

# Aerial Robotics Path Planning IV

Prof. Arthur Richards

# Optimal Control

- Construct a mathematical model of my problem
- Need functions that define:
  - How drone responds to controls (dynamics)
  - Limits on drone flight envelope
  - Limits on flight regions (inc. obstacles)
  - Quality of a chosen path
- Hand all of these to an **optimizer** to find an answer
- Transcription problem: how to encode the control?

# Optimal Control

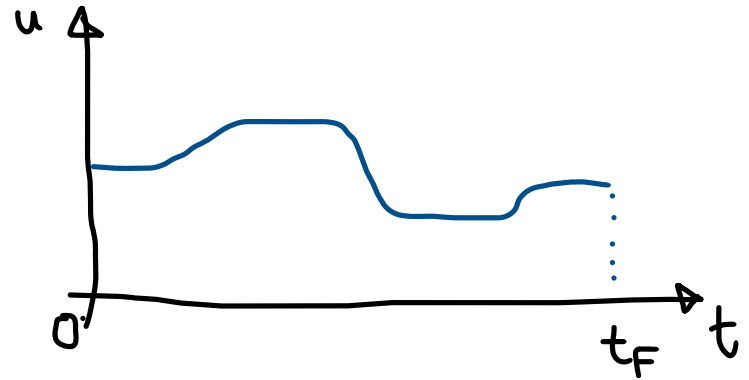
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$$\dot{x} = f(x, u)$$

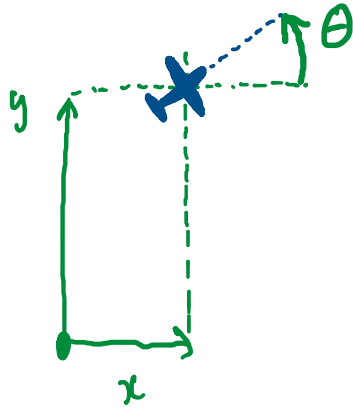
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# Typical Dynamics



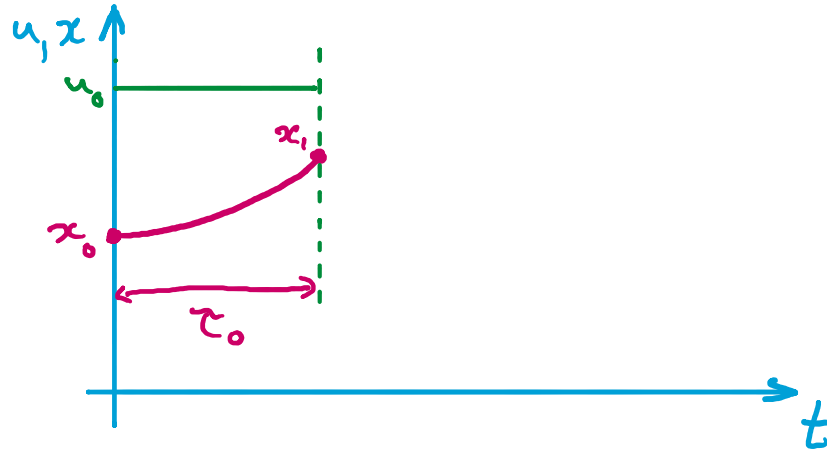
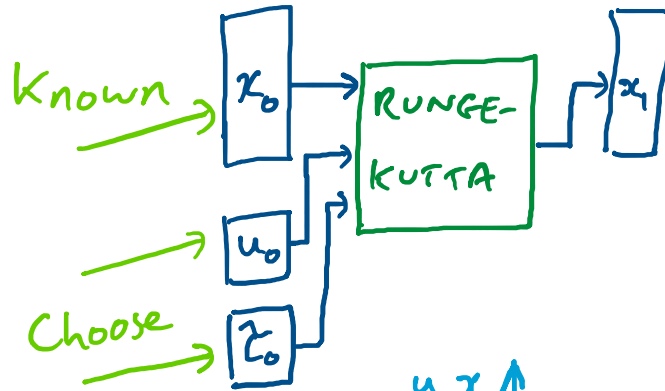
$$\dot{x} = v \cos \theta$$

$$\dot{y} = v \sin \theta$$

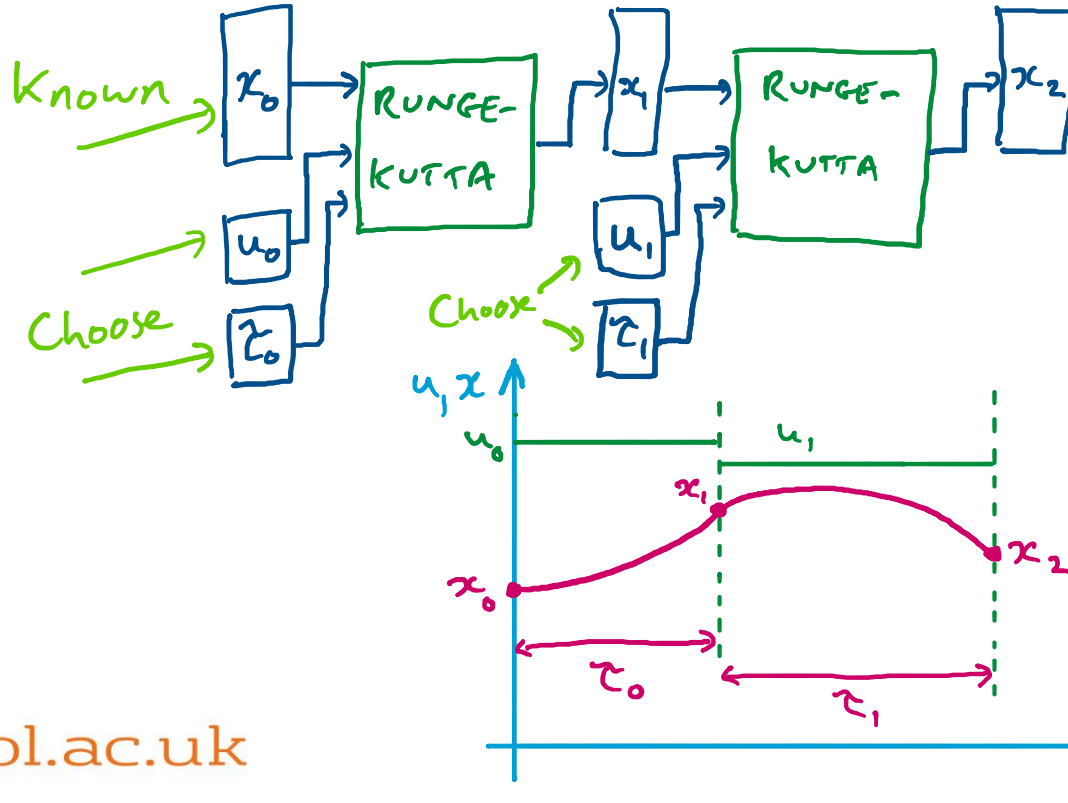
$$\dot{\theta} = vk \quad \leftarrow \text{curvature}$$

$$\underline{x} = \begin{pmatrix} x \\ y \\ \theta \end{pmatrix} \quad \underline{u} = \begin{pmatrix} v \\ k \end{pmatrix}$$

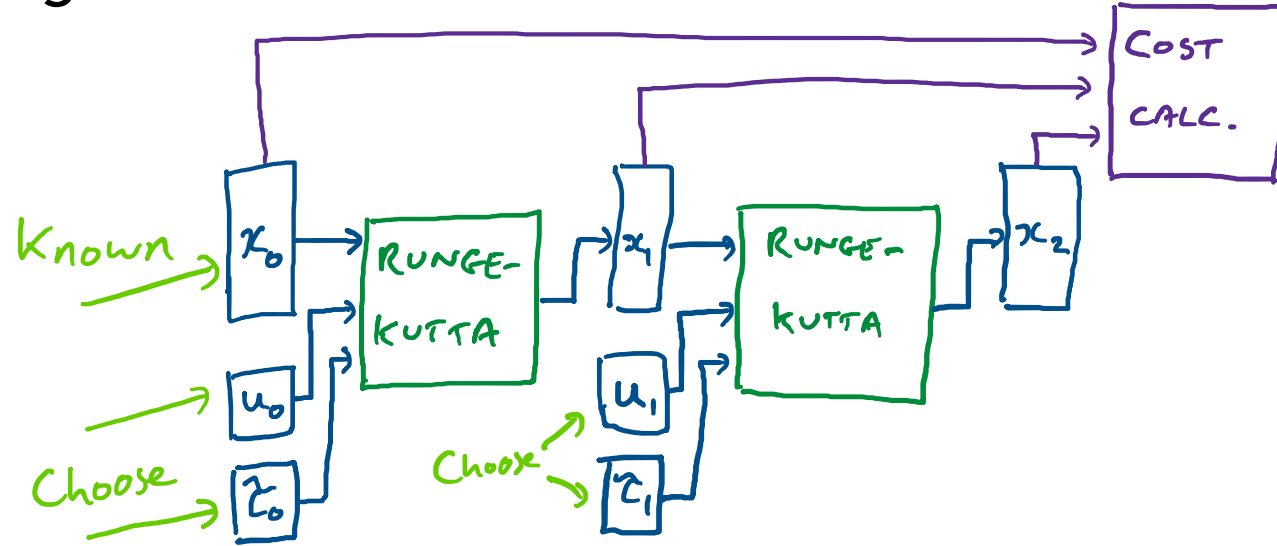
# Shooting Method



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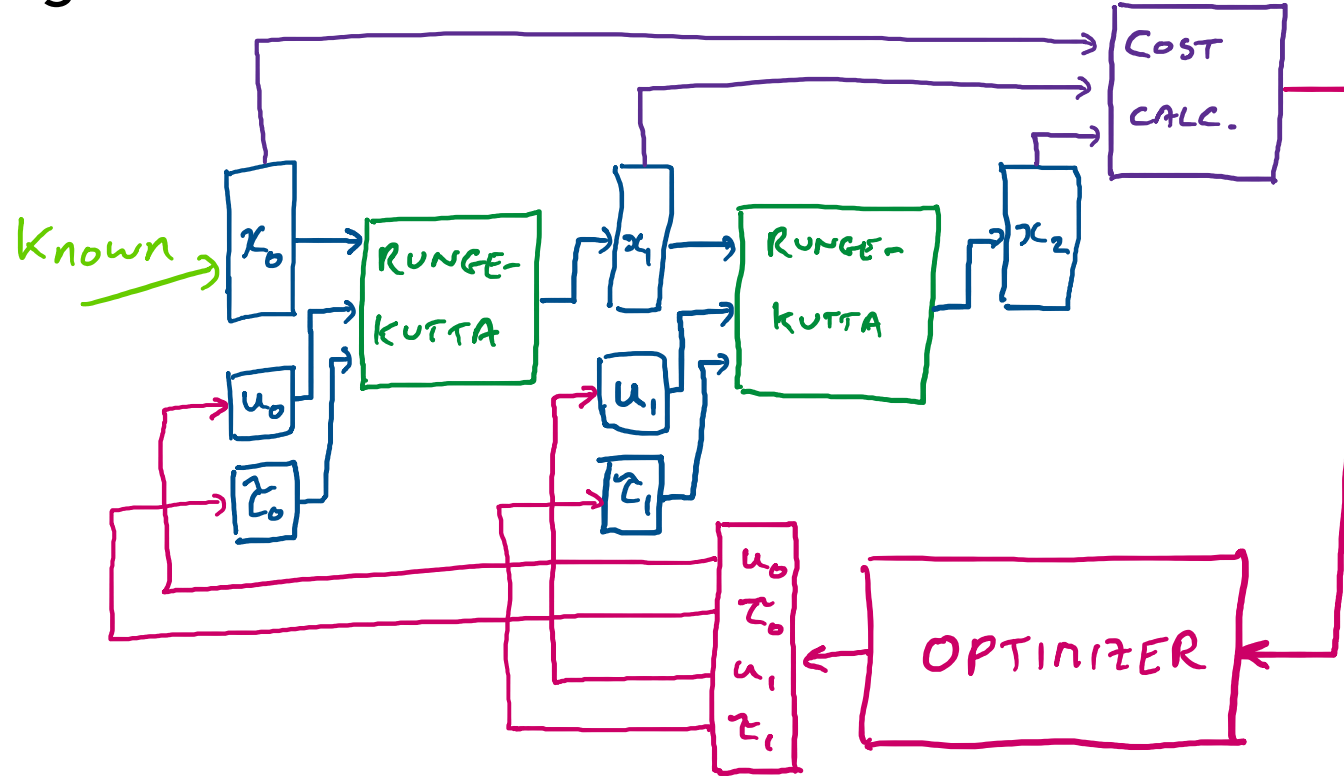


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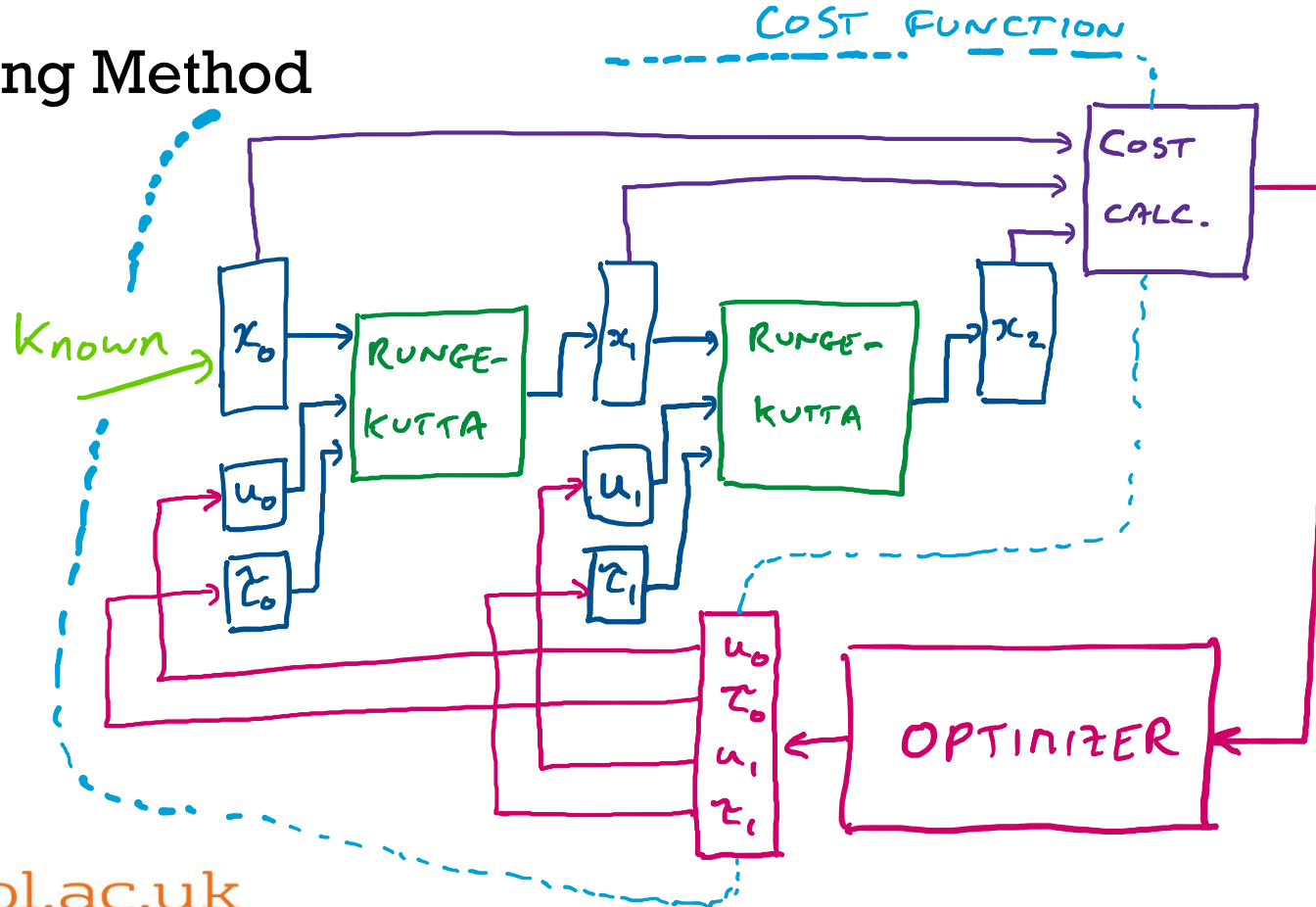




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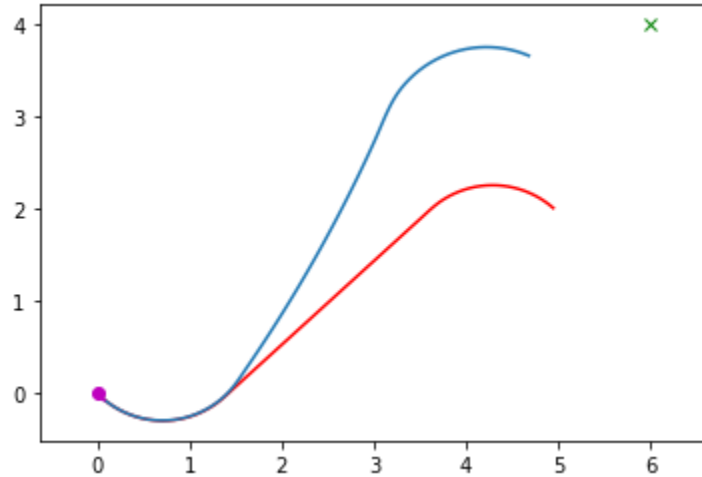
## Typical Cost

$$J = \underbrace{\tau_0 + \tau_1}_{\text{TIME OF FLIGHT}} + w_f \underbrace{\|x_2 - x_{\text{GOAL}}\|}_{\text{DISTANCE FROM GOAL AT END}}$$

$w_f \gg 1$  (i.e. big!)  
 $\Rightarrow$  TOP PRIORITY TO REACH GOAL

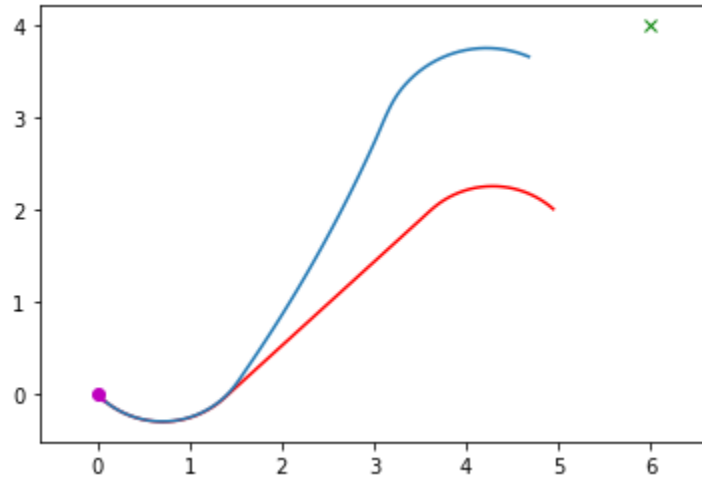
# Shooting Method Results

- Disappointing at first...

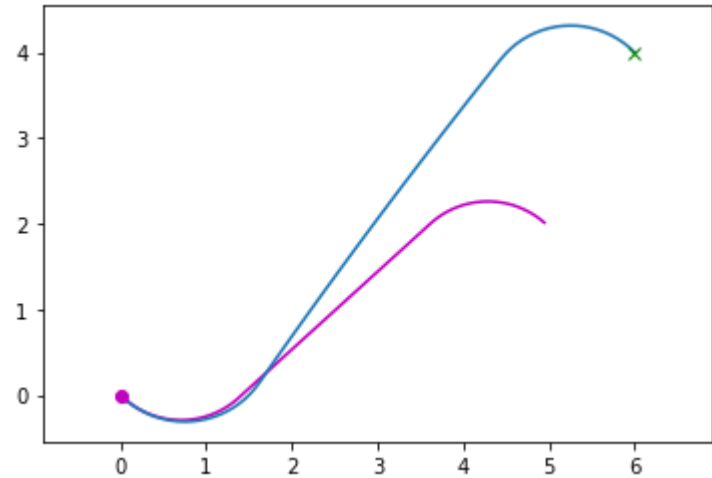


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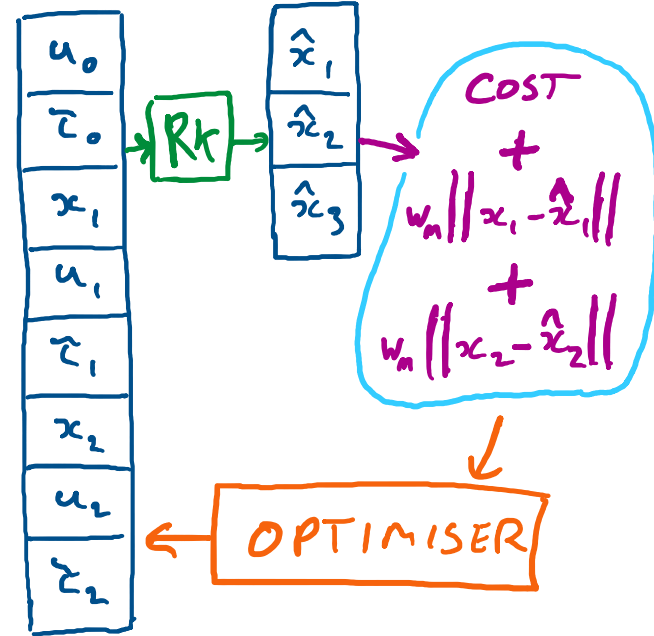
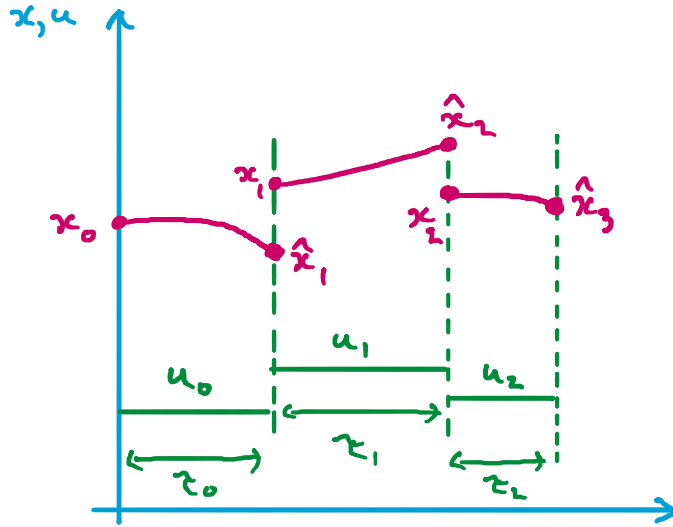
- Disappointing at first...



- ...but better with a bit of tuning



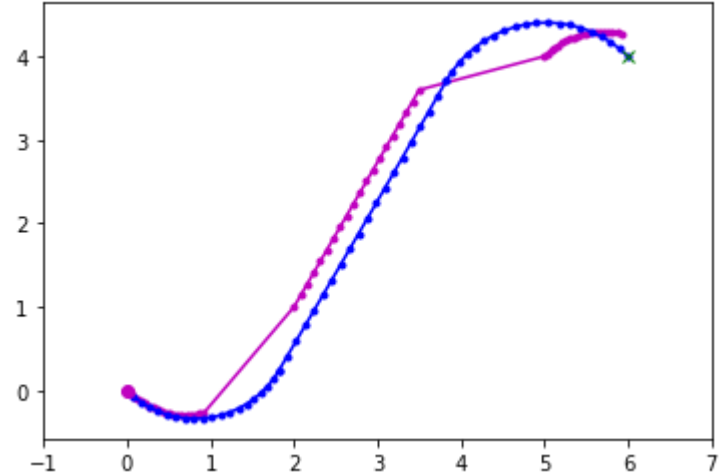
# Multiple Shooting



- PRIORITIES:
- ① CLOSE  $x - \hat{x}$  GAPS
  - ② REACH GOAL
  - ③ MINIMIZE FLIGHT TIME

# Multiple Shooting Results

- Much better!



- Weird! More decision variables yet better outcome
  - Structure in the problem helps

## Multiple Shooting with Avoidance

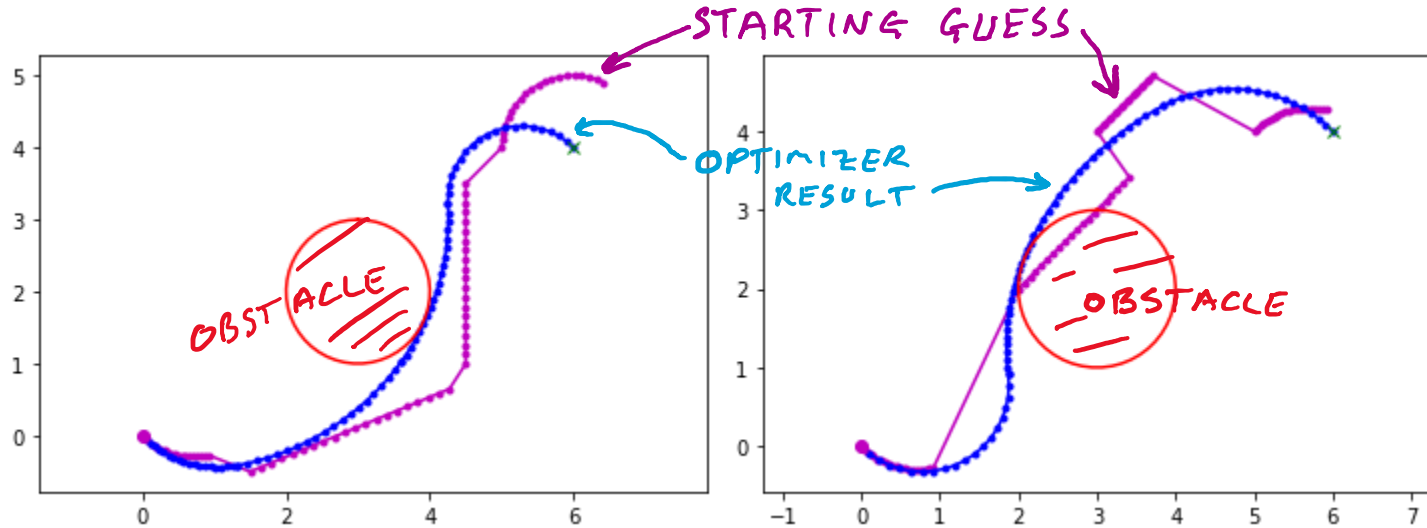
$$\begin{aligned} \text{Cost} = & \sum \tau_i \quad \leftarrow \text{minimize time} \\ & + w_f \|\hat{x}_3 - x_4\| \quad \leftarrow \text{reach goal} \\ & + w_m \|\hat{x}_2 - x_2\| + w_m \|\hat{x}_1 - x_1\| \quad \leftarrow \text{no gaps} \\ & + w_a \sum_i \max \{R_o - \|x_i - C_o\|, 0\} \quad \leftarrow \begin{array}{l} \text{stay } R_o \\ \text{away from } C_o \end{array} \end{aligned}$$

↑  
all the little points from RK output

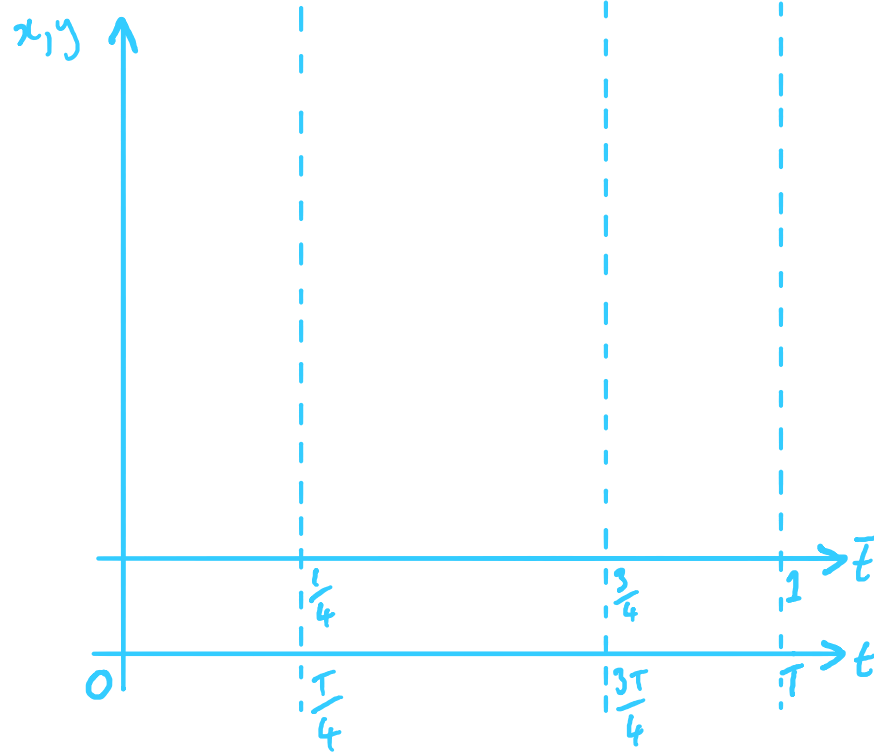


# Multiple Shooting with Avoidance

- Works OK. Notice that optimization is only **local**.



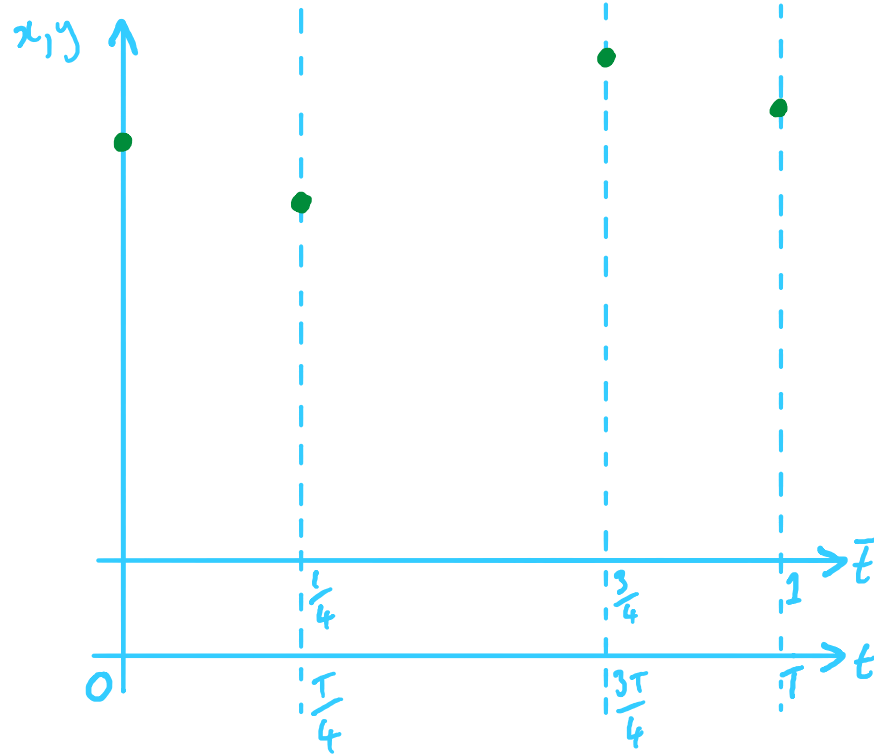
# Collocation



Choose:

- Time scale  $T$

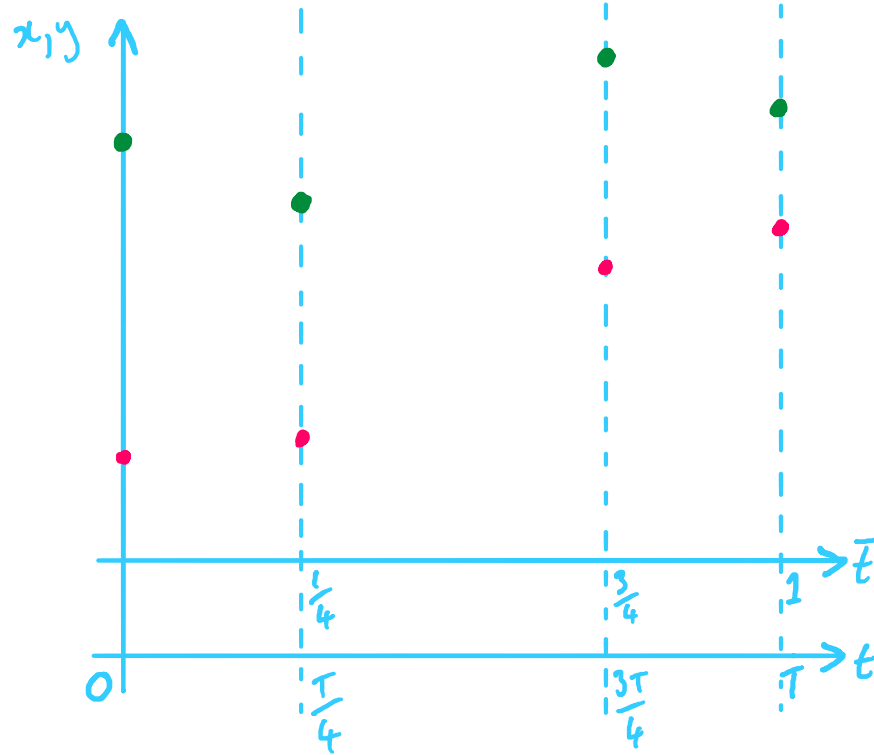
# Collocation



Choose:

- Time scale  $T$
- Four 'x' points

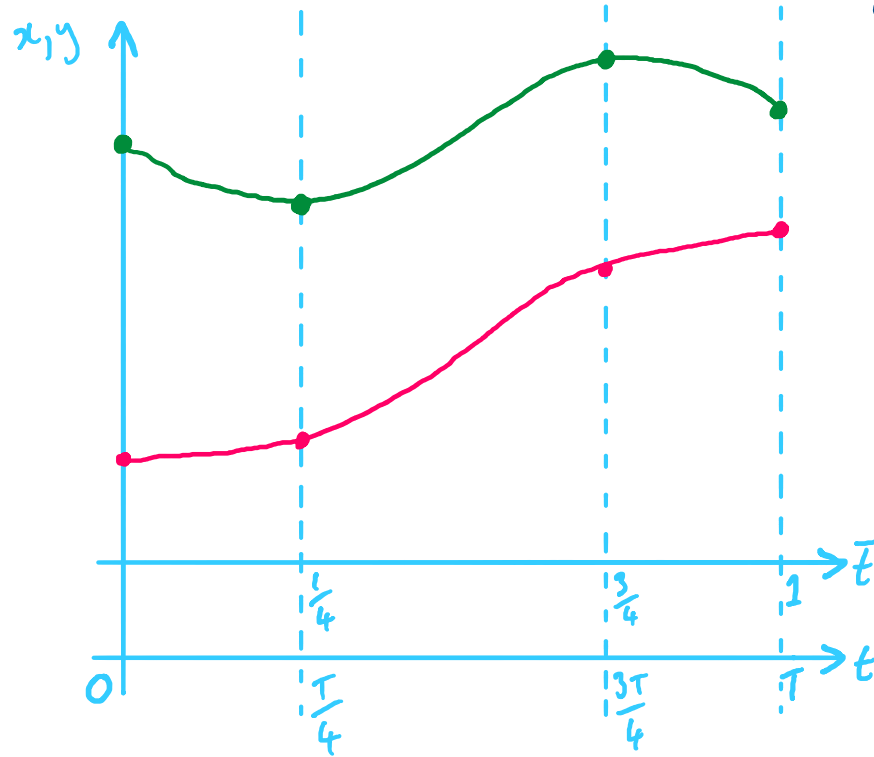
# Collocation



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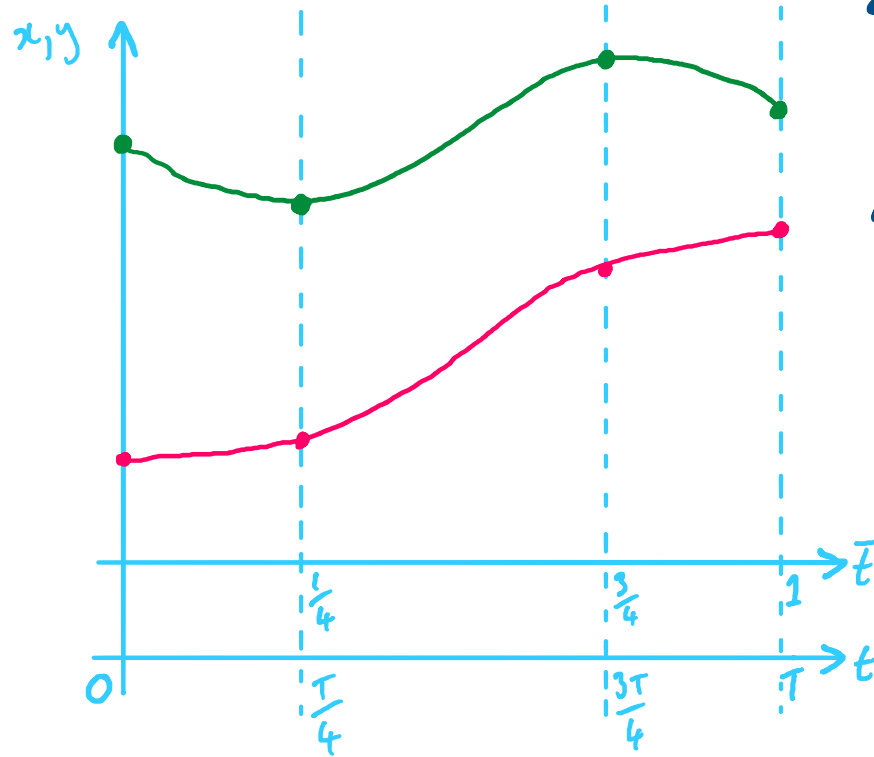
- Time scale  $T$
- Four 'x' points
- Four 'y' points

# Collocation



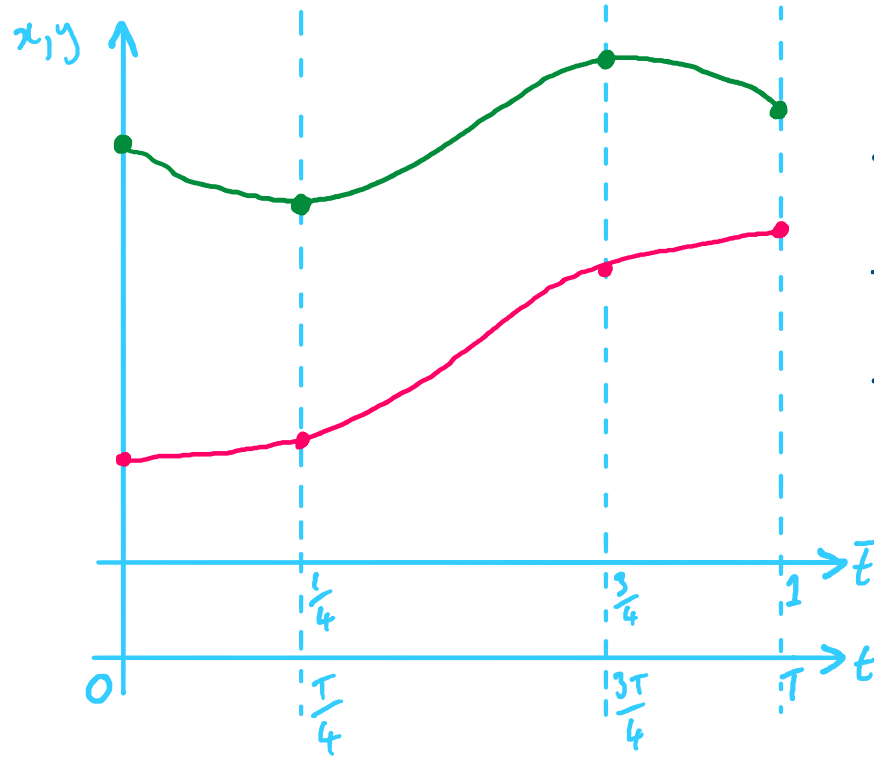
- Fit cubic curves to  $x, y$

# Collocation



- Fit cubic curves to  $x, y$
- Calculate derivatives:  $\dot{x}, \dot{y}, \ddot{x}, \ddot{y}$

# Collocation



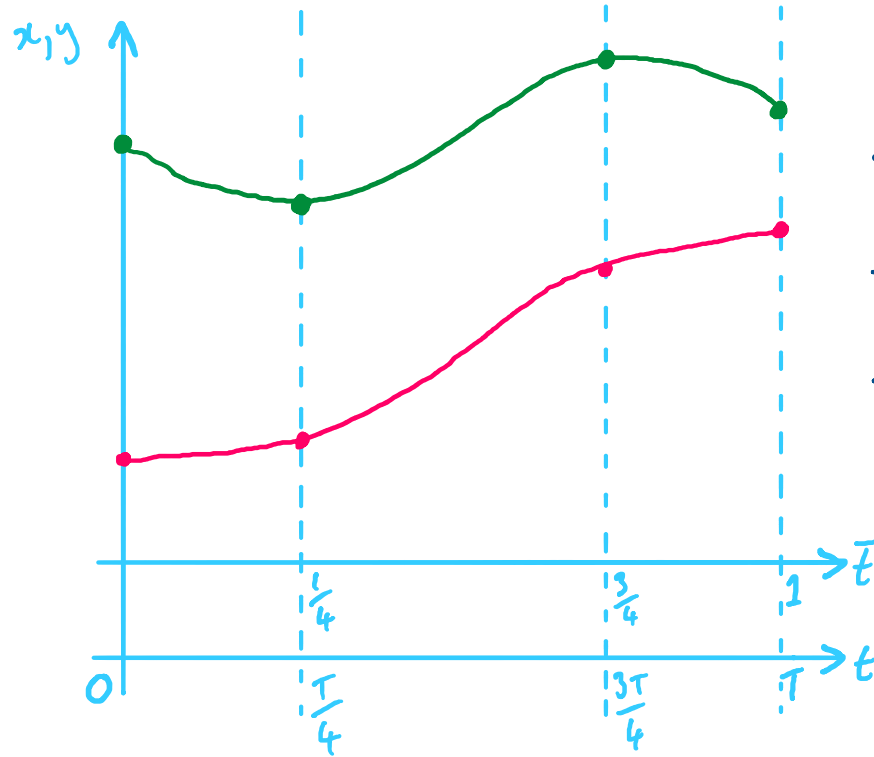
- Get states + inputs :

$$\rightarrow \theta = \tan^{-1}(\dot{y}/\dot{x})$$

$$\rightarrow v = \sqrt{\dot{x}^2 + \dot{y}^2}$$

$$\rightarrow k = \frac{\dot{x}\ddot{y} - \dot{y}\ddot{x}}{v^3}$$

# Collocation



- Get states + inputs :

$$\rightarrow \theta = \tan^{-1}(\dot{y}/\dot{x})$$

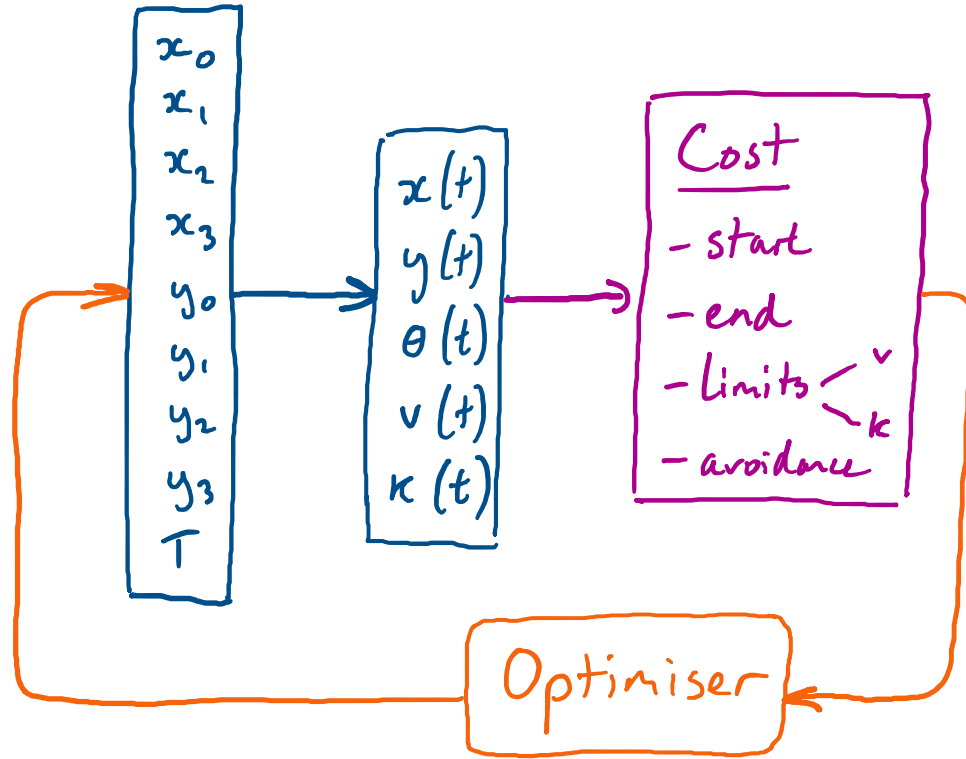
$$\rightarrow v = \sqrt{\dot{x}^2 + \dot{y}^2}$$

$$\rightarrow k = \frac{\dot{x}\ddot{y} - \dot{y}\ddot{x}}{v^3}$$

Know whole trajectory!



# Collocation



# Collocation

- Good results, fast
- Quite robust
- Not quite as flexible as shooting

