

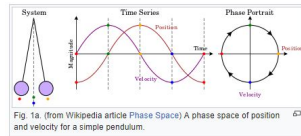
Lecture 4

Chaos



Chaos and the butterfly effect.

Credit: University of Michigan



Phase-space (position-velocity) diagram of a pendulum. Credit: Wikipedia

Lecture 3: Harmonic motion The non-linear pendulum

- ▶ **Non-linear pendulum** without dissipation or driving force

$$\ddot{\theta} = -\frac{g}{l}\sin\theta$$

non-linear: do **not** make the small angle approximation, $\sin \theta \approx \theta$

- ▶ No dissipation, no driving : **energy conservation**

and hence amplitude is constant as well

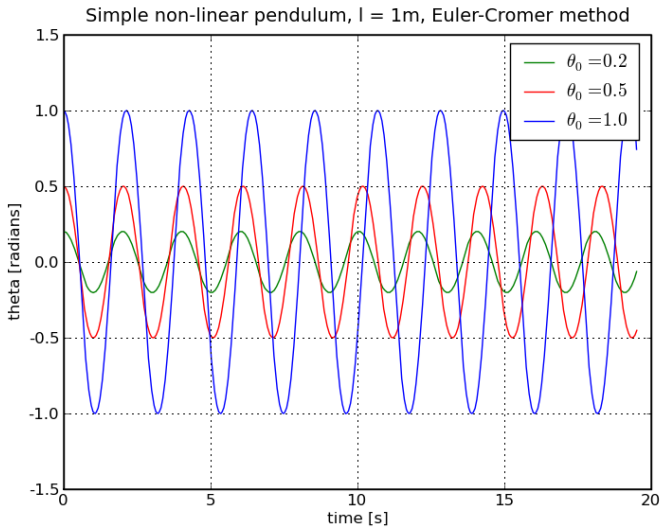
- ▶ Motion is periodic, but **not simple harmonic**

meaning: is **not** described by linear combination of $\sin(\Omega t)$ and $\cos(\Omega t)$

- ▶ **Frequency depends on amplitude**

unlike the case of simple harmonic oscillation, for which frequency $\Omega = \sqrt{\frac{g}{l}}$, is independent of θ_0 and ω_0

Simple non-linear pendulum



Driven, non-linear pendulum, with dissipation

- ▶ Add **driving force** and **dissipation**

$$\ddot{\theta} = -\frac{g}{l} \sin \theta + F_D \sin(\Omega_D t) - q\dot{\theta}$$

- ▶ Numerical solution: **Euler-Cromer** method
- ▶ θ coordinate has 'periodic boundary' conditions

meaning $\theta = \pi$ is same position of pendulum as $\theta = -\pi$, for example

may lead to 'jumps' in a plot of $\theta(t)$ vs time t

- ▶ When $F_D = 0$ but $q > 0$: amplitude decreases with time
- ▶ When $F_D > 0$: Different regimes:

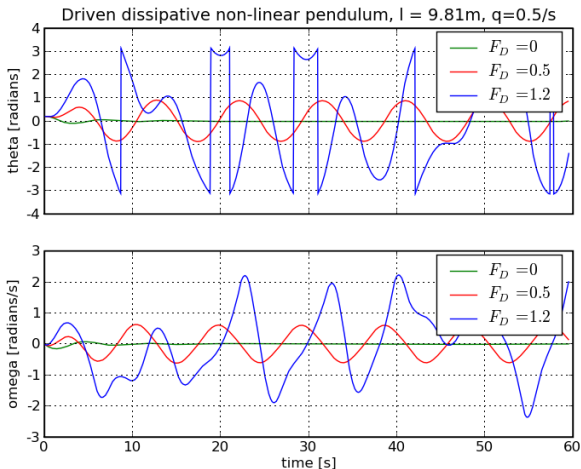
- ▶ pendulum in resonance with driving force

frequency is Ω_D , amplitude may increase

- ▶ $\theta(t)$ plot may appear **chaotic**

subject of this lecture

Driven, non-linear pendulum, with dissipation



damped oscillation, driven: $\Omega = \Omega_d$, no apparent periodicity

$\theta \rightarrow -\pi \rightarrow \pi$: pendulum rotates rather than oscillates

Driven, non-linear pendulum, with dissipation

- ▶ $\theta(t)$ for $F_D = 0.5$ is periodic but $F_D = 1.2$ is chaotic

no apparent periodicity, even at much later times: we call this **chaos**

- ▶ In what sense is this 'chaotic' ?
 - ▶ $\theta(t)$ appears to be 'unpredictable' no obvious pattern emerges
 - ▶ Yet solution is determined uniquely by the DE and its initial condition

- ▶ Example of **deterministic chaos** seems like a contradiction in terms

Small differences in initial conditions get amplified

$$|\theta_1(t=0) - \theta_2(t=0)| < \epsilon \rightarrow |\theta_1(t) - \theta_2(t)| \gg \epsilon$$

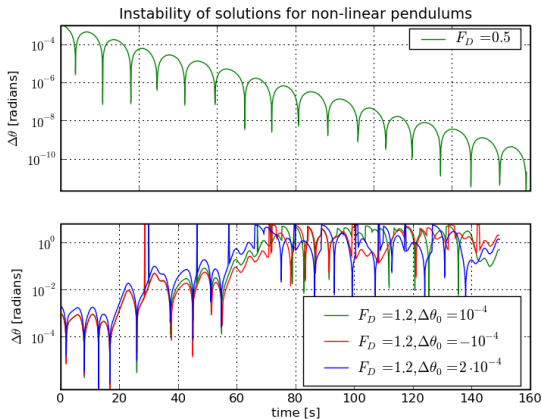
Generic outcome of non-linear DEs.

Arguably this also implies we cannot really obtain the numerical answer, since small errors build-up catastrophically

- ▶ More careful analysis subject of this lecture.

Chaos: dependence on initial conditions

- Compare evolution for small change in initial value $\theta_0 = 0.2 \pm \Delta\theta_0$



$F_D = 0.5$: small differences in ICs stay small in fact become smaller

$F_D = 1.2$: small differences in ICs amplify rapidly saturate at $\Delta\theta = \pi$ - no

Chaos: dependence on initial conditions

Lyapunov exponents

- ▶ Vary start condition (initial displacement $\theta_0 = 0.2$)
- ▶ Compute evolution of two identical pendulums, differing by $\Delta\theta_0 = \mathcal{O}(0.0001)$
- ▶ Plot difference $\Delta\theta = |\theta^{(1)} - \theta^{(2)}|$ as function of time.
- ▶ Findings:
 - ▶ For $F_D = 0.5$ dampening dominates and $|\Delta\theta|$ decreases.
 - ▶ For $F_D = 1.2$ $|\Delta\theta|$ increases (up to $\max=\pi$)

In both cases for t small: $|\Delta\theta| \sim e^{\lambda t}$ $\lambda < 0$ not chaotic, $\lambda > 0$: chaotic

- ▶ λ is called **Lyapunov exponent**

Simple test: $\lambda > 0 \implies$ chaotic, $\lambda < 0 \implies$ not chaotic

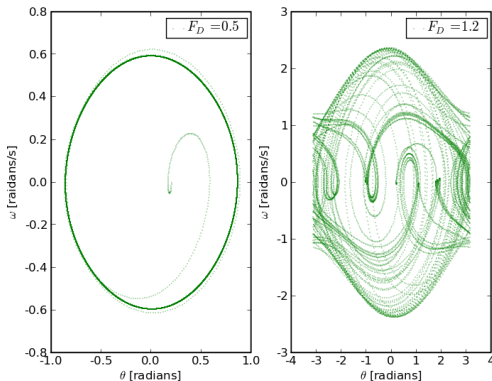
- ▶ Definition of **deterministic chaos**:

System shows deterministic chaos, if its evolution depends sensitively on the initial conditions

Visualising chaos: Phase space

phase space is position-velocity space. For pendulum: $(\theta, \omega = \dot{\theta})$ space

- Plot trajectories in θ - ω space.



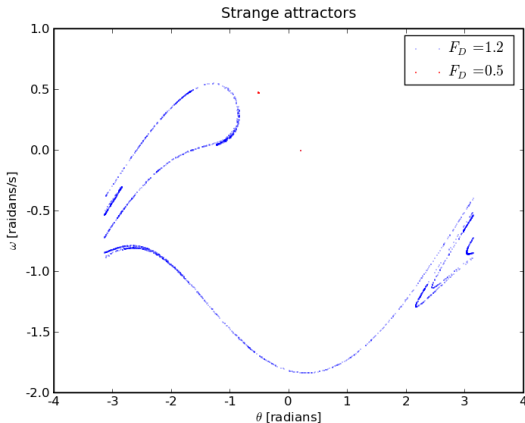
Non-chaotic case (left) looks strikingly different from chaotic case (right). Yet there is still some structure in the right panel. Question: how would a periodic pendulum look like in this plot?

Note: curve is composed of many dots, since it is integrated numerically

Visualising chaos: Phase space

- ▶ Small driving force left panel
 - ▶ Transient time at beginning: eigen-frequency decays
different frequency corresponds to different ω at a given θ
 - ▶ pendulum quickly settles into a regular orbit;
 - ▶ shape of $\omega(\theta)$ curve is independent of initial conditions
(in agreement with $\lambda < 0$)
- ▶ Large driving force: right panel
 - ▶ Expectation of no structure in this panel is **not true!**
Notice that there is no maximum θ : pendulum goes all the way around
 - ▶ Surprise: recognizable orbits, even though chaotic
but a given orbit is traversed only a few times
 - ▶ Examine phase space by plotting its **Poincaré section**
Plot ω vs θ but only when $\Omega t = 2n\pi$, with $n \in \mathbb{N}$
meaning: plot position in phase space *when the driving term is zero but increasing*

Chaos: Poincaré section



value of $\omega(\theta)$ when driving force is zero: Poincaré section

non-chaotic: just two points (shown as red dots)

chaotic: a curve called **strange attractor**

Chaos: A section on Poincaré



Henri Poincaré.

Credit: [Wikipedia](#)

French mathematician, 1854-1912. Worked on many things, including the three-body problem.

Chaos: Strange attractors

- ▶ Poincaré section is very different for chaotic versus non-chaotic motion
 - ▶ **non-chaotic: just a few points**
original motion at eigen frequency, the driven motion with $\Omega = \Omega_d$
 - ▶ **chaotic: a fuzzy surface**
 - ▶ 'Fuzziness' is **not** due to numerics property of the system
 - ▶ **Shape** of surface is largely **independent** of **initial conditions**
important: implies that the Poincaré section is a good way to examine deterministic chaos
 - ▶ A **fractal structure** (fractals discussed again in lecture 7)

Transition to chaos: Period doubling

- ▶ What happens to solution when $F_D = 0.5 \rightarrow 1.2$ non-chaotic \rightarrow chaotic?

- ▶ Answer: Not only one, but a chain of transitions: **Hard to study**

- ▶ Therefore: look for $F_D \in [1.3, 1.48]$ (fix $\Omega_D = 3\pi$).

nature of the transition is clearer for this choice of F_D

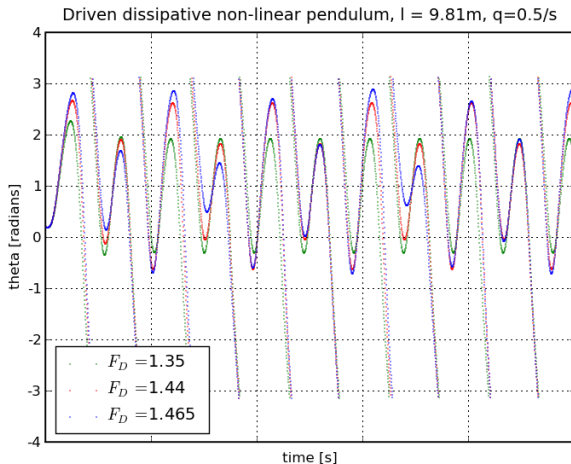
- ▶ In this region, the **period starts doubling!**
 \implies periodic motion with frequencies $\Omega_D/2, \Omega_D/4$ etc..

- ▶ Typically the **opposite** happens in a harmonic oscillator

when harmonics appear - oscillations with period $P/2, P/3$, etc. - e.g. in string instruments

- ▶ In the chaotic pendulum, periodicities with period $2P, 4P$ etc appear - **sub-harmonics** P is the period of the driving force

Transition to chaos: Period doubling pendulum

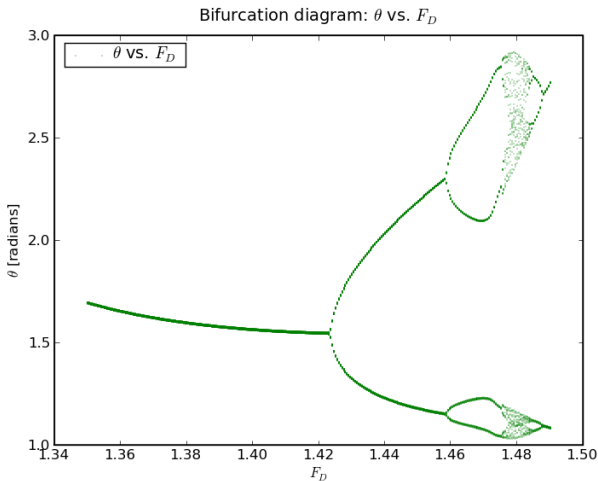


Amplitude of the second maximum is smaller - true (almost periodic) cycle has a period **twice** that of the driving force (for $F_D = 1.44$) - and $4P$ (for $F_D = 1.465$)

Transition to chaos: Bifurcations

way to visualise how period doubling leads to chaos

- Plot θ when $\Omega_D t = 2\pi n$ with $n \in N$ i.e. at given phase in driving cycle



Interpreting the bifurcation diagram

- ▶ At low F_D left side of diagram

At a given phase of the driving force, pendulum is at a single value of θ

- ▶ At $F_D \approx 1.43$: First period doubling

two possible values for θ at a given phase of driving, small or large amplitude oscillation

- ▶ At $F_D \approx 1.46$: Second period doubling

four possible values for θ at a given phase of driving - 4 different possible amplitudes

- ▶ At larger F_D - more and more period doublings appear

- ▶ Introduce $F_n = F_D$ for n th period doubling and

$$\delta_n = \frac{F_n - F_{n-1}}{F_{n+1} - F_n}.$$

In limit of $n \rightarrow \infty$, $\delta_n \rightarrow \delta_\infty \approx 4.669$

- ▶ **Universal feature:** δ_∞ seemingly the same for all systems

for which where period doubling leads to chaos, see Feigenbaum's original [1987 paper](#)

Summary

- ▶ Concept of **deterministic chaos**

for example, non-linear, damped, driven pendulum

- ▶ Ways to quantify/describe chaos:

- ▶ Lyapunov exponents exponential divergence of solutions with nearly ICs

- ▶ Phase space diagrams and strange attractors

way to visualise behaviour

- ▶ Period doubling leading to chaos \implies bifurcations

way to visualize period doubling

- ▶ Clearly very hard to do something like this analytically!
- ▶ Unexpected behaviour of 'simple' non-linear equations

hot research topic when computers became readily available