

# Lecture 10

◆ Some assignment 3 problems – Titius law

## ◆ Interpolation

◆ Lagrange polynomials and their limitations

◆ Splines

## ◆ Ordinary Differential equations

◆ Single, 1<sup>st</sup> order ODE. Sets of 1<sup>st</sup> order diff.

❖ ODEs are equivalent to higher order eqs.

❖ Taylor expansions and integration schemes:

- derivation of trapezoid and midpoint methods
- RK4 scheme; comments on multistep methods
- shooting method in split-point boundary conditions

❖ Examples of 1<sup>st</sup> order nonlinear equations:

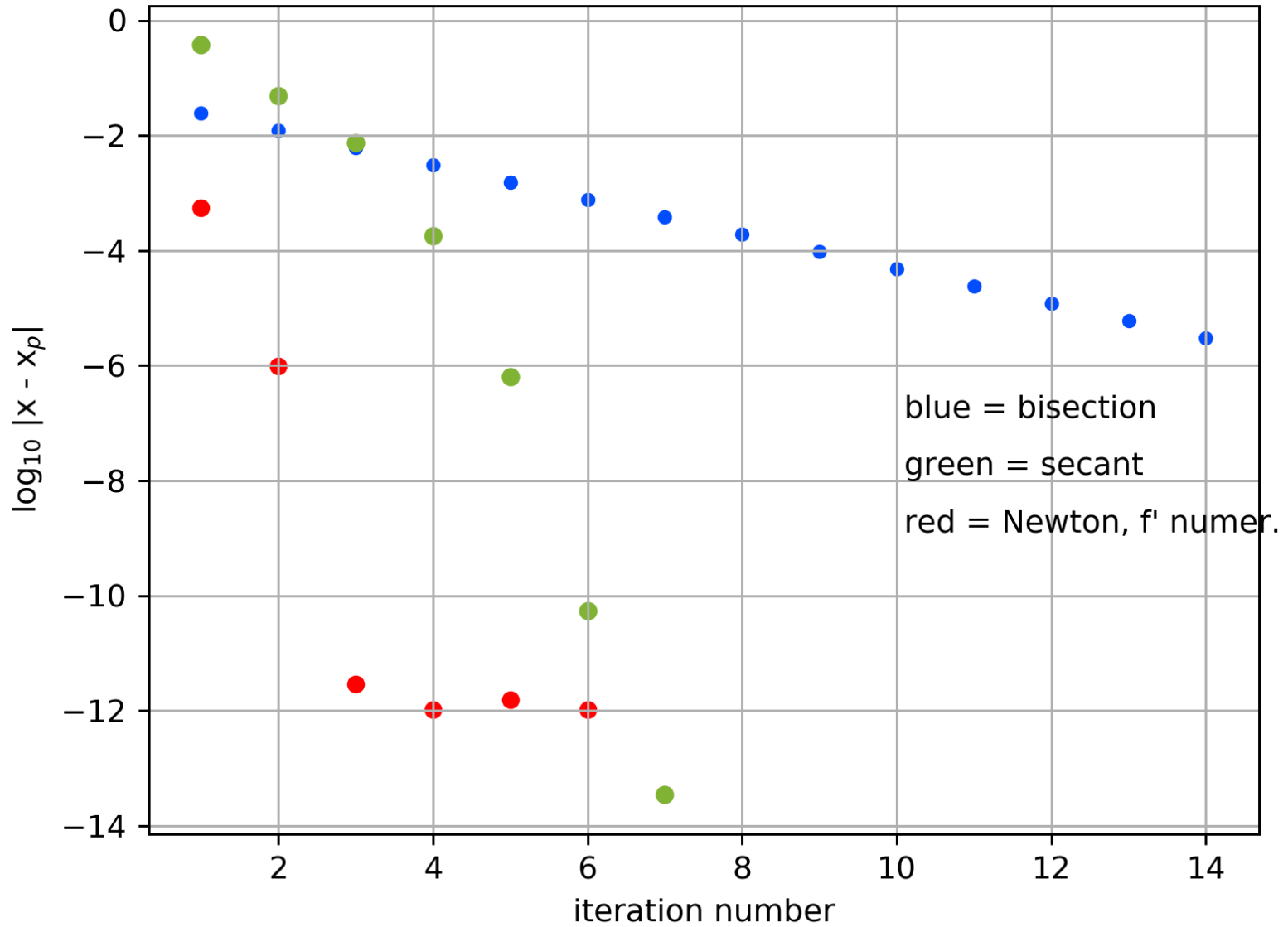
○  $y' = -y \cos(x)$ ,  $y' = -y \sin^3(x)$ ; accuracy, error drift, convergence

❖  $y'' = -g$  - unusually simple and accurate 2<sup>nd</sup> ord. solutions

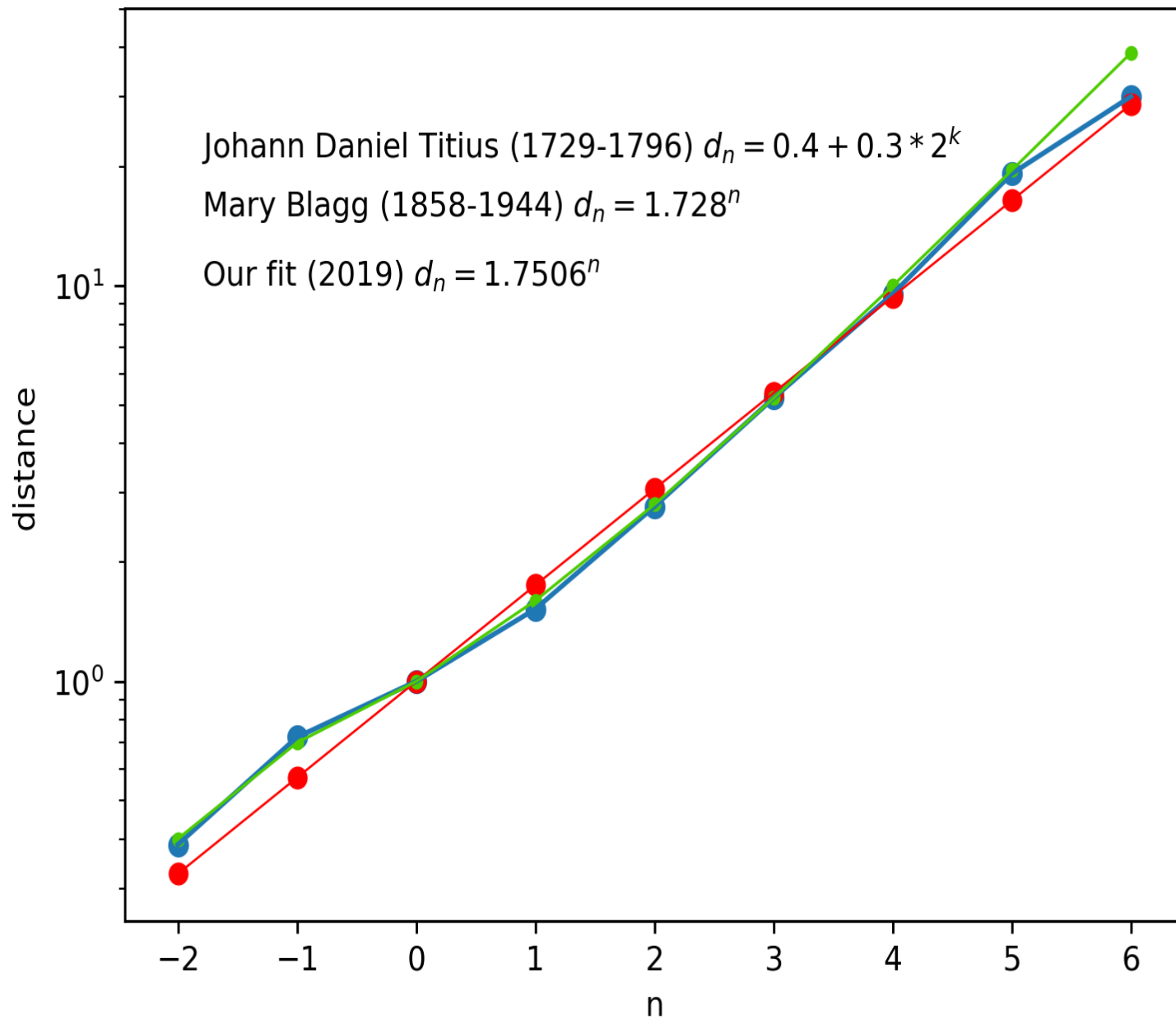
❖ chapter 7 in Turner et al (2018)

# Titius-Bode rule problem

Minimum via  $f=dE/dx=0$ . Planetary distance law.



# Old and newer forms of Titius rule

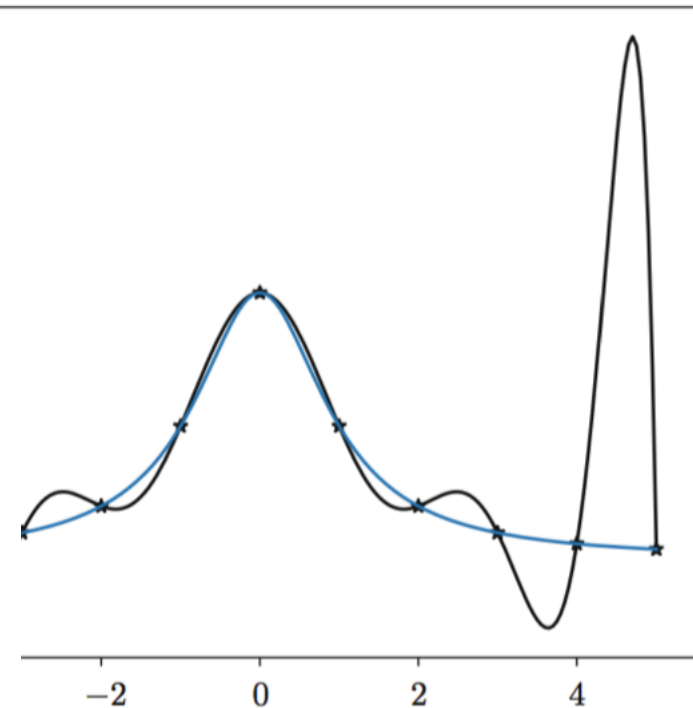
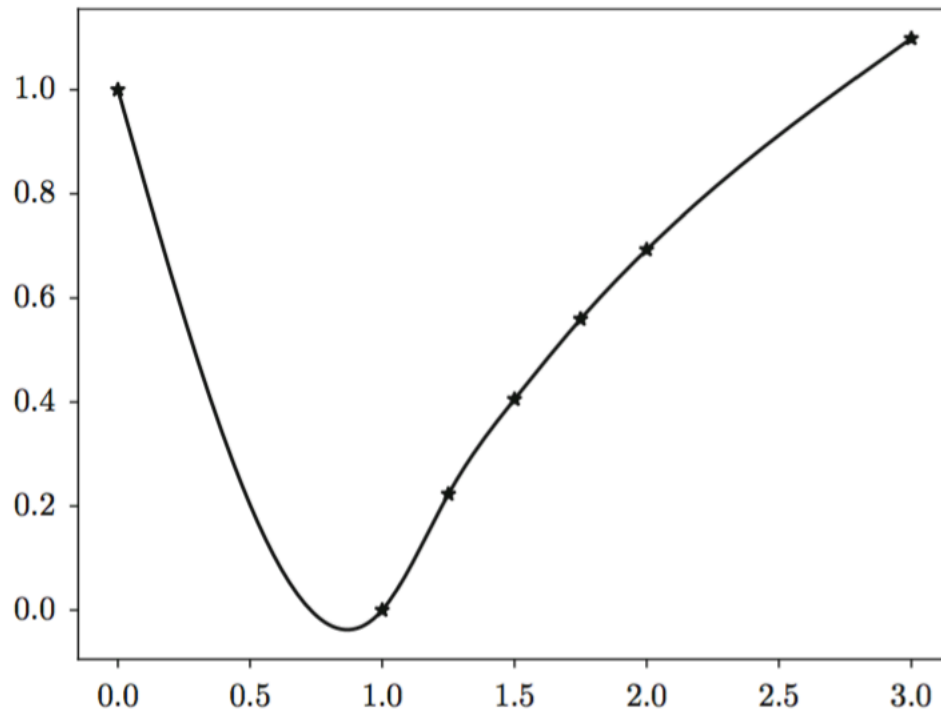
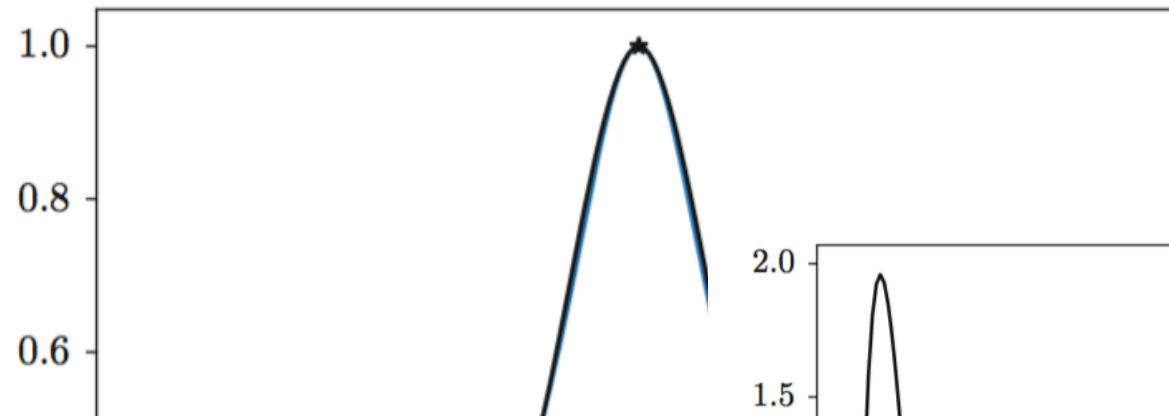


# Interpolation

- Turner et al (2018) – read chapter 6, starting with p. 189
- Interpolation by polynomials: **Lagrange polynomials**
  - problem: wiggly polynomials
  - the trouble also explains why extrapolation is difficult
- Interpolation by piecewise polynomials:
  - **Splines**; much nicer than polynomials in general
  - cubic splines have continuous 0<sup>th</sup>, 1<sup>st</sup> and 2<sup>nd</sup> deriv.
  - they require solving a tri-diagonal linear system for constants of piecewise cubic functions.
  - this is a cheap calculation, only  $O(N)$  arithm. operations
  - **`f = scipy.interpolate.interpld(X, Y, 'cubic')`**
  - offers several different interpolation schemes depending on string argument, input: X and Y (numpy arrays of length N).  
Result is a *function* that you can call with some other array of x's to interpolate & plot:
  - **`plt.plot(x, f(x)); plt.show()`**

# Interpolation, Extrapolation, Splines

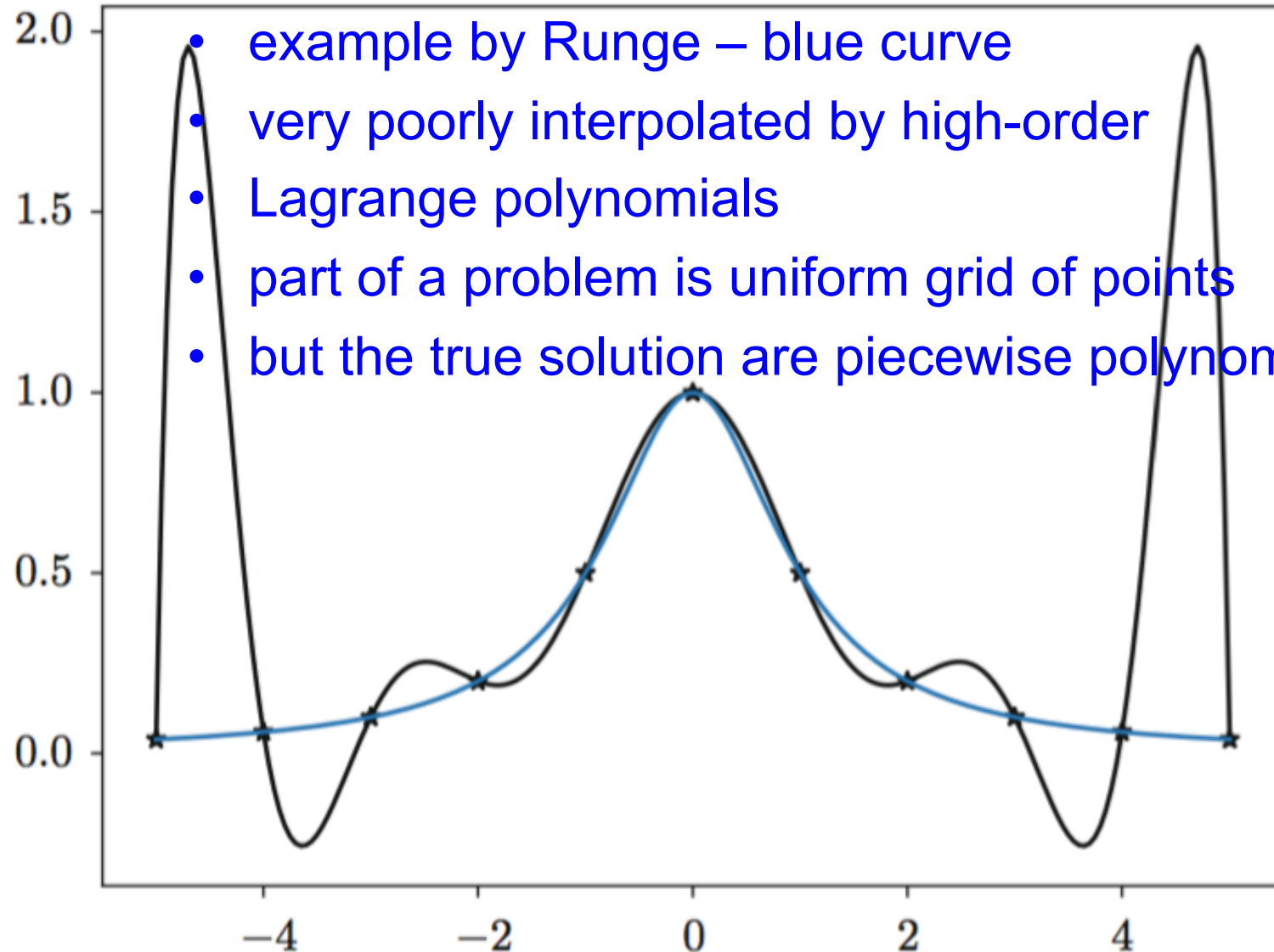
Turner et al. (2018) - textbook

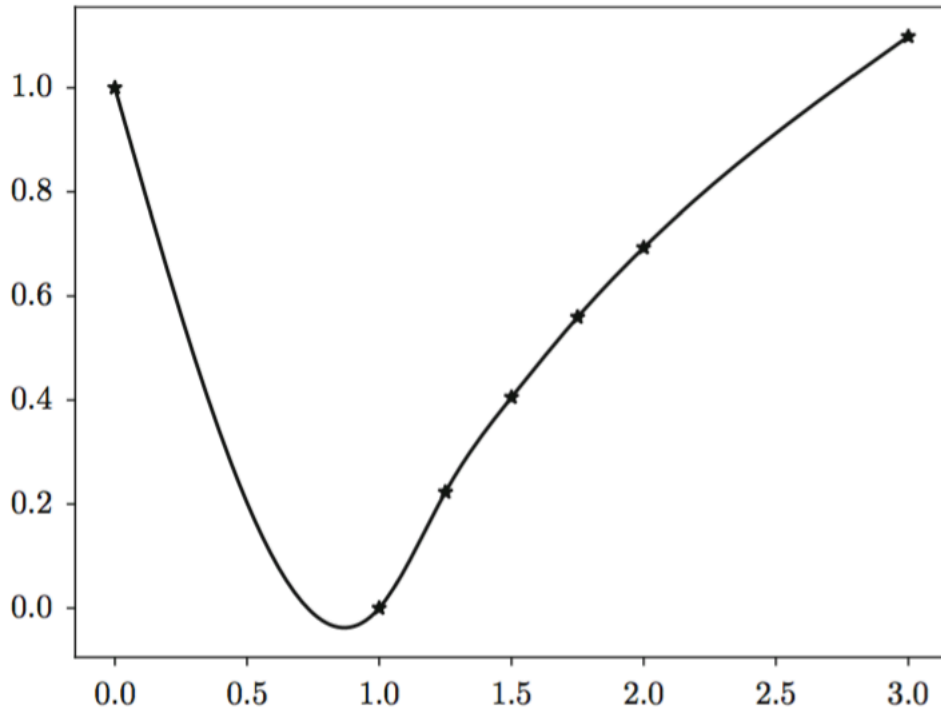
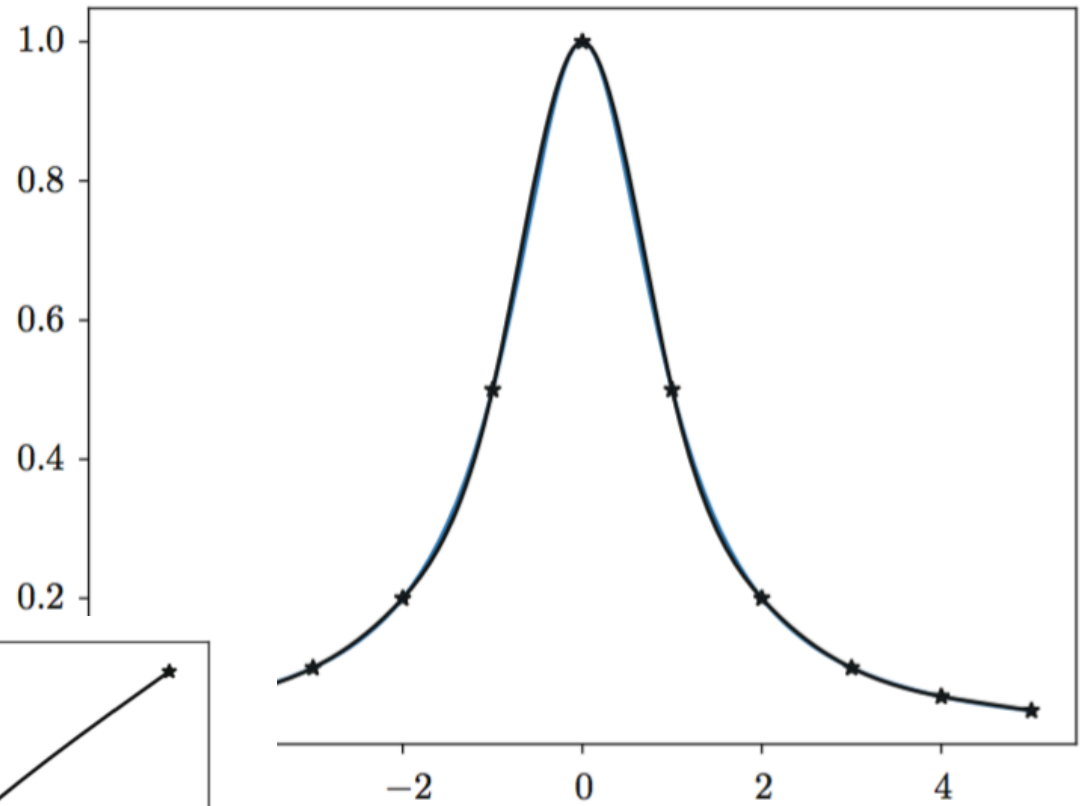


# Interpolation, Extrapolation, Splines

Turner et al. (2018) - textbook

- there is a problem with polynomials
- example by Runge – blue curve
- very poorly interpolated by high-order Lagrange polynomials
- part of a problem is uniform grid of points
- but the true solution are piecewise polynomials

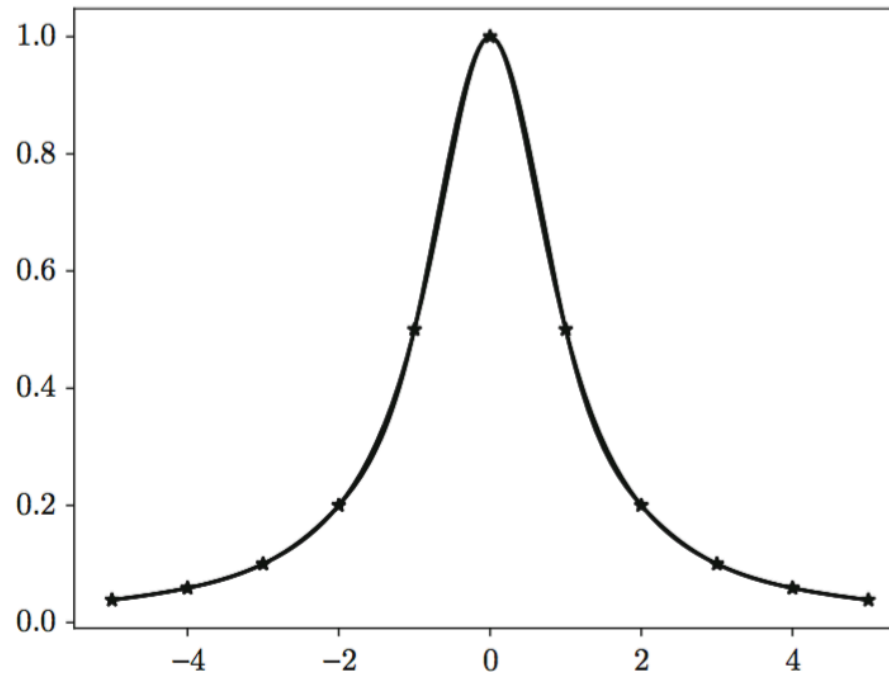




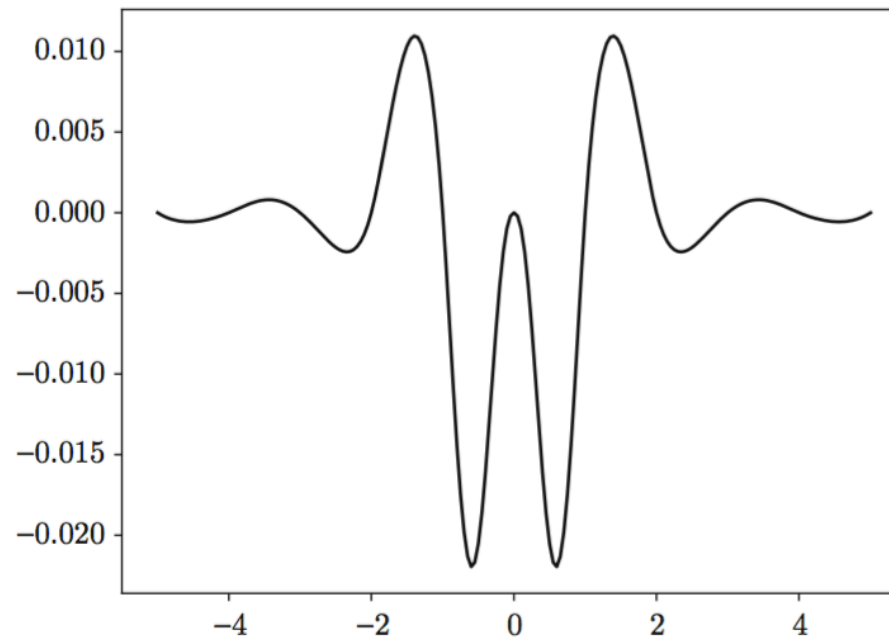
**splines** have continuous  
1<sup>st</sup> and 2<sup>nd</sup> order derivatives  
across intervals

To get their coefficients, one solves  
a linear algebraic set of eqs., which  
has a band structure -> fast solution

**Fig. 6.9** Interpolation of the Runge function with a cubic spline



**Fig. 6.10** Error of the interpolation from Fig. 6.9





# ODEs

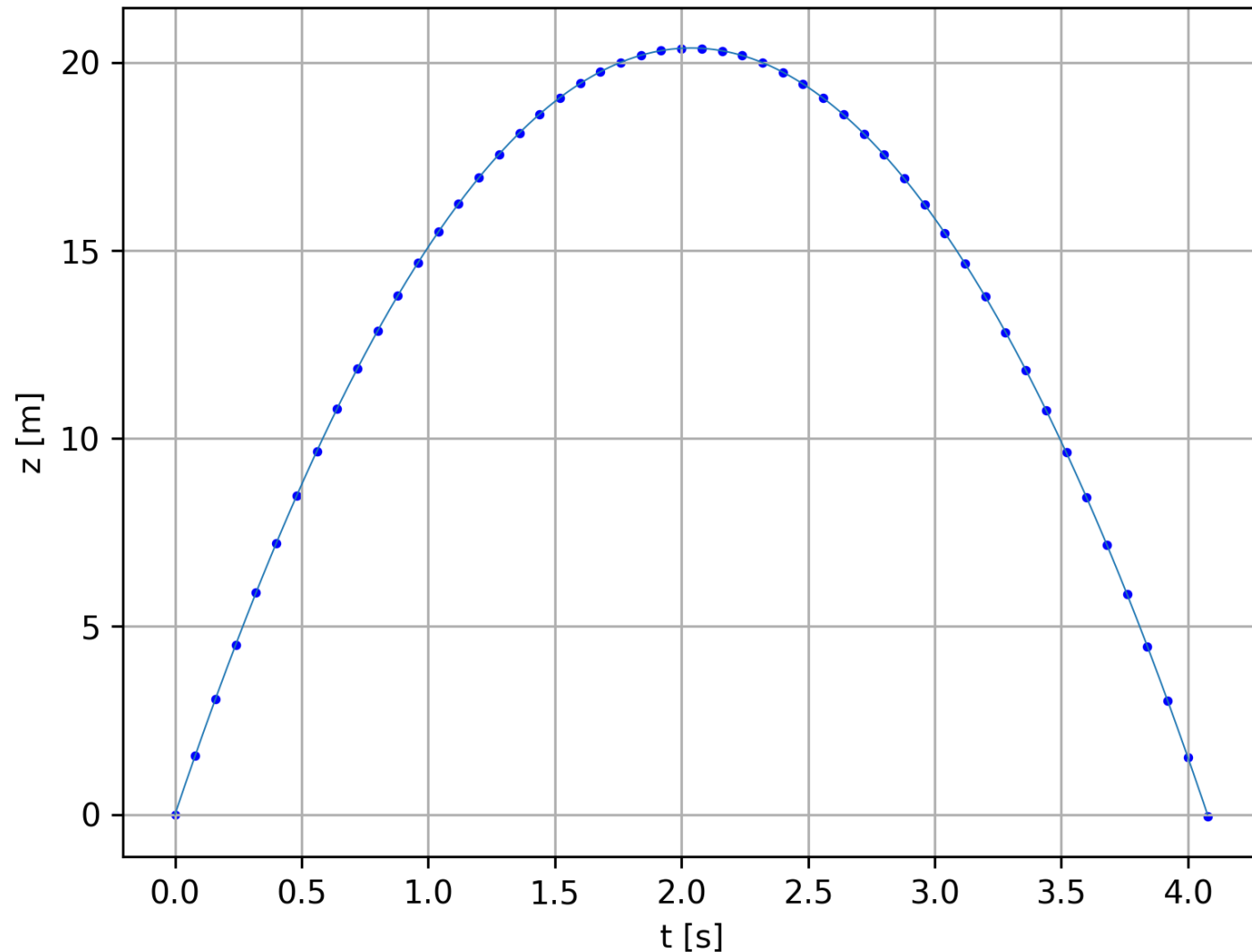
Turner et al. pp. 229+

- $dy/dt = y' = f(x,y)$  - simple first order ODE
- simple 1D 1<sup>st</sup> order differential equations:
  - $y' = -y \sin(x)$
  - $y' = -y \sin^3(x)$  initial value problems, B.C.:  $y(0)=1$
- $d^2y/dt^2 = f(x,y)$  - simple second order ODE,
- Newtonian, Hamiltonian, and Lagrangian dynamics is full of such ODEs, often  $f(x,y) = f(y)$   $t=x$  not explicit
- Taylor expansion useful to create integration methods
  - example: trapezoid rule is 2<sup>nd</sup> order.
- Similarities and differences with definite integrals of functions
- Basics of drag forces and their implementation
  - example: throwing a ball in vacuum vs. in air

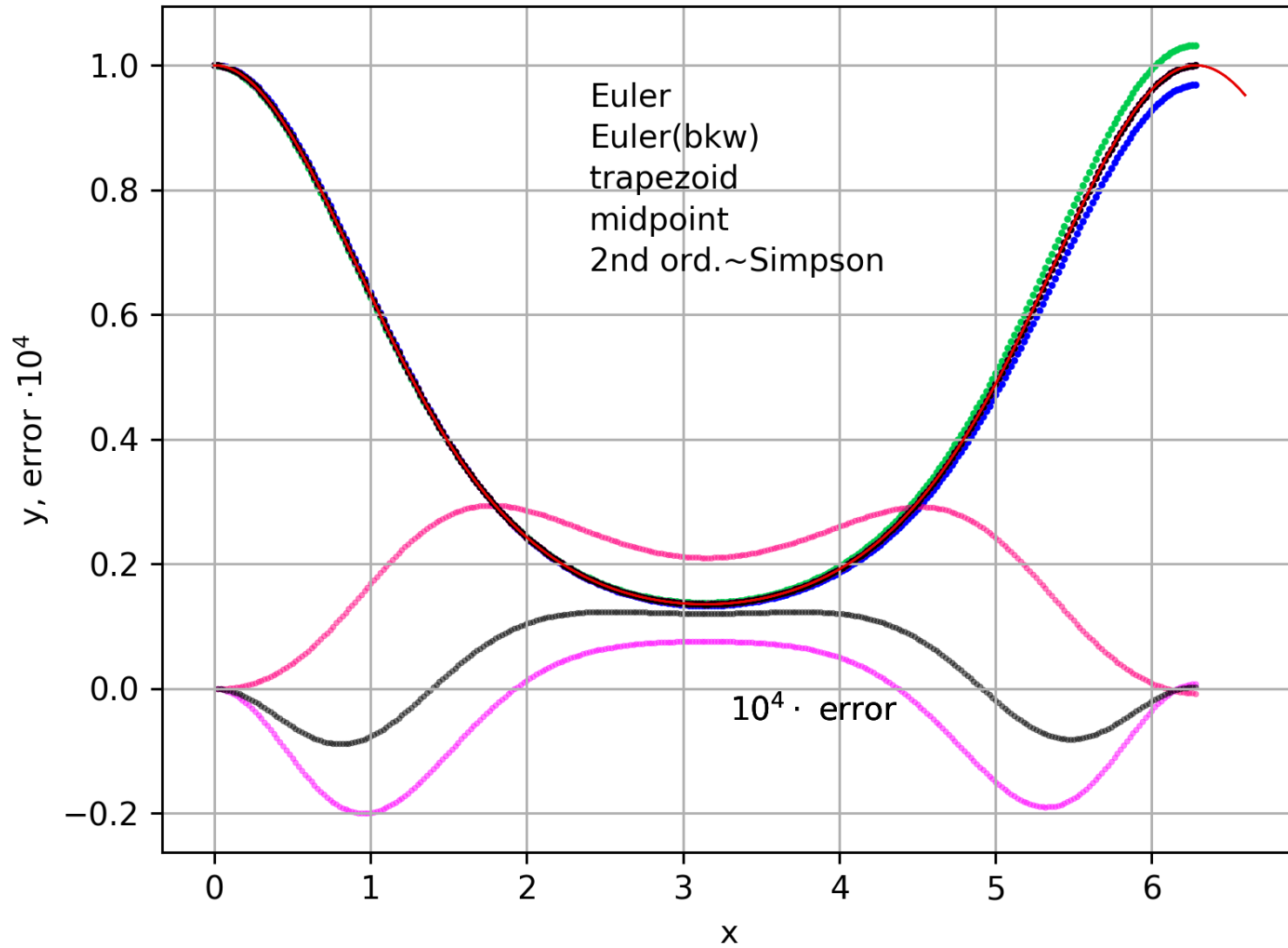
# vertical throw in vacuum – 2<sup>nd</sup> order 1D ODE

Trapezoidal rule. Equations so simple (no higher order derivatives that this scheme returns zero errors with sizeable step  $dt$ ).

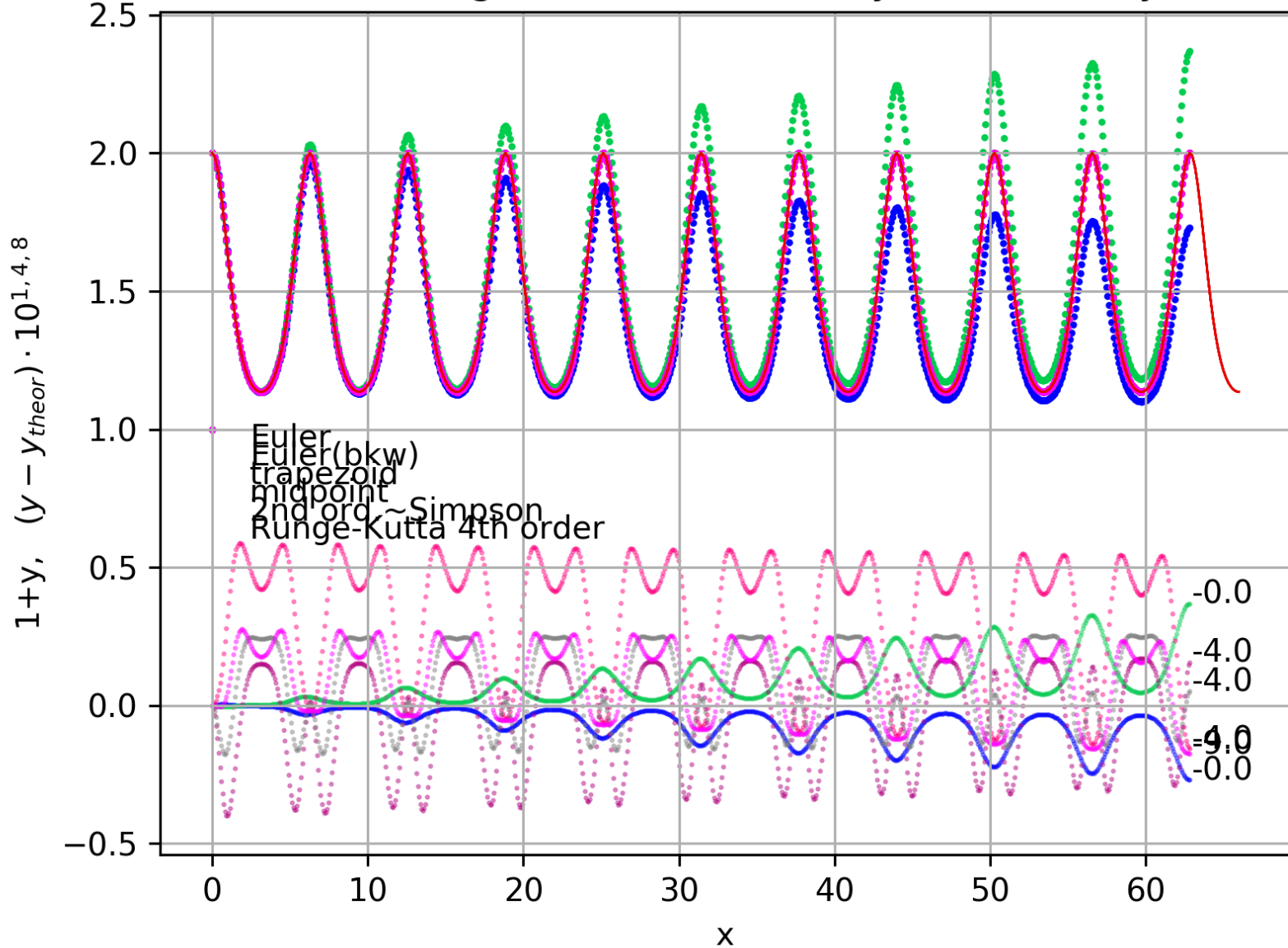
vertical throw  $v_0=20.0$  m/s,  $dt=0.08$  s



diff1-throw-6.py

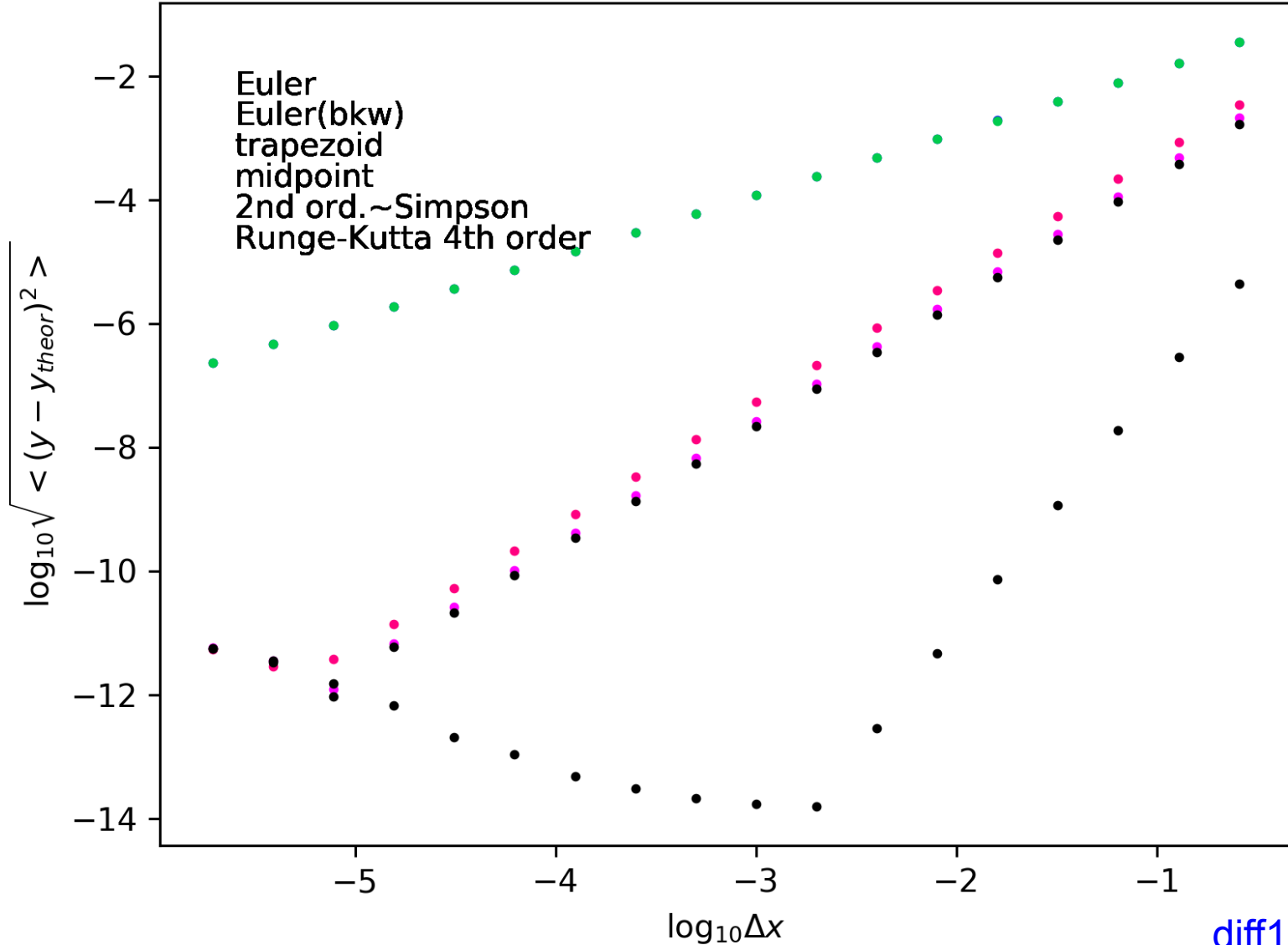
ODE integration schemes of  $dy/dx = -\cos(x)y$ 

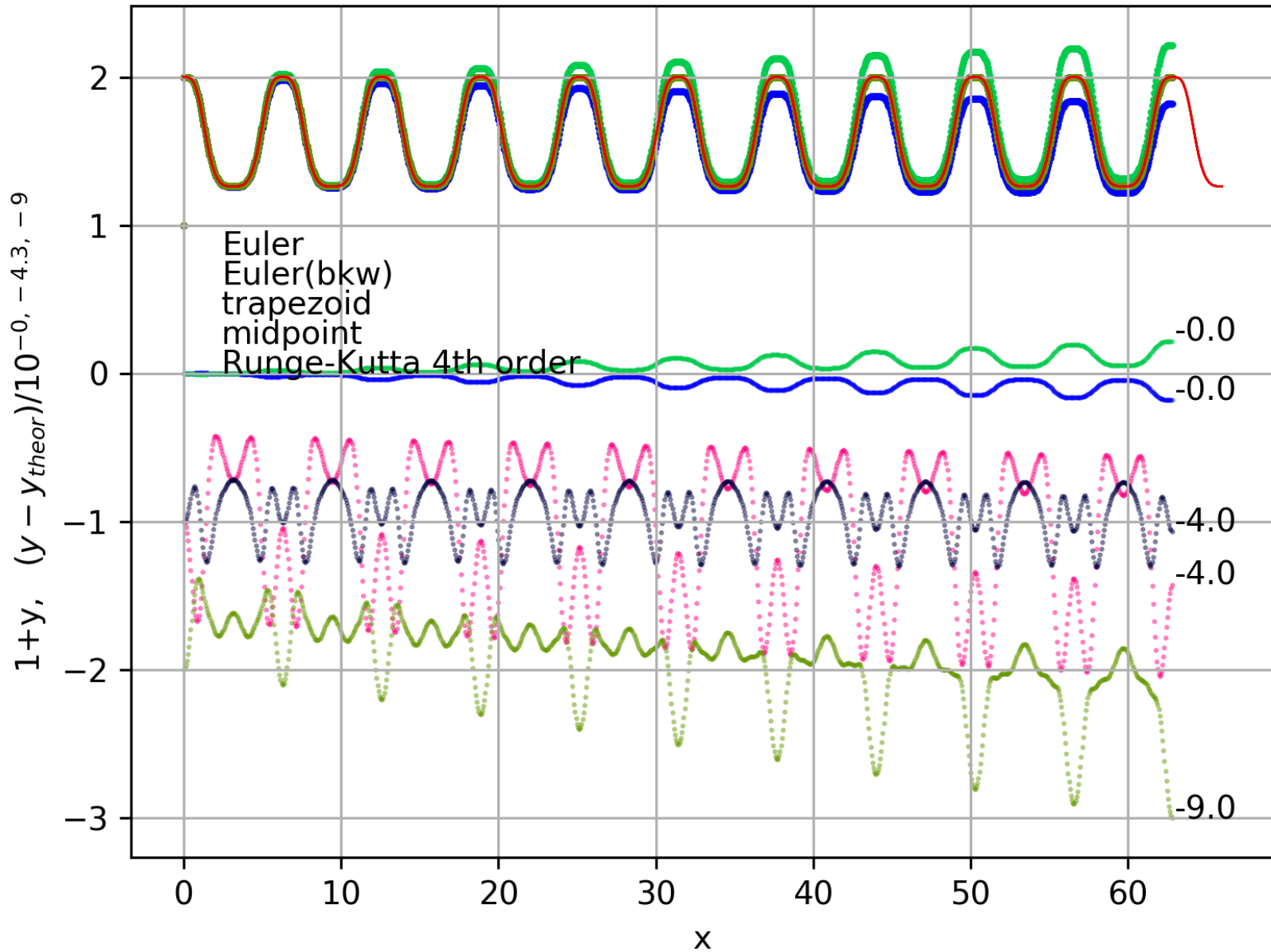
ODE integration schemes of  $dy/dx = -\cos(x)y$



# convergence of schemes

mean error of solution to  $dy/x = -y \cos(x)$ ,  $x=0$  to  $x=\pi$



ODE integration schemes of  $dy/dx = -y \sin(x)**3$ 

# Integration schemes

read chapter 7 of the textbook

- Midpoint trapezoid and RK4 methods
- Turner pp. 239-242
- Multistep methods – p. 245+
- Systems of equations
- Trajectories of chase

# Chaotic solutions of simple regular ODEs

- Lorenz attractor – a meteorological model
  - very few variables, only 3
- The butterfly effect present
- Definition of chaos. Non-periodic behavior, extremely sensitive to perturbation.
- Orbits of Pluto and *all* other planets are chaotic too