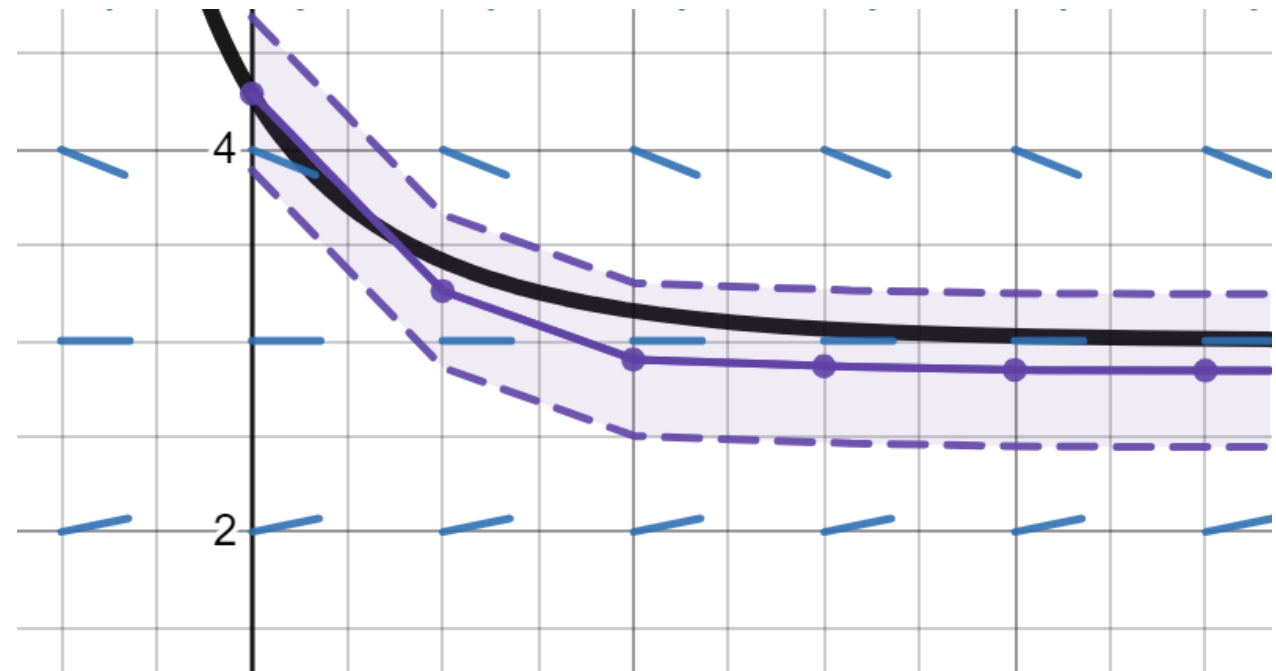


# Numerical Extension ODE in KeYmaera X

Evelyn Kuo



# Differential equations are fundamental to hybrid systems

$$\begin{cases} \frac{d}{dt}x(t) = f(t, x(t)) \\ x(t_0) = x_0 \end{cases}$$

- Differential equations model the physical world
- Initial value problem
- Analysis of differential equations
  - Mathematics: ODE theory (existence, uniqueness), numerical methods
  - Theorem provers: KeYmaera X

# Pros/Cons of KeYmaera X ODE Tactics

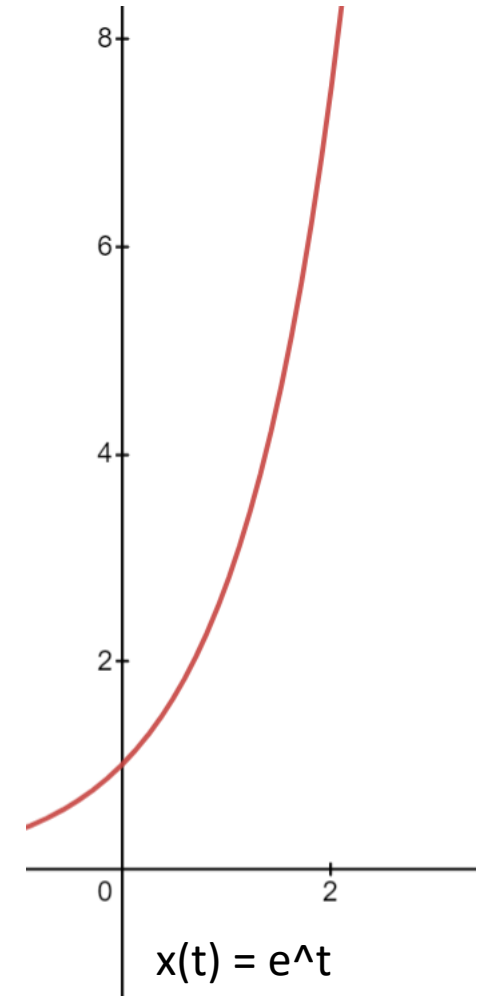
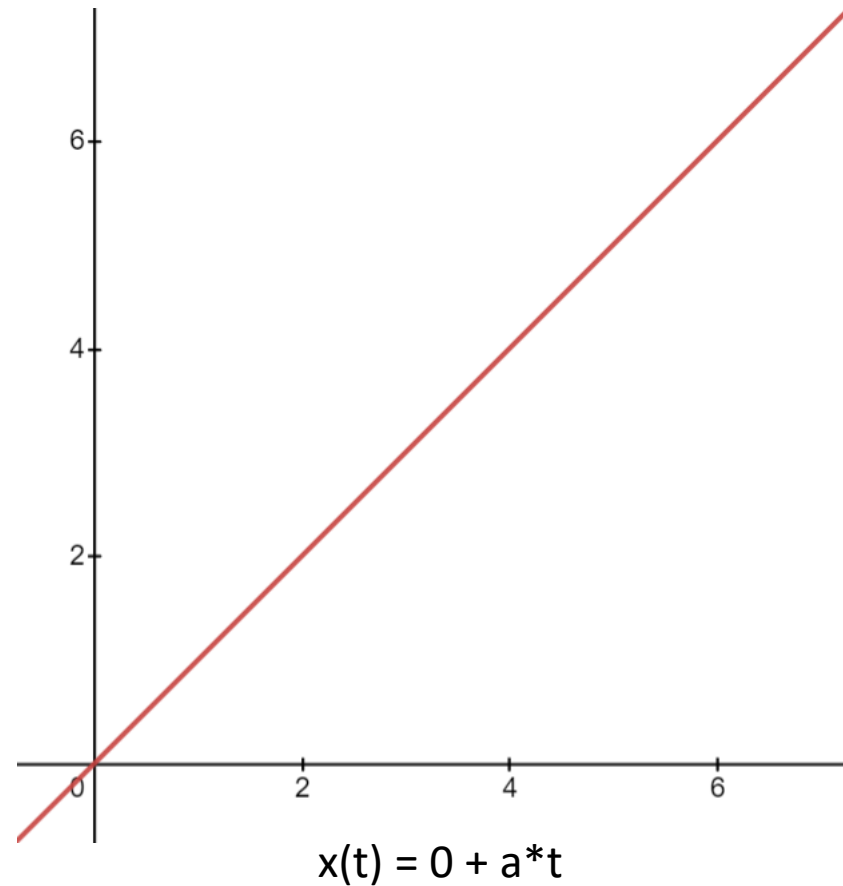
## Actual Solution

- Easy to prove things knowing exact solution

$$\{x' = a\}$$

- Not always easy to find or even represent solutions

$$\{x' = x\}$$



# Pros/Cons of KeYmaera X ODE Tactics

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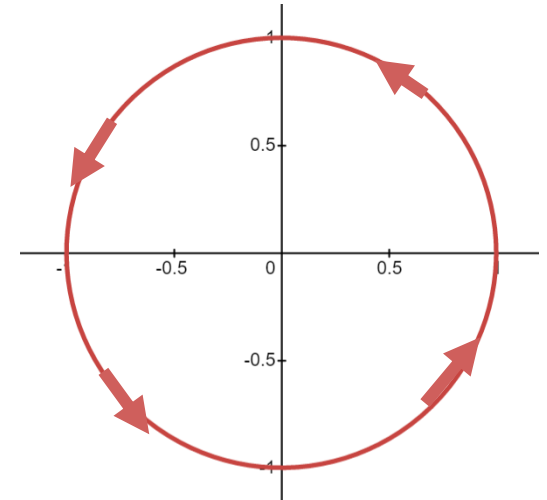
## Differential Invariant

- Analyze trends in how quantities change without knowing exact solution

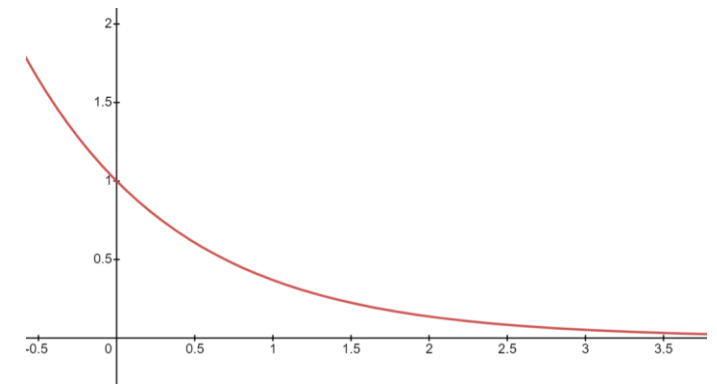
$$[\{x' = -y, y' = x\}] x^2 + y^2 = 1$$

- Trends may not help in proof

$$[\{x' = -x\}] x > 0$$

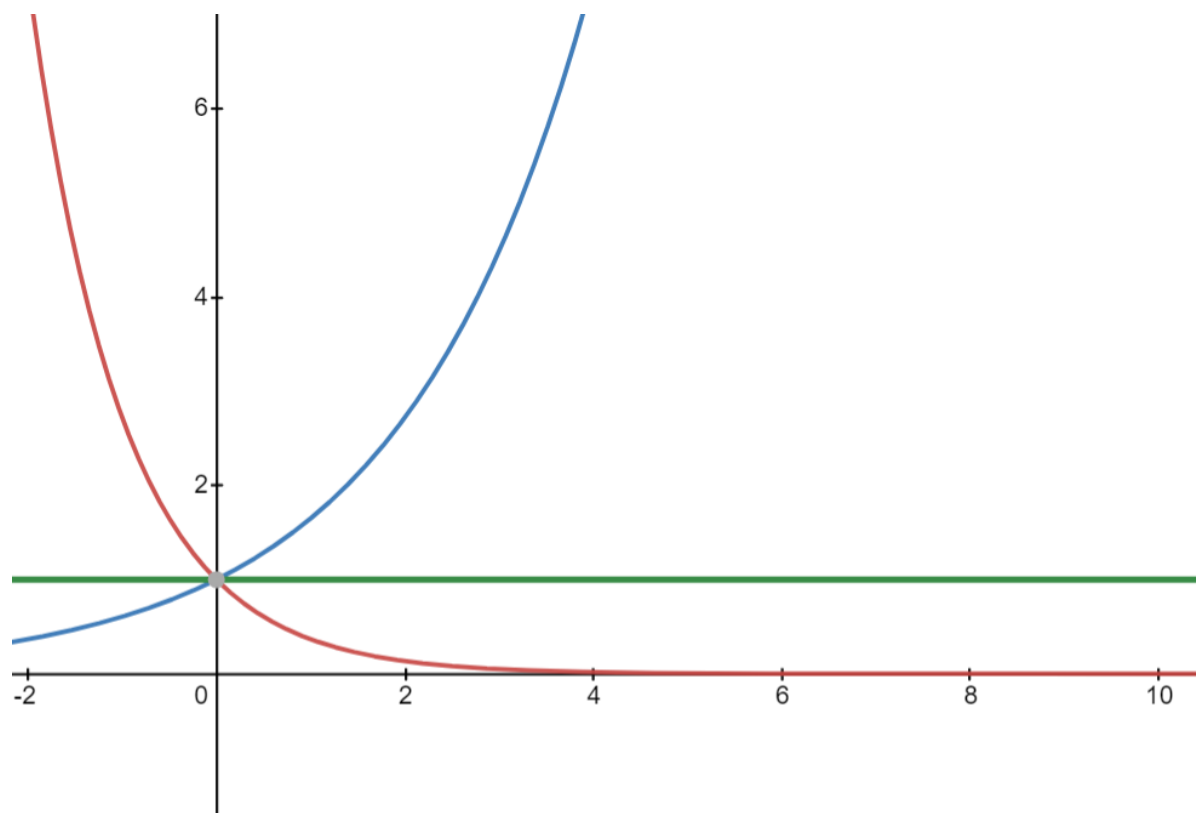


$$x(t) = \cos(t)$$
$$y(t) = \sin(t)$$



$$x(t) = e^{-t}$$

# Pros/Cons of KeYmaera X ODE Tactics



$$x(t) = e^{-t} \quad y(t) = e^{t/2} \quad x(t) * y(t)^2 = 1$$

## Differential Ghost

- Use ghost variable to analyze how quantities change without knowing exact solution

$$[\{x' = -x, y' = y/2\}] x * y^2 = 1$$

- Ghost variable solution needs to exist for at least as long as original diffeq

# Pros/Cons of KeYmaera X ODE Tactics

## Actual Solution

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## Differential Invariant

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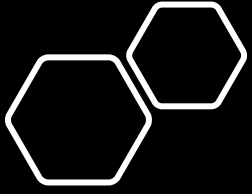
$$[\{x' = -x\}] x > 0$$

## Differential Ghost

- Use ghost variable to analyze how quantities change without knowing exact solution

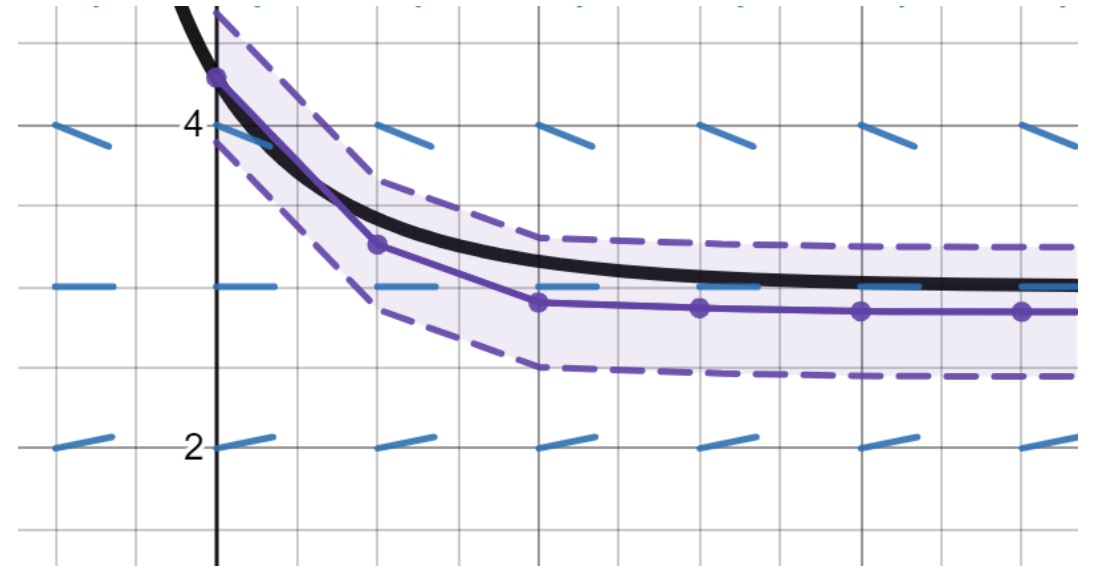
$$[\{x' = -x, y' = y/2\}] x * y^2 = 1$$

- Ghost variable solution needs to exist for at least as long as original diffeq



Numerical methods can offer approximate solutions which are almost like actual solutions

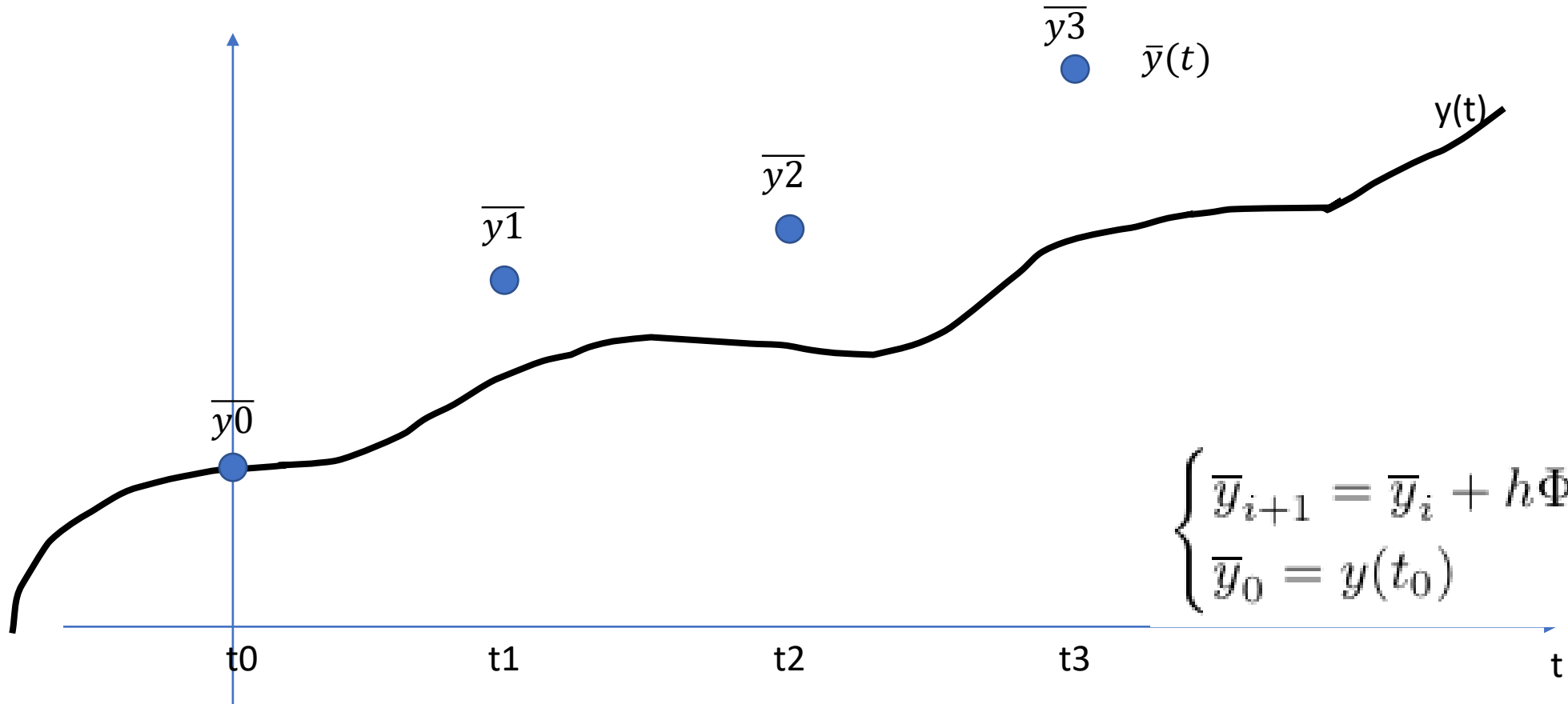
- Require timestep specification
- Symbolic initial value problem
- How to transform post conditions to account for error



$$\begin{cases} \bar{y}_{i+1} = \bar{y}_i + h\Phi(t_i, \bar{y}_i | h) \\ \bar{y}_0 = y(t_0) \end{cases}$$

# Theory: constructing approximations

- Given timestep  $h$ , numerical methods can yield discrete approximations

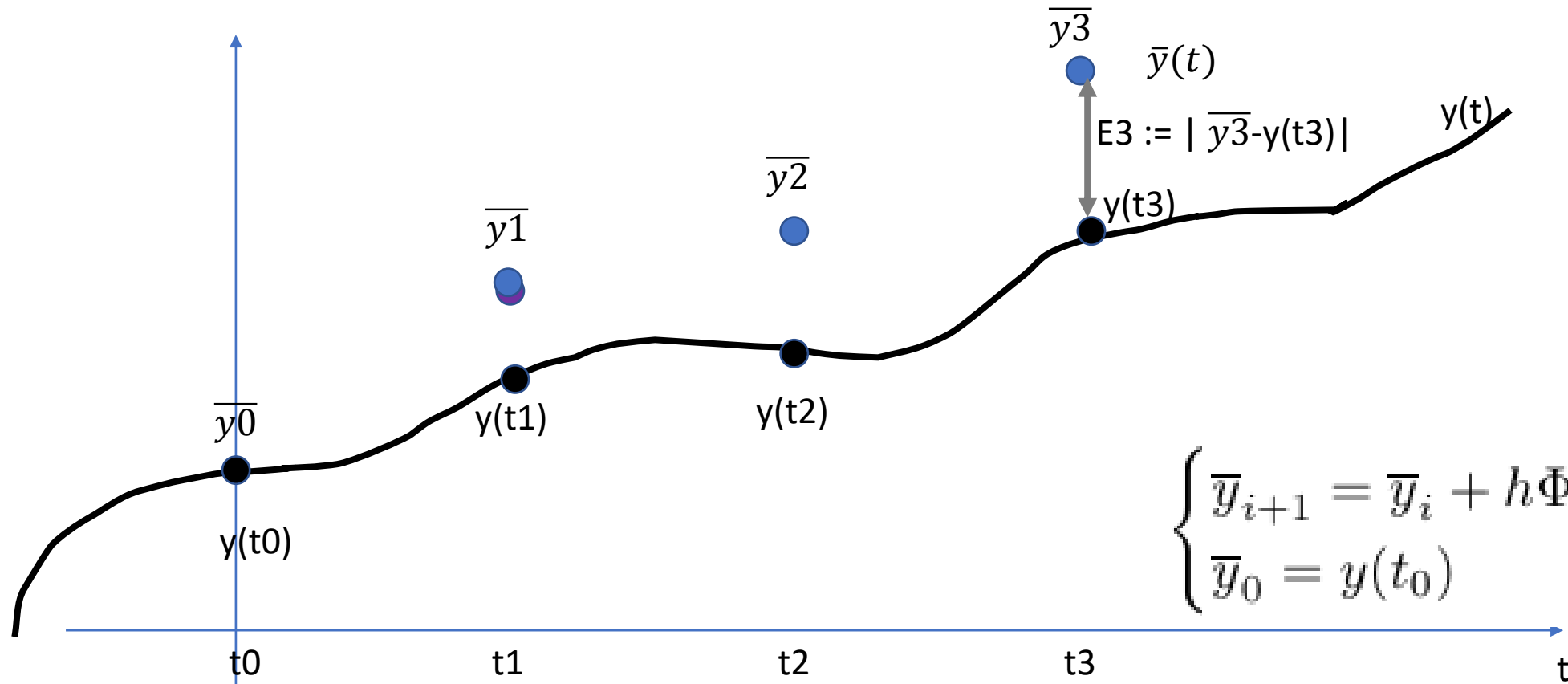


$$\begin{cases} \bar{y}_{i+1} = \bar{y}_i + h\Phi(t_i, \bar{y}_i | h) \\ \bar{y}_0 = y(t_0) \end{cases}$$



# Theory: global error of discrete approximation

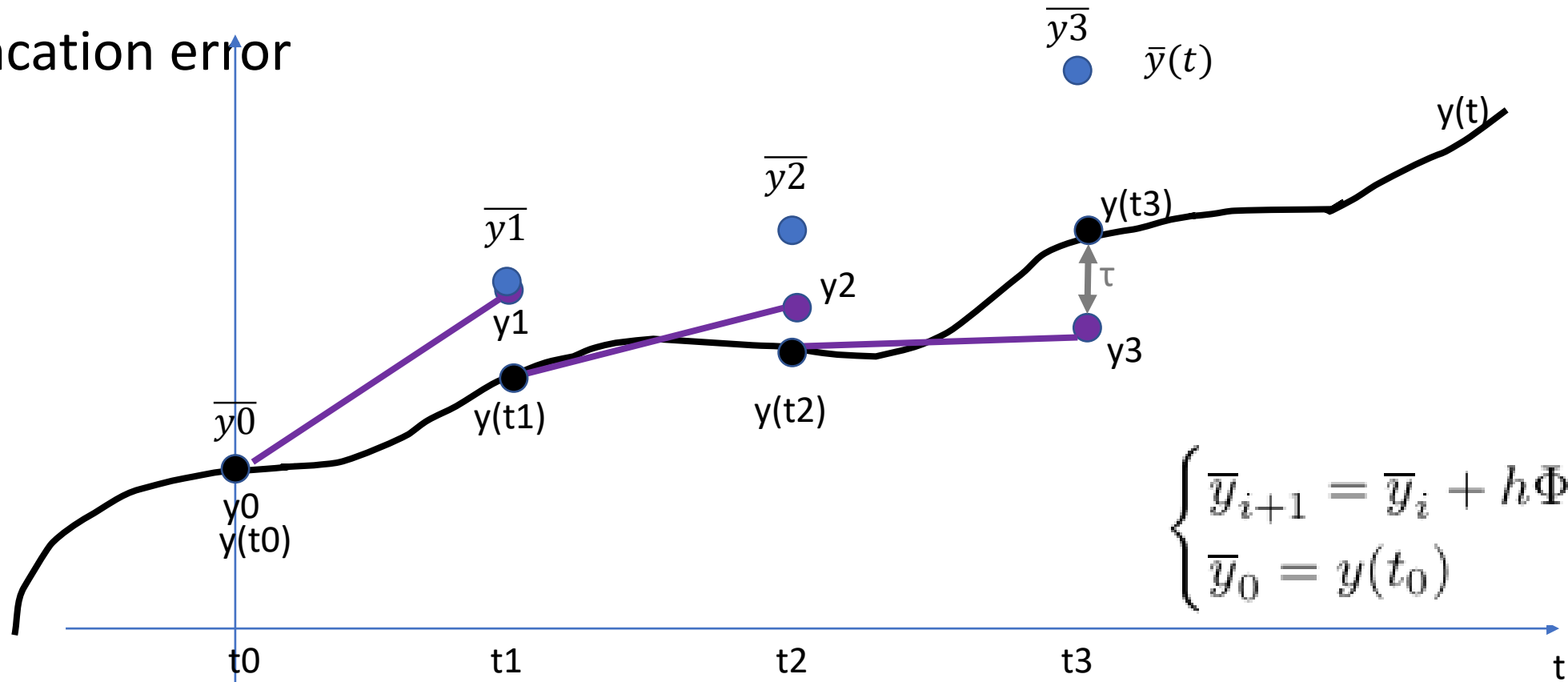
Define error  $E_i := |\bar{y}_i - y(t_i)|$ , want to find global bound on error



# Theory: global error of discrete approximation

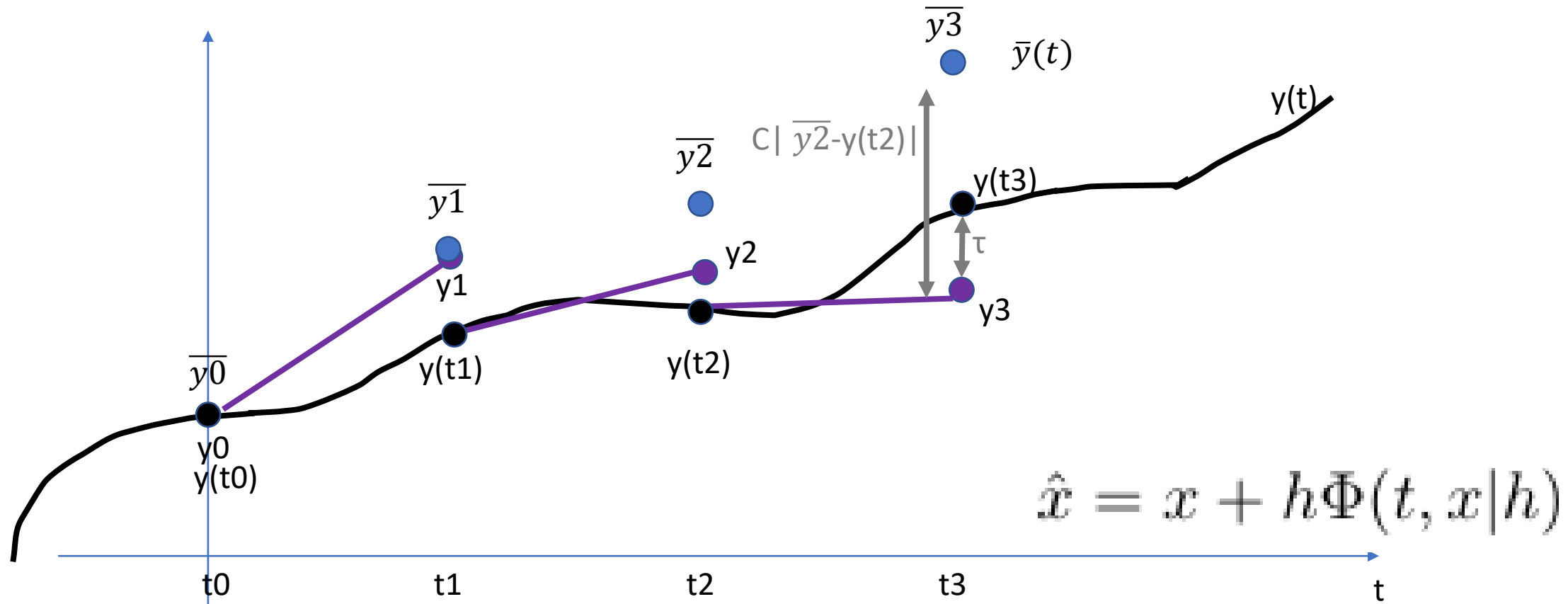
Introduce new sequence  $\{y(i+1) = y(t_i) + h\Phi(t_i, y(t_i)|h)\}$  (one step approximations

Truncation error



# Theory: global error of discrete approximation

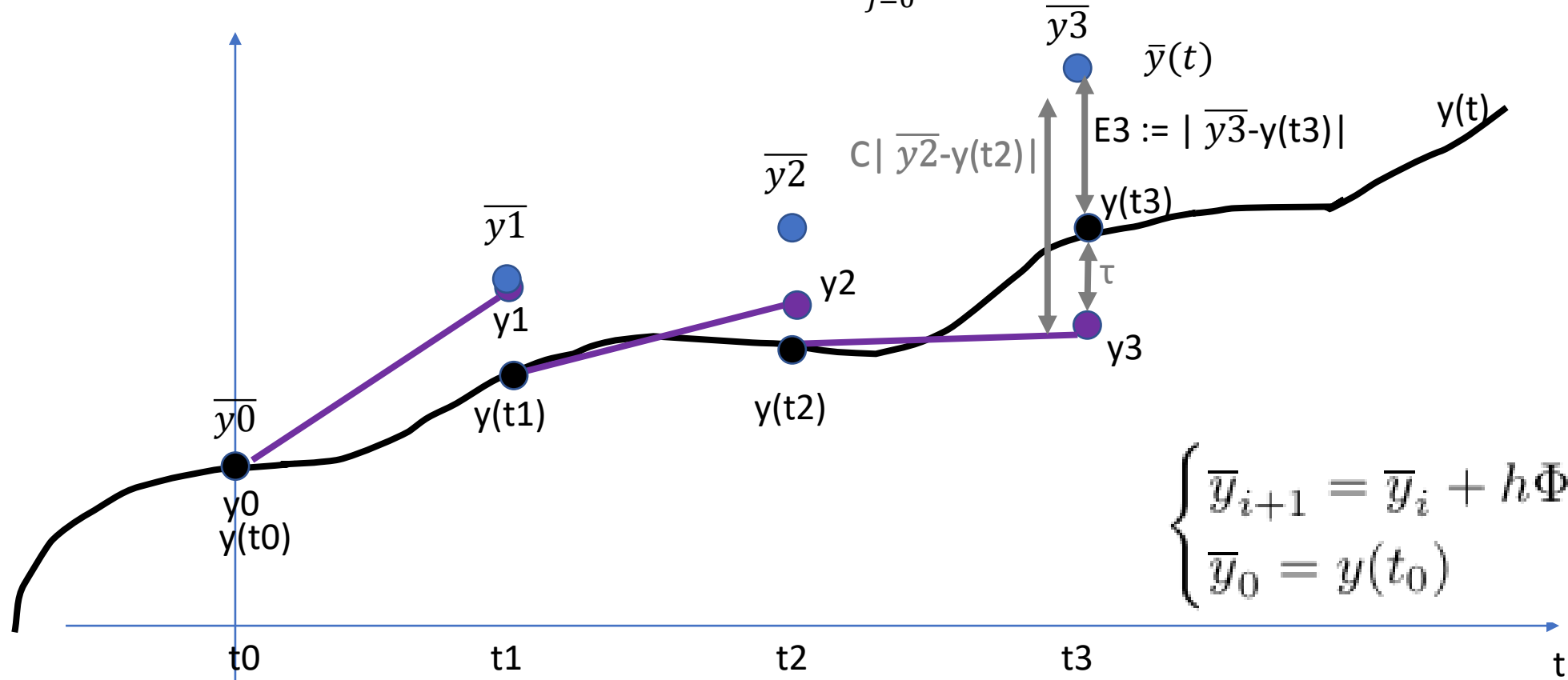
If  $\phi$  sufficiently nice, exists constant  $C$  such that  $|\hat{y} - \hat{z}| \leq |y - z|C$



# Theory: global error of discrete approximation

If  $N=T/h$ , global error of discrete approximation

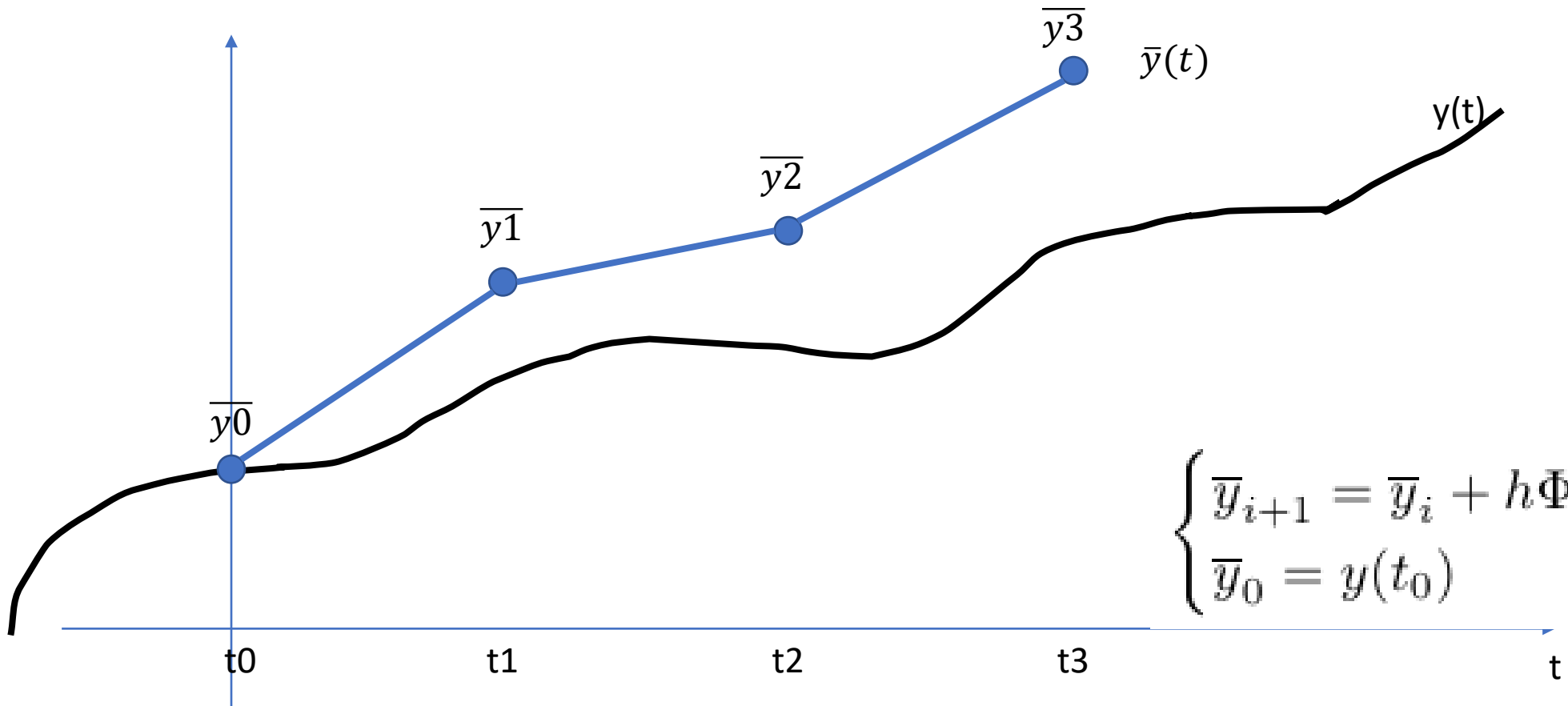
$$E_{i+1} \leq CE_i + \tau \leq C^{i+1}E_0 + \tau \sum_{j=0}^{i-1} C^j \leq \tau \frac{C^N - 1}{C - 1}$$



$$\begin{cases} \bar{y}_{i+1} = \bar{y}_i + h\Phi(t_i, \bar{y}_i | h) \\ \bar{y}_0 = y(t_0) \end{cases}$$

# Theory: constructing approximations

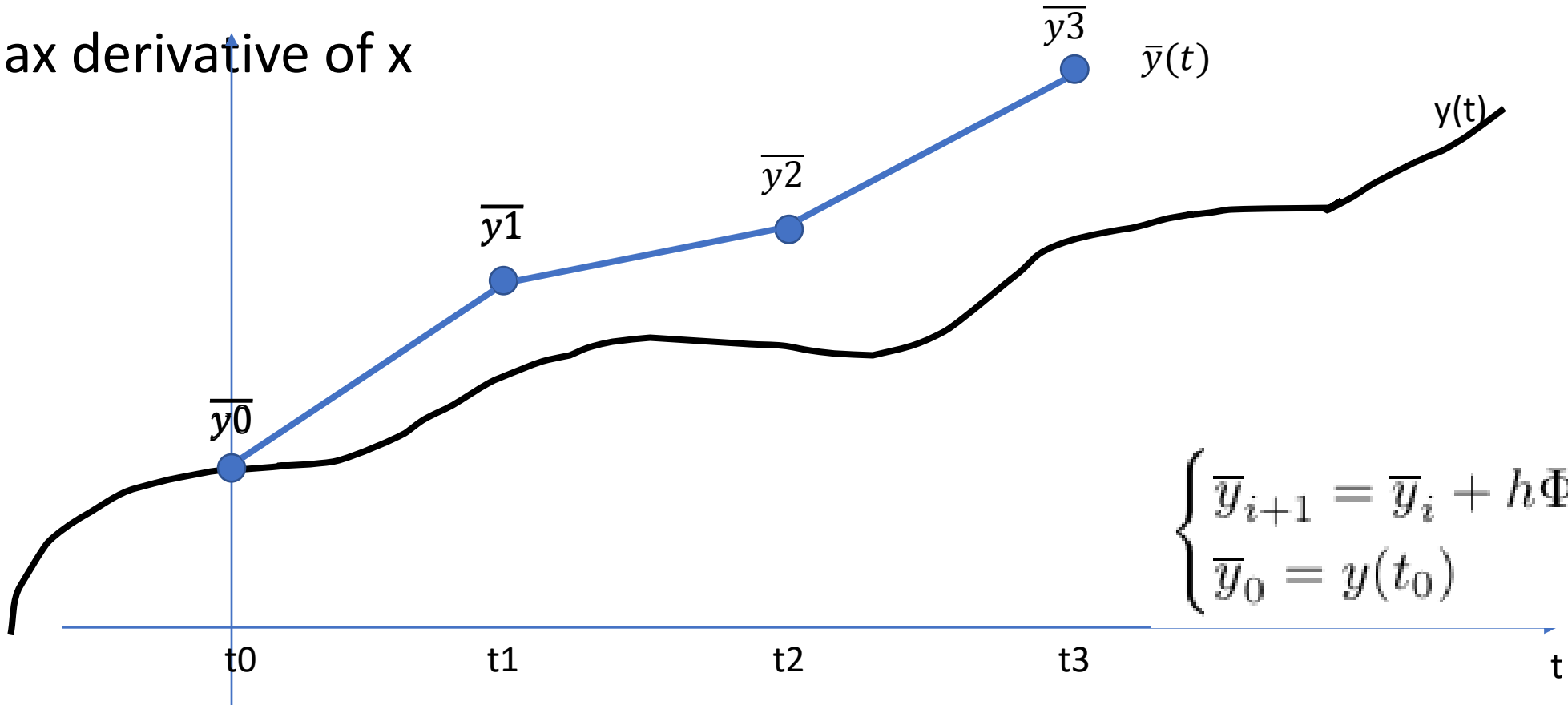
- Use linear interpolation to convert to continuous approximations



# Theory: global error of continuous approximation

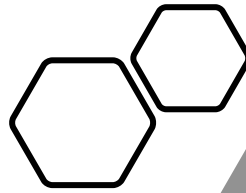
If  $\epsilon_a$  is discrete approximation error, then continuous approximation error of linear interpolation is bounded by  $\epsilon_a + hL$

L: max derivative of x



$$\begin{cases} \bar{y}_{i+1} = \bar{y}_i + h\Phi(t_i, \bar{y}_i | h) \\ \bar{y}_0 = y(t_0) \end{cases}$$

# Theory: global error



global error of  
continuous  
approximation  
 $\epsilon_a + hL$

Putting it together

If desired error bound is  $\epsilon$ ,

Solve for h

$$\epsilon = \tau \frac{C^N - 1}{C - 1} + hL$$

global error of discrete  
approximation

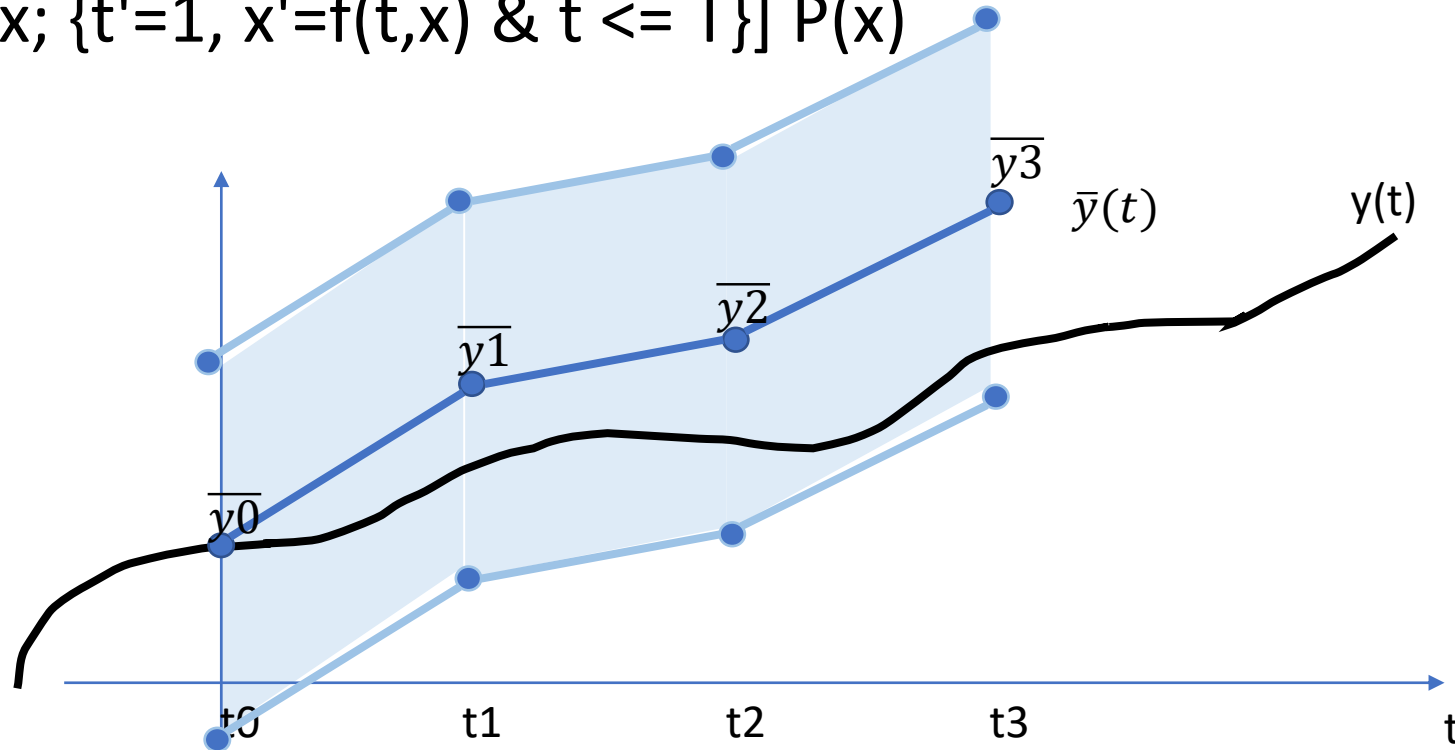
$$\epsilon_a \leq \tau \frac{C^N - 1}{C - 1}$$

# Theory: Proof Rule

$\exists e > 0 \forall t (0 \leq t \leq T \ \& \ |x - x_{\text{approx}}(x_0, t, \epsilon)| < e \rightarrow P(x))$

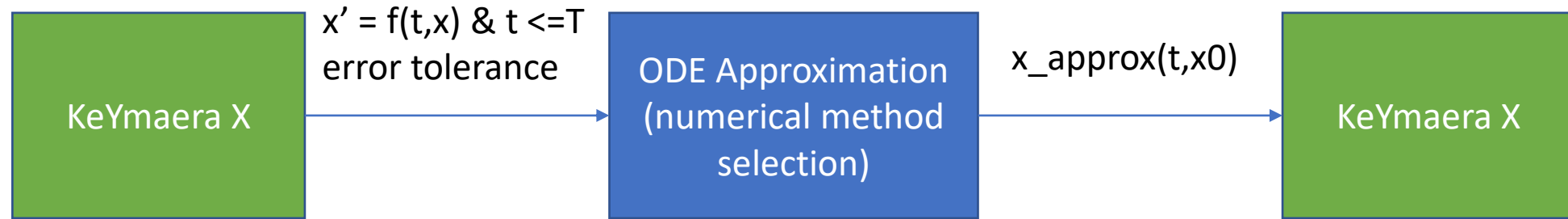
----- [dApprox]

$[t := 0; x_0 := x; \{t' = 1, x' = f(t, x) \ \& \ t \leq T\}] P(x)$

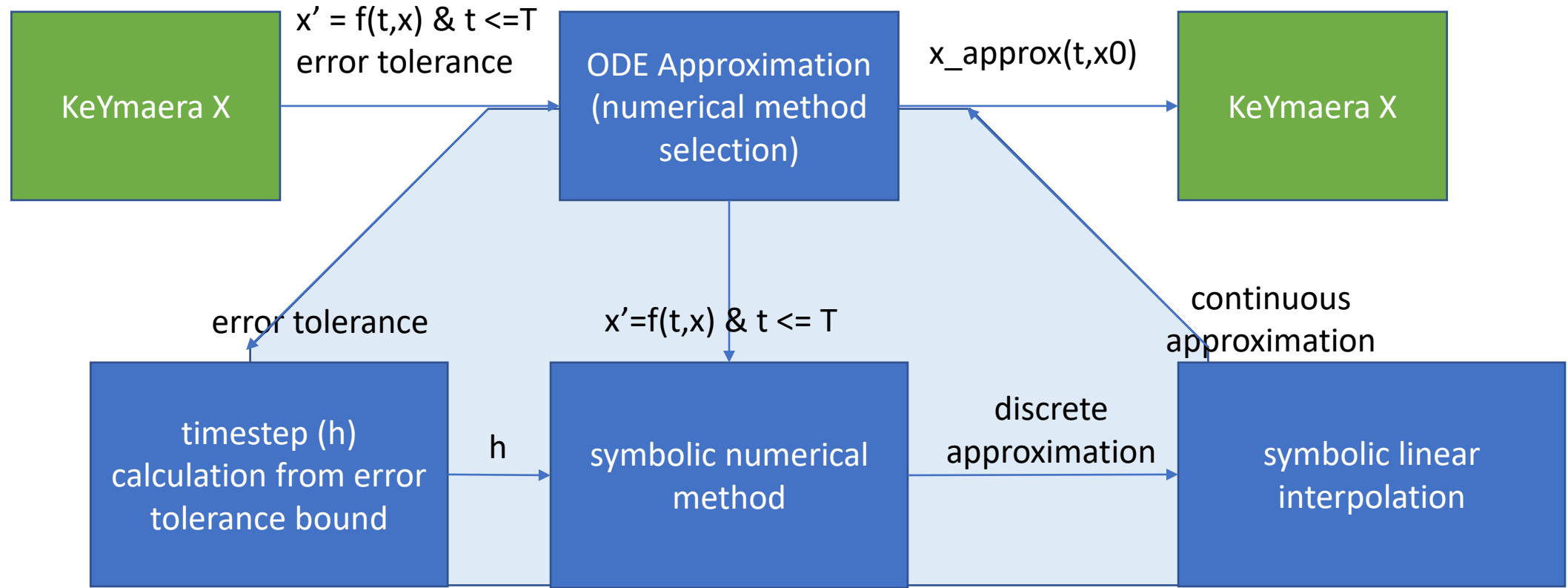


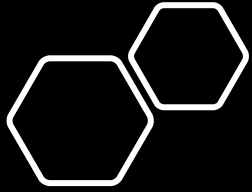


# Implementation:



# Implementation:





# Discussion and Further Work

- Comparison of existing KeYmaera X tools for analyzing ODEs
- Theory of how to convert desired error tolerance into continuous approximation
- Implementation
  
- Convert python function into KeYmaera X function
- Handle non-initial value symbols in function  $x'=f(t,x)$
- Extend to other numerical methods

