ChaosBook.org chapter go with the flow

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# dynamical systems

# state space (often: phase space)

 $\mathcal{M} \in \mathbb{R}^d$  : *d* numbers determine the state of the system

 ${\mathcal M}$  is a manifold - a torus, a cylinder,  $\cdots$ 

#### representative point

 $x(t) \in \mathcal{M}$ : a state of physical system at instant in time

# today's experiments

## example of a representative point

 $x(t) \in \mathcal{M}, d = \infty$ a state of turbulent pipe flow at instant in time

Stereoscopic Particle Image Velocimetry  $\rightarrow$  3-*d* velocity field over the entire pipe<sup>1</sup>



<sup>&</sup>lt;sup>1</sup>Casimir W.H. van Doorne (PhD thesis, Delft 2004)

#### dynamics

map  $f^t(x_0)$  = representative point time *t* later

#### evolution rule



 $f^t$  maps a region  $\mathcal{M}_i$  of the state space into the region  $f^t(\mathcal{M}_i)$ .

## smooth dynamical system

*f*<sup>*t*</sup> can be differentiated as many times as needed

## deterministic dynamics

evolution rule f maps a point into exactly one point at time t

dynamical system

the pair  $(\mathcal{M}, f)$ 

# dynamical systems

#### flow

evolution in continuous time  $t \in \mathbb{R}$ :

# iteration of a map

$$x_{n+1} = f(x_n)$$

evolution advances in discrete time steps, integer time  $n \in \mathbb{Z}$ 

#### flows

for infinitesimal times, flows can be defined by differential equations - a generalized vector field

$$v(x) = \dot{x}(t)$$

#### examples

Newton's laws for a mechanical system

general flows, mechanical or not, defined by a time-independent vector field v(x)

devil is in the details

## fluid dynamics

have equations: can compute the trajectories

# **Navier-Stokes**

$$\frac{\partial \mathbf{v}}{\partial t} + (\mathbf{v} \cdot \nabla)\mathbf{v} = \frac{1}{R} \nabla^2 \mathbf{v} - \nabla \rho + \mathbf{f}, \qquad \nabla \cdot \mathbf{v} = \mathbf{0},$$

velocity field  $\mathbf{v} \in \mathbb{R}^3$  ; pressure field p ; driving force  $\mathbf{f}$ 

## example: unforced Duffing system

a two-dimensional vector field v(x)

$$\dot{x}(t) = y(t)$$
  
 $\dot{y}(t) = -0.15 y(t) + x(t) - x(t)^3$ 



two visualization of the velocity vector field v(x), superimposed over the configuration coordinates  $(x(t), y(t)) \in M$ 

velocity field belongs to a different space,

the tangent bundle  $T\mathcal{M}$ 

orbit vs. trajectory

trajectory



curve  $x(t) = f^t(x)$  through the point *x* traced out by the evolution rule  $f^t$ 

after a time *t* the point is at  $f^t(x)$ 

## orbit of *x*<sub>0</sub>

subset in  $\mathcal{M}$  of points reached by the (possibly infinite) trajectory of  $x_0$ 

For a flow, an orbit is a continuous curve; for a map, it is a sequence of points

# orbit is a dynamically invariant set

# orbit, or a solution of $x_0$ :

subset of points  $\mathcal{M}_{x_0} \subset \mathcal{M}$  that belong to the infinite-time trajectory of a given point  $x_0$ 

 $\mathcal{M}_{x_0}$  is a dynamically invariant set, the totality of states that can be reached from  $x_0$ , with the full state space  $\mathcal{M}$  foliated into a union of such orbits

we label a generic orbit  $\mathcal{M}_{x_0}$  by a point belonging to it, for example  $x_0 = x(0)$ 

#### possible trajectories?



# example : Duffing flow equilibria

 $x_q$  is an equilibrium point

if 
$$v(x_q) = 0$$



Duffing flow is bit of a bore: every trajectory ends up in one of the two attractive equilibrium points

# periodic orbits

# periodic point

returns to the initial point after a finite time,  $x = f^{T_p}(x)$ 

## periodic orbit

p is the set of periodic points  $p = \mathcal{M}_p = \{x_1, x_2, \cdots\}$  swept out by the trajectory of any one of them in the finite time  $T_p$ 



periodic orbits - a very small subset of the state space, in the same sense that rational numbers are a set of zero measure on the unit interval

generic orbit might be ergodic, unstable and essentially uncontrollable

# ChaosBook strategy : "geometry of chaos"

populate the state space by a hierarchy of compact invariant sets (equilibria, periodic orbits, invariant tori, ...), each computable in a finite time

together with their invariant stable/unstable manifolds

orbits which are compact invariant sets we label by alphabet convenient in a particular application:

- $EQ = x_{EQ} = \mathcal{M}_{EQ}$  for an equilibrium
- $p = \mathcal{M}_p$  for a periodic orbit
- $\mathcal{M}_{\mathcal{T}}$  for an invariant torus

o...

#### close recurrences

for a generic dynamical system most motions are aperiodic, so give up on exact periodicity, consider instead close recurrences

#### non-wandering set

point x is recurrent or non-wandering if for any open neighborhood  $M_0$  of x there exists a later time t such that

$$f^t(x) \in \mathcal{M}_0$$

 $\Omega$ : the non–wandering set of *f*, the union of all the non-wandering points of  $\mathcal{M}$ 

 $\boldsymbol{\Omega}$  is the key to understanding the long-time behavior of a dynamical system

#### attractor

if there exists a connected state space volume that maps into itself under forward evolution, the flow is globally contracting onto a subset of  $\mathcal{M}$ , the attractor

there can coexist any number of distinct attracting sets, each with its own basin of attraction, the set of all points that fall into the attractor under forward evolution

the attractor can be

- a fixed point
- a periodic orbit
- aperiodic
- or any combination of the above

the most interesting case is that of an aperiodic recurrent attractor, to which we shall refer loosely as a strange attractor

## example : Lorenz strange attractor



Edward Lorenz: the weather will remain unpredictable

#### strange repeller

conversely, if we can enclose the non–wandering set  $\Omega$  by a connected state space volume  $\mathcal{M}_0$  and then show that almost all points within  $\mathcal{M}_0$ , but not in  $\Omega$ , eventually exit  $\mathcal{M}_0$ , we refer to the non–wandering set  $\Omega$  as a repeller

## example : game of pinball



Pinball Wizard: no pinball bounces forever

# periodic orbit: a perfect pinball shot



Pinball Wizard: cannot make it, it is an unstable solution

#### example : Lorenz "butterfly" strange attractor



Lorenz fixed  $\sigma = 10$ , b = 8/3, varied the "Rayleigh number"  $\rho$ 

## example : Rössler flow

# **Rössler flow**

$$\dot{x} = -y - z$$
  

$$\dot{y} = x + ay$$
  

$$\dot{z} = b + z(x - c),$$
  

$$a = b = 0.2, \quad c = 5.7$$

# typical numerically integrated long-time trajectory

Z(t)



## equilibria of Rössler flow

two trajectories of the Rössler flow initiated in the neighborhood of the "upper" equilibrium point



2 repelling equilibrium points (no dynamics there!)

$$(x^-, y^-, z^-) = (0.0070, -0.0351, 0.0351)$$
  
 $(x^+, y^+, z^+) = (5.6929, -28.464, 28.464)$ 

#### a strange attractor?



a trajectory of the Rössler flow up to time t = 250

trajectories that start out sufficiently close to the origin seem to converge to a strange attractor

Z(t)

Charles Babbage:

"On two occasions I have been asked [by members of Parliament],

'Pray, Mr. Babbage, if you put into the machine wrong figures, will the right answers come out?'

I am not able rightly to apprehend the kind of confusion of ideas that could provoke such a question."

# Résumé

a dynamical system – a flow, or an iterated map – is defined by specifying

a pair

 $(\mathcal{M}, f)$ 

where  $\mathcal{M}$  is the state space, and  $f : \mathcal{M} \to \mathcal{M}$ 

the key concepts in exploration of the long time dynamics are the notions of

- recurrence and of
- non-wandering set of *f*, the union of all the non-wandering points of *M*