):

- **Completely ergodic type**



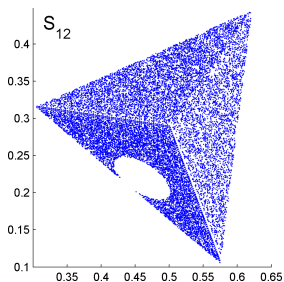
Types of Dynamics for Zero-Sum Games

- Space decomposed into elliptic islands and ergodic regions



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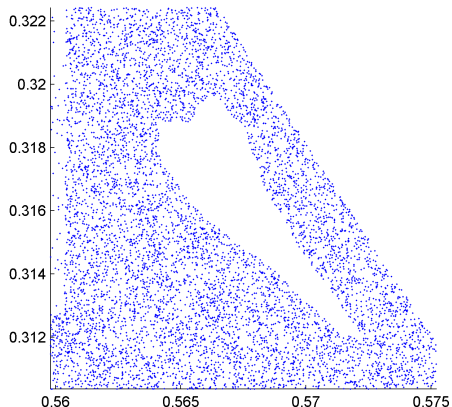
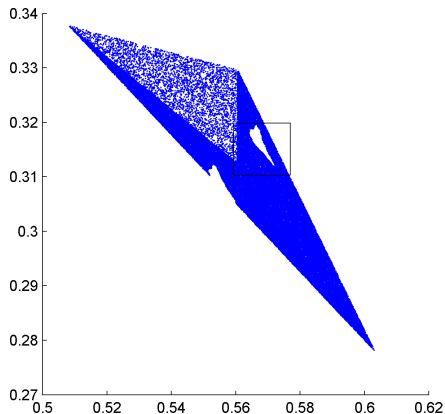


Remark (O., van Strien, 2011)

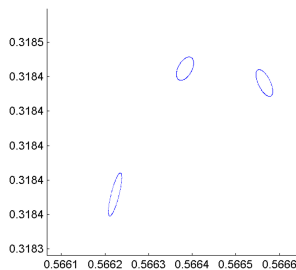
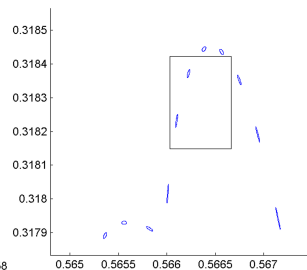
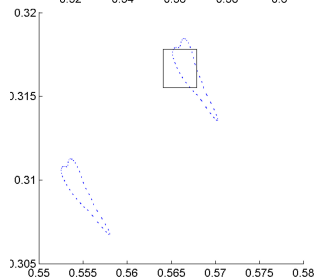
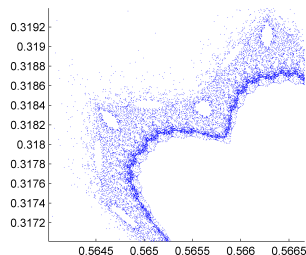
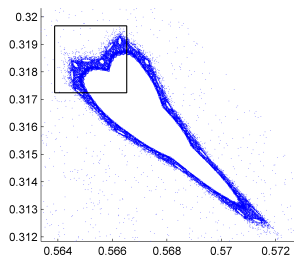
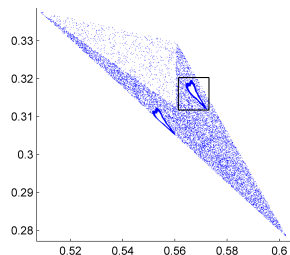
Quasi-periodic orbits in the elliptic regions exactly correspond to orbits with periodic itinerary (players switch strategies in a cyclic way).

Types of Dynamics for Zero-Sum Games

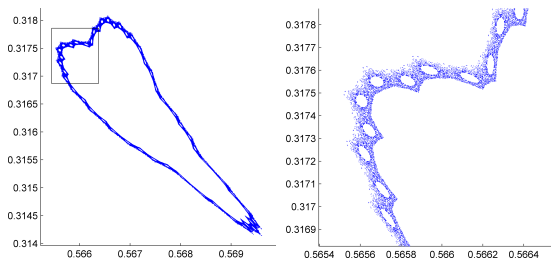
- **More complicated situation with coexistence of different quasi-periodic islands and stochastic motion**



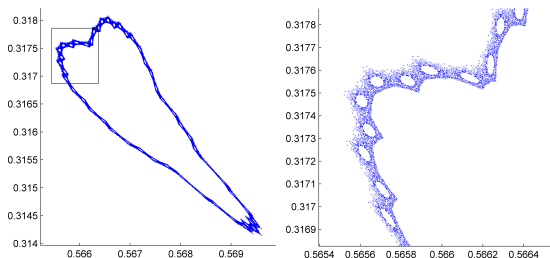
Types of Dynamics for Zero-Sum Games



Types of Dynamics for Zero-Sum Games



Types of Dynamics for Zero-Sum Games



- The images indicate the occurrence of ‘Arnold Diffusion’; coexistence of various families of islands of (quasi-)periodic motion (filled with invariant circles), contained in regions of stochastic (space-filling) motion.

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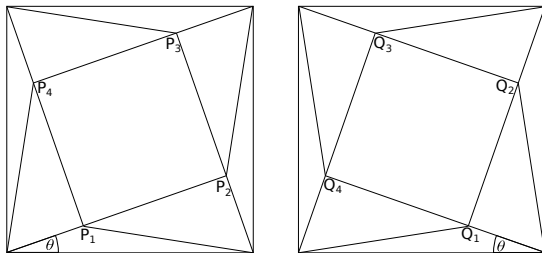
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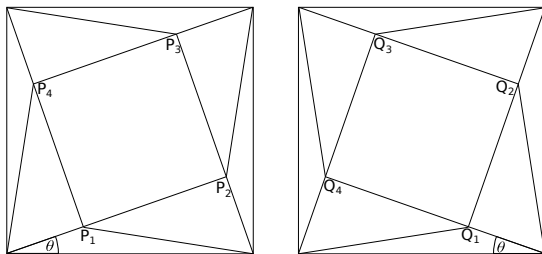
Trying to construct simple (non-trivial) examples of maps with these properties shows that the properties are quite restrictive.

A Model Map

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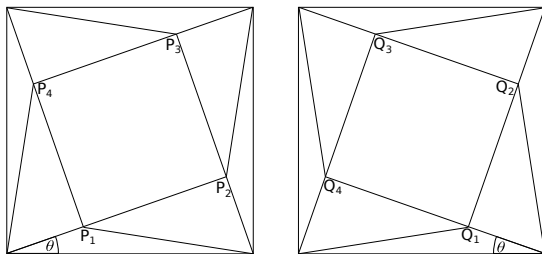
A Model Map



The map F_θ for $\theta \in (0, \frac{\pi}{4}]$ is defined by declaring:

- 1 $F_\theta = id$ on the boundary of the square
- 2 $F_\theta(P_i) = Q_i$ for $i = 1, \dots, 4$
- 3 F_θ affine on each of the shown pieces

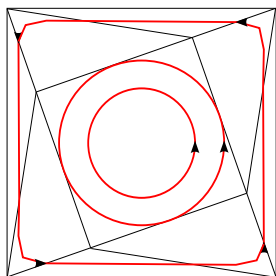
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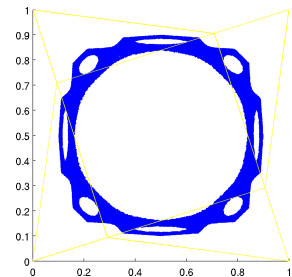
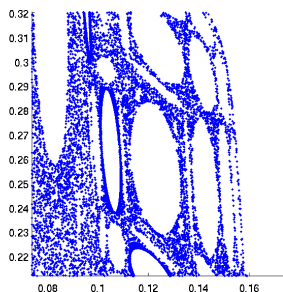
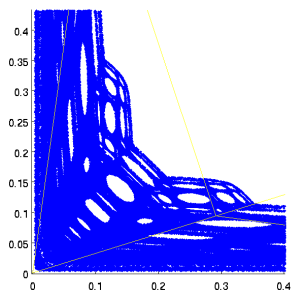
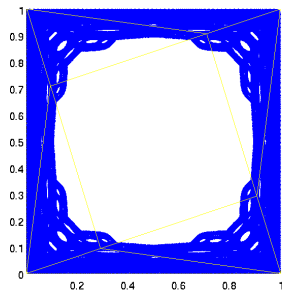
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- The map acts similar to a twist map. Intuitively, all points approximately rotate counterclockwise with rotation number decreasing to zero as points approach the boundary.

Invariant curves

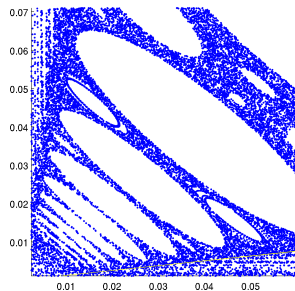
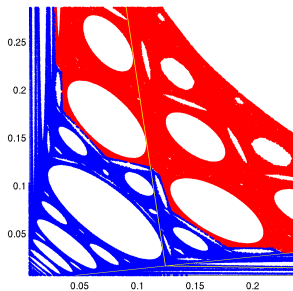
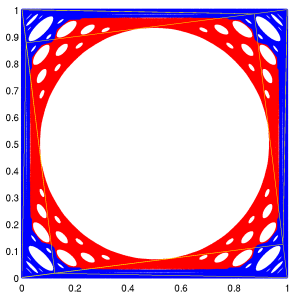


- For many parameter values of θ , families of invariant circles consisting of straight line segments and accumulating on the boundary can be constructed explicitly. On these invariant circles, F_θ has rational rotation number.

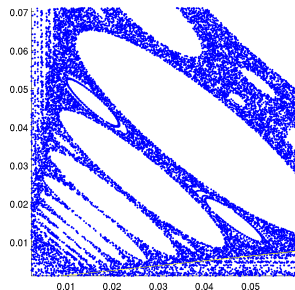
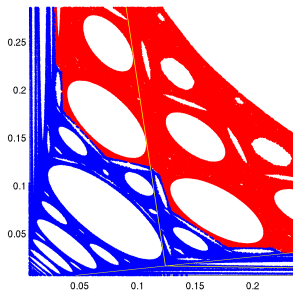
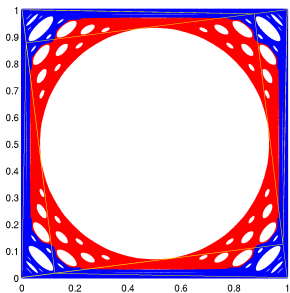
Stochastic Regions



Open Questions

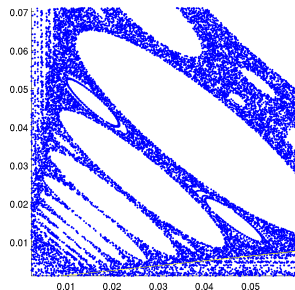
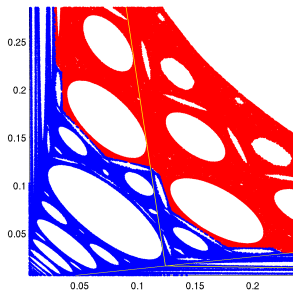
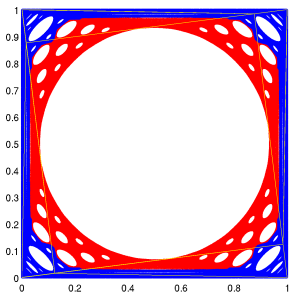


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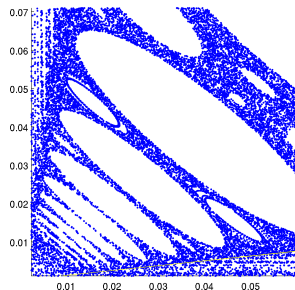
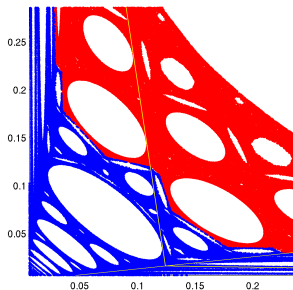
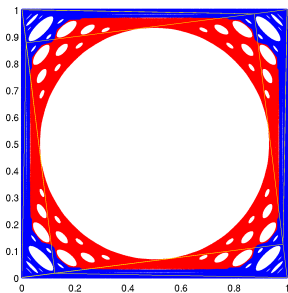
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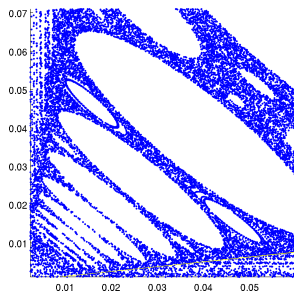
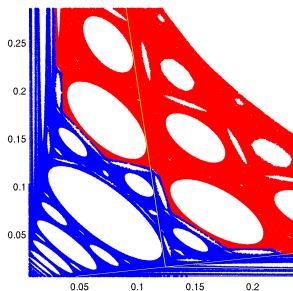
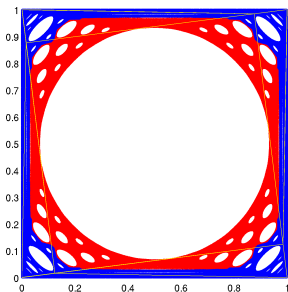
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