

Patterns of Attractors in the "Brain" - Wild Dynamics at the Edge

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- 3 the fact that the agent has been evolved by a Genetic Algorithm.

How to describe main dynamical properties

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General paradigm in the qualitative theory of Dynamical Systems

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Genetic algorithm as a form of searching algorithm
find a “good initial condition”

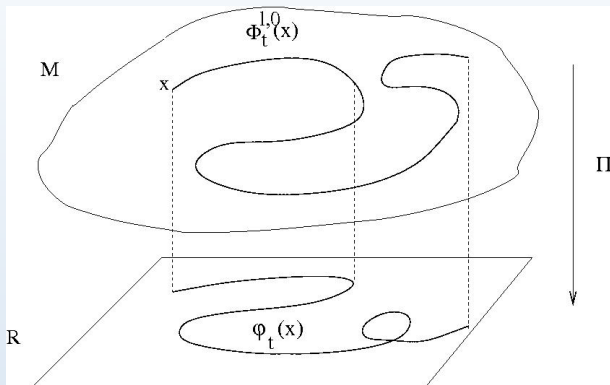
General framework. Why dynamics?

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Agent is “controlled” by a dynamical system B that acts after a stimulus.

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Why dynamics?

The ODE/neural network/“brain” is evolved by a “Genetic algorithm”

$$\mathcal{B}^1 = B_1^1, \dots, B_n^1 \rightarrow \mathcal{B}^2 = B_1^2, \dots, B_n^2$$

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Twofold approach:

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Twofold approach:

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- forced by an evolutionary process.

A few words about dynamical systems

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Pick up your preferred Differential Equation

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Mechanics,

A few words about dynamical systems

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Mechanics, chemical reaction,

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Mechanics, chemical reaction, growth population,

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‘Equation’

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$$\Phi : \mathbb{R} \times M, \text{ "Solutions"}. \quad \cdot$$

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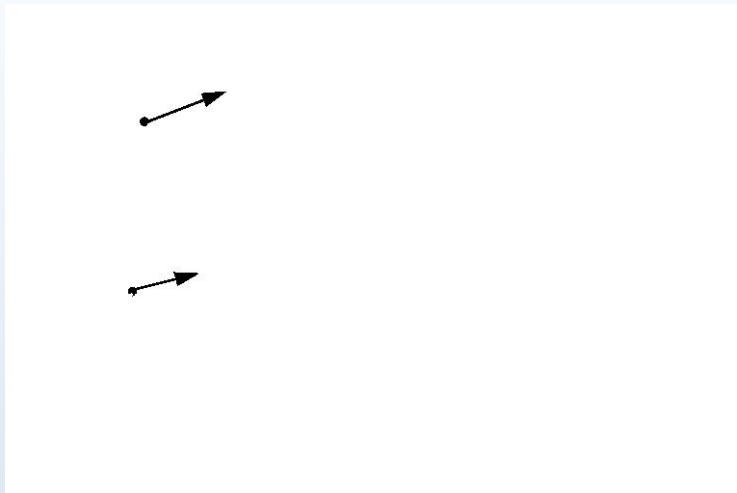
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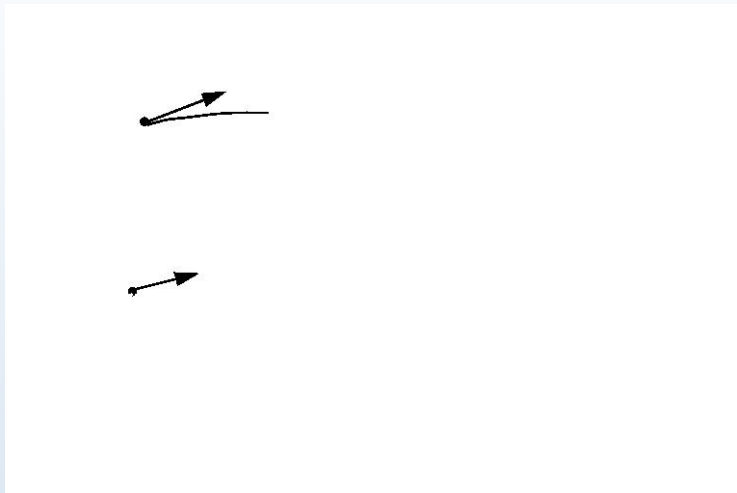
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This is a dynamical system

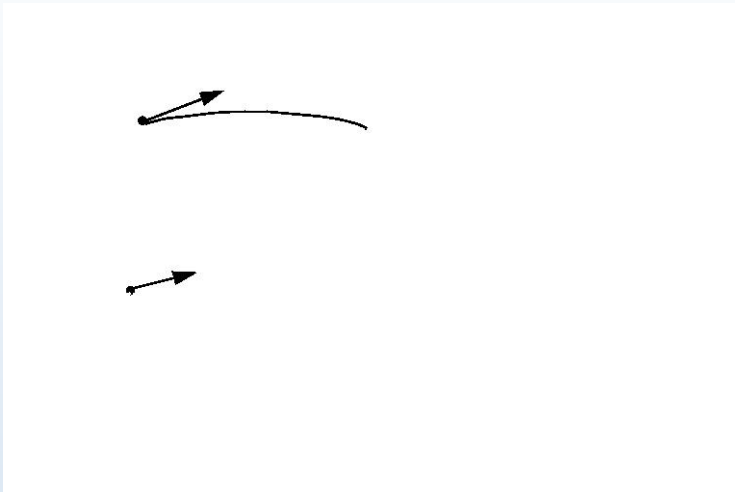
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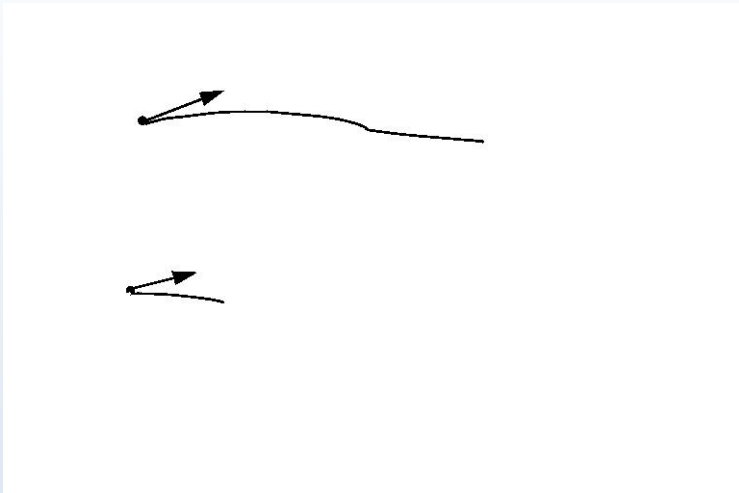
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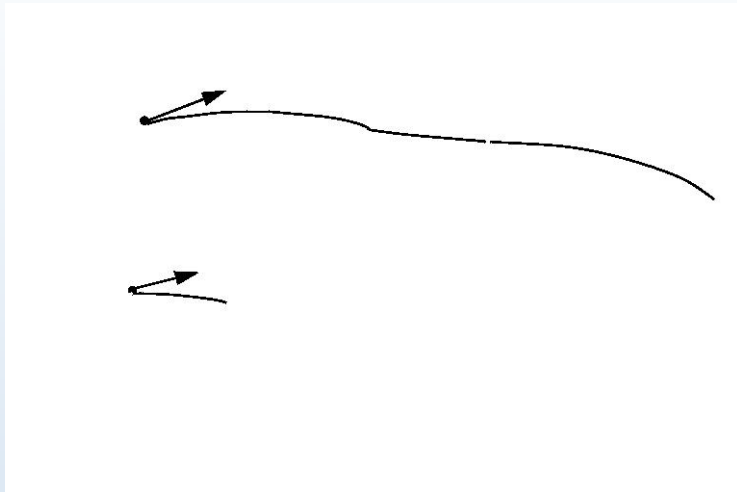
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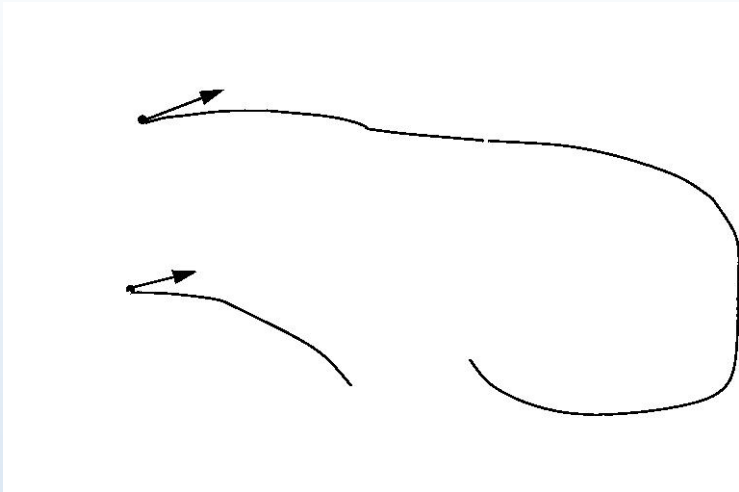
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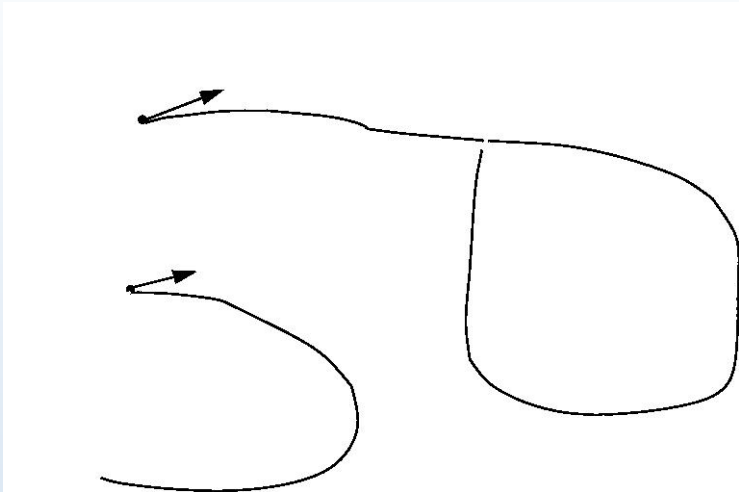
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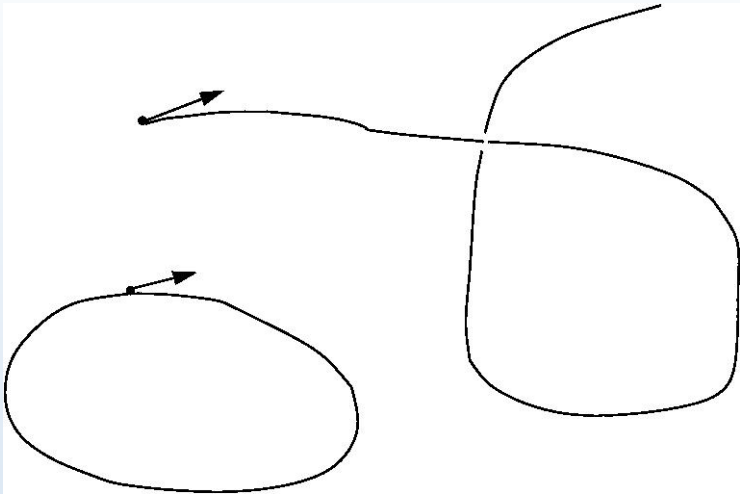
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Some goals in dynamics

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We can “compute the trajectories” “to describe the dynamics”

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Can we trust what we get from numerical approximation?

How do we interpret the numerical solutions?

A taxonomy could help

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“A CLASSIFICATION of possible dynamics”
would help to interpret the results

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A “TAXONOMY” of generic well described dynamical behaviors

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A ROAD MAP

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Fuzzy information

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Fuzzy information —> better description.

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Looking for the possible *generic* dynamical scenario

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“MODEL OF THE MODELS”

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“Reality to be understood”

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“Reality to be understood” \longleftrightarrow Mathematical Models.

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Dynamical Equations

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How to get those model of the models? Example.

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Poincaré and 3 body problem

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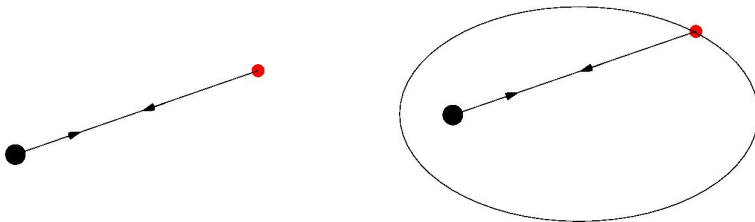


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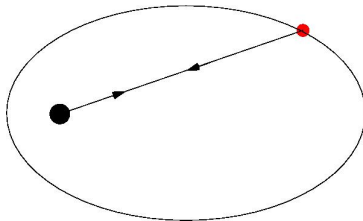
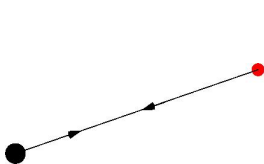


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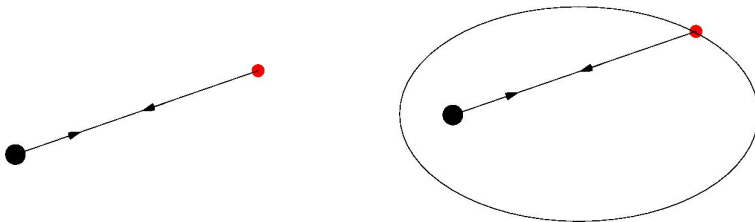
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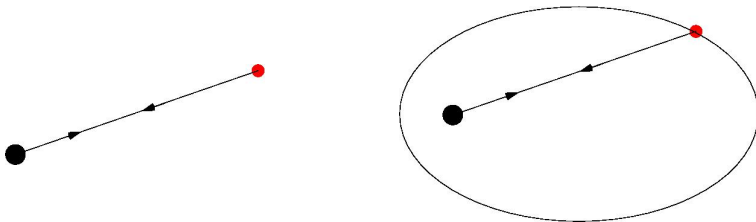
Elliptic motions. Motions are periodic.

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Poincaré: 3 body problem as a perturbation of the 2 body one.

3 body problem.

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Poincaré observed “complicated trajectories”.

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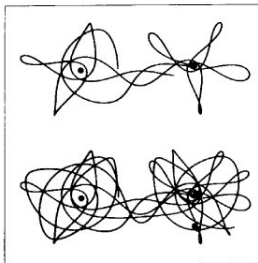


Figure 1. Orbits related to the three-body problem (Modified from Stewart,

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It can be found in the original problem.

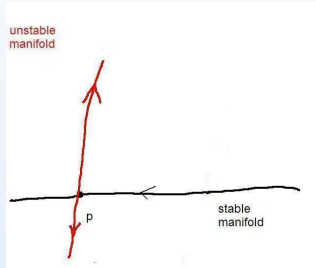
Poincaré: Homoclinic points.

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Homoclinic points: “Points with same past and future”

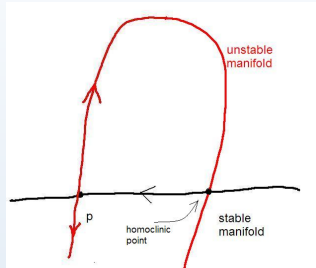
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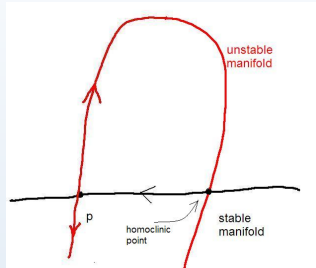
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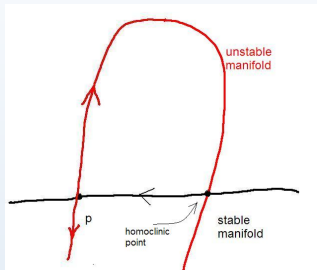
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Infinitely many periodic orbits.

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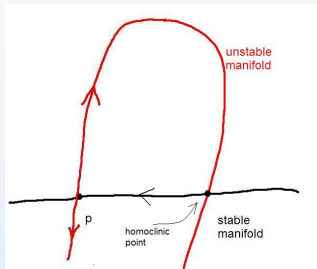


Infinitely many periodic orbits.

Chaotic dynamic.

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It holds in a robust way.

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Appears in the 3 body problem.

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Perturbed pendulum.

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Generic in mechanical problems with at least two degree of freedom

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Dichotomy

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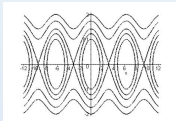
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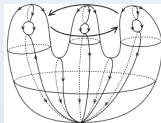
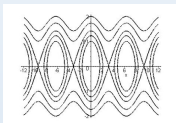
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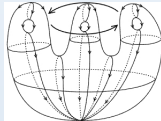
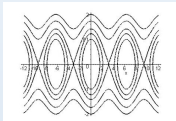
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- or there is a transversal homoclinic point.

Homoclinic points.

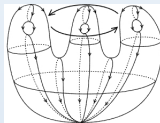
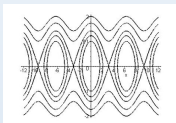
Appears in the 3 body problem.

Perturbed pendulum.

Generic in mechanical problems with at least two degree of freedom

Dichotomy

- Either the dynamics is VERY SIMPLE



- or there is a transversal homoclinic point. There are chaotic components.

A Paradigm for generic dynamics

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A LIST/TAXONOMY OF POSSIBLE DYNAMICAL PHENOMENAS

A Paradigm for generic dynamics

A LIST/TAXONOMY OF POSSIBLE DYNAMICAL PHENOMENAS

A LIST OF POSSIBLE MECHANISMS

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A LIST/TAXONOMY OF POSSIBLE DYNAMICAL PHENOMENAS

A LIST OF POSSIBLE MECHANISMS

BUILD A DICTIONARY/MECHANISMS

A Paradigm for generic dynamics

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BUILD A DICTIONARY/MECHANISMS

Fuzzy information

A Paradigm for generic dynamics

A LIST/TAXONOMY OF POSSIBLE DYNAMICAL PHENOMENAS

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BUILD A DICTIONARY/MECHANISMS

Fuzzy information → better description.

Coming back to a concrete EAA

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A robot that moves on an Arena (table)

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- starting from a random position, **it follows a light** turned on in a place also chosen randomly

Coming back to a concrete EAA

A robot that moves on an Arena (table)

- starting from a random position, **it follows a light** turned on in a place also chosen randomly
- a **light is flashed** and the robots move into that place where it was flashed.

Dissecting the agent/problem

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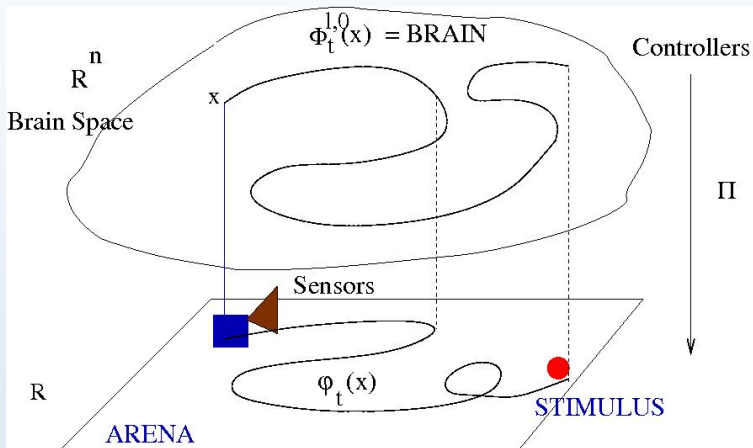
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Dissecting the agent/problem



More on the “brain”/Neural network

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A parameter family of equations

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$$B = \{X^0, X^I\}_{I \in R}$$

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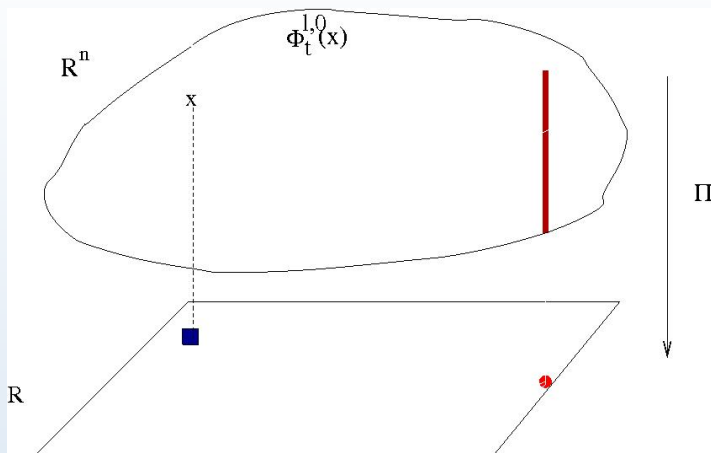
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Trajectories in the Arena /Projections of brain trajectories

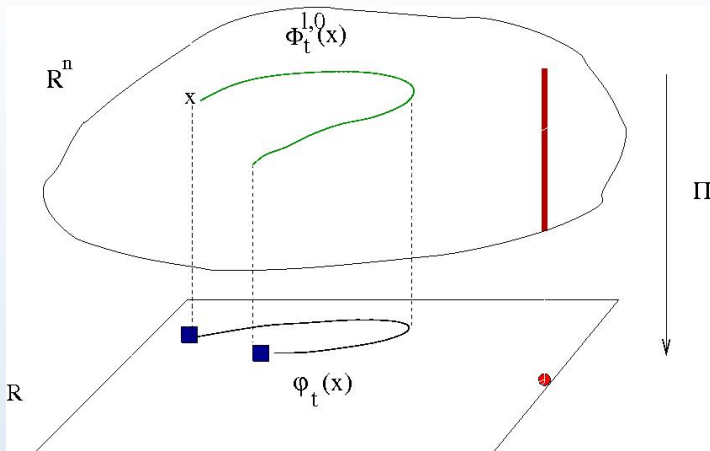
$\Psi^I : \Pi(\Phi^I)$ projections of Φ^I

$\Psi^0 : \Pi(\Phi^0)$ projections of Φ^0

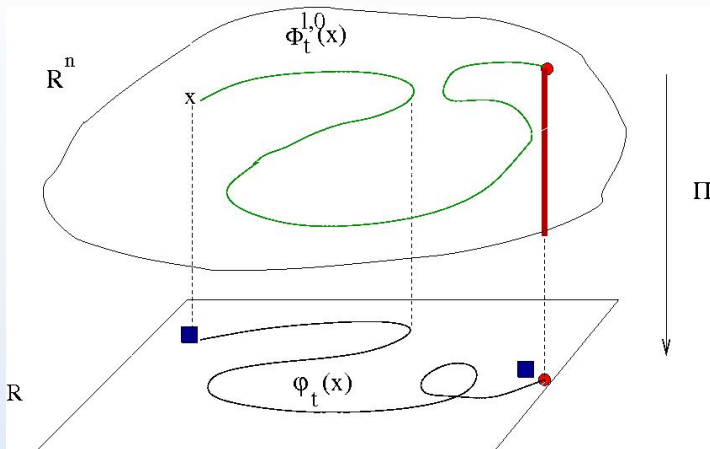
Sketch of trajectories



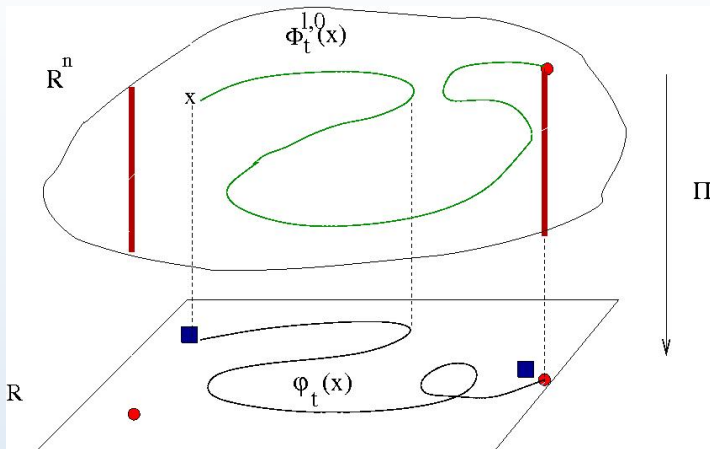
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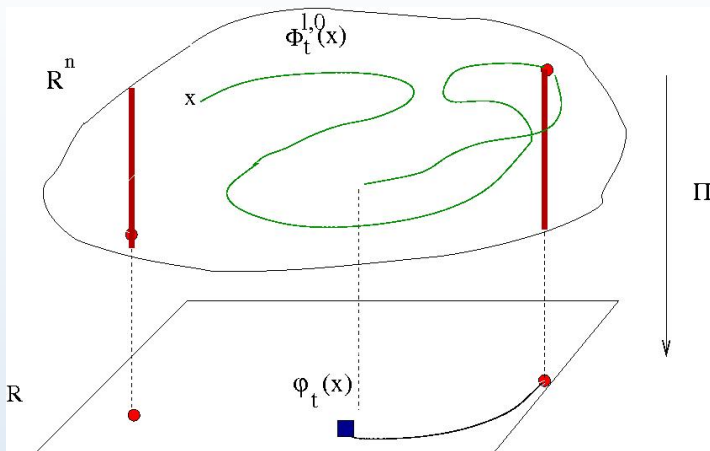
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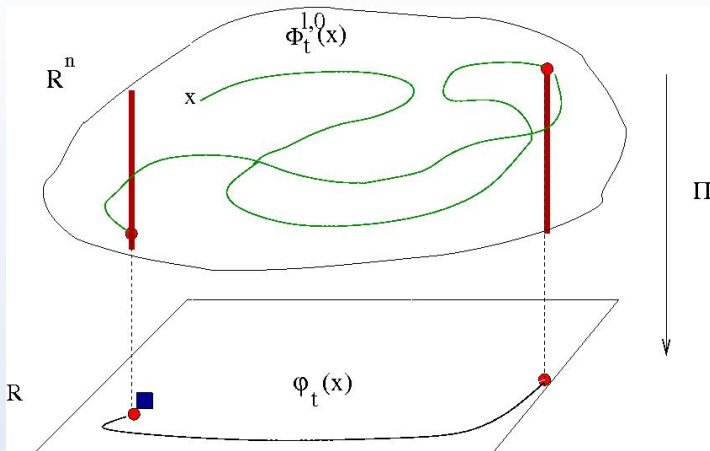
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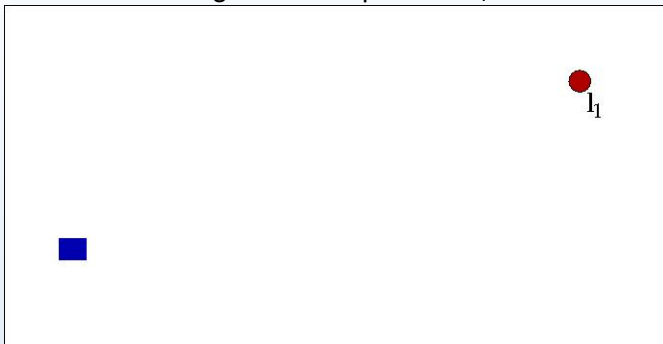


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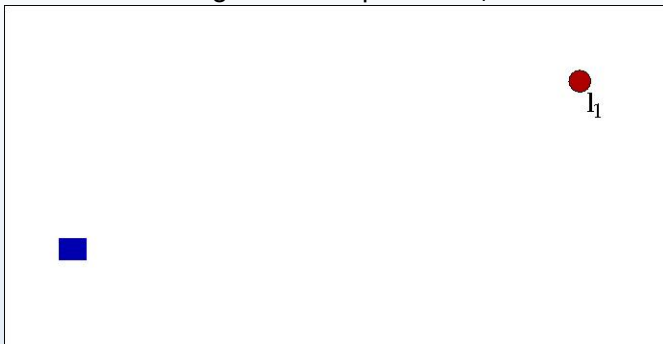
The equation/flow X' on the Arena

Light is on at position l_1



The equation/flow X' on the Arena

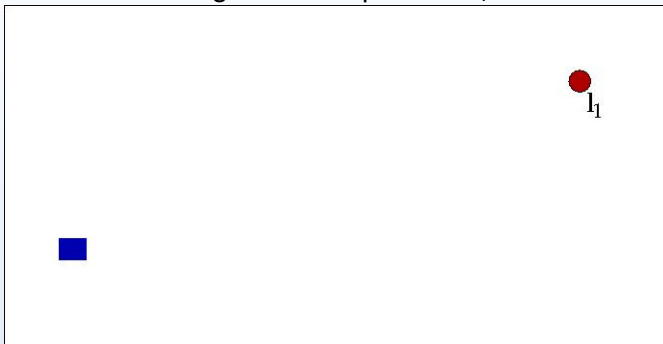
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Acts equation/flow $\psi_t^{l_1}(x) = \Pi(\Phi_t^{l_1}(x))$

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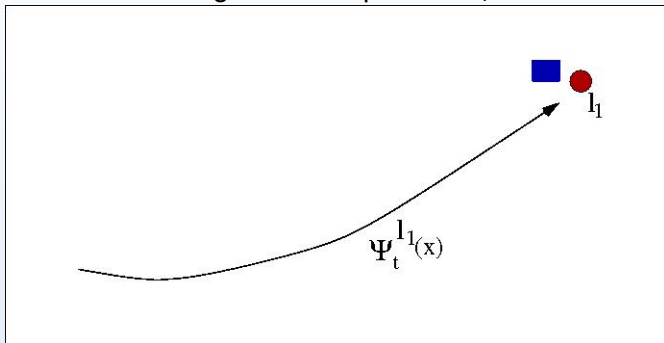
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l_1 is an attractor for ψ^{l_1}

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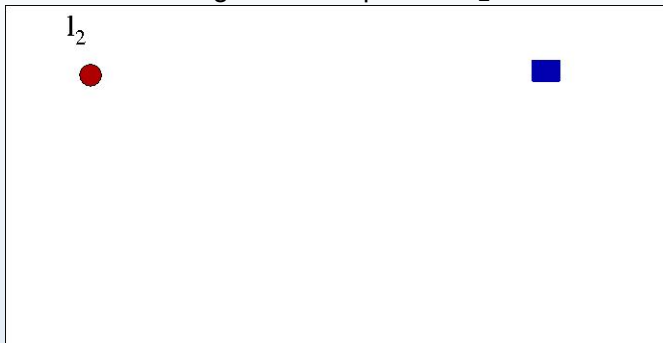
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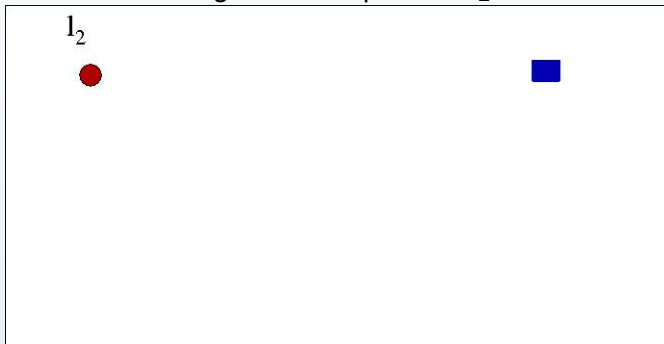
The equation/flow X' on the Arena

Light is on at position l_2



The equation/flow X' on the Arena

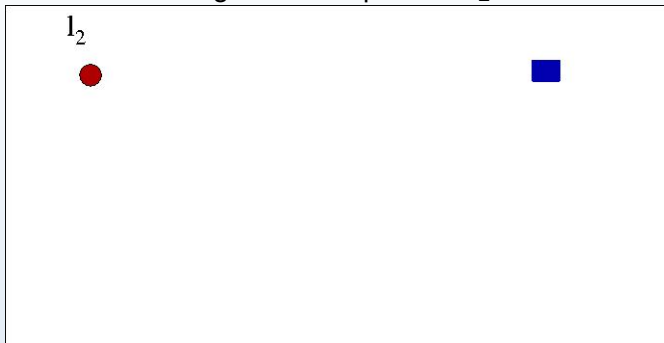
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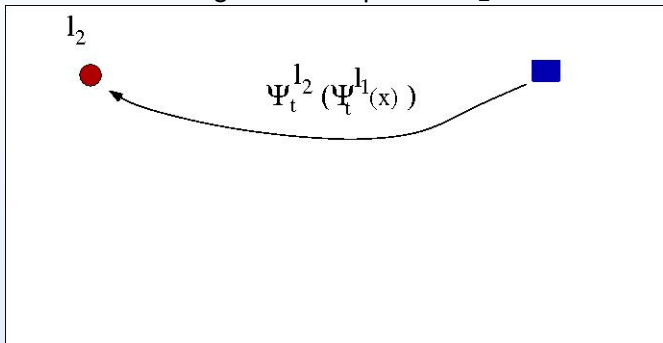
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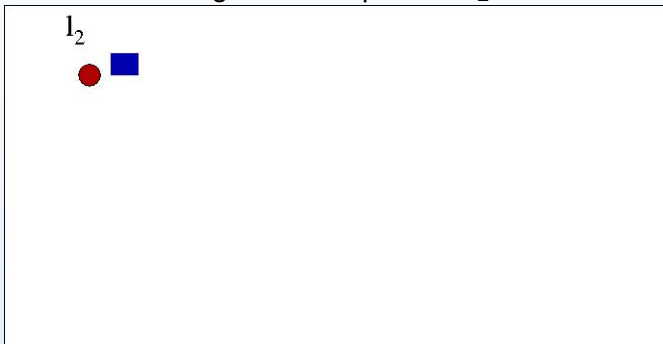
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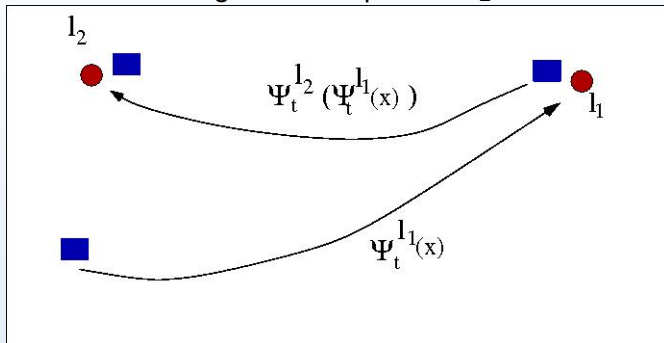
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Light is on at position l_1, l_2

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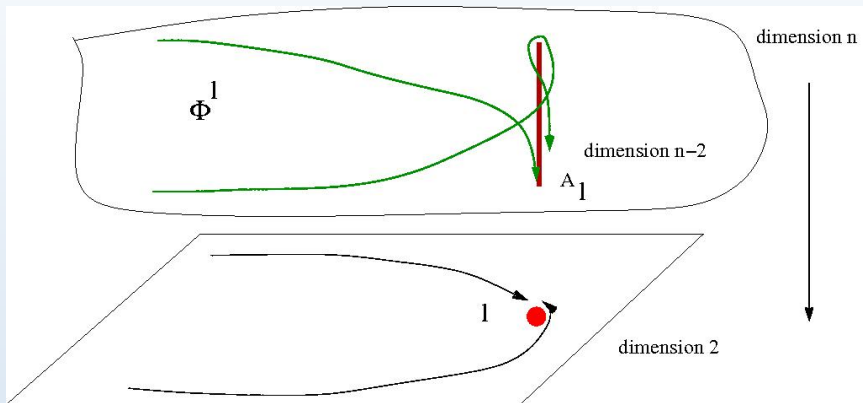
Light is on at position l_1, l_2

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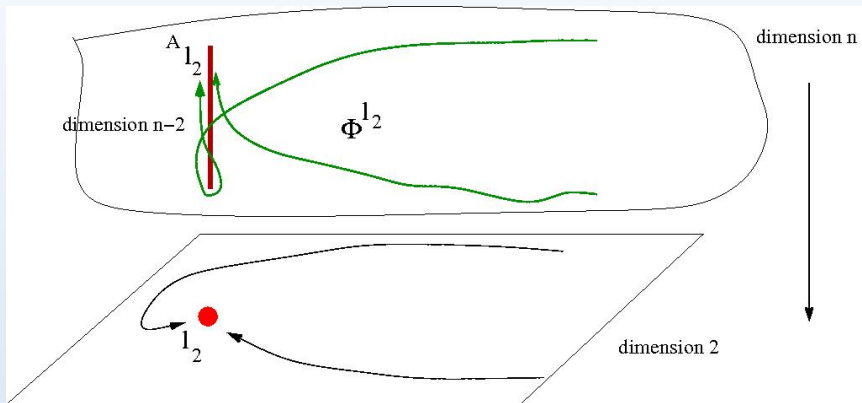
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Light is on at position l_1, l_2

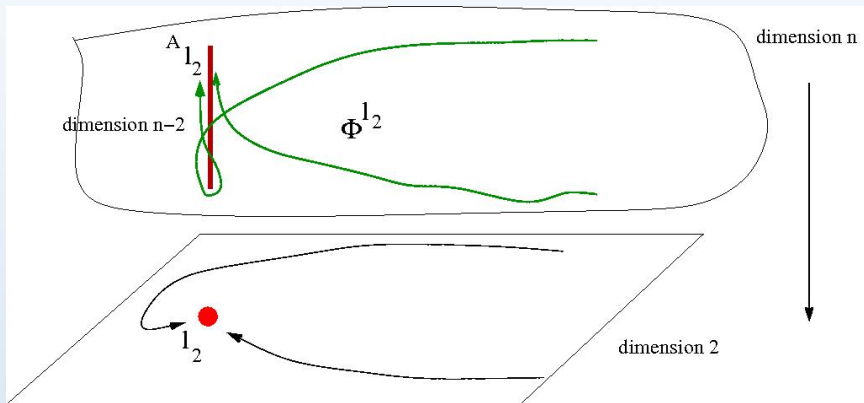
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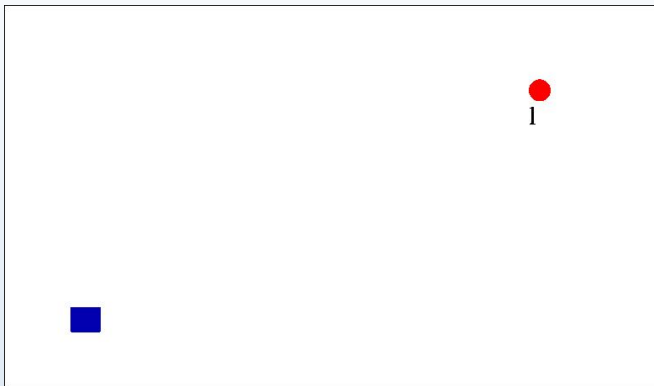
Each Φ^I has a unique attractor A_I that $\Pi(A_I) = I$

The equation/flow X^0 on the Arena

$\psi_t^0 = \Pi(\phi_t^0)$ has to go to I (any I) in the Arena

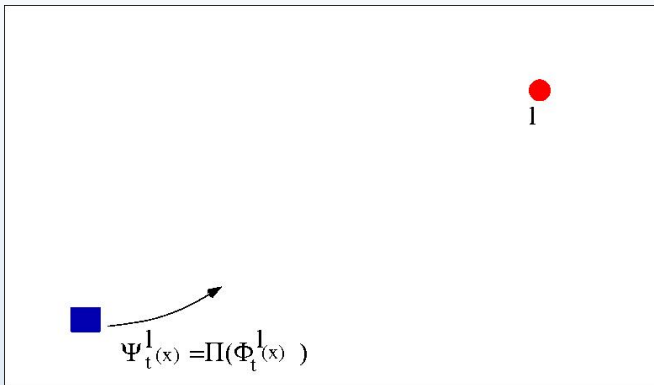
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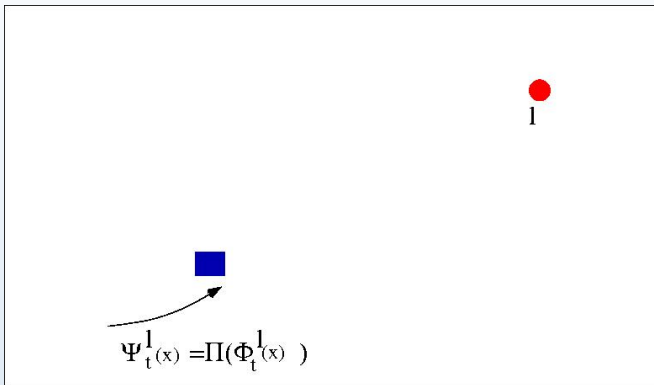
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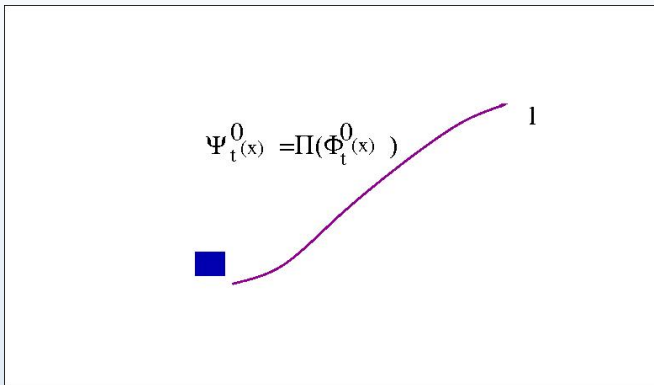
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The equation/flow X^0 on the Arena

$\psi_t^0 = \Pi(\phi_t^0)$ has to go to l (any l) in the Arena

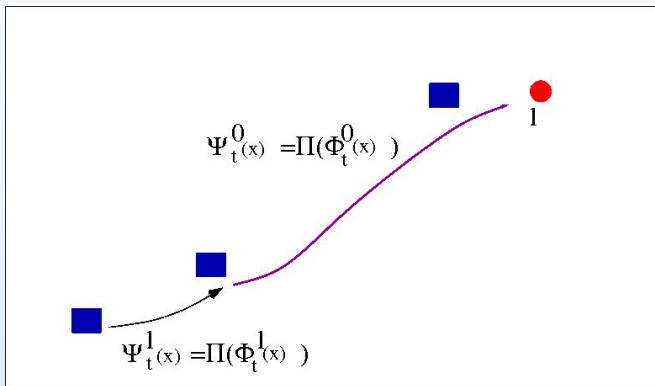
$$\Psi_{t(x)}^0 = \Pi(\Phi_{t(x)}^0)$$



1

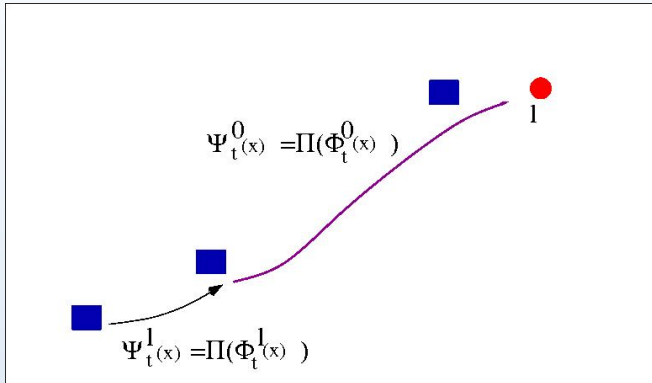
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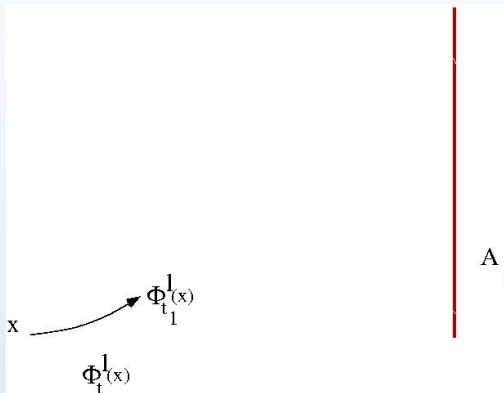
A_I is an attractor for Φ^0 ($\Pi(A_I) = I$)

The equation/flow X^0/ϕ^0 on the Brain space

ϕ_t^0 has to go to A_l (any l) in the Brain space

The equation/flow X^0/ϕ^0 on the Brain space

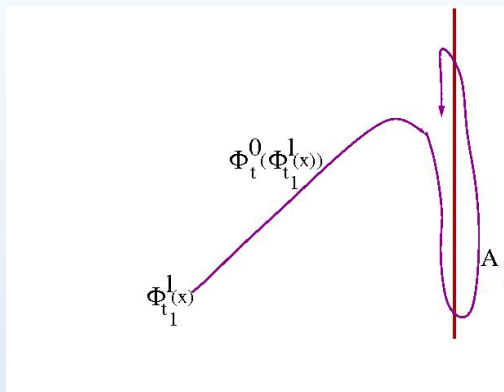
ϕ_t^0 has to go to A_l (any l) in the Brain space



First acts ϕ_t^l

The equation/flow X^0/ϕ^0 on the Brain space

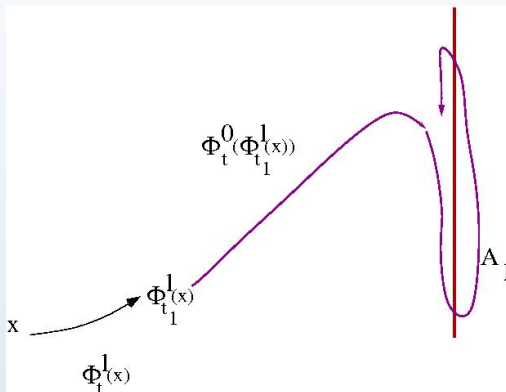
ϕ_t^0 has to go to A_l (any l) in the Brain space



Later acts ϕ_t^0

The equation/flow X^0/ϕ^0 on the Brain space

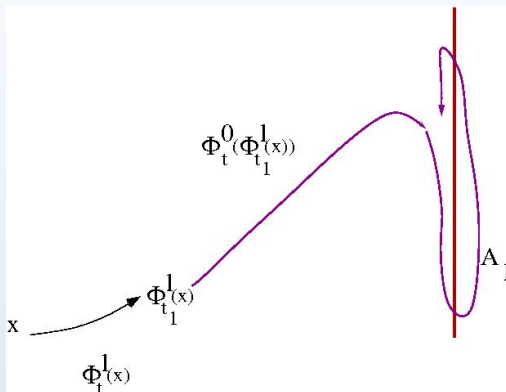
ϕ_t^0 has to go to A_l (any l) in the Brain space



ϕ^0 has an attractor at A_l that $\Pi(A_l) = I$

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ϕ_t^0 has to go to A_l (any l) in the Brain space



ϕ^0 has an attractor at A_l that $\Pi(A_l) = I$

So, ϕ^0 has “many” attractors

Infinitely many attractors for X^0/Φ^0 on the Brain space

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As many as places where the robot has to go

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So, ϕ^0 has “many” attractors

As many as places where the robot has to go

But if you are in an attractor, how do you move to others?

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A recalling from dynamics: Basin of attraction

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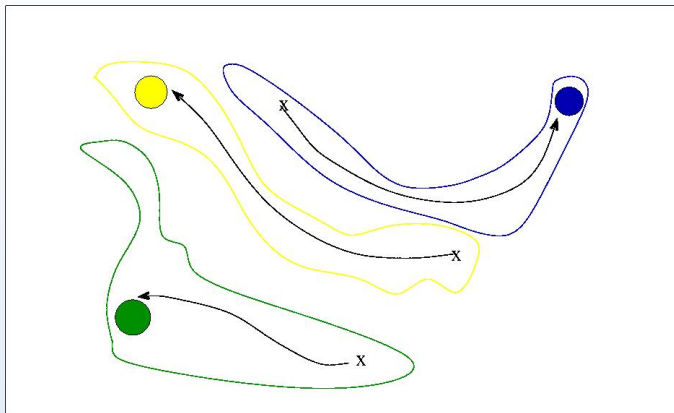
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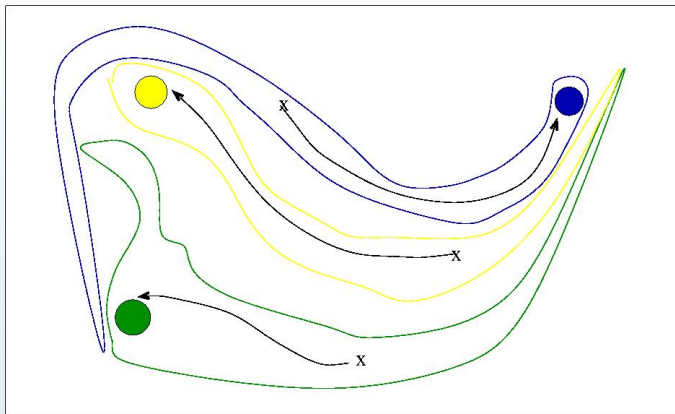
X^I, ϕ^I is kicking out with a small STIMULUS

Infinitely many attractors for X^0/Φ^0 on the Brain space



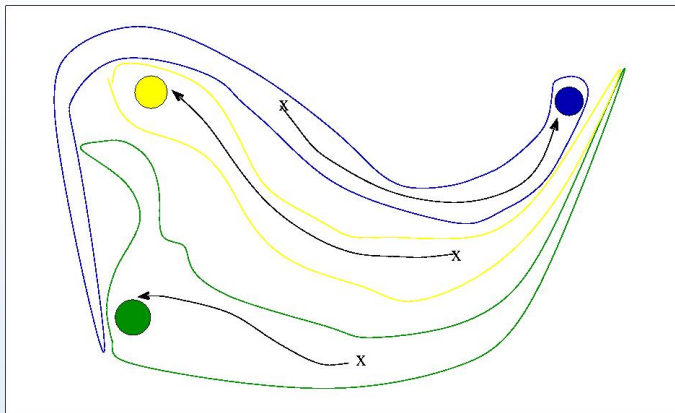
Attractors and its basin of attractions

Infinitely many attractors for X^0/Φ^0 on the Brain space



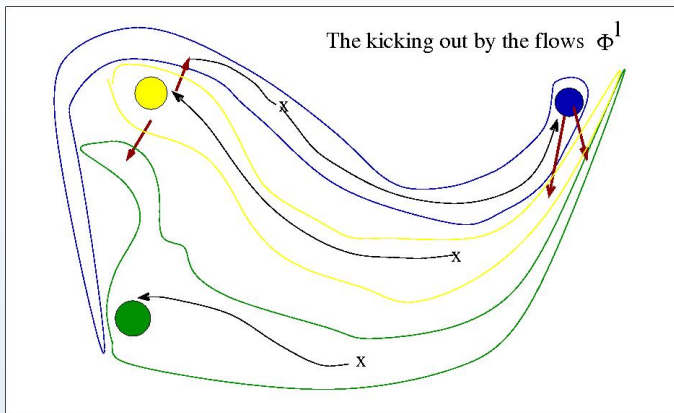
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Attractors and its basin of attractions
Intertwining basin of attraction

Infinitely many attractors for X^0/Φ^0 on the Brain space



Attractors and its basin of attractions
Intertwining basin of attraction
Flows Φ^1 moves between basins

Is it possible to have such phenomena?

Yes. WILD DYNAMICS.

Is it possible to have such phenomena?

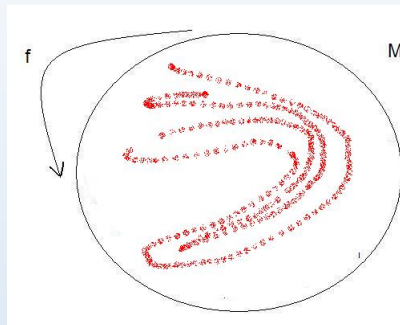
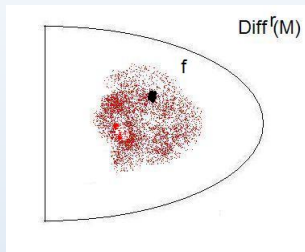
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Infinitely many attractors appearing and dissapearing

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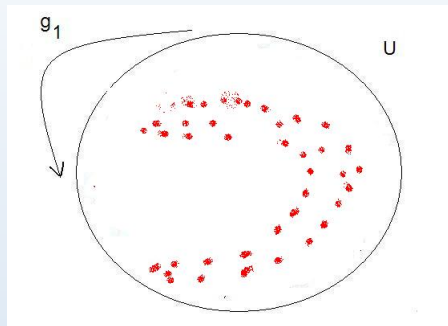
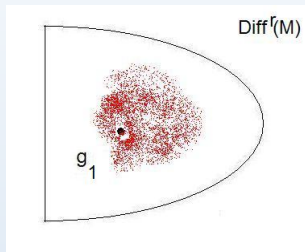
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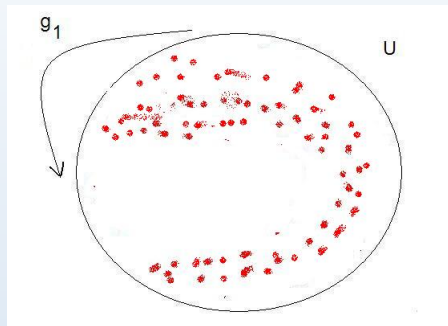
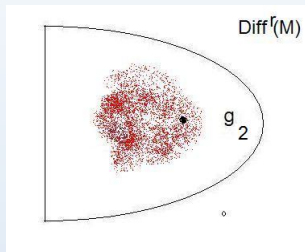
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Infinitely many attractors appearing and disappearing



Mechanisms for wild dynamics?

Can we characterize the **mechanisms**
underlying the presences of **wild dynamics**?

Mechanisms for wild dynamics?

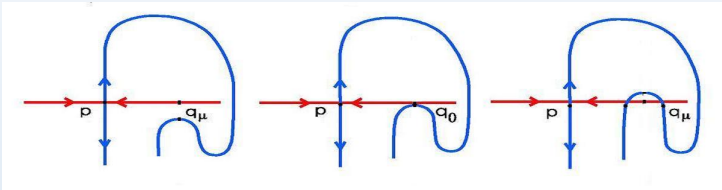
Can we characterize the **mechanisms**
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YES: HOMOCLINIC TANGENCIES

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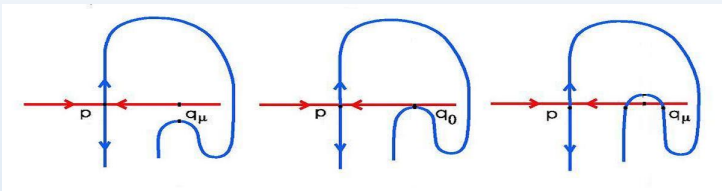
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Mechanisms for wild dynamics?

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YES: HOMOCLINIC TANGENCIES



Residual sets of systems having infinitely many attractors.

Properties of Wild Dynamics

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they change with small perturbations

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attractors are not robust

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power law properties

Properties of Wild Dynamics

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Many of the features that appears in the edge of chaos

And the Smart Data?

And the Smart Data?

Is this approach relevant for understanding EAA?

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MAYBE

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**Is this approach relevant for understanding EAA?
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Is this approach relevant to help to evolve them?

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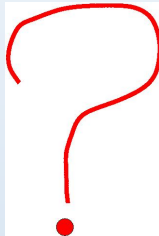
Is this approach relevant for engineering SMART DATA?

And the Smart Data?

**Is this approach relevant for understanding EAA?
MAYBE**

**Is this approach relevant to help to evolve them?
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Is this approach relevant for engineering SMART DATA?



So?

So?

We need a model to start

So?

We need a model to start

At least a **TOY**

So?

We need a model to start

At least a **TOY** and start to play

So?

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At least a **TOY** and start to play

being pragmatic