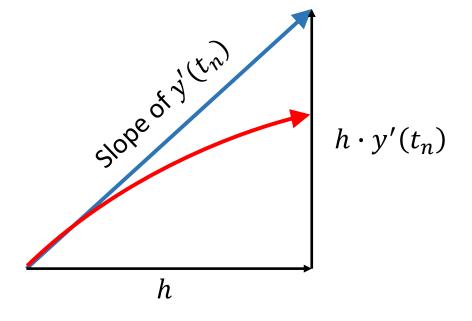
### Understanding forward Euler error

Recall: Forward Euler makes a linear approximation at each step.

Smaller step size  $h \rightarrow$  more frequent estimates of the slope  $\rightarrow$  less error in approximate solution.

Let's determine this error!



Exact = 
$$\longrightarrow$$
 Approx. =  $\longrightarrow$ 

### More accurate time-stepping

Use of Taylor expansions hints at how to derive higher order schemes.

Forward Euler: 
$$O(h^2)$$
 
$$y(t_{n+1}) = y(t_n) + h \cdot y'(t_n) + \frac{h^2}{2}y''(t_n) + \frac{h^3}{6}y'''(t_n) + \cdots$$
 A better method,  $O(h^3)$  ?

Keep more terms in the series, so error is even higher order (smaller)?

### Keeping more terms

Again, Taylor series is

$$y(t_{n+1}) = y(t_n) + h \cdot y'(t_n) + \frac{h^2}{2}y''(t_n) + O(h^3)$$

Problem: we don't know y''! (It may be hard/costly to find exactly.) Our ODE only gives us the 1<sup>st</sup> derivative, y'(t) = f(t, y).

Solution: Use another forward (finite) difference to approximate y''.

$$y''(t) = \frac{y'(t_{n+1}) - y'(t_n)}{h} + O(h)$$

Let's try doing this....

# Trapezoidal Rule ("Crank-Nicolson")

In the end, we have:

$$y(t_{n+1}) = y(t_n) + \frac{h}{2} \Big( f \Big( t_{n+1}, y(t_{n+1}) \Big) + f \Big( t_n, y(t_n) \Big) \Big) + O(h^3)$$
Trapezoidal Rule

Error Term

Therefore the *local truncation error* for trapezoidal rule is  $O(h^3)$ . Reducing step size h now reduces per-step error cubically!

### Trapezoidal Rule – Intuition?

In the end, we have:

$$y(t_{n+1}) = y(t_n) + \frac{h}{2} \Big( f \Big( t_{n+1}, y(t_{n+1}) \Big) + f \Big( t_n, y(t_n) \Big) \Big) + O(h^3)$$
Trapezoidal Rule

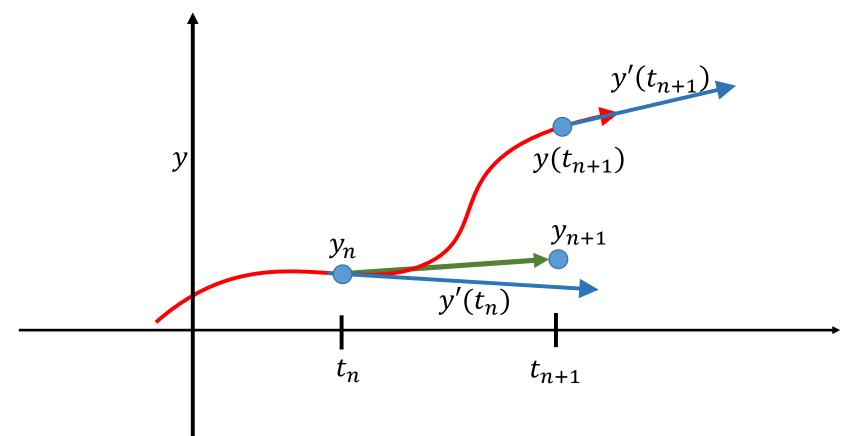
Error Term

Q: What is the *geometric* intuition for this scheme?

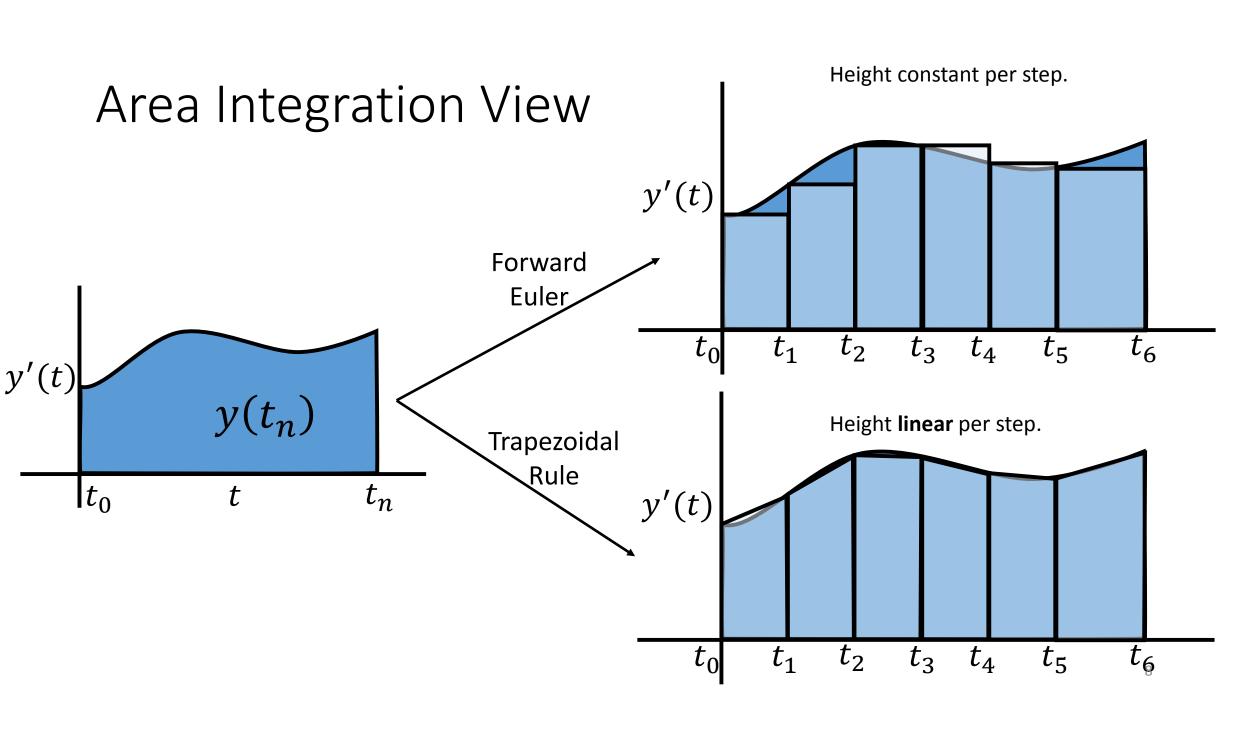
A: Evaluate the slope y' = f at the start **and** end of the time step, and step forward using the **average slope**.

# Trapezoidal Rule - Illustrated

$$y_{n+1} = y_n + \frac{h}{2} (f(t_n, y_n) + f(t_{n+1}, y_{n+1}))$$



Evaluate the slope y' = f at the start **and** end of the time step, and step along the **average slope**.



# Explicit v.s. Implicit Schemes

Forward Euler is an *explicit scheme*.

$$y_{n+1} = y_n + hf(t_n, y_n)$$

The right-hand-side involves only known, time  $t_n$  quantities. Plug in and directly evaluate!

Trapezoidal is an *implicit scheme*.

$$y_{n+1} = y_n + \frac{h}{2} (f(t_n, y_n) + f(t_{n+1}, y_{n+1}))$$

The right-hand-side involves some quantities from the (*currently unknown*) time  $t_{n+1}$ ?!

We just need to solve the implicit equation for  $y_{n+1}$ .

# Explicit v.s. Implicit Schemes - Tradeoffs

#### **Explicit**

- Simpler, and fast to compute *per step*.
- Less stable require smaller timesteps to avoid "blowing up". (More later.)

#### **Implicit**

- Often more complex and expensive to solve per step.
- More stable can safely take somewhat larger steps.

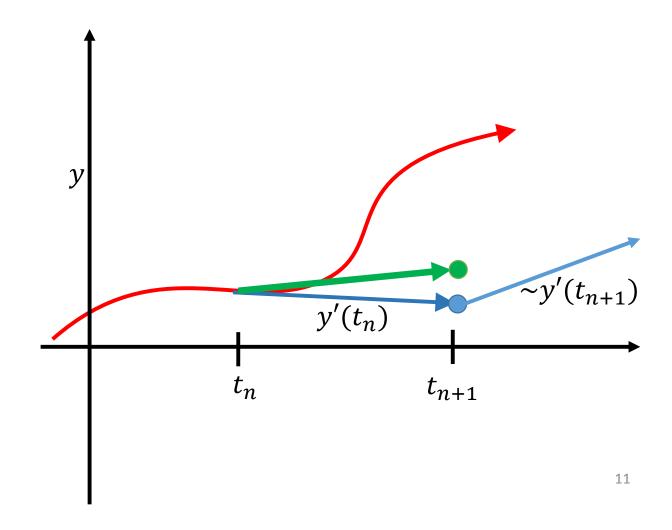
#### Which is more **computationally efficient**?

Problem-dependent – Tradeoff between solving the implicit equations for one large step v.s., versus cheaply computing many small steps.

# Making Trapezoidal Explicit?

Let's derive another scheme that avoids the "implicitness" of trapezoidal.

- Take a forward Euler step to estimate the unknown end point.
- 2. Evaluate slope there instead.
- 3. Use this *approximate* end-of-step slope in the trapezoidal formula.



# Modified / Improved Euler

This is exactly the idea behind the modified/improved Euler method!

#### This looks like:

1. 
$$y_{n+1}^* = y_n + hf(t_n, y_n)$$

2. 
$$y_{n+1} = y_n + \frac{h}{2} (f(t_n, y_n) + f(t_{n+1}, y_{n+1}^*))$$

Tentative Forward Euler step

Trapezoidal-*like* step, using approximate value  $y_{n+1}^*$ .

Improved Euler is an explicit scheme like F.E.:

No (potentially nonlinear, systems of) equations to solve.

### Error of Improved Euler

Like trapezoidal, improved Euler has local truncation error (LTE)  $O(h^3)$ .

- 1. Let's see this derivation.
- 2. Then we'll visualize how forward and improved Euler methods behave (in Matlab).
- 3. Finally, try applying it to the particle example from last time.