

# Predictability and Interactive Visualization

Ramses van Zon

SciNet HPC Consortium

12 February 2015

# Introduction

In previous session, we have talk about

- Computing for Modeling
- Analyzing Data to fit a model
- Using randomness
- Errors
- Lots of Python
- Using Public Data: Twitter API, Geocode, Exoplanets

Today, we'll focus on computation per se: when or why do we need it, and what are the limits of computability?

# When must we compute?

Or more precisely, when must we calculate numbers using a computer?

- Sometimes just handy:

E.g. what's the total after tax of a \$45 item?

By hand:

$$\begin{array}{r} 113 \\ \times 45 \\ \hline 565 \\ + 4520 \\ \hline 5085 \end{array}$$

Using a calculator:  $\$45 \times 1.13 = \$50.85$

Still, the latter isn't really what we think of as 'computing'.

- Sometimes not a straightforward computation.
- Sometimes just a lot: 'Big Data'
- Sometimes complex.

# Example that requires computation

- Okay, so a parachuter jump out of a plane 1 km above the ground.
- Let's say he's eager, draws the cord right away, so the drag coefficient is the same all the way down.
- Using a bit of math and physics, the height as a function of time is found to be given by

$$h(t) = h_0 - g s t + g s^2 (1 - e^{-t/s})$$

( $g=9.8$ ,  $s$ =characteristic time to reach terminal velocity  $\approx 1$  sec)

- How long does it take to reach the ground?

$$0 = h_0 - g s t + g s^2 (1 - e^{-t/s})$$

Even with parameters given, we can't solve this exactly. Must do so numerically (or try many, many times).

# Counter example

- We ignore the drag, then

$$h(t) = h_0 - \frac{1}{2}gt^2$$

- This, we can solve, since it's just a quadratic equation.
- Also at the end, we'd punch in numbers to compute a square root, but, again, this isn't really computing.

# Counter-counter example

- Let's replace the parachuter with a ball (for his sake).
- Once the ball has hit the ground (at the time we just computed), it bounces up at some fraction of the incoming velocity.
- What's the next collision, and the next, and the next, ...
- Definitely do not want to do this by hand: automate = compute.

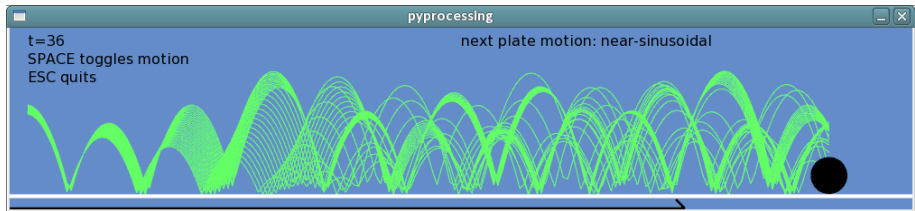
This example is a 'dynamical system'. Such models can be used for predictions. E.g. in this case: what is the maximum height in the 20th bounce?

# Predictability

- Will introduce a model of a ball bouncing on a vibrating plate
- Use an interactive, visual implementation to explore how predictable this is.
- Since there are several bounces, this definitely requires computation.
- To investigate predictability, will use nearby starting conditions.
- Experimental realization: <http://arxiv.org/abs/1405.3482>

# Predictability

- Will introduce a model of a ball bouncing on a vibrating plate
- Use an interactive, visual implementation to explore how predictable this is.
- Since there are several bounces, this definitely requires computation.
- To investigate predictability, will use nearby starting conditions.
- Experimental realization: <http://arxiv.org/abs/1405.3482>





# How to get this Python App

Python Script for Interactive Ball on Vibrating Plate

Downloadable from: <http://support.scinet.utoronto.ca/bounce.py>

Requires modules pyglet and pyprocessing

```
pip install pyglet
pip install pyprocessing
```

On Window 7, I've had to do the following:

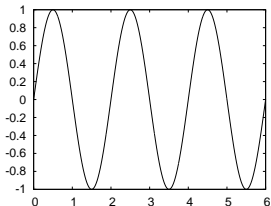
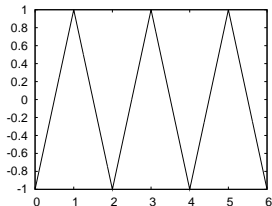
```
pip install pyglet
pip install --upgrade http://pyglet.googlecode.com/archive/tip.zip
DOWNLOAD AND RUN
https://pyprocessing.googlecode.com/files/
pyprocessing-0.1.3.22.linux-x86_64.exe
```

# Play with it

What do we see?

# Model

- The bouncing ball motion:  $\mathbf{h(t) = at^2 + bt + c}$   
 $\mathbf{a = -g/2}$  always, but  $\mathbf{b}$  and  $\mathbf{c}$  depend vary from bounce to bounce
- The floor: moves up and down either as a sawtooth or near-sinusoidal



## Sawtooth

## Near-sinusoidal

- Near-sinusoidal actually means piecewise quadratic, so also of the form:  $\mathbf{z(t) = At^2 + Bt + C}$
- computation of the bounce time: solve a quadratic equation.

# Some theory

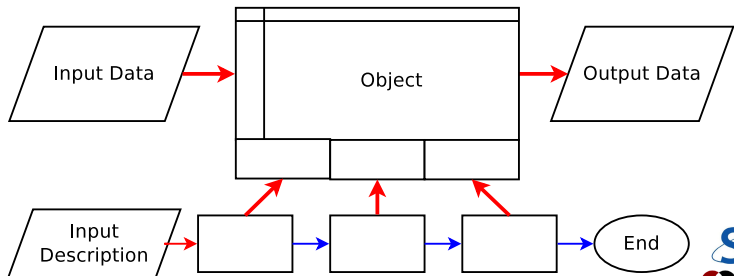
- Each bounce can be computed, but as we see from the collection of green trajectories, nearby situations diverge.
- Sawtooth and sinusoidal behave quite differently.
  - ▶ For sawtooth, clumps of trajectories stay together, but there are a couple different clumps.
  - ▶ For sinusoidal, at first the trajectories smoothly diverge, before going all over the place.
- In dynamical systems parlance, the former is called 'non-chaotic', the latter is called 'chaotic'
- Other prime example of a chaotic system: The Weather.

# Object Oriented Programming

- This type of simulation lends itself to so-called object programming.
- In Python (and most other languages), objects are collections of variables together with functions that act on this data
- Object can be contain other objects.
- The bounce.py is a fairly elaborate example: there are objects for the various balls and a floor object.

# Objects

- Functional programming: data and the functions that can act on that data, are defined separately.
- Object oriented programming, the functions belong to the data structure.
- Better consistency, modularity, and reusability of your code.
- Implementation in python using the `class` construct.



# Classes in Python

- Classes are used to group together data and code, accessing them with the . operator.
- One could also do this with modules. But there can be only one instance of a module, and many instances of a class.
- Inheritance: multiple base classes, derived class can override any methods of its base class or classes, and method can call a base class method with the same name.
- Objects can contain arbitrary amounts and kinds of data.
- As everything in Python, classes are dynamic: created at runtime, and can be modified further after creation.

# Classes as collections of variables

```
class Apple:
    type = "Delicious"
    colour = "Green"
apple1 = Apple()
apple2 = Apple()
Apple.colour = "Golden"
print apple1.colour
```

Outputs: Golden

apple1 and apple2 *share* colour  
(class variable): tricky.

```
class Apple: pass
apple1 = Apple()
apple1.type = "Delicious"
apple1.colour = "Green"
apple2 = Apple()
apple2.type = "Delicious"
apple2.colour = "Golden"
print apple1.colour
```

Outputs: Green

This works, but now we have to  
assign each member.  
Anything more workable requires  
writing a constructor.



# Initializing objects with constructors

- Collection of variables
- Same def keyword to define methods.
- Constructor name is `__init__`

```
class Apple:  
    def __init__(self):  
        self.type="Delicious"  
        self.colour="Green"  
  
apple1 = Apple()  
apple2 = Apple()  
print apple1.colour
```

Outputs Green

# Class syntax in Python

- Methods take a first argument that is an instance of the class
- This argument is explicit `self` in definition but implicit in calls.
- In methods, refer to member fields as `self.field`.
- No separation interface/implementation

```
class Apple:
    def __init__(self):
        self.type="Delicious"
        self.colour="Green"
    def describe(self):
        print self.type,
            self.colour

apple1 = Apple()
apple2 = Apple()
print apple1.colour
[Green]

apple1.describe()
[Delicious Green]
```

# More special methods

- `__del__`  
A kind of destructor.
- `__str__`  
Converts object to a string for output. Used by `print`. Intended to be readable by users.
- `__repr__`  
Returns a string representation for the object. Used by `python` (e.g., if you just type the name of an object). Intended to be understandable by developers.
- `__enter__`  
Called when used in a 'with' construct (later)
- `__exit__`  
Called when a 'with' construct is done (later).

# Example: Particle

```
class Particle(object):
    def __init__(self,m,x0,v0):
        self.t = 0.0
        self.m = m
        self.x = x0
        self.v = v0
    def timeStep(self,dt):
        self.t += dt
        self.x += dt*self.v
    def __str__(self):
        return str(self.t)+" "+str(self.x)+" "+str(self.v)
p = Particle(2.0,0.0,-1.0)
while p.t <= 10.0:
    p.timeStep(0.1)
    print p
```

# PyProcessing

- The interactive visualization used here is called pyprocessing.
- This is a python version of 'processing', an interactive visualization based off of Java.
- Other ports exist as well, such as in javascript or even c (partially).

From <https://processing.org/>:

- Free to download and open source
- Interactive programs with 2D, 3D or PDF output
- OpenGL integration for accelerated 3D
- For GNU/Linux, Mac OS X, and Windows
- Over 100 libraries extend the core software
- Well documented, with many books available

# PyProcessing

- Fairly simple syntax to do drawing
- It's set up for interactive programming
- A 'draw' function is called repeatedly
- If mouse is moved, key is clicked, etc, a corresponding function can capture that event.
- Can be a nicer intro to programming than full-blown Java.
- Btw, it's on the Kahn Academy too, which some high school teachers use already, I believe.