### Numerics!

CS2 RECITATION SERIES FRIDAY, FEBRUARY 27, 2015

#### Administrivia

- The Othello Project starts soon
  - Sign up for your groups!
  - Even if you're soloing, sign up with a group name
- The Othello Project will <u>require</u> submission via Git
  - Details will be provided in the assignment instructions on Moodle
- The Othello Project will require Java to test
  - You can write your player in your choice of language (Python, C, C++, or Java)
  - Support code is provided for C++ only

#### This week's assignment

- Numerical integration
  - Simulating motion of things
  - Three variants of Euler's method: forward, backward, symplectic
  - We ask you to implement them
- Root finding
  - Finding  $x_0$  so that  $f(x_0) = 0$
  - Bisection method and Newton-Raphson method
- Discrete and fast Fourier transforms

#### Numerical Integration

- •Suppose we have x(t),  $v(t) = \frac{dx}{dt}$ ,  $a(t) = \frac{dv}{dt} = f(x, t)$ 
  - We want to simulate the evolution of x over time
  - If there's no analytic solution, we need to simulate x numerically (with timestep  $\delta$ )

#### Euler methods

- Forward Euler
  - $v(t + \delta) = v(t) + \delta \cdot f(t, x(t))$
  - $x(t + \delta) = x(t) + \delta \cdot v(t)$
- Backward Euler
  - $v(t + \delta) = v(t) + \delta \cdot f(t + \delta, x(t + \delta))$
  - $x(t + \delta) = x(t) + \delta \cdot v(t + \delta)$
  - Next x and v depend and next x and v ... ???
  - Do some algebra:) (there are hints in the assignment)
- Symplectic Euler
  - $v(t + \delta) = v(t) + \delta \cdot f(t, x(t))$
  - $x(t + \delta) = x(t) + \delta \cdot v(t + \delta)$
  - Next x depends on next v

#### Forward Euler

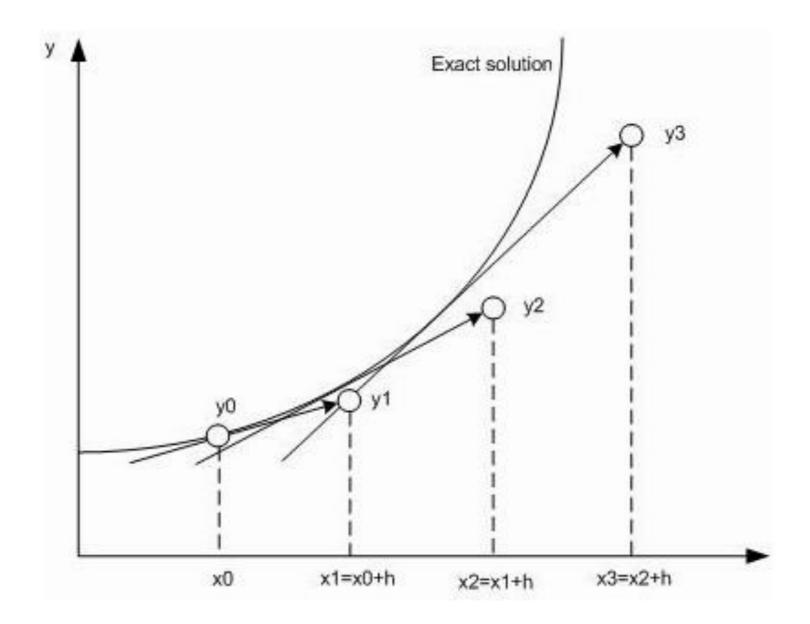


Image source: <a href="http://alexkr.com/source-code/127/intuitive-understanding-of-ode-solvers/">http://alexkr.com/source-code/127/intuitive-understanding-of-ode-solvers/</a>

#### Backward Euler

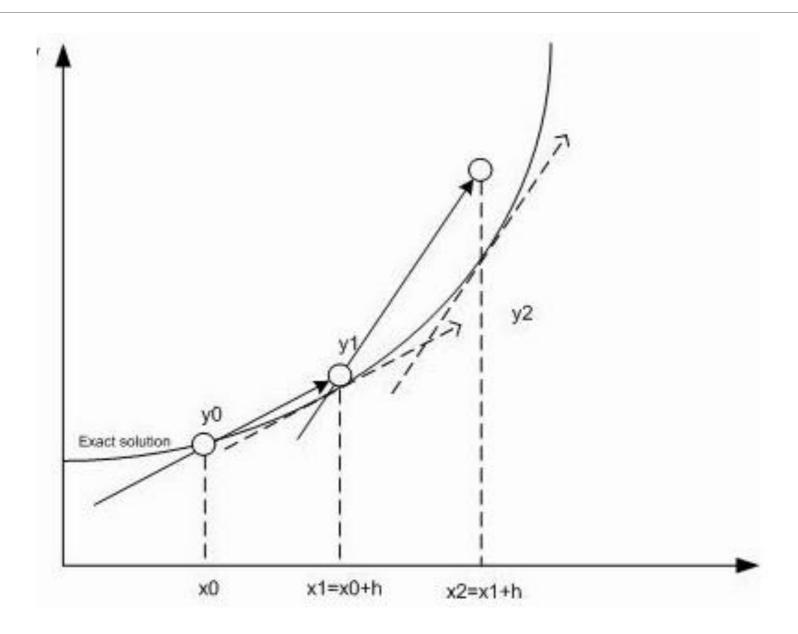


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#### Euler methods in assignment

- •You are given a parameter h in each of the functions as well as the current x, y, vx, vy values as pointers
  - h represents the timestep  $\delta$  in the previous slide
- Update position and velocity through the pointers you are given, function does not return anything

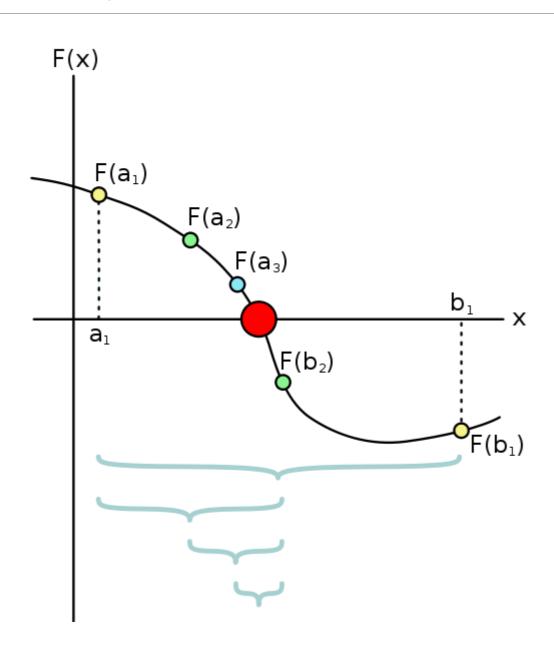
#### Root Finding

- This is exactly what it sounds like
- Some analytic functions do not have closed form solutions
- •We have some numerical methods to find roots for these functions

#### The bisection method

- If we have a continuous function f(x) and  $x_1, x_2$  such that  $f(x_1)$  and  $f(x_2)$  have opposite signs, the intermediate value theorem tells us that there is a root between  $x_1$  and  $x_2$ . Assume  $x_1 < x_2$  and start with the range  $[x_1, x_2]$ .
- Guess the root:  $x_0 = \frac{x_1 + x_2}{2}$
- If  $f(x_0)$  has the same sign as  $f(x_1)$ , change our range to  $[x_0, x_2]$
- Otherwise change our range to  $[x_1, x_0]$
- Repeat until the length of the range is smaller than some given parameter
- In the assignment you are given  $x_1, x_2$  and a parameter PRECISION. The function is passed as a function pointer, don't be scared of this
  - Calling the function is easy this way, f(a) is simply f(a) in the code

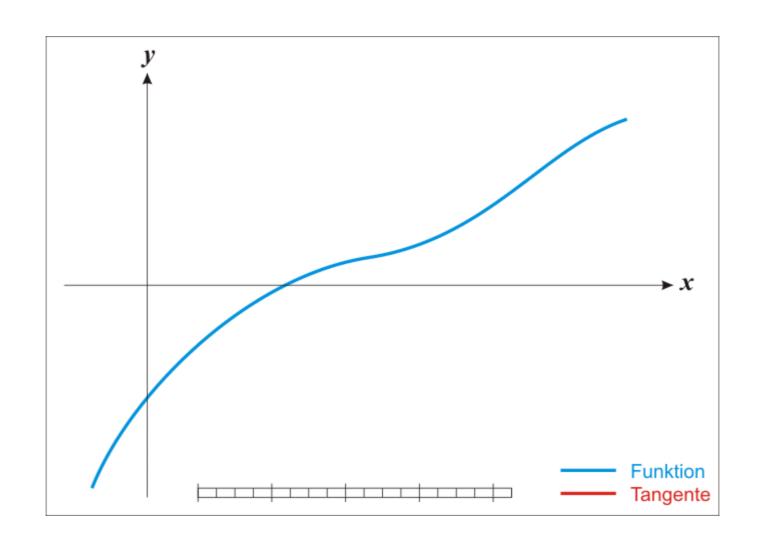
# Picture example (photo from Wikipedia)



#### Newton-Raphson Method

- General idea is to continue tracing tangent lines until we get to our root
- Start with an initial guess  $x_1$
- Linearize the function around  $x_1$  by taking the first two terms of its Taylor expansion
  - $f(x) \approx f(x_1) + f'(x_1)(x x_1)$
  - Set f(x) = 0 and solve the above equation to find
  - $x_2 = x_1 \frac{f(x_1)}{f'(x_1)}$
- If  $x_2$  is close enough to zero (TOLERANCE in the assignment) then we found the root!
  - Evaluate the derivative the same way you evaluated functions in the bisection method

# Newton-Raphson (animation)



Source: Wikipedia

### Discrete and Fast Fourier Transforms

- This was covered very thoroughly in class, see lecture slides (they will be posted soon) for details
- We provide you a complex number class
  - You will probably find the getRootOfUnity function useful
  - Returns the primitive  $n^{th}$  root of unity of z in  $z^n = 1$
- What to do with the roots?
  - See lecture slide
- FFT pseudocode is given on lecture slides should be easy to follow