

## Lecture 6

①

We will discuss visual package briefly.

To install on Mac, go to [vpython.org](http://vpython.org)

Follow instructions to download Python-2.7.9 + then

VPython-Mac-Py 2.7-6.11

This installs an older version of Python that is compatible w/ vpython / visual

This can run alongside

Anaconda

Use Spyder for Python 3.4

+ VIDE for visual / python 2.7

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Bring up 0-sphere.py

simple program to plot a sphere

can change the size & position of  
sphere w/

sphere (radius = 0.5, pos = [1, 0, -0.2, 0.5])

can draw many spheres &  
change their colors.

Bring up 1-spheres.py

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You can change properties of a sphere  
after creating it. Use

```
s = sphere()
```

creates a variable for the sphere.  
(really an object)

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can change properties w/

$s.radius = 0.5$

$s.color = color.blue$

can use these to make animations

can also draw other objects besides  
spheres, including

box

cone

cylinder

pyramid

arrow

can change properties of the screen  
window w/ display function

many options for this function

like foreground color, location of  
"camera", "camera angle",

can make a variable  $d = display()$  to  
change properties later ...

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can make animations,  
which might be helpful for  
visualizing physical systems  
could do, e.g.,

from visual import sphere

s = sphere (pos = [0, 0, 0])

s.pos = [1, 4, 3]

however, computer will be so fast  
that you won't notice the change  
to slow down, use the  
rate function

rate(x) tells Python to wait

x seconds since previous

time rate was called.

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Bring up 3-revolve.py

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Move on to chap. 5

### Integration

Might not be possible to evaluate integrals by hand.

We can instead evaluate w/ computer to get approximate results.

Simplest rule is trapezoidal rule

Show 4-trapezoidal.png

Given function  $f(x)$  &

suppose we want integral from  $x=a$  to  $x=b$

$$I(a,b) = \int_a^b f(x) dx$$

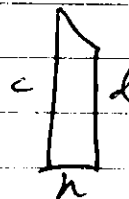
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divide area under curve into trapezoids

Divide  $[a, b]$  into  $N$  slices

so each slice has width  $h = (b-a)/N$

recall area of trapezoid is


$$= \frac{c+d}{2} h$$

RHS of  $k$ th slice occurs @  $a+kh$

+ LHS @  $a+kh-h = a+(k-1)h$

⇒ area of trapezoid for this slice is

$$A_k = \frac{1}{2} h [f(a+(k-1)h) + f(a+kh)]$$

So approximation for integral is

$$\begin{aligned} I(a, b) &\approx \sum_{k=1}^N A_k \\ &= \frac{1}{2} h \sum_{k=1}^N [f(a+(k-1)h) + f(a+kh)] \end{aligned}$$

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$$= h \left[ \frac{1}{2} f(a) + f(a+h) + f(a+2h) + \dots + f(a+(N-1)h) + \frac{1}{2} f(b) \right]$$

$$= h \left[ \frac{1}{2} f(a) + \frac{1}{2} f(b) + \sum_{k=1}^{N-1} f(a+kh) \right]$$

extended trapezoidal rule

Example: calculate integral of

$$x^4 - 2x + 1 \quad \text{from } x=0 \text{ to } x=2$$

using this rule.

By hand, it works out to

$$\begin{aligned} \int_0^2 (x^4 - 2x + 1) dx &= \left. \frac{x^5}{5} - x^2 + x \right|_0^2 \\ &= \frac{32}{5} - 4 + 2 = \frac{22}{5} = 4.4 \end{aligned}$$

Bring up 4-trapezoidal.py

try out higher levels of accuracy

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Alternative to trapezoidal rule  
which can be more accurate  
is Simpson's rule.

Trapezoidal rule uses straight-line  
segments for approximation, but we  
can instead use curves.

Simpson's rule fits w/ quadratic  
curves

Show 5-simpson.png

We require 3 points to specify  
a quadratic (not just 2 as  
w/ a line)

so fit a quadratic to pairs of  
adjacent slices

Suppose integrand is  $f(x)$  of spacing is  $h$



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Suppose three points are @

$-h, 0, +h$

Fitting a quadratic

$Ax^2 + Bx + C$  through these  
points gives

$$f(-h) = Ah^2 - Bh + C$$

$$f(0) = C$$

$$f(h) = Ah^2 + Bh + C$$

Solving these equations for  $A, B, C$   
gives

$$A = \frac{1}{h^2} \left[ \frac{1}{2}f(-h) - f(0) + \frac{1}{2}f(h) \right]$$

$$B = \frac{1}{2h} [f(h) - f(-h)]$$

$C = f(0)$   $\downarrow$  area under curve  
from  $-h$  to  $h$  is approximated  
by area under quadratic

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$$\int_{-h}^h (Ax^2 + Bx + C) dx$$

$$= \frac{2}{3} Ah^3 + 2Ch$$

$$= \frac{1}{3} h [f(-h) + 4f(0) + f(h)]$$

This is the Simpson rule.

Approximates area under two adjacent slices.

Need an even # of slices for this to work

Approximate value of an integral over  $[a, b]$  is

$$\begin{aligned} I(a, b) \approx & \frac{1}{3} h [f(a) + 4f(a+h) + f(a+2h)] \\ & + \frac{1}{3} h [f(a+2h) + 4f(a+3h) + f(a+4h)] \\ & + \dots + \frac{1}{3} h [f(a+(n-2)h) + 4f(a+(n-1)h) \\ & + f(b)] \end{aligned}$$

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$$= \frac{1}{3} h [f(a) + 4f(a+h) + 2f(a+2h) + 4f(a+3h) + \dots + f(b)]$$

$$= \frac{1}{3} h [f(a) + f(b) + 4 \sum_{\substack{k \text{ odd} \\ 1, \dots, N-1}} f(a+kh) + 2 \sum_{\substack{k \text{ even} \\ 2, \dots, N-2}} f(a+kh)]$$

extended Simpson's rule

Bring up 5 - simpson.py

What is the error associated w/ trapezoidal rule?

Main source of error is not rounding error but error in approximating integral

(b/c we're calculating an approximation to integrand)

How big is the error?

We can quantify w/ some simple tricks

Recall trapezoidal rule gives

$$\int_a^b f(x) dx = I(a,b) \approx h \left[ \frac{1}{2} f(a) + \frac{1}{2} f(b) + \sum_{k=1}^{N-1} f(a+kh) \right]$$

Let  $x_k = a + kh$

Consider slice of integral between  $x_{k-1}$  &  $x_k$

Perform Taylor series expansion of  $f(x)$  about  $x_{k-1}$

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so that

$$f(x) = f(x_{k-1}) + (x - x_{k-1}) f'(x_{k-1}) + \frac{(x - x_{k-1})^2}{2} f''(x_{k-1}) + \dots$$

Integrate this from  $x_{k-1}$  to  $x_k$  to get

$$\int_{x_{k-1}}^{x_k} f(x) dx = f(x_{k-1}) \int_{x_{k-1}}^{x_k} dx + f'(x_{k-1}) \int_{x_{k-1}}^{x_k} (x - x_{k-1}) dx + \frac{1}{2} f''(x_{k-1}) \int_{x_{k-1}}^{x_k} (x - x_{k-1})^2 dx + \dots$$

Make substitution  $u = x - x_{k-1}$  so that

$$\int_{x_{k-1}}^{x_k} f(x) dx = f(x_{k-1}) \int_0^h du + f'(x_{k-1}) \int_0^h u du + \frac{1}{2} f''(x_{k-1}) \int_0^h u^2 du + \dots$$
$$= h f(x_{k-1}) + \frac{1}{2} h^2 f'(x_{k-1})$$

$$+ \frac{1}{6} h^3 f''(x_{k-1}) + \underbrace{O(h^4)}$$

higher order terms

Can also expand around  $x = x_k$   
 of integrate from  $x_{k-1}$  to  $x_k$

$$\int_{x_{k-1}}^{x_k} f(x) dx = h f(x_k) - \frac{1}{2} h^2 f'(x_k) + \frac{1}{6} h^3 f''(x_k) - o(h^4) \quad (**)$$

Take average of (\*) & (\*\*) to get

$$\int_{x_{k-1}}^{x_k} f(x) dx = \frac{1}{2} h [f(x_{k-1}) + f(x_k)] + \frac{1}{4} h^2 [f'(x_{k-1}) - f'(x_k)] + \frac{1}{12} h^3 [f''(x_{k-1}) + f''(x_k)] + o(h^4)$$

Now sum this over all slices to get

$$\begin{aligned} (***) \int_a^b f(x) dx &= \sum_{k=1}^N \int_{x_{k-1}}^{x_k} f(x) dx \\ &= \frac{1}{2} h \sum_{k=1}^N [f(x_{k-1}) + f(x_k)] + \frac{1}{4} h^2 [f'(a) - f'(b)] + \frac{1}{12} h^3 \sum_{k=1}^N [f''(x_{k-1}) + f''(x_k)] + o(h^4) \end{aligned}$$

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1st sum is trapezoidal rule

All other terms correspond to error in approximation

Second term is nice - many terms cancel and we are left w/ only first & last terms

observe that third term is trapezoidal rule approximation to  $f''(x)$  over interval from  $a$  to  $b$ .

So using same formula but substituting  $f(x) \rightarrow f''(x)$ , we find that

$$\int_a^b f''(x) dx = \frac{1}{2} h \sum_{k=1}^N [f''(x_{k-1}) + f''(x_k)] + o(h^2)$$

Multiply by  $\frac{1}{6} h^2$  & rearrange to find that

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$$\begin{aligned} & \frac{1}{12} h^3 \sum_{k=1}^N [f''(x_{k-1}) + f''(x_k)] \\ &= \frac{1}{6} h^2 \int_a^b f''(x) dx + o(h^4) \\ &= \frac{1}{6} h^2 [f'(b) - f'(a)] + o(h^4) \end{aligned}$$

Now substitute back into ~~(\*)~~ to get

$$\begin{aligned} \int_a^b f(x) dx &= \frac{1}{2} h \sum_{k=1}^N [f(x_{k-1}) + f(x_k)] \\ &+ \frac{1}{12} h^2 [f'(a) - f'(b)] + o(h^4) \end{aligned}$$

To leading order in  $h$ , we see that error from trap. rule is

$$\epsilon = \frac{1}{12} h^2 [f'(a) - f'(b)]$$

called the Euler-MacLaurin formula

$\Rightarrow$  trapezoidal rule is first-order integration rule, accurate up to terms proportional to  $h$  + leading-order approx. error is order  $\frac{1}{2}$



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1<sup>st</sup>-order rule is accurate to  $O(h)$   
+ has error  $O(h^2)$ .

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There is also a rounding error

recall that rounding error is

$Cx$  where  $x$  is value of  $f$   
+  $C$  is machine precision,  
which is  $C \approx 10^{-16}$

can make  $h$  smaller but then  
there is a limit to increasing  
accuracy due to rounding error.

decreases in  $h$  help only to the  
point at which approx. error +  
rounding error are equal, which is

$$\frac{1}{12} h^2 [f'(a) - f'(b)] = C \int_a^b f(x) dx$$

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Solve for  $h$  to get

$$h \approx \sqrt{\frac{12 \int_a^b f(x) dx}{f'(a) - f'(b)}} \quad C^{1/2}$$

set  $h = (b-a)/N$  to get

$$N \approx (b-a) \sqrt{\frac{f'(a) - f'(b)}{12 \int_a^b f(x) dx}} \quad C^{-1/2}$$

So, e.g., if all factors except

$C$  are around 1 then

$$N \approx 10^8$$

But this is a bit large,

it would be wiser to use

smaller  $N$  w/ more accurate

rule like Simpson rule.