

# The Butterfly Effect: Understanding the Unpredictable

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**The **Norah Boyce** Lecture  
Tuesday 10 May, St Edmund's College, Cambridge**

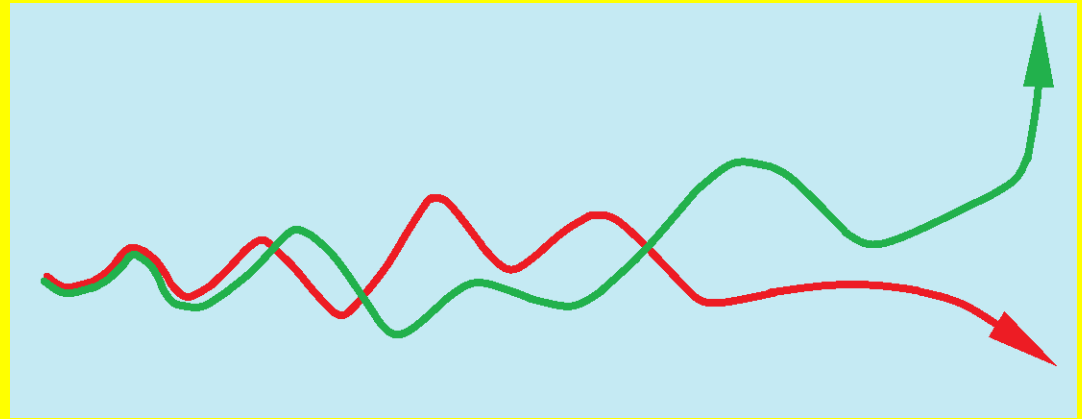
# Lorenz, 1963

“Does the flap of a butterfly's wings in Brazil set off a tornado in Texas?”



**Signature of chaos:**  
**Small changes lead to bigger changes**

# So what is Chaos?



- An unexpected 'random' response of a precise deterministic system
- With extreme sensitivity to how it is started ... **THE BUTTERFLY EFFECT**
- Mathematically unsolvable, and computer simulations prone to large errors
- Long term prediction is impossible, but there is order within chaos
- **Challenge: how to cope and maybe use it**

# Double Pendulum: a taste of chaos

The double pendulum gives us a first glimpse of chaos.

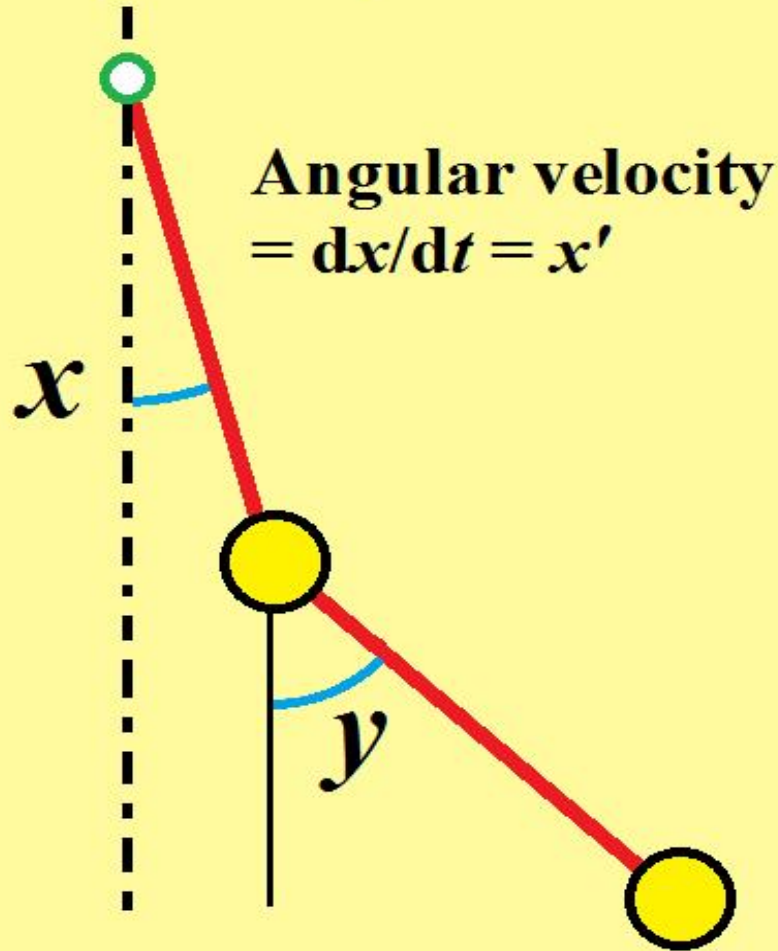
A real pendulum will have friction, air resistance, etc, which will dissipate energy: it will eventually stop.

But often it is useful to **imagine** a non-dissipative pendulum which oscillates for ever.



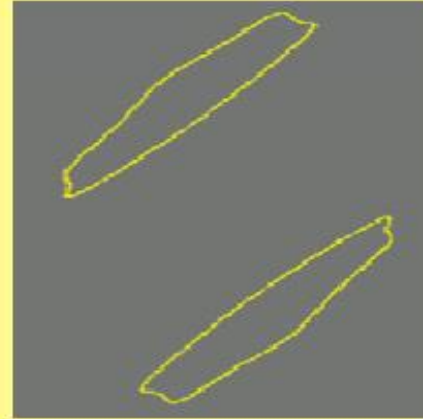
# Undamped Double Pendulum in a Poincaré Section

Response depends on the start

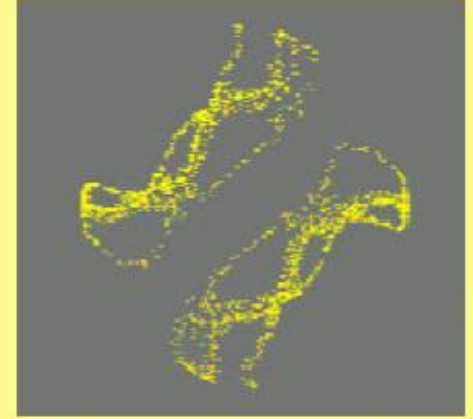


Poincaré dots show  $x$  and  $y$   
when  $dx/dt = 0$

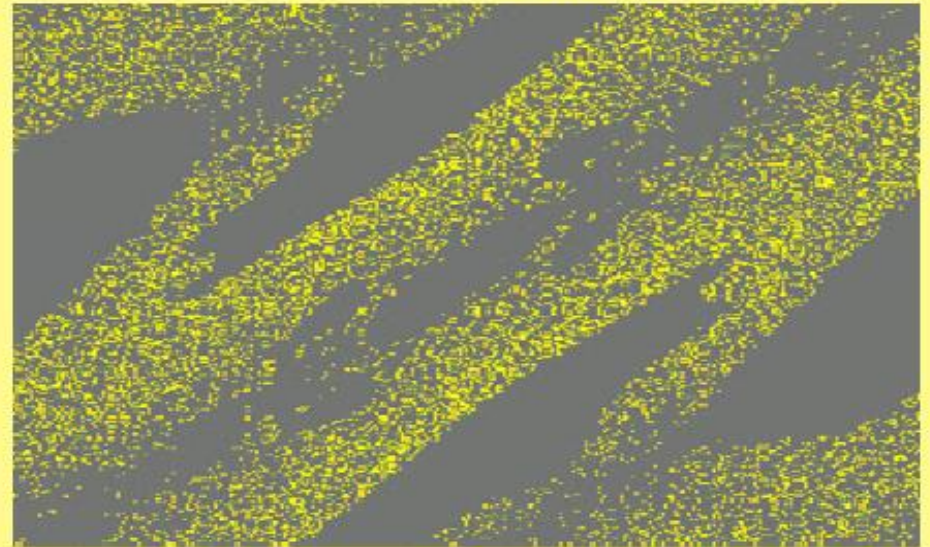
Regular motion



Chaotic motion



Chaotic motion



# **Outline of Talk**

**Impact of Newton**

**A little about phase space**

**Pioneers: Poincaré, Lorenz**

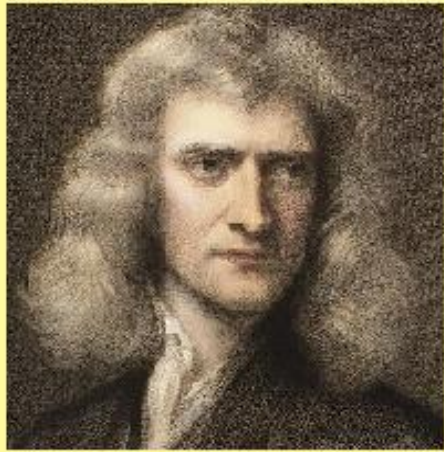
**Spaceflight for free**

**Introduction to fractals**

**Populations, Logistic map**

**Four concluding examples**





**Newton**

**1643-1727**

***Principia***

**1686**

PHILOSOPHIÆ

NATURALIS

PRINCIPIA

MATHEMATICA.

AUCTORE

ISAACO NEWTONO, EQ. AUR.

Editio tertia aucta & emendata.

LONDINI:

Apud GUIL. & JOH. INNYES, Regiæ Societatis typographos.  
MDCCXXVI.

**Newton's Laws of Motion  
revolutionised science.**

**Giving a dynamical system  
described by the calculus.**

**Still the ideal way to model  
a system evolving in time.**

**Starting conditions for the  
equations define a unique future.**

**But CHAOS has been found WITHIN this system.**

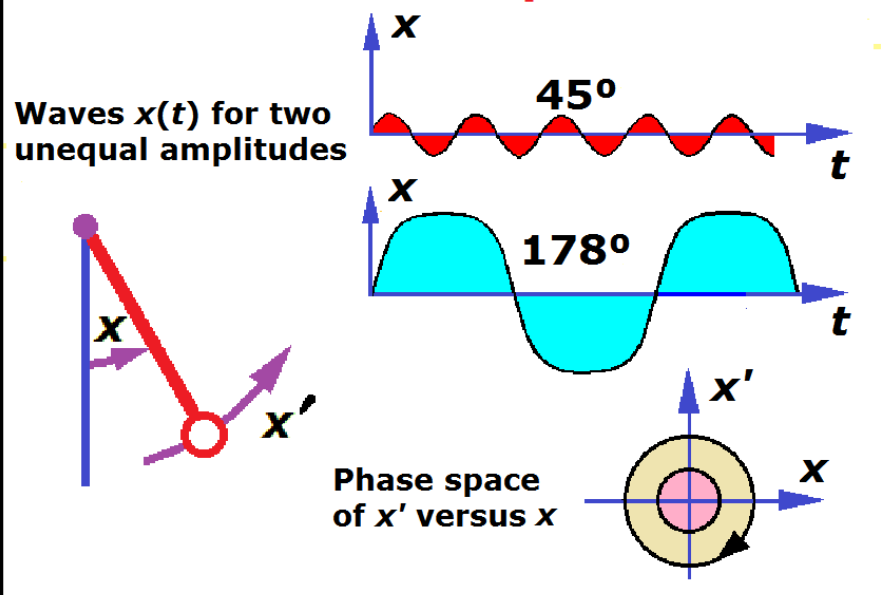
# A quick look at Newtonian Dynamics

## The Importance of Phase Space

The space of the starting conditions  $(x, x')$  full of trajectories, a unique path at every point

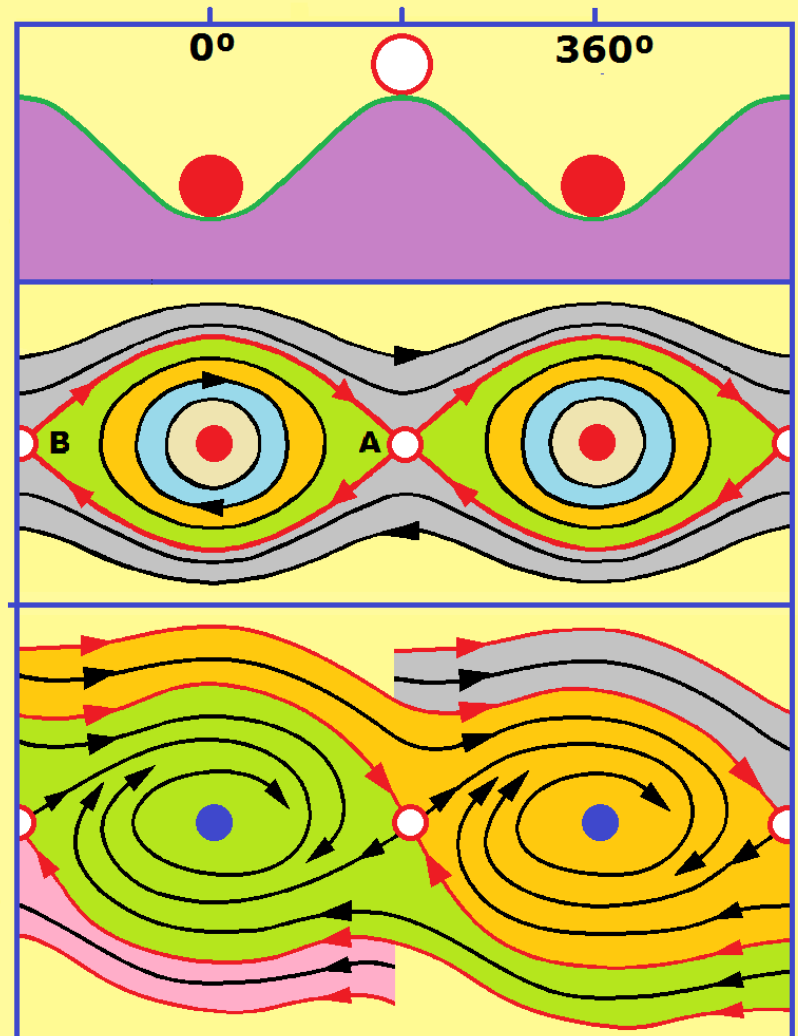
A pendulum is equivalent to a ball rolling on a wavy surface.

### Wave and Phase Representations



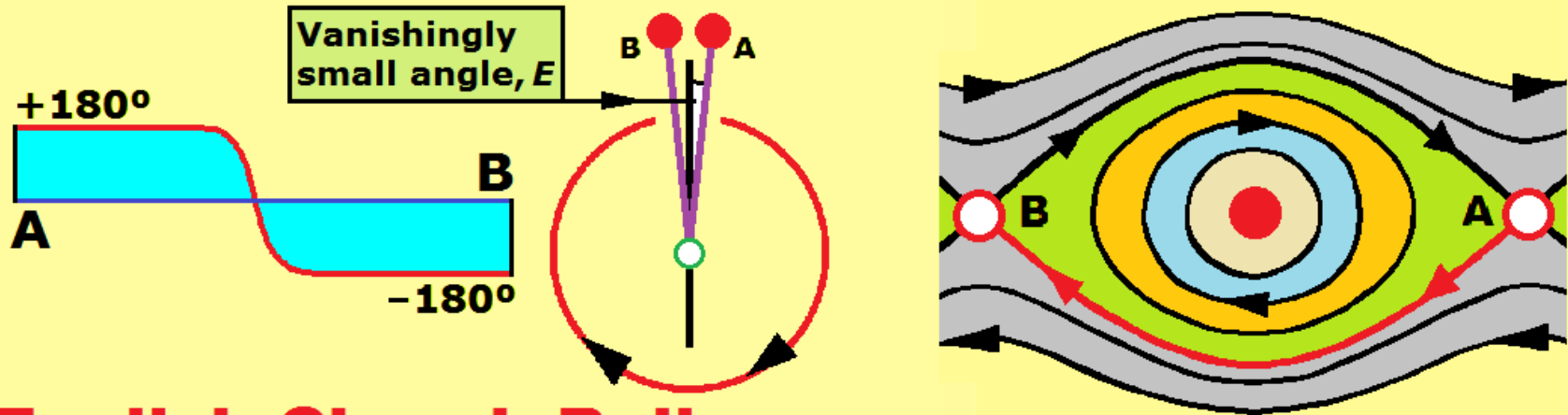
### With Damping: Energy Dissipated

● Stable equilibrium states are point attractors, sitting in coloured basins. Note the basin boundaries in red.

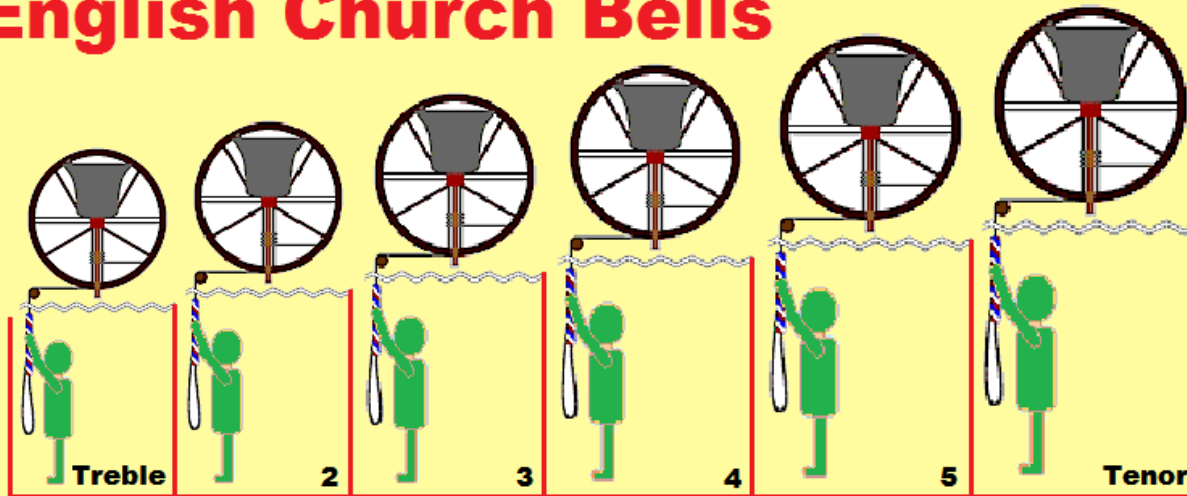




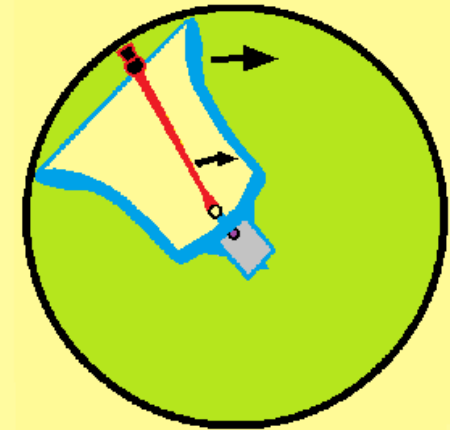
# Saddle connections play key roles in Generating Chaos



## English Church Bells



A ringer rests the bell close to its inverted state. Then with little effort, but considerable skill, it can be tugged into its **homoclinic** trajectory. It swings through  $\sim 360^\circ$  and back to 'rest'.



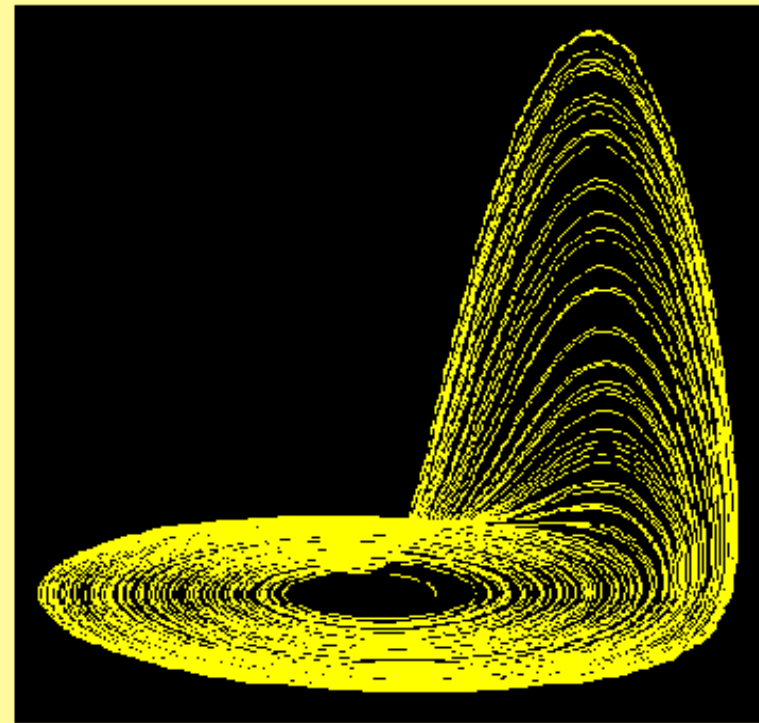
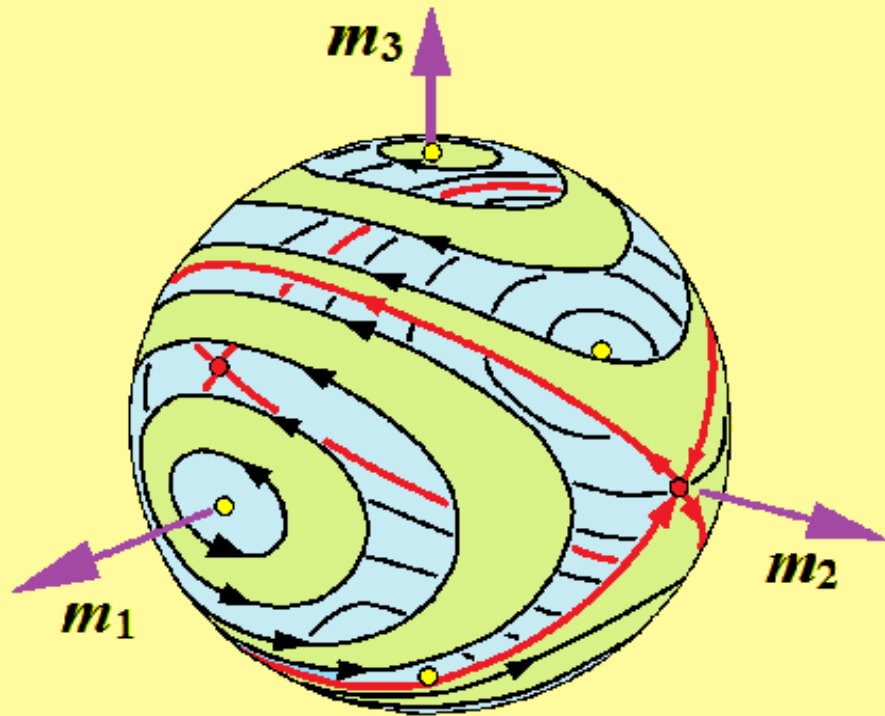
The clapper, rotating faster, is about to strike and ring the bell.

# Phase Spaces with Higher Dimensions

Chaos only exists in 3D or higher.  
The double pendulum has 4D.

In 3D Rossler shows **chaos** created  
by repeated **folding and mixing**.

This creates an infinite number of  
thin layers: a fractal structure.



Rossler's Band (1976)

## A Spinning Satellite

This has a 2D phase space,  
but it lies on the surface of  
a sphere (as on the left).

# From Newton to Chaos

Newton's Laws allow precise solutions to two problems:

Simple pendulum

Sun-Earth (2 body) system

One small step in complexity gives 'un-solvable' chaos for:

Double pendulum

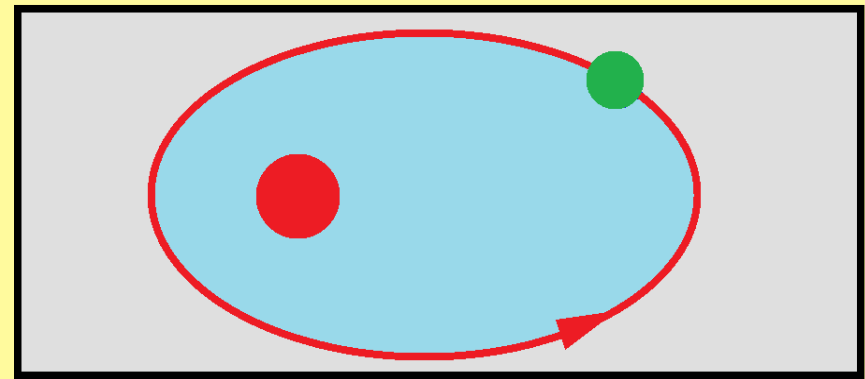
Sun-Earth-Moon system

## BIRTH OF CHAOS

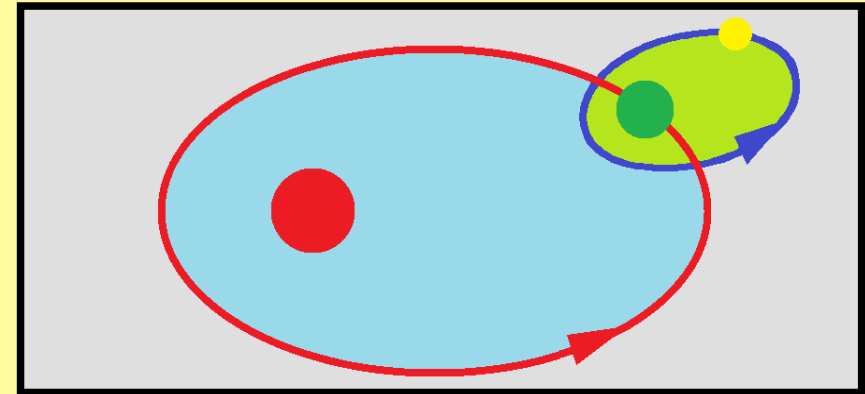
In 1887 the King of Sweden offered a prize for an answer to the issue 'is the solar system stable?'

Poincaré won for his 3-body studies, using his 'section' to prove that 'tangles' (our chaos) must occur.

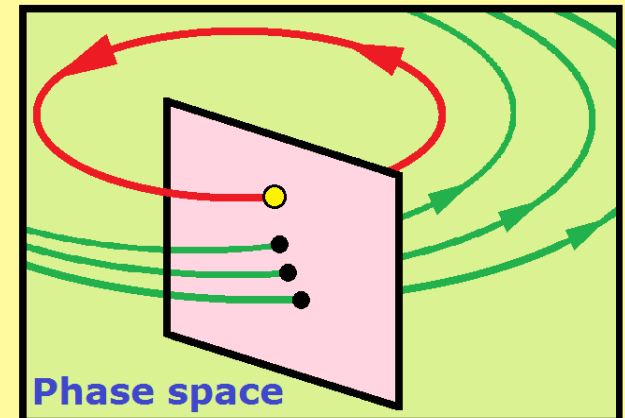
"I shall not even try to draw it ..."



Newton solved 2-body case

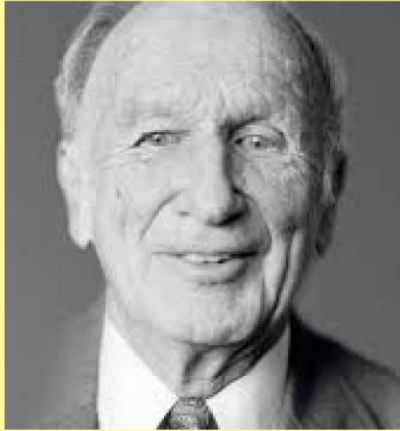


Henri Poincaré: 3-body case



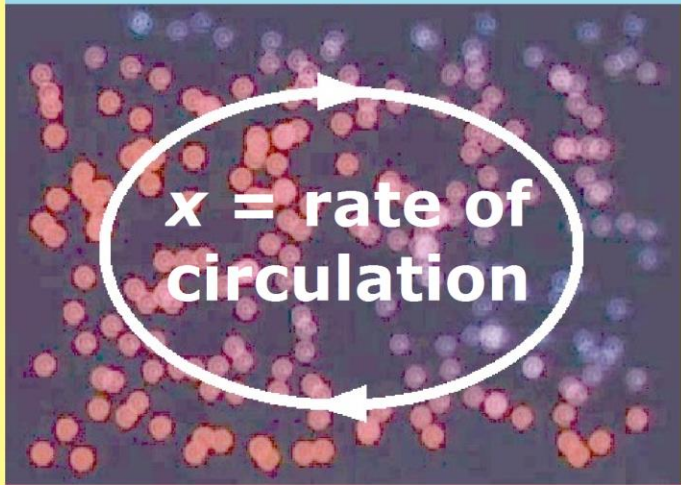
Phase space

# Lorenz: Atmospheric convection in a box



(1917-2008)

Low temperature



High temperature

## Finds the BUTTERFLY EFFECT

In 1963 Ed Lorenz was trying to improve weather forecasting.

Using a recently available **computer** he discovered the first **chaotic attractor**.

He used three phase-variables ( $x, y, z$ ) and a controlled thermal gradient,  $R$ .

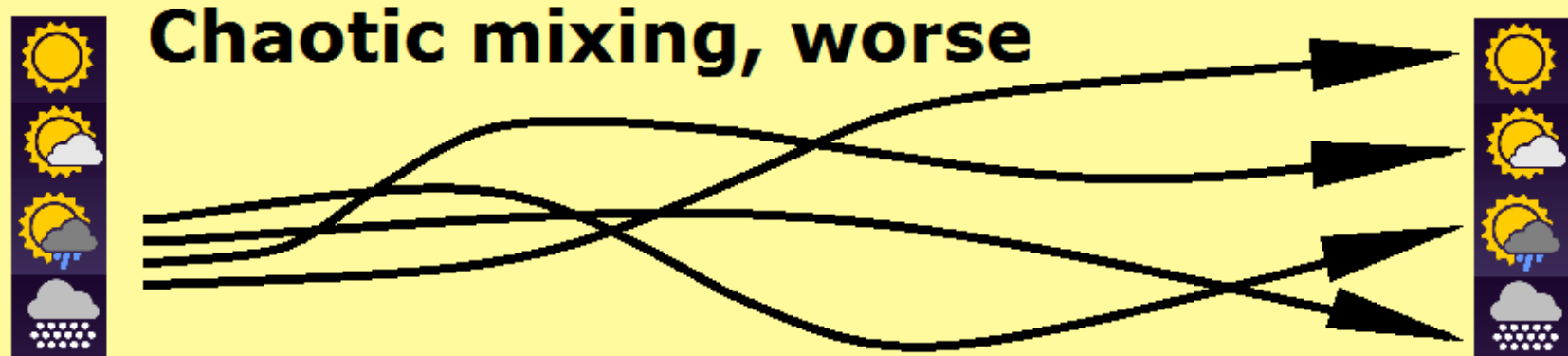
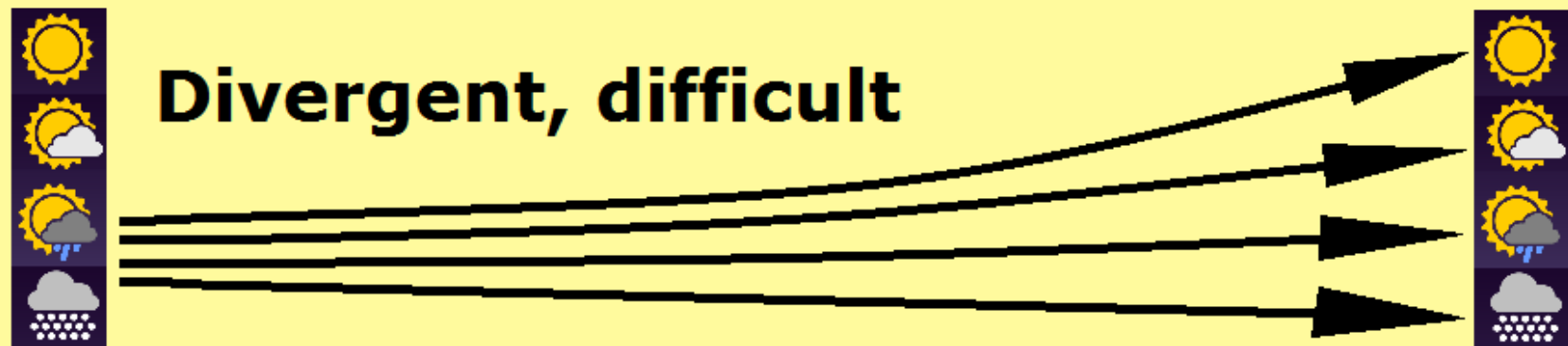
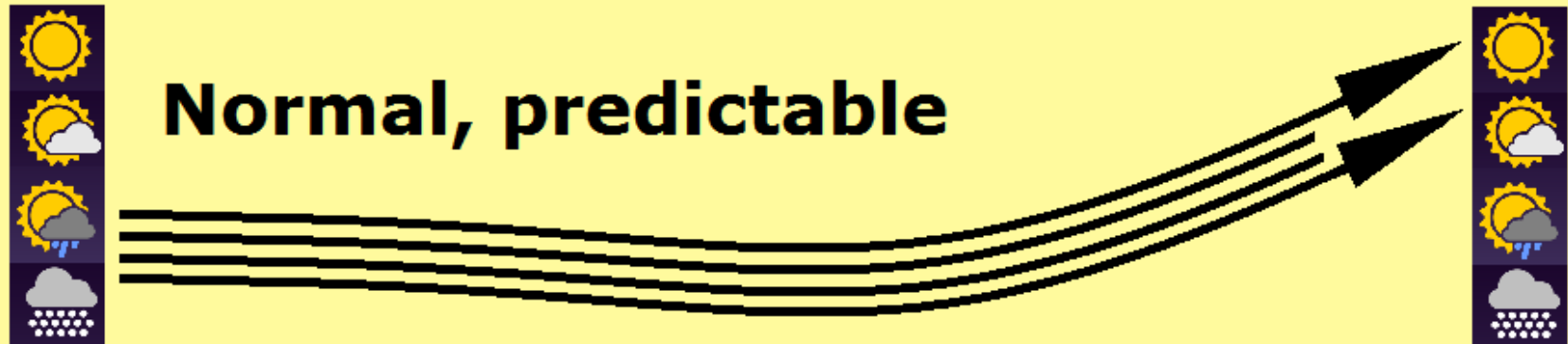
At fixed  $R$ , convection is represented by trajectories in the 3D phase space.

Convection starts at  $R=1$ .

At  $R=28$ , Lorenz showed that **all starts** settle onto a strange, chaotic attractor.

**Divergence and mixing** within the attractor make prediction impossible.

# Headache for the Weather Man

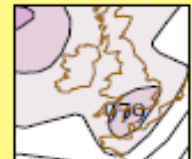
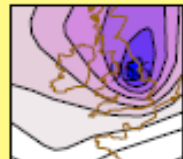




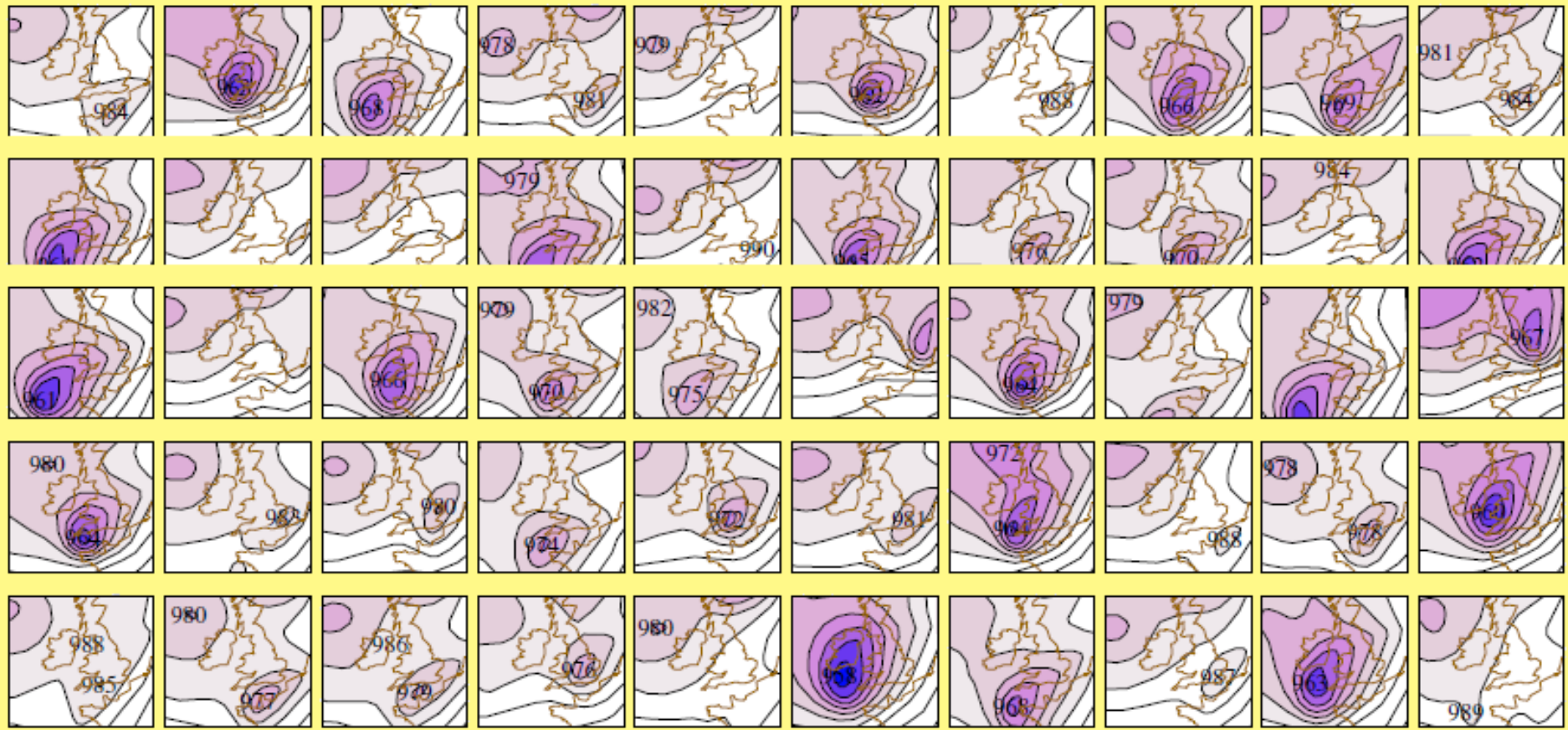
# Chaos Theory now at the Heart of Weather Forecasting

**BEFORE**

**FORECAST**



**Since Michael Fish (15-16 Oct, 1987)  
Met Office uses probability forecasting**



**An ensemble of 50 forecasts with randomly perturbed starting winds, temperatures, pressures, etc.  
Many develop deep depressions after 66 hours.**

# NASA's zero fuel highways: natural chaotic trajectories





# Interplanetary Transport Network (ITN) IEEE 2002

Created and accessed by halo orbits around 3-body Lagrange points

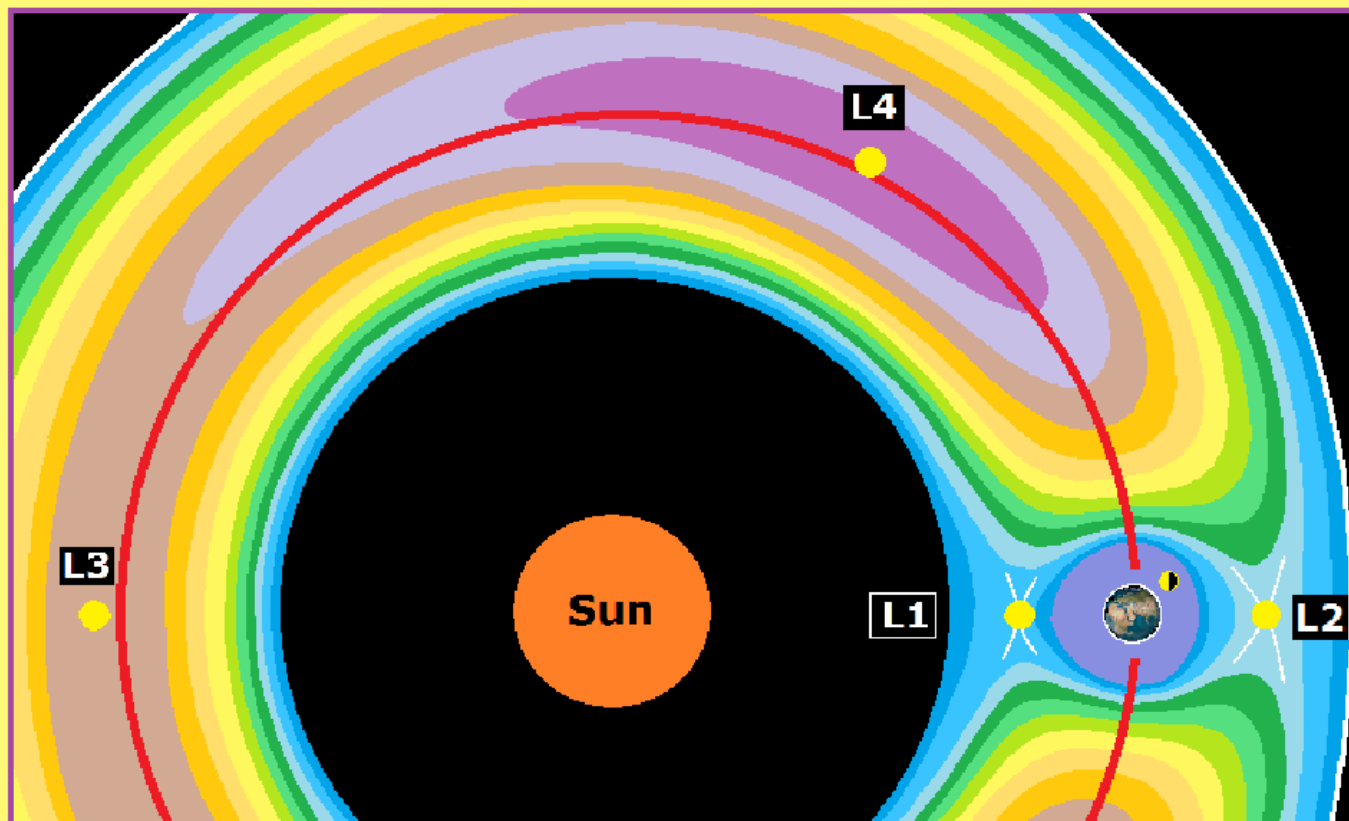
## (A) Parking

Sun-Earth-Craft  
in rotating frame

PE contours  
(gravitational  
+ centrifugal)

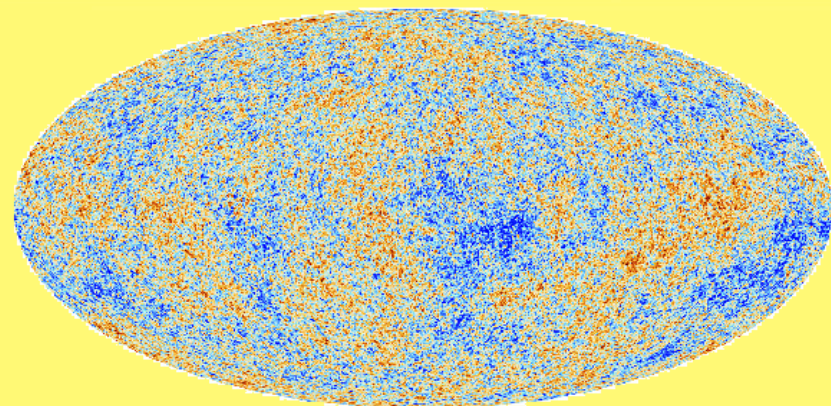
L1-3 unstable  
saddles

L4-5 hill-tops,  
stabilized  
by coriolis



L1 hosts 2 sun observatories,  
Soho (1995) and Ace (1997).

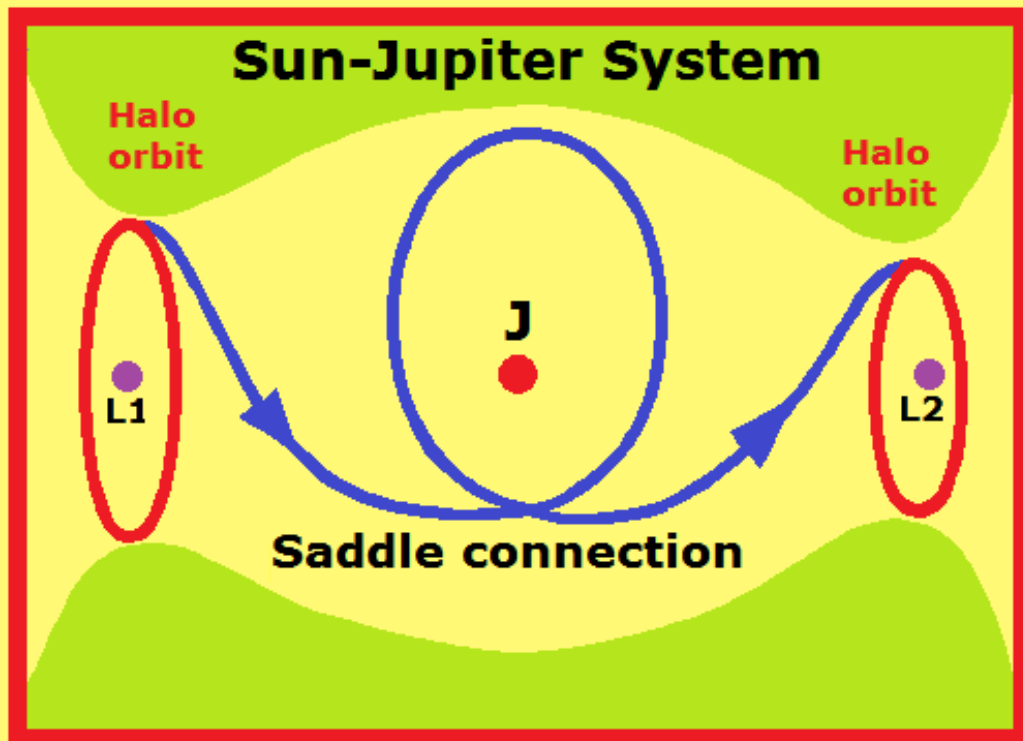
L2 hosts Planck (2009, ESA):  
Cosmic Microwave Background.



## **(B) Chaotic trajectories of the ITN**

**These use saddle-connections between Lagrange halo orbits.**

**Being chaotic, they are easily controlled to different destinations.**



### **ITN Missions**

**1990 Japan Hiten  
(moon)**

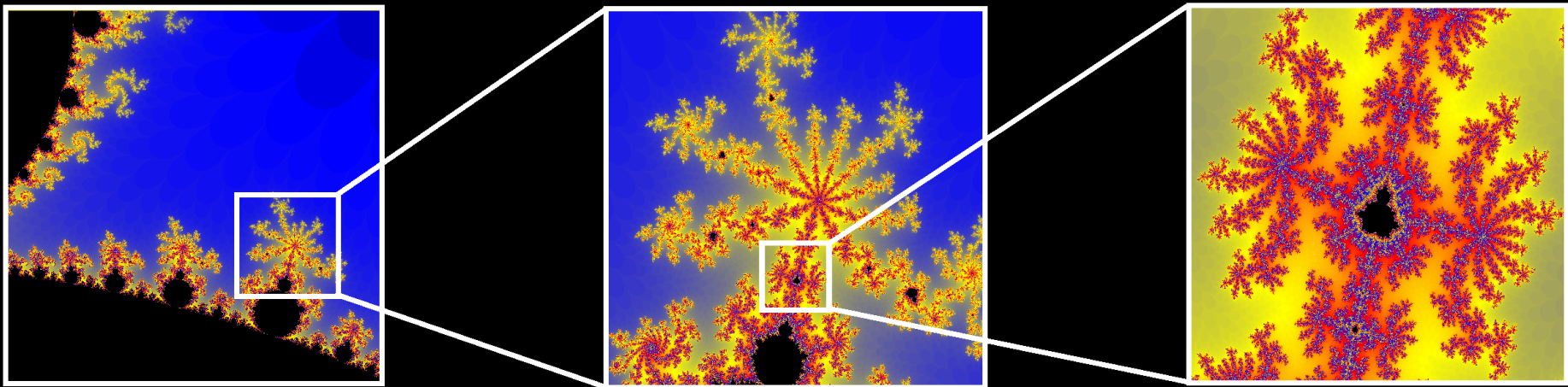
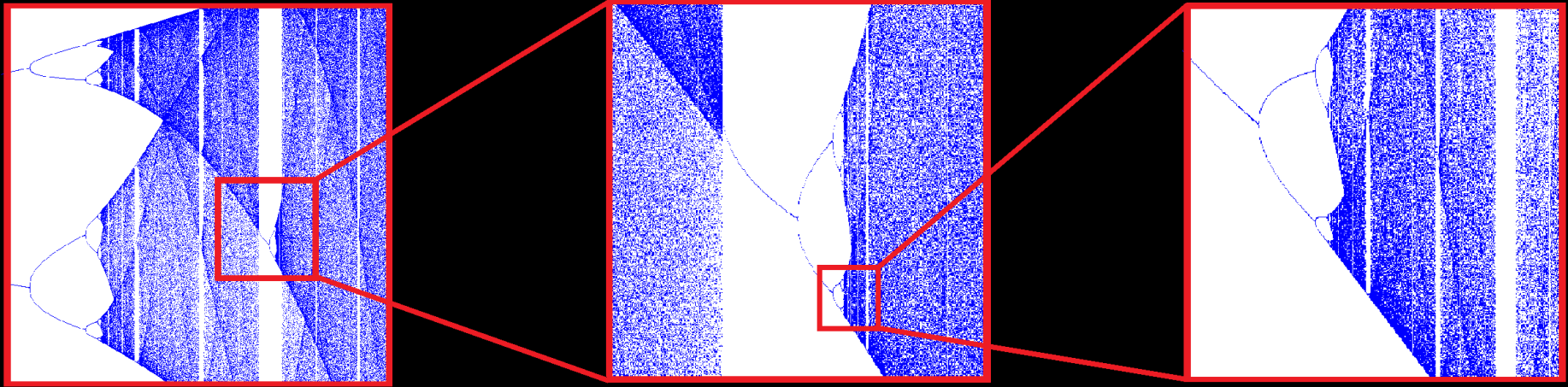
**2001 NASA Genesis  
(solar)**

**2003 Europe Smart 1  
(moon)**

**2010 China Changé 2  
(moon)**

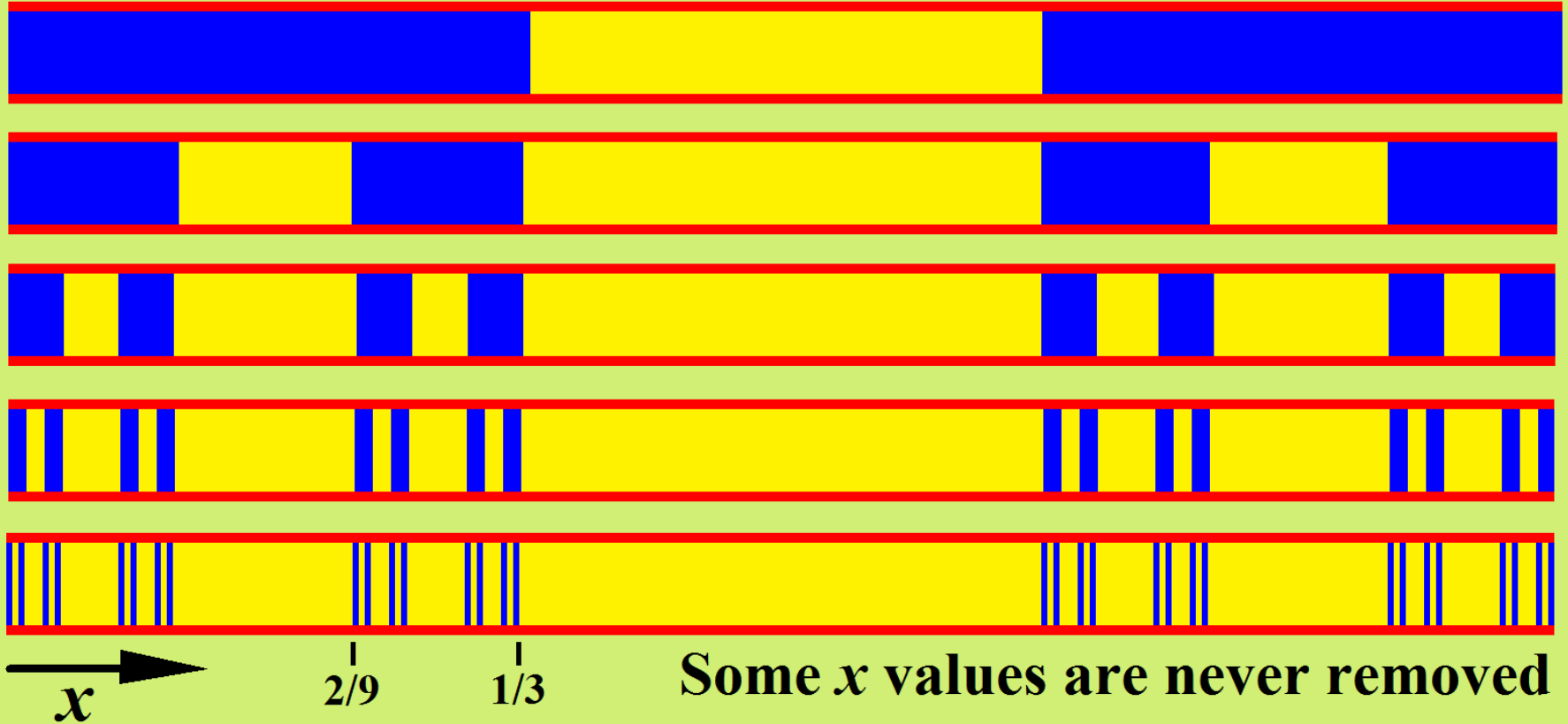
# What is a Fractal?

**A pattern that can be magnified for ever, revealing more and more detail**





# The Cantor Set (a simple example of a fractal)



Draw line 0 to 1, delete the (open) middle-third.

Do the same for each remaining segment.

Repeat this for ever, leaving the 'Cantor Set'.

Removed =  $1/3 + 2(1/3)^2 + 4(1/3)^3 + \dots = 1$ .

All length is gone, but an infinity of points remain.

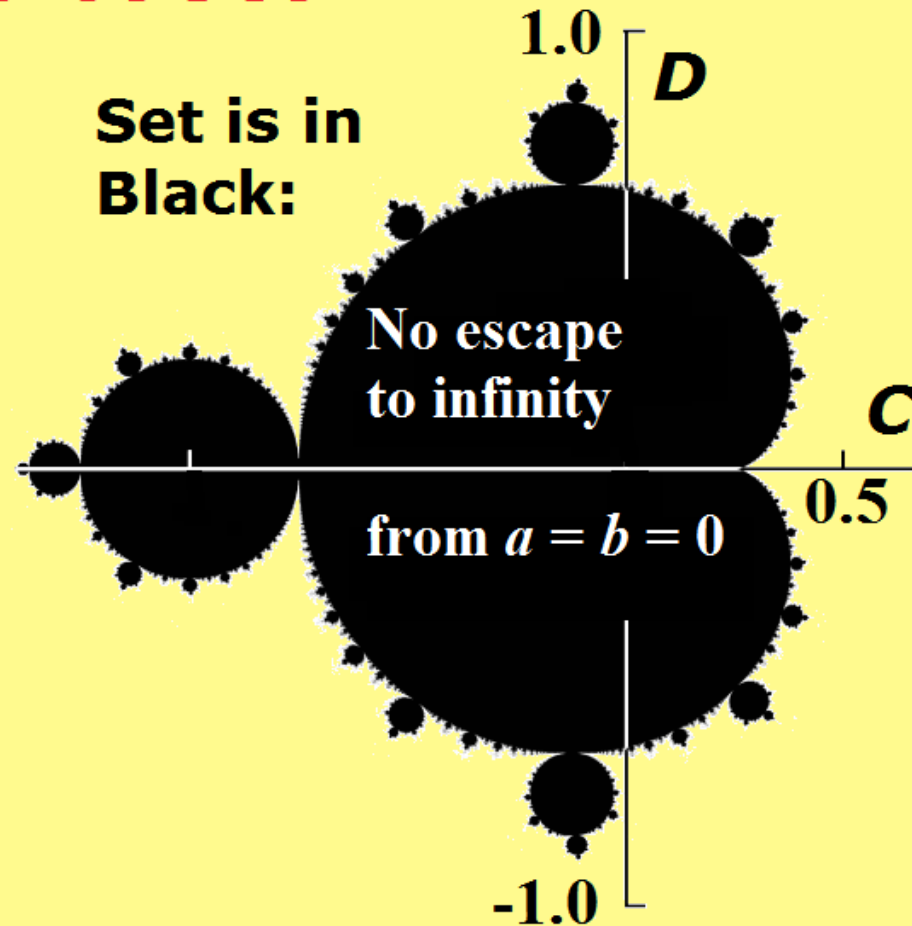
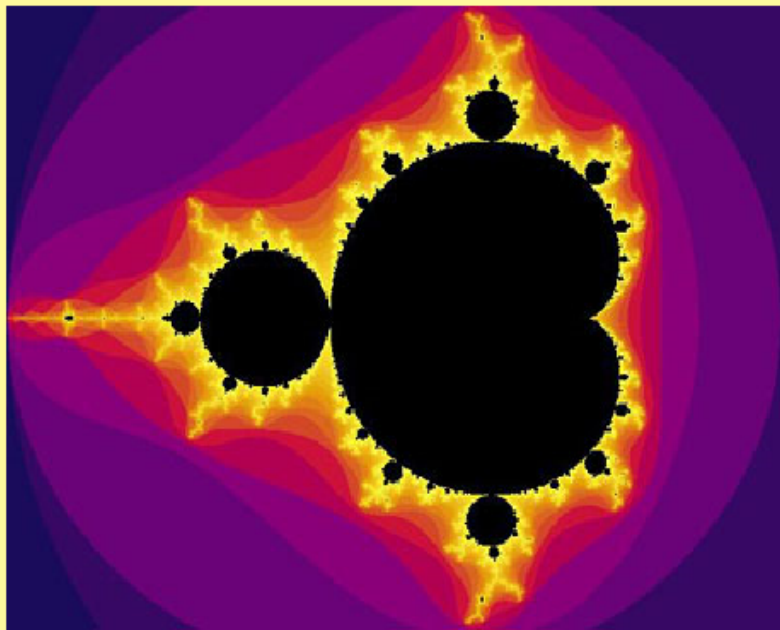
# The Fractal Mandelbrot Set

New  $a = \text{Old } (a^2 - b^2 + C)$

New  $b = \text{Old } (2ab + D)$

$C$  and  $D$  are held fixed during each calculation.

The set is determined by 'runs' from  $a = 0, b = 0$

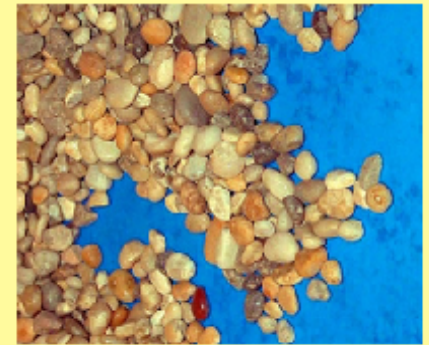


**Colours define rate of divergence**

**Image of the set can be magnified indefinitely**

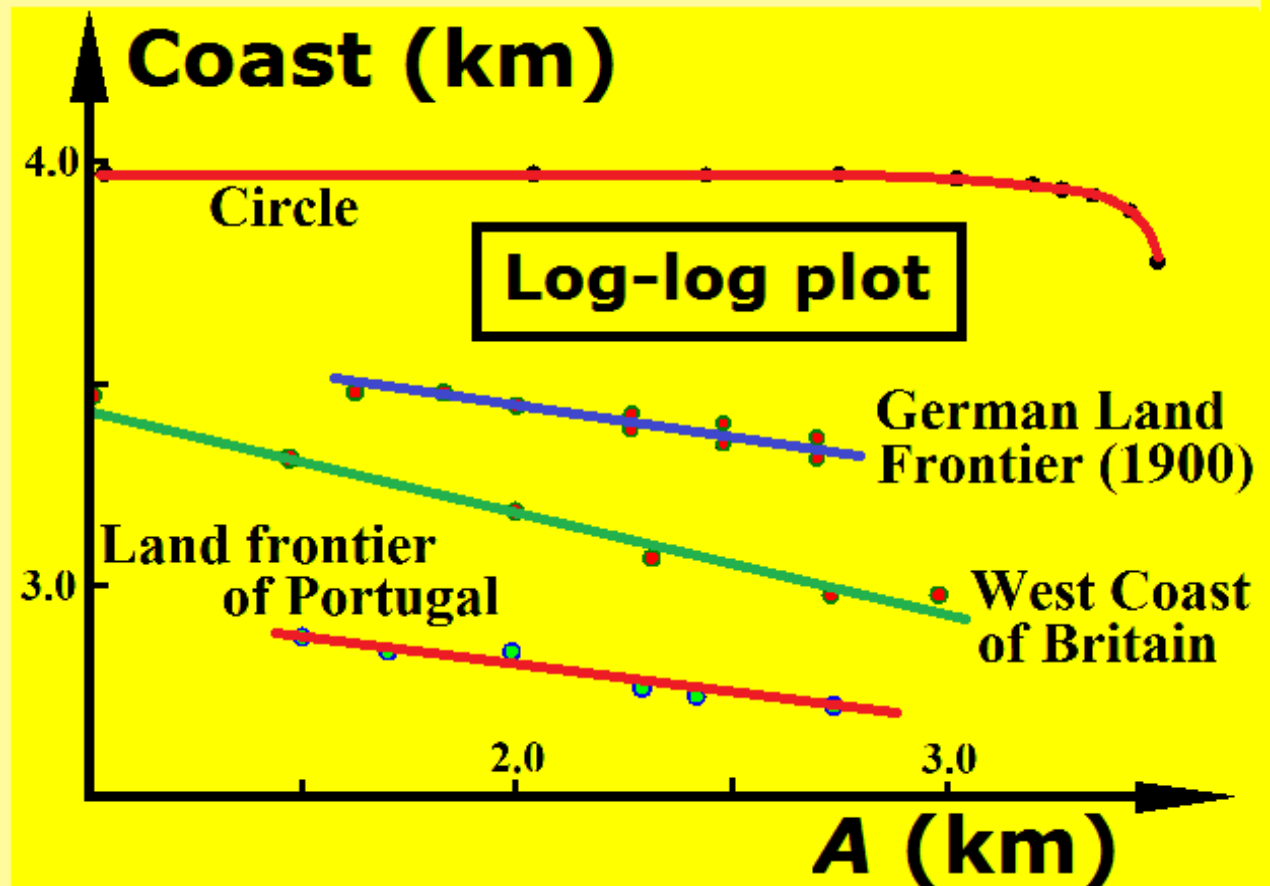
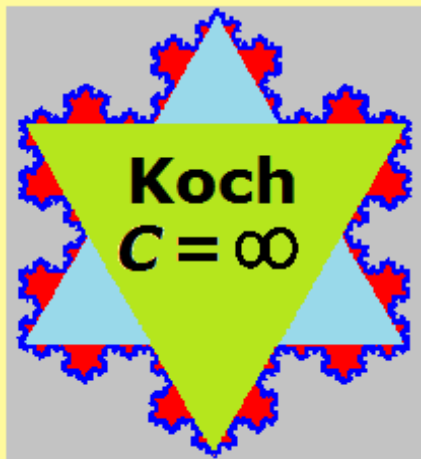
# Fractal Coastline of Britain

The more detailed a map, the greater is the length estimate



On the coast, a string will wind round stones and molecules

Coast is like a **fractal**. Its length tends to **infinity** as  $A$  goes to zero. This is not the case for a circle.



# Population Growth

Suppose the number of mayflies,  $x$ , increases by ratio  $a$  each year.

We have the 'discrete-time map':

$$\text{New } x = a x$$



If  $a=2$  and  $x=12$  (million, say) yearly numbers explode:

**12 ... 24 ... 48 ... 96 ...** We have exponential increase!

Applied to humans, this alarmed Thomas Malthus.

His *Principle of Population* (1798) influenced Darwin and his thoughts on natural selection.

Taking  $a=0.5$  (less than 1) we have:

**12 ... 6 ... 3 ...** decaying to zero.

We need a better model, including (say) competition and a **limited food supply**.



**Explosive bacterial growth in a dish**

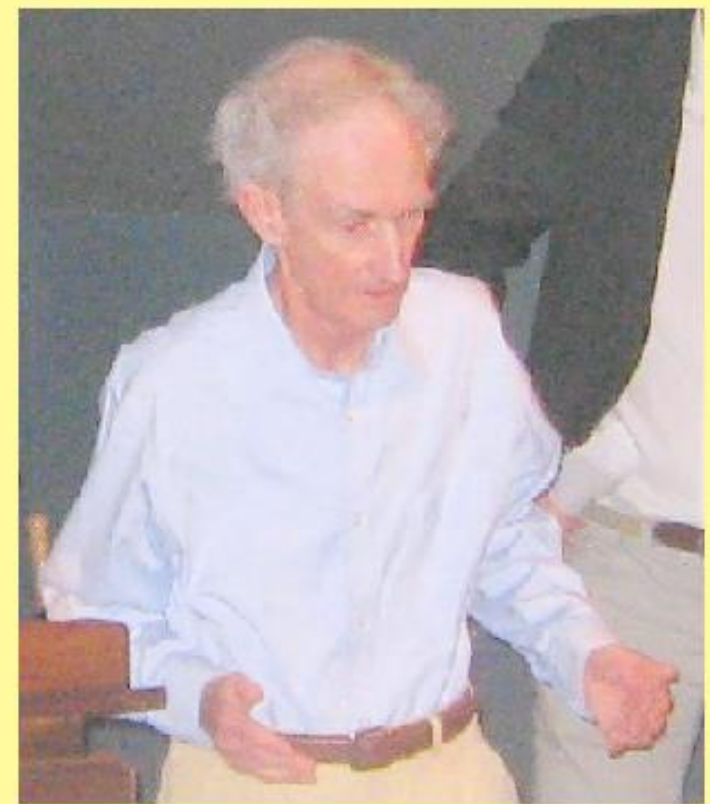


# Chaos in Logistic Map

$$\text{New } x = a x (1 - x)$$

$x$  is fraction of the maximum population

$$x_{n+1} = r x_n (1 - x_n)$$



An improved model of population growth.  $(1-x)$  admits the constraint of limited food.

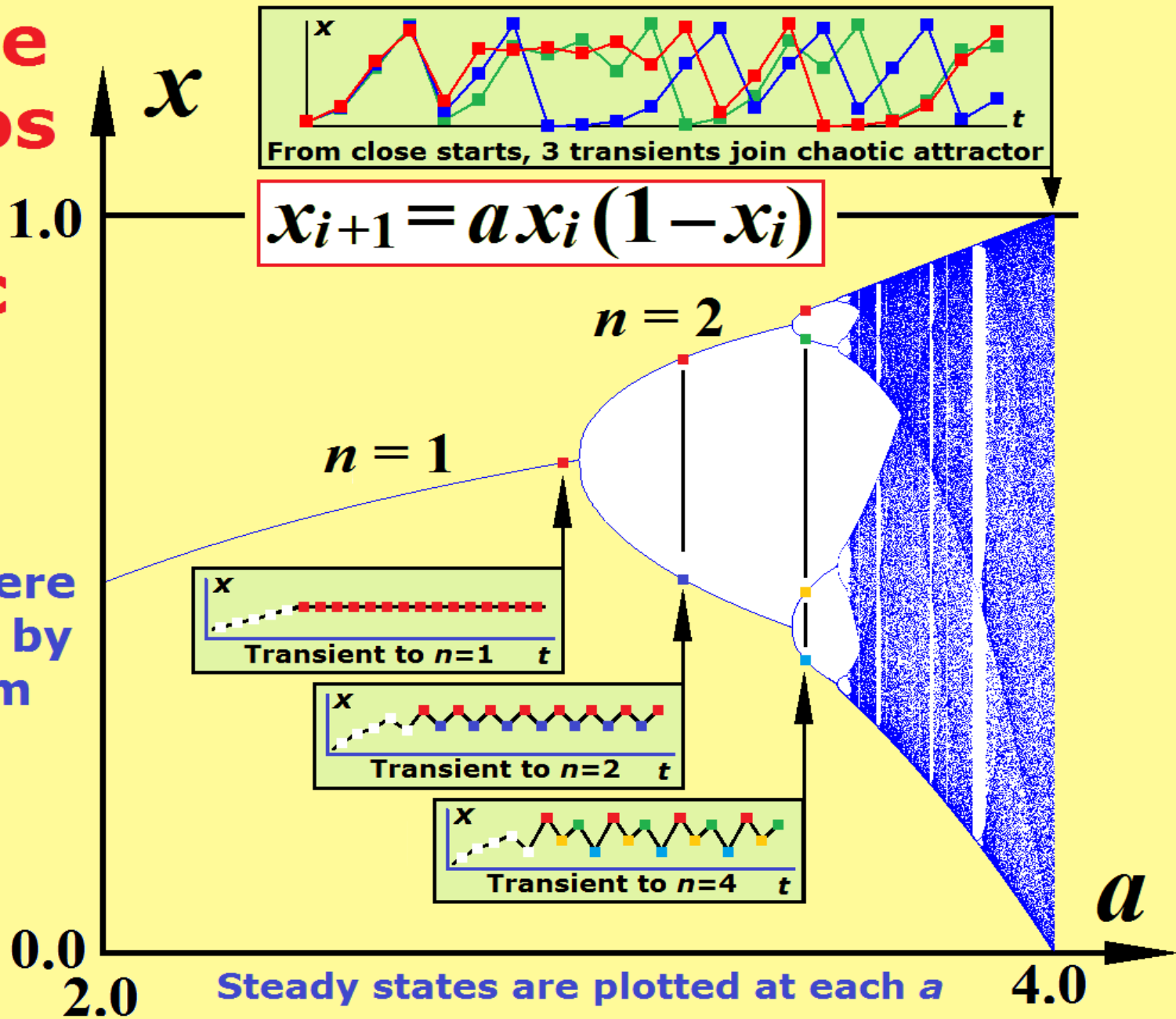
One-time President of the Royal Society, Lord Robert May (*Nature*, 1976) showed this gives sensitivity to initial conditions.

**THE BUTTERFLY EFFECT AGAIN !!!**



# Cascade to chaos in the logistic map

Universal features were discovered by Feigenbaum

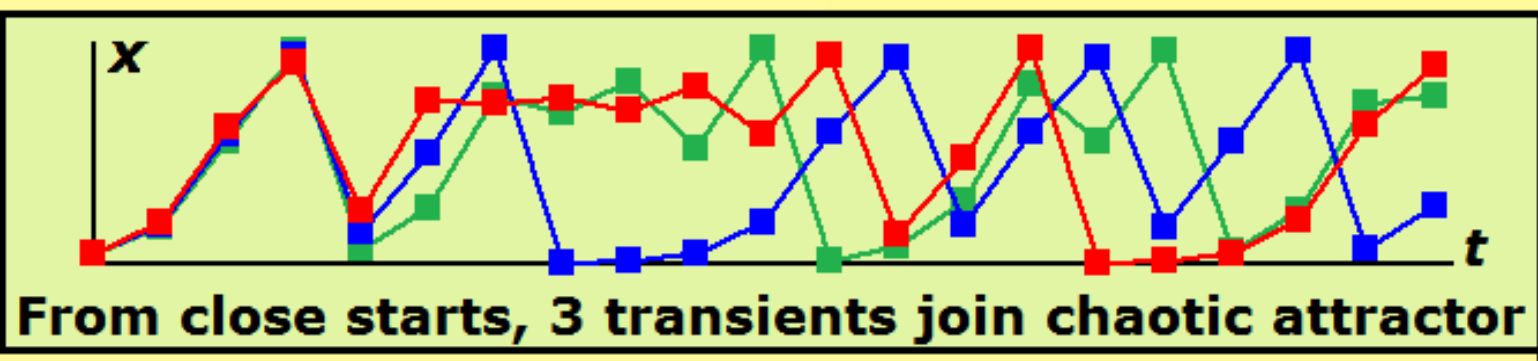
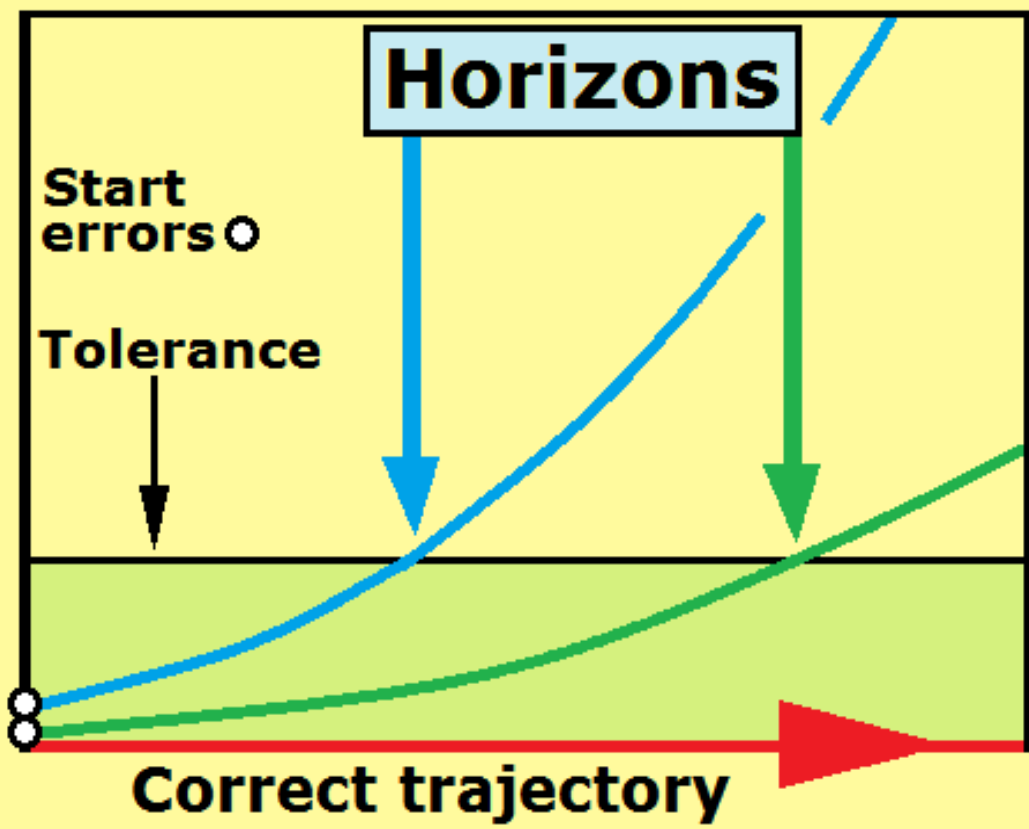


# Predictability Horizons with Exponential Growth

We consider the multiplier 4 of the logistic map chaos.

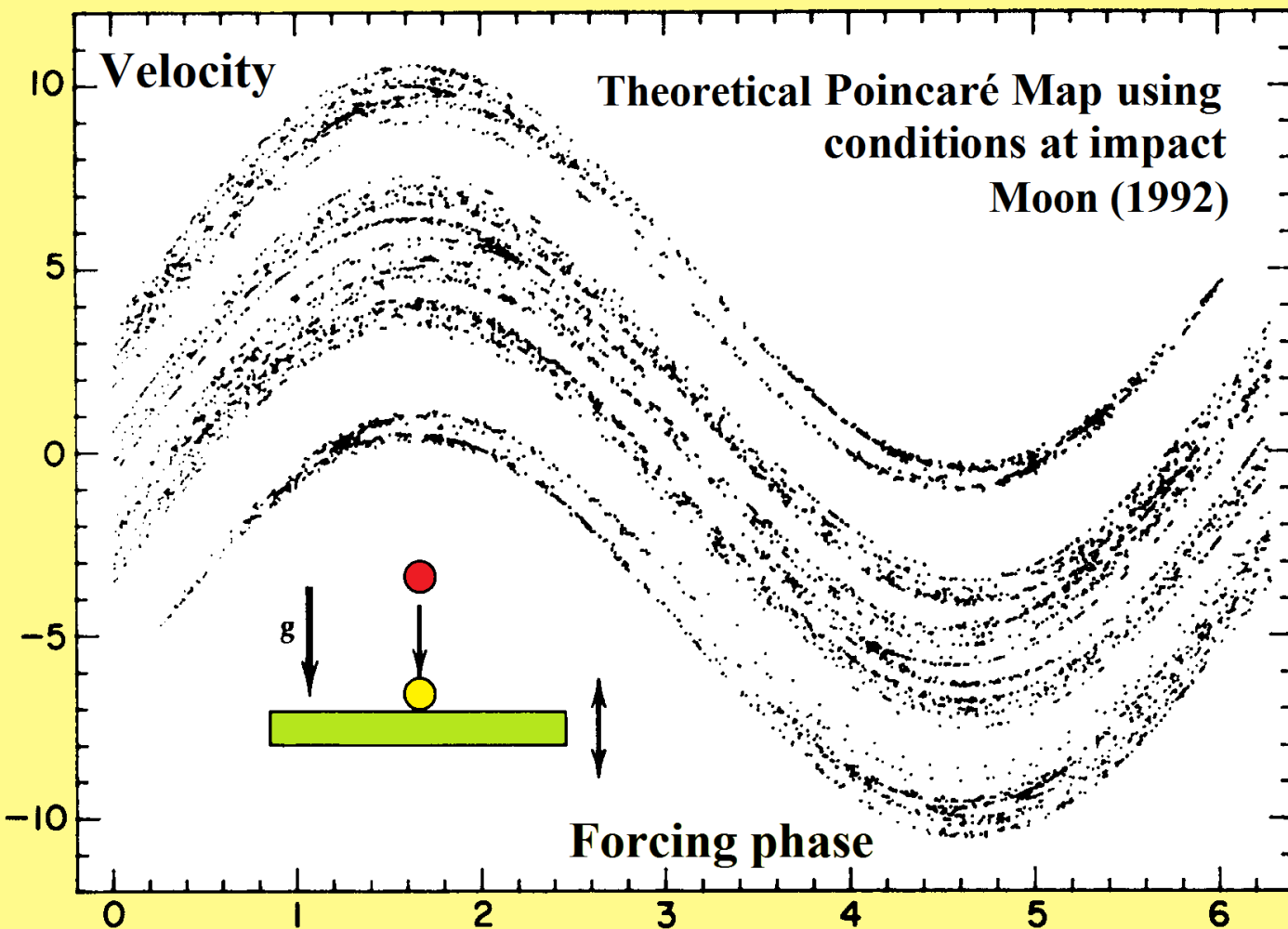
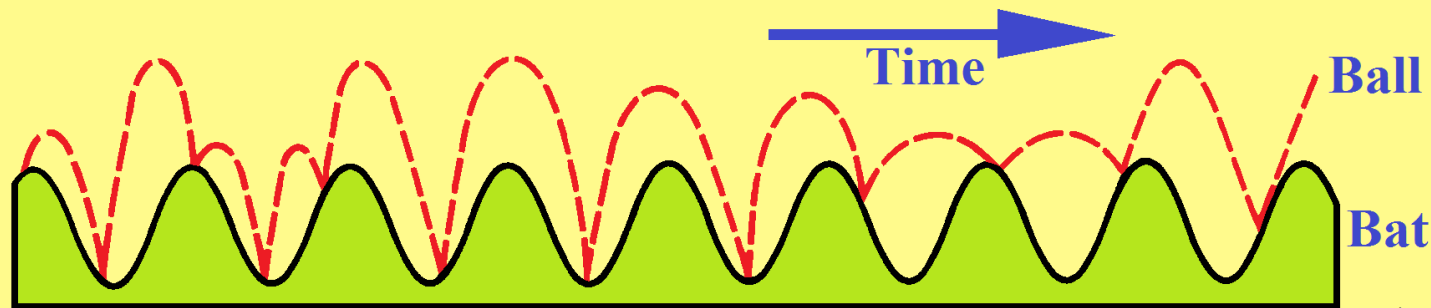
Then, to double the horizon, we need to quarter the error.

$$x_{i+1} = 4x_i(1 - x_i)$$

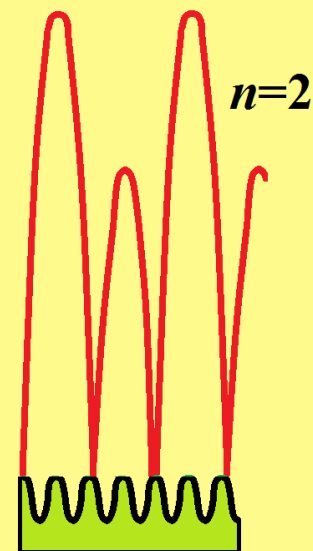
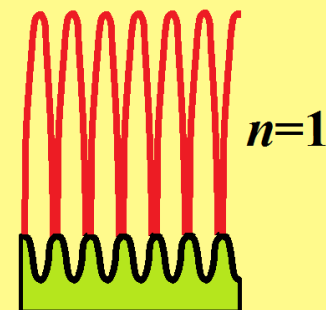


From close starts, 3 transients join chaotic attractor

# Chaotic bouncing on a periodically vibrating bat

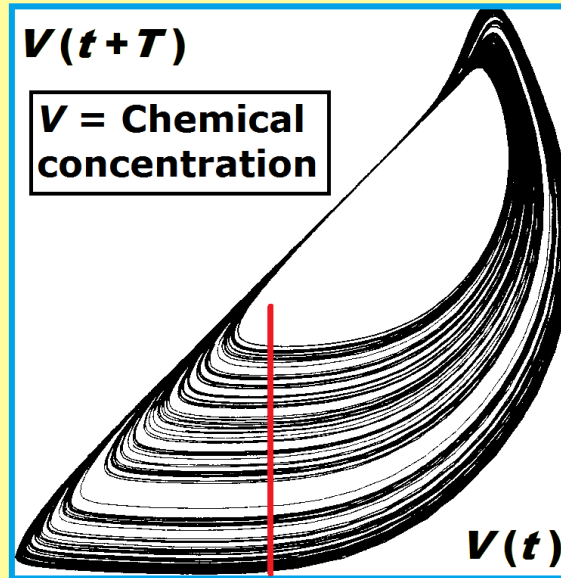
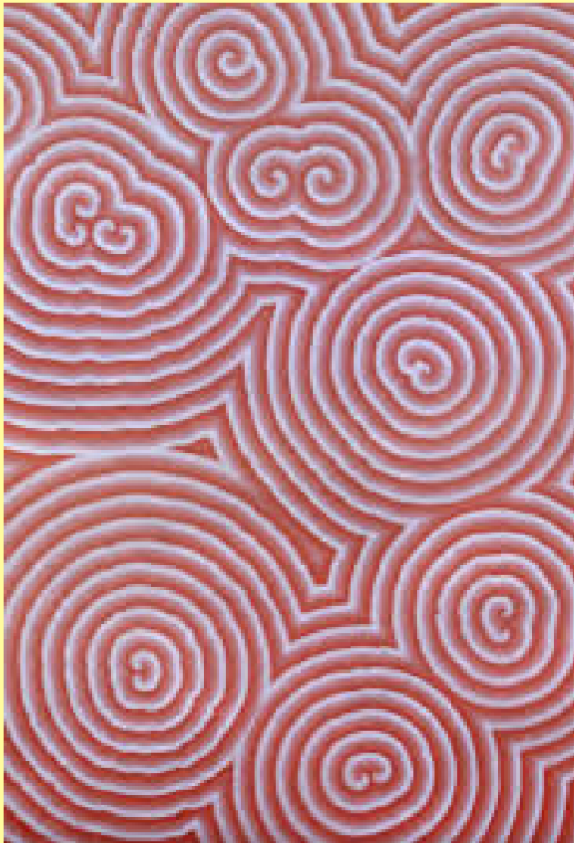


Alternative steady states ...

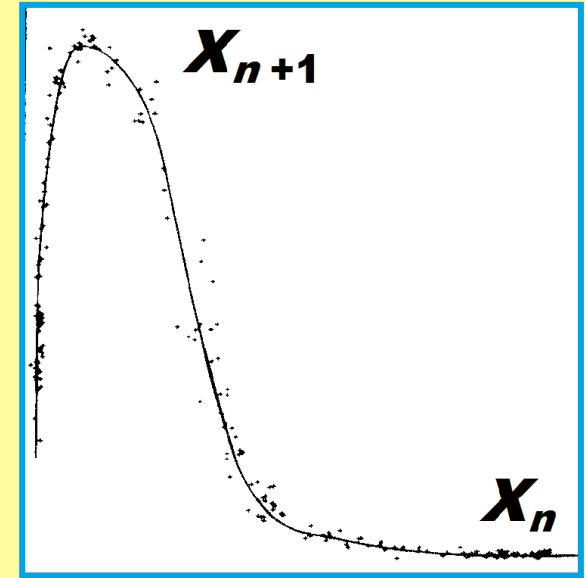


# Chaos in oscillating chemical reaction (Belousov-Zhabotinsky)

## Spontaneous pattern formation as conceived by Alan Turing



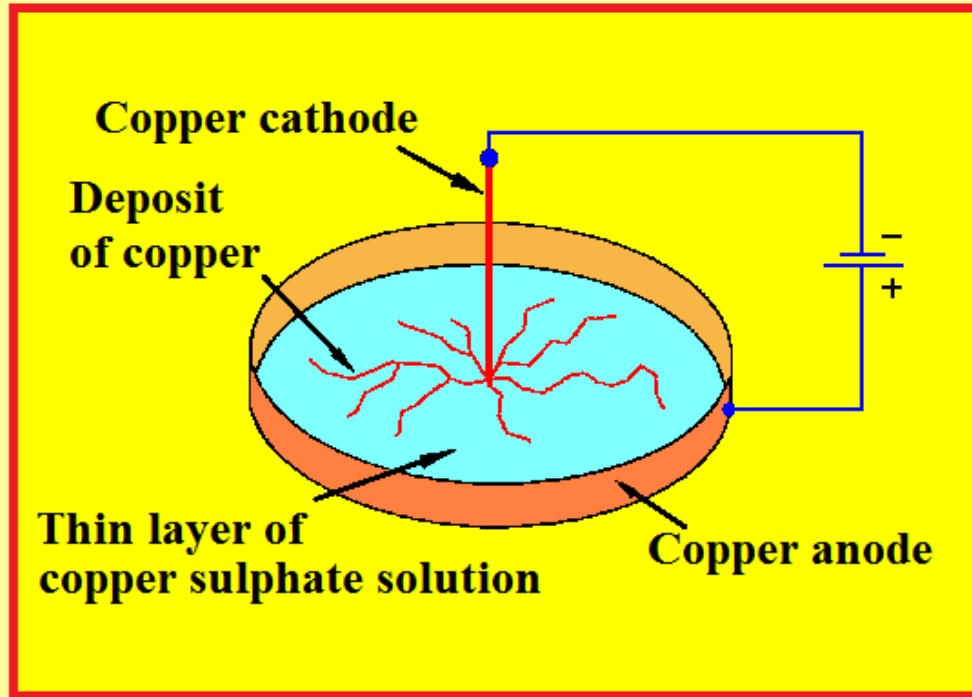
Chaos in a 2D projection of a 3D phase space using  $V(t)$ ,  $V(t+T)$ ,  $V(t+2T)$



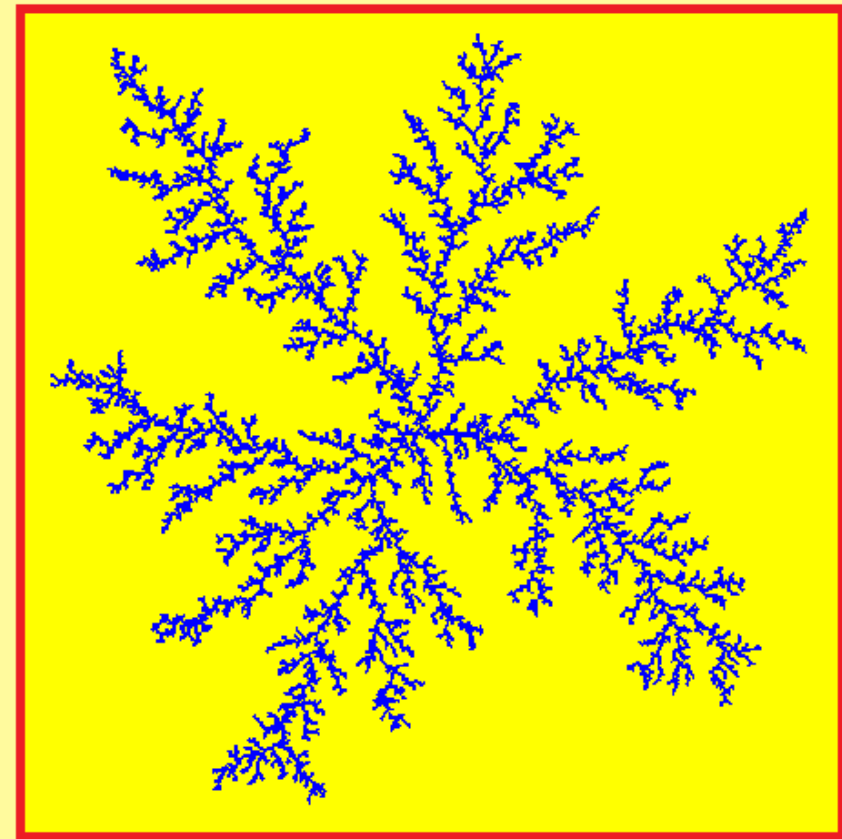
A 1D map from crossings of the red line in the left-hand figure



# Fractal growth of a copper deposit during electrolysis



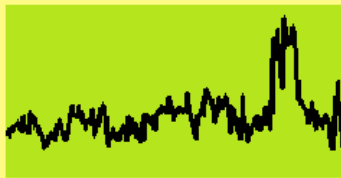
The experimental set-up in the laboratory



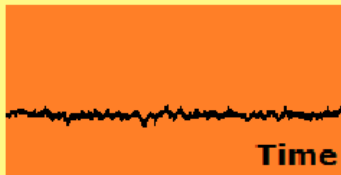
A theoretical prediction using 'diffusion-limited aggregation' modelling

## Chaotic Heart-Beat is Best

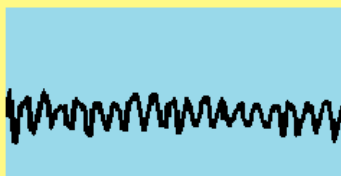
Plots of heart-beat **rate** over a 15 min. interval of three real hospital patients



**Healthy**  
**Chaotic wave**



**Unhealthy**  
**Nearly constant**



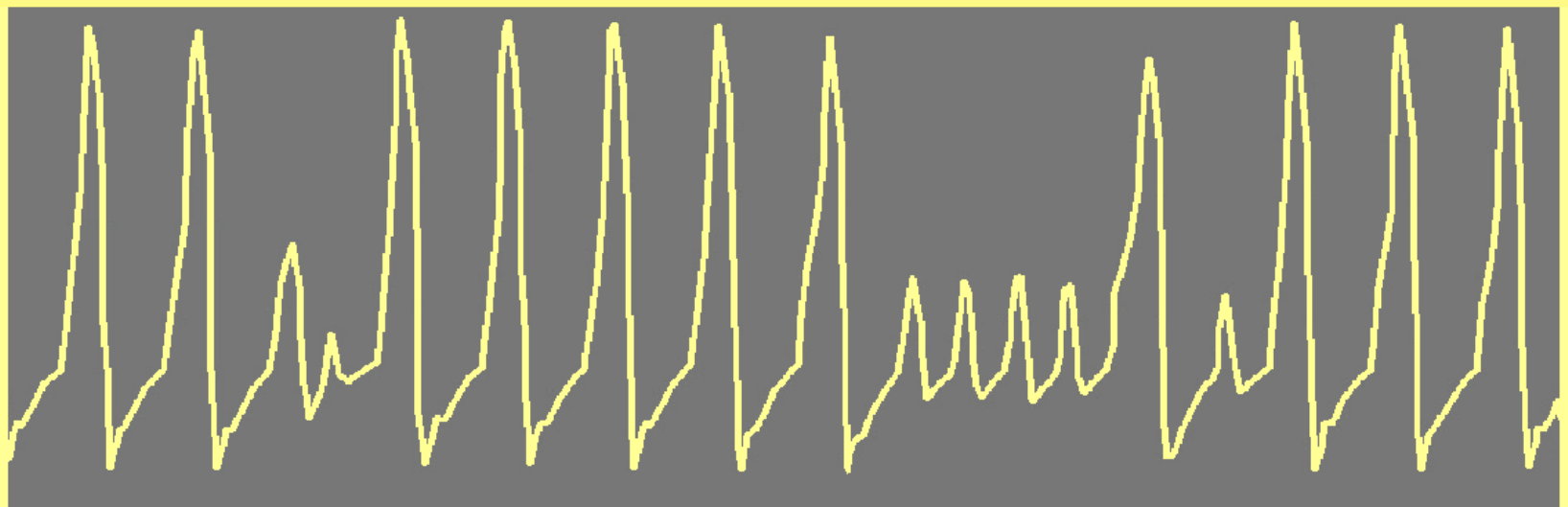
**Unhealthy**  
**Nearly periodic**

## Chaos is Good for You

It is said that we work best in a chaotic state

So if your brain is in chaos, the lecture was a success!

## Chaotic firing of a periodically excited brain neuron



## CONCLUDING REMARKS

- Chaos is a 'random' output of a deterministic system
- With extreme sensitivity to initial conditions
- Technically unsolvable, and numerically tricky
- No long-term prediction, but 'order within chaos'

### WHY 300 YEARS FROM NEWTON TO CHAOS?

- (1) There were no computers or video displays
- (2) Researchers were looking for order
- (3) Random results were thought wrong: into the waste bin

## FURTHER INFORMATION

Movies & Simulation apps (and many more) are on U3AC Website: under Tutors, Handouts, SCE 25

SCE 25 'Chaos & Fractals' will be given again next year

My homepage: <http://www.ucl.ac.uk/~ucess21/>