

modelling workshop

Days 2+3: Introduction to numerical modelling

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General Learning Objectives

- ❑ How to use Python as a modelling tool
- ❑ How to describe physical processes mathematically:
 - ❑ Heat diffusion and advection
 - ❑ Fluid flow
- ❑ Mathematical concepts required to build numerical models:
 - ❑ Finite differences
 - ❑ Discretization
 - ❑ Time-stepping
 - ❑ Boundary conditions
 - ❑ Coupled equations
- ❑ How to construct basic numerical models in Python:
 - ❑ Heat advection-diffusion models
 - ❑ Mantle convection
- ❑ How to critically evaluate numerical models



General Setup

1. Tue AM Introduction; 0D, 1D; radioactive decay, diffusion
2. Tue PM Extension to 2D models
3. Wed AM Advection-diffusion equation
4. Wed PM Coupled equations: convection model



Today's aims:

- ❑ The basic steps and processes behind building a numerical model
- ❑ How **timestepping** works and be able to compare different timestepping techniques
- ❑ Using **resolution tests** to check your model against **analytical solutions**
- ❑ Modelling a radioactive decay system
- ❑ The diffusion process and its governing equation
- ❑ Numerical modelling of spatially varying processes
- ❑ How to apply finite difference techniques to model 1D time-dependent heat diffusion

A first example: Filling a bath tub

A very basic example: open tap & fill bath tub. What is amount of water in the tub through time?

- If we assume that it fills at a constant rate of 2.6 litres/sec,

we get a basic equation (**governing equation**) of:

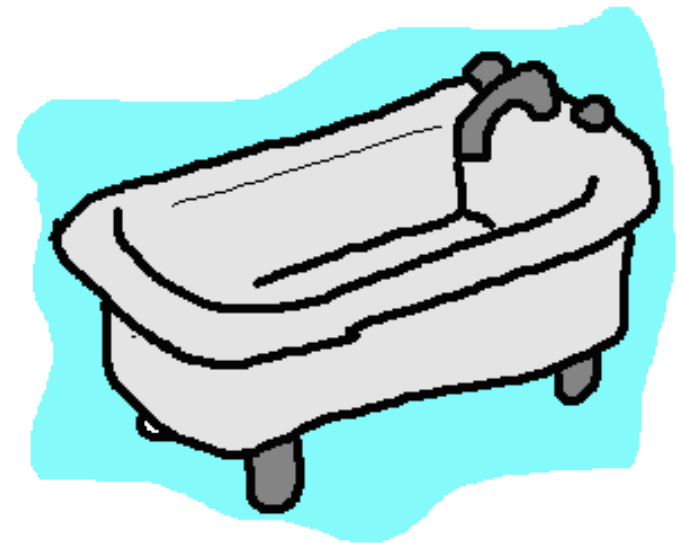
$$\frac{dV}{dt} = b, \quad b = 2.6$$

- Initially the bath is empty

Initial condition: $V(0) = 0$

Analytical solution:

$$V(t) = 0 + 2.6t = 2.6t$$



A first example: Filling a bath tub

Numerical approach:

Governing Equation:

$$\frac{dV}{dt} = b \quad (\text{infinitesimal calculus expression})$$

$$\frac{\Delta V}{\Delta t} = \frac{V_{new} - V_{old}}{\Delta t} = b \quad (\text{discrete expression})$$

$$V_{new} = V_{old} + b\Delta t$$

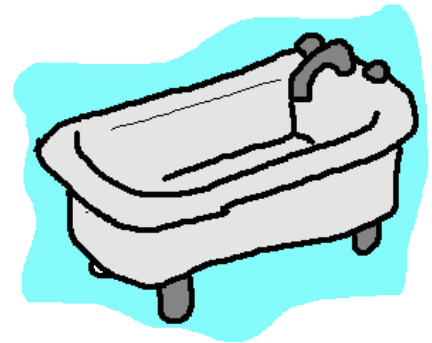
(unknowns left, known variables to right)

Numerical time step: try $\Delta t = 2$ seconds

$$\text{Timestep 1: } V^1 = V^0 + b\Delta t = 0 + 2.6 * 2 = 5.2 \text{ litres}$$

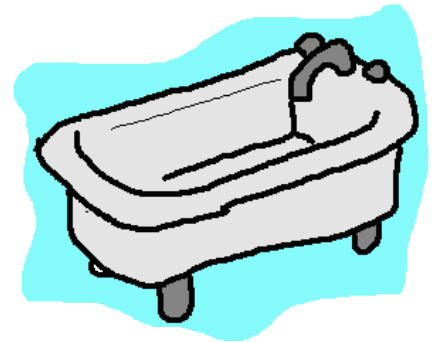
$$\text{Timestep 2: } V^2 = V^1 + b\Delta t = 5.2 + 2.6 * 2 = 10.4 \text{ litres}$$

and so on ...



Second example: Draining a bath tub

- ❑ Possible differential equation: $\frac{dV}{dt} = -aV$
- ❑ Analytical solution: $V(t) = V^0 \exp(-at)$
- ❑ with V^0 the amount of water at $t=0$
- ❑ Numerical approach: $\frac{V^{new} - V^{old}}{\Delta t} = -aV^{old}$



Let's take $V^0=500$ litres, and $a = 0.01$:

Timestep 1: $V^1 = V^0 - a\Delta t * V^0 = 500 - 0.01 * 2 * 500 = 490.0$

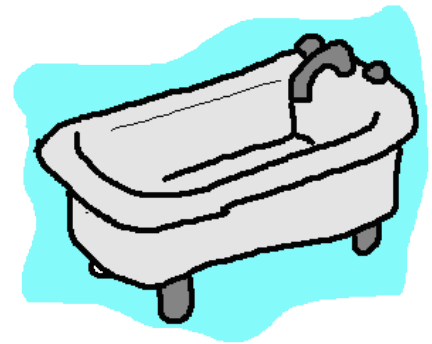
Timestep 2: $V^2 = V^1 - a\Delta t * V^1 = 490 - 0.01 * 2 * 490 = 480.2$

Third example: combination of the previous two

$$\frac{dV}{dt} = -aV + b$$

- Analytical solution for an initially empty bath:

$$V(t) = \frac{b}{a} (e^{-at} - 1)$$

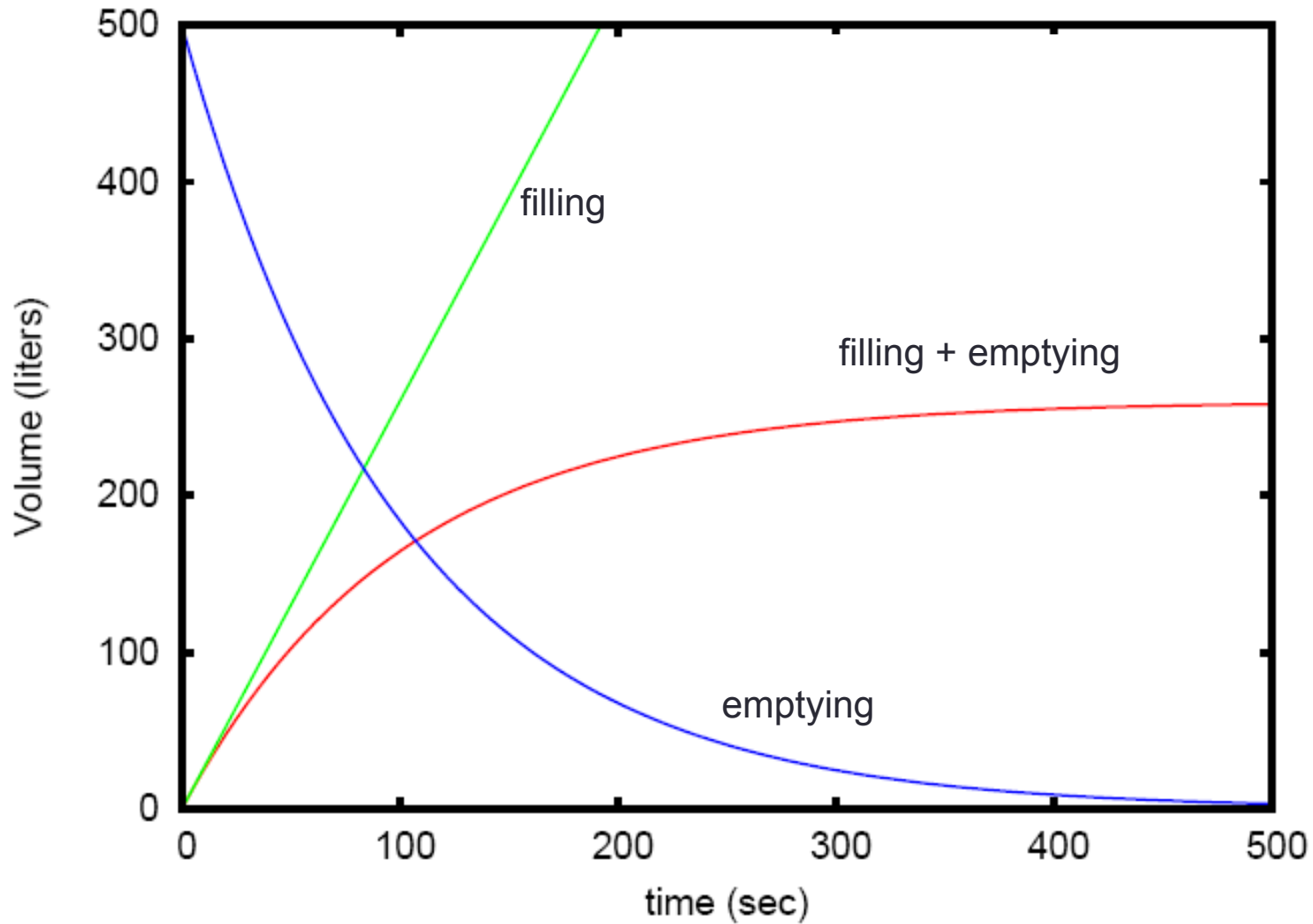


- Numerical approach:

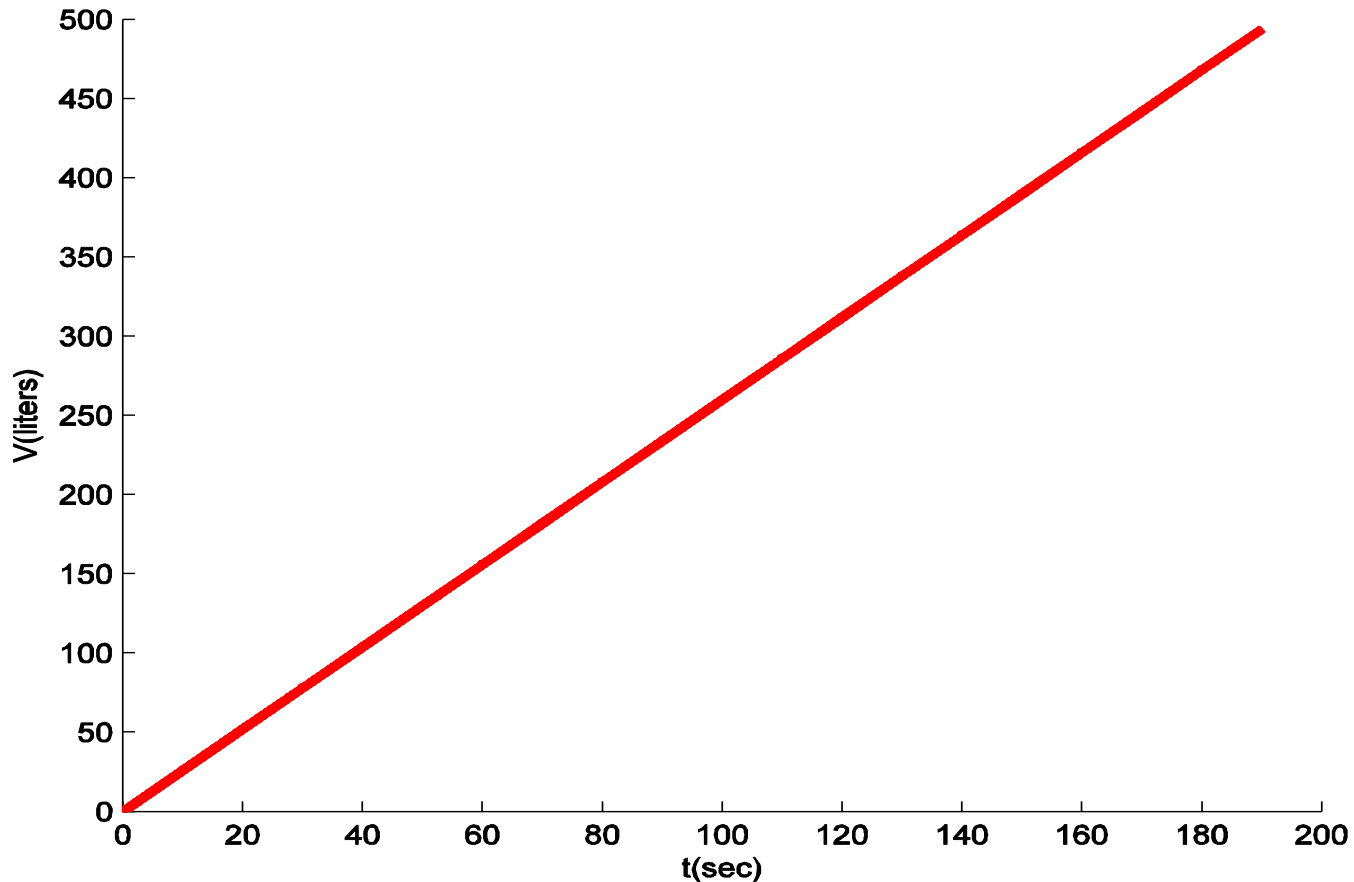
$$\text{Time step 1: } V^1 = V^0 + dt * (-aV_0 + b) = 0 + 2 * (-0.01 * 0 + 2.6) = 5.2$$

$$\text{Time step 2: } V^2 = V^1 + dt * (-aV_1 + b) = 5.2 + 2 * (-0.01 * 5.2 + 2.6) = 10.296$$

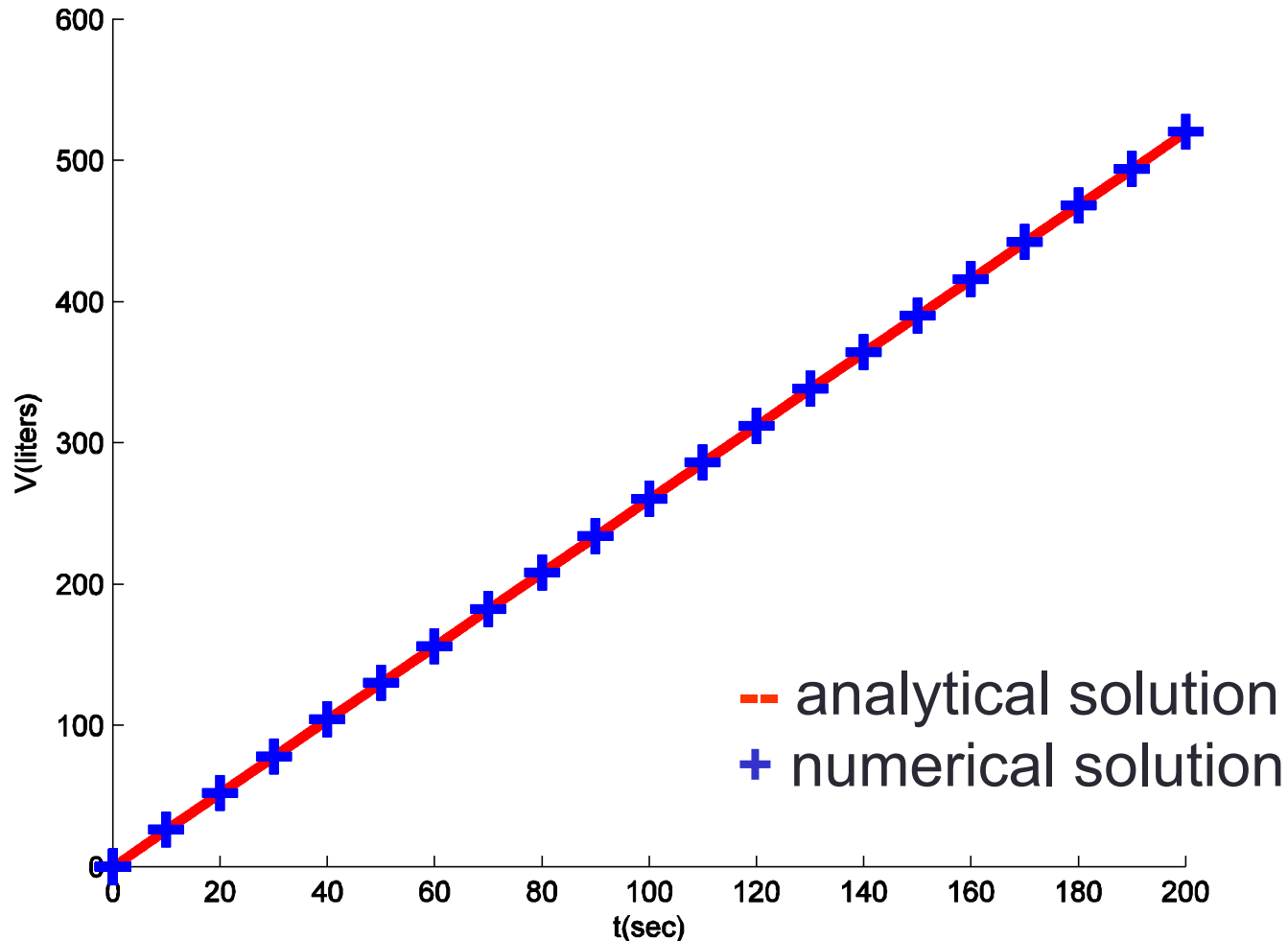
Analytical Solutions



Accuracy of the model: Filling the bathtub



Accuracy of the model: Filling the bathtub



```
import numpy as np
import matplotlib.pyplot as plt

# Initialisation of the parameters:
v_ini = 500          # Volume at time t=0
v_old = v_ini
a = -0.01           # parameter related to emptying bathtub
t = 0               # set start time to 0
dt = 25             # time step size
nt = 25             # number of time steps
volume = np.zeros(nt) # create some arrays to put solutions in
time = np.zeros(nt)

# Start time-stepping
for it in range(0,nt):
    # save old solutions in arrays:
    volume[it] = v_old
    time[it] = t
    v_new = v_old + dt*a*v_old # Calculate new solution
    t = t + dt                 # Update time
    v_old = v_new              # Prepare for next time step

# Plot solution:
plt.clf()
plt.figure(1)
plt.plot (time,volume,'o-')
plt.xlabel('t(sec)')
plt.ylabel('V(litres)')
plt.title('Bath tub volume through time')
plt.show()
```

initialisation

calculation

plotting

Python code
for calculation
of draining of
a bath tub

Practical 1, Part 1:

- ❑ Take a look at our first numerical model.
- ❑ Add the analytical solution. Is the solution perfect?
 - ❑ Why or why not?
- ❑ What effect does the size of the time step have on the accuracy of the model
 - ❑ Why?



<https://community.dur.ac.uk/jeroen.van-hunen/Subitop/session1.html>

Finite difference approximation

□ Taylor expansion:

$$f(t + \Delta t) = f(t) + \Delta t \frac{df}{dt} + \frac{\Delta t^2}{2!} \frac{d^2 f}{dt^2} + \frac{\Delta t^3}{3!} \frac{d^3 f}{dt^3} + \frac{\Delta t^4}{4!} \frac{d^4 f}{dt^4} + \dots$$

□ Truncate:

$$f(t + \Delta t) = f(t) + \Delta t \frac{df}{dt} + O(\Delta t^2)$$

□ Re-arrange:

$$f(t + \Delta t) - f(t) = \Delta t \frac{df}{dt} + O(\Delta t^2)$$

$$\frac{f(t + \Delta t) - f(t)}{\Delta t} = \frac{df}{dt} + O(\Delta t)$$

or:

$$\frac{df}{dt} = \frac{f(t + \Delta t) - f(t)}{\Delta t} + O(\Delta t)$$

Thus: derivative of function $h(t)$ at time $t \approx$ **forward difference** of the function over a time step Δt .

This approximation has additional terms the **largest** of which includes the factor Δt .

Time stepping Methods

□ Differential equation

$$\frac{dV}{dt} = -aV$$

□ Discretization

$$\frac{V^{new} - V^{old}}{\Delta t} = -aV$$

$$\frac{V^{new} - V^{old}}{\Delta t} = -a \underline{V^{old}}$$

forward Euler method

$$\frac{V^{new} - V^{old}}{\Delta t} = -a \underline{V^{new}}$$

backward Euler method

Time stepping Methods


Re-arranging backward Euler equation:

$$\frac{V^{new} - V^{old}}{\Delta t} = -aV^{new}$$



Time stepping Methods

Re-arranging backward Euler equation:

$$\frac{V^{new} - V^{old}}{\Delta t} = -aV^{new}$$
$$V^{new} - V^{old} = -a\Delta t V^{new}$$
$$V^{new} (1 + a\Delta t) = V^{old}$$
$$V^{new} = \frac{V^{old}}{(1 + a\Delta t)}$$


Time stepping Methods

Discretization

$$\frac{V^{new} - V^{old}}{\Delta t} = -aV$$

$\frac{V^{new} - V^{old}}{\Delta t} = -aV^{old}$
 forward Euler method

$\frac{V^{new} - V^{old}}{\Delta t} = -aV^{new}$
 backward Euler method

$$\frac{V^{new} - V^{old}}{\Delta t} = -a\left(\frac{V^{old} + V^{new}}{2}\right)$$

Crank-Nicholson method

Practical 1, Part 2:

- ❑ Using finite difference techniques to model radioactive decay
 - ❑ Work in small groups to discuss key modelling decisions about how to describe the geological process mathematically, what other information you'll need, how long a time to model, etc.
 - ❑ Try out new Python commands and techniques you'll need for your model
 - ❑ Build the model and implement different time stepping methods yourself
 - ❑ If time permits, build a larger model to explore the Earth's secular cooling (Practical 1, Extras, part A)

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