

機械手臂 軌跡規劃 Manipulator Trajectory Planning

林沛群

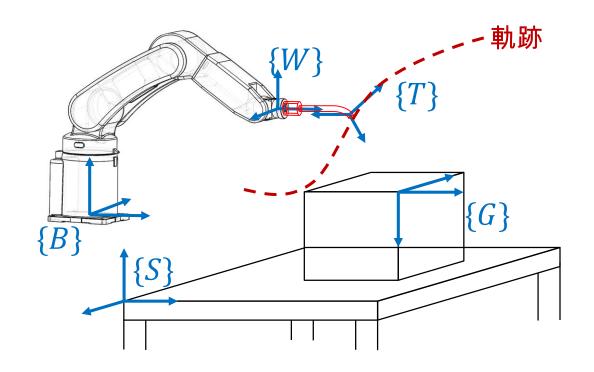
國立台灣大學機械工程學系



引言-1

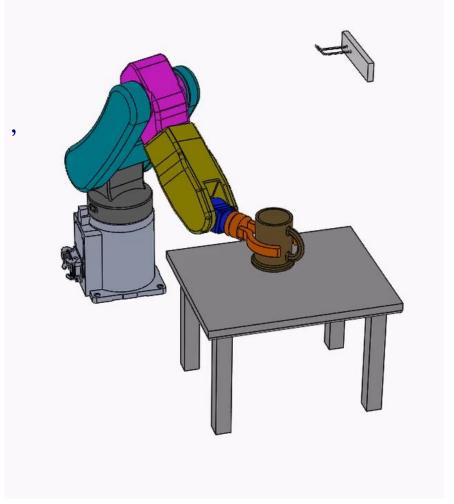
- □ 軌跡:機械手臂(的末端點或操作點)的位置、速度、加速 對對時間的歷程
- □ 可進一步定義成 {T}相對{G}的狀態歷程

和手臂種類無關, $\{G\}$ 也可隨時間變動(如輸送帶)



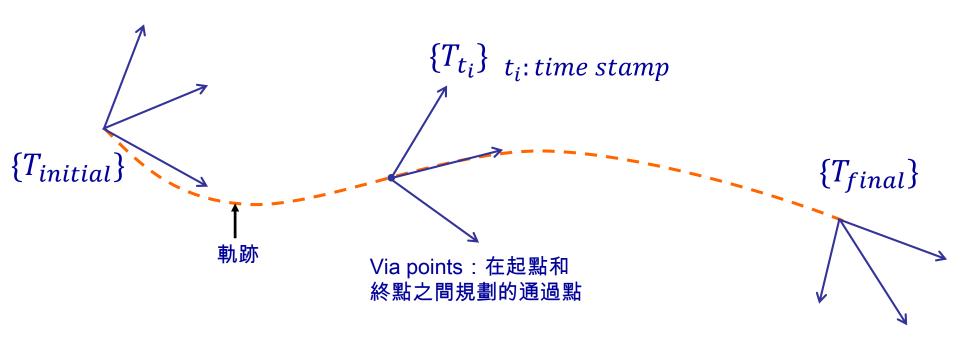
引言-2

- □ 物件取放任務中手臂末端點(或物件)的運動歷程,即是軌 跡規劃所進行的內容
 - ◆ Example情境:
 - ◆機械手臂夾住放在桌上的杯子,移動手臂將杯子掛到牆上的杯架



□ 理想軌跡: Smooth path (i.e., continuous with continuous first derivative)

常常為 GT





Joint-space下的軌跡規劃 -1

□步驟

• 定義 $\{T\}$ 相對於 $\{G\}$ 的initial, via, & final points, G_TT_i (包含移動和轉動自由度)

i=1 initial i=2~N-1 via points i=N+1 final

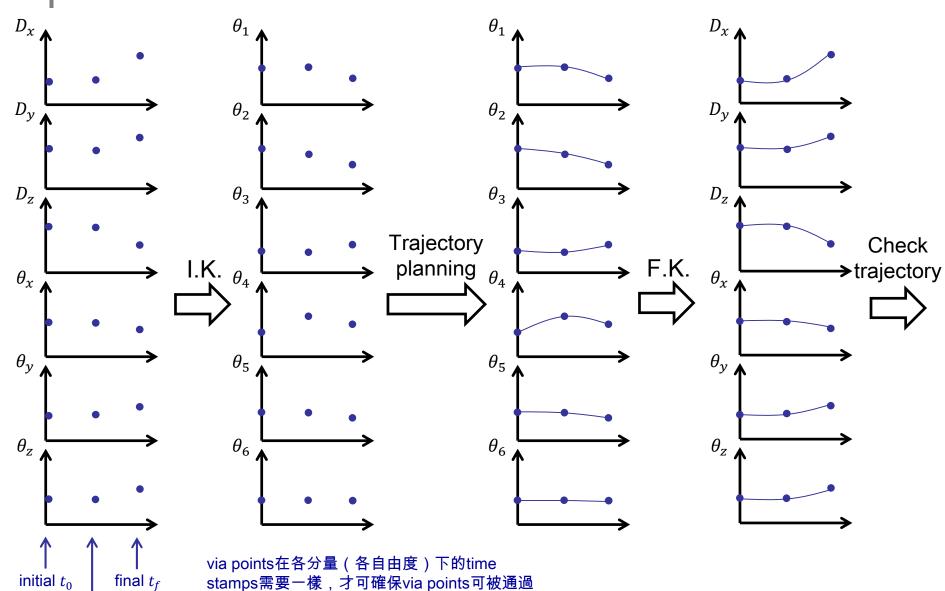
將
$$_{T}^{G}T_{i}$$
 以6個參數方式來表達 $_{T}^{G}X_{T}=\begin{bmatrix} {}^{G}P_{T\ org} \\ ROT({}^{G}\widehat{K}_{T},\theta) \end{bmatrix}$ 非rotation matrix的方式表達

- ◆ Inverse kinematics: 將手臂末端點狀態轉換到joint狀態: ${}^GX_T \to \Theta_i$
- ◆ 對所有joints規劃smooth trajectories
- ◆ Forward Kinematics:將joint狀態轉換到手臂末端點狀態,檢查莫短點在Cartesian-space下軌跡的可行性



via point t_i

Joint-space下的軌跡規劃 -2





Cartesian-space下的軌跡規劃 -1

□步驟

• 定義 $\{T\}$ 相對於 $\{G\}$ 的initial, via, & final points, G_TT_i (包含移動和轉動自由度)

i=1 initial i=2~N-1 via points i=N+1 final

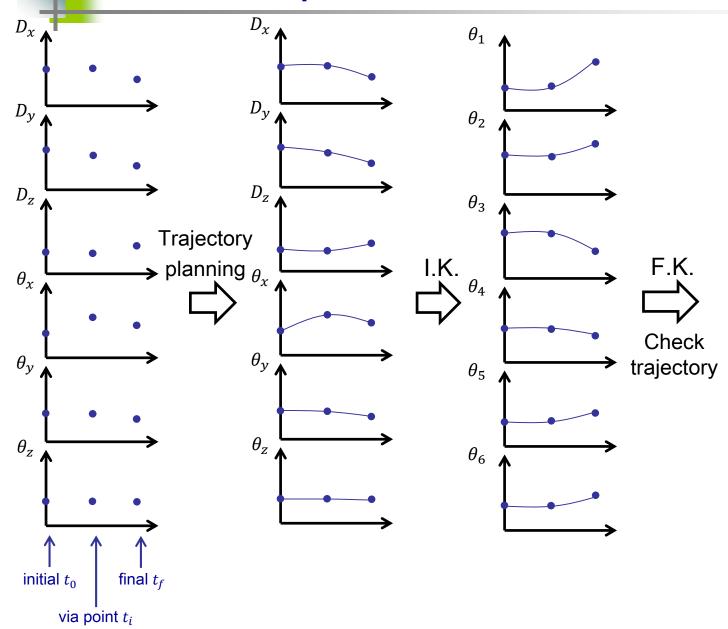
將
$$_{T}^{G}T_{i}$$
 以6個參數方式來表達 $_{T}^{G}X_{T} = \begin{bmatrix} {}^{G}P_{T \ org} \\ ROT({}^{G}\widehat{K}_{T}, \theta) \end{bmatrix}$

- ◆ 對所有手臂末端點狀態規劃smooth trajectories
- ◆ 將規劃好手臂末端點狀態的軌跡點轉換到joint狀態: ${}^GX_T \to \Theta_i$
- ◆ 檢查joint狀態在Joint-space下軌跡的可行性

Comments

- ◆ 較具物理直觀的軌跡
- ◆ 較高的運算負載 (i.e., IK)

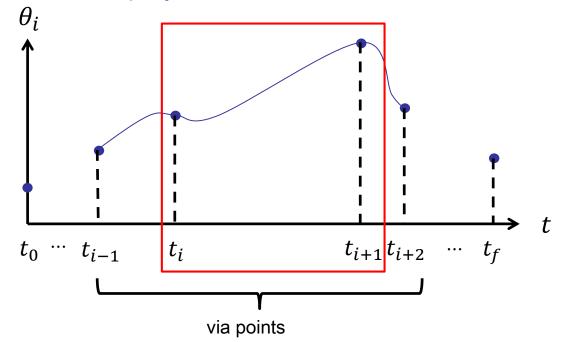
Cartesian-space下的軌跡規劃 -2





□ 原則

- ◆ 軌跡:不同軌跡區段 $[t_i t_{i+1}]$ 以不同參數的函數來規劃
- Smooth: 需定義各函數的邊界條件(包含位置和速度 $\theta(t_i), \theta(t_{i+1}), \dot{\theta}(t_i), \dot{\theta}(t_{i+1}), \dot{\eta}(t_{i+1})$, 有4個條件)
- ◆ 以cubic polynomial (三次多項式)來規劃軌跡



- 1 linear
- 2 quadratic
- 3 cubic
- 4 quartic
- 5 quintic
- 6 hexic (sextic)
- 7 heptic (septic)
- 8 octic
- 9 nonic
- 10 decic



Cubic Polynomials說明-2

解cubic polynomial

◆ 通式

$$\theta(\tilde{t}) = a_0 + a_1 \tilde{t} + a_2 \tilde{t}^2 + a_3 \tilde{t}^3 \qquad 4 \text{ unknowns: } a_{j=0} = 0$$

◆ 對每一個區段: $t \in [t_i, t_{i+1}]$

$$\tilde{t} = t - t_i$$
 so $\tilde{t}|_{t=t_i} = 0$ and $\tilde{t}|_{t=t_{i+1}} \equiv \Delta t = t_{i+1} - t_i > 0$

每一個區段[t_i , t_{i+1}]的 Δt 可以不同,取決於via points的設定

邊界條件

$$\theta(\tilde{t}|_{t=t_i}) = \theta_i = a_0 \tag{1}$$

$$\theta(\tilde{t}|_{t=t_{i+1}}) = \theta_{i+1} = a_0 + a_1 \Delta t + a_2 \Delta t^2 + a_3 \Delta t^3$$
 (2)

$$\dot{\theta}\left(\tilde{t}|_{t=t_i}\right) = \dot{\theta}_i = a_1 \tag{3}$$

$$\dot{\theta} \left(\tilde{t} |_{t=t_{i+1}} \right) = \dot{\theta}_{i+1} = a_1 + 2a_2 \Delta t + 3a_3 \Delta t^2 \tag{4}$$



Cubic Polynomials說明-3

□ 解聯立方程式 ① ② ③ ④

$$a_2 = \frac{3}{\Delta t^2} (\theta_{i+1} - \theta_i) - \frac{2}{\Delta t} \dot{\theta}_i - \frac{1}{\Delta t} \dot{\theta}_{i+1}$$

$$a_{3} = -\frac{2}{\Delta t^{3}} (\theta_{i+1} - \theta_{i}) + \frac{1}{\Delta t^{2}} (\dot{\theta}_{i+1} + \dot{\theta}_{i})$$



Cubic Polynomials說明-4

□ 以Matrix operation方式運算

$$\begin{bmatrix} \theta_i \\ \theta_{i+1} \\ \dot{\theta}_i \\ \dot{\theta}_{i+1} \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 1 & \Delta t & \Delta t^2 & \Delta t^3 \\ 0 & 1 & 0 & 0 \\ 0 & 1 & 2\Delta t & 3\Delta t^2 \end{bmatrix} \begin{bmatrix} a_0 \\ a_1 \\ a_2 \\ a_3 \end{bmatrix}$$

$$\Theta = T_{4\times 4}(\Delta t) \cdot A$$

$$\det(T_{4\times 4}) = -\Delta t^4 \neq 0 \text{ as long as } \Delta t \neq 0$$

所以

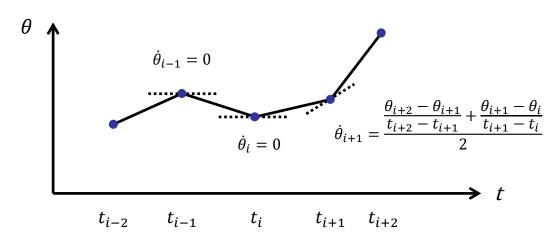
$$A = T_{4\times4}^{-1} \cdot \Theta$$

$$\begin{bmatrix} a_0 \\ a_1 \\ a_2 \\ a_3 \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ -\frac{3}{\Delta t^2} & \frac{3}{\Delta t^2} & -\frac{2}{\Delta t} & -\frac{1}{\Delta t} \\ \frac{2}{\Delta t^3} & -\frac{2}{\Delta t^2} & \frac{1}{\Delta t^2} & \frac{1}{\Delta t^2} \end{bmatrix} \begin{bmatrix} \theta_i \\ \theta_{i+1} \\ \dot{\theta}_i \\ \dot{\theta}_{i+1} \end{bmatrix}$$



- \Box 如何選擇速度條件 $\dot{\theta}_i$ 和 $\dot{\theta}_{i+1}$?
 - ◆ 直接定義,不論在 Cartesian space 或 joint space 不建議,過於複雜,尤其軌跡落在singular points附近時
 - ◆ 自動生成

Ex: 如果 $\dot{\theta}_i$ 在 t_i 前後變號,選擇 $\dot{\theta}_i = 0$ 如果 $\dot{\theta}_i$ 在 t_i 前後同號,選擇平均



以此兩個方式,不同區段的Cubic polynomials可以分開求解



◆ 規劃速度使過程中加速度也CONTINUOUS

(有效使用此可調控的變數)

不同區段的Cubic polynomials需要整合一起,一併求解

Example: A trajectory with one via point

 $[t_0 \ t_1]$ $\tilde{t} = t_1 - t_0$ $[0 \ \Delta t_1]$ θ_1 θ_0 θ_f

各段在運算時將時間平移到0開始

$$\theta_I(\tilde{t}) = a_{10} + a_{11}\tilde{t} + a_{12}\tilde{t}^2 + a_{13}\tilde{t}^3$$

$$[t_1 t_f] \qquad \tilde{t} = t_f - t_1 \quad [0 \Delta t_2]$$

$$\theta_{II}(\tilde{t}) = a_{20} + a_{21}\tilde{t} + a_{22}\tilde{t}^2 + a_{23}\tilde{t}^3$$

 \Rightarrow 8 unknowns



Example: A trajectory with one via point (cont.)

4 position B.C.s 2 for each
$$\theta_j(t)_{j=1,II}$$

4 position B.C.s
$$2 \text{ for each } \theta_j(t) \mid_{j=1,\text{II}} \theta_0 = a_{10}$$

$$\theta_1 = a_{10} + a_{11}\Delta t_1 + a_{12}\Delta t_1^2 + a_{13}\Delta t_1^3$$

$$\theta_1 = a_{20}$$

$$\theta_f = a_{20} + a_{21}\Delta t_2 + a_{22}\Delta t_2^2 + a_{23}\Delta t_2^3$$

$$\begin{bmatrix} \dot{\theta}_0 = 0 \\ \dot{\theta}_f = 0 \end{bmatrix} = a_{11}$$
$$\dot{\theta}_f = 0 = a_{21} + 2a_{22}\Delta t_2 + 3a_{23}\Delta t_2^2$$
$$not\ necessary\ "0"$$

Via point velocity continuity acceleration continuity

$$\begin{bmatrix} \dot{\theta}_1 = a_{11} + 2a_{12}\Delta t_1 + 3a_{13}\Delta t_1^2 = a_{21} \\ \ddot{\theta}_1 = 2a_{12} + 6a_{13}\Delta t_1 = 2a_{22} \end{bmatrix}$$

$$\Rightarrow$$
 8 equations



Example: A trajectory with one via point (cont.)

8 equations, 8 unknowns

代數解法 (when $\Delta t_1 = \Delta t_2 = \Delta t$)

$$a_{10} = \theta_0$$

$$a_{11} = 0$$

$$a_{12} = \frac{12\theta_1 - 3\theta_f - 9\theta_0}{4\Delta t^2}$$

$$a_{13} = \frac{-8\theta_1 + 3\theta_f + 5\theta_0}{4\Delta t^3}$$

$$t_0 \xrightarrow{t_1} \Delta t_2 \xrightarrow{t_f}$$

$$a_{20} = \theta_1$$

$$a_{21} = \frac{3\theta_f - 3\theta_0}{4\Delta t}$$

$$a_{22} = \frac{-12\theta_1 + 6\theta_f + 6\theta_0}{4\Delta t^2}$$

$$a_{23} = \frac{8\theta_1 - 5\theta_f - 3\theta_0}{4\Delta t^3}$$



Example: A trajectory with one via point (cont.)

$$A_{8\times 1} = T_{8\times 8}^{-1} \Theta_{8\times 1}$$

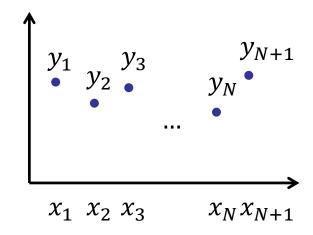
$$\det(T_{8\times 8}) = 4\Delta t_1^{\ 4} \Delta t_2^{\ 3} + 4\Delta t_1^{\ 3} \Delta t_2^{\ 4}$$

$$\neq 0 \text{ as long as } \Delta t_1 \neq 0, \Delta t_2 \neq 0, \Delta t_1 \neq -\Delta t_2)$$



General Cubic Polynomials -1

General cubic spline function



N cubic functions

$$s_j(x) = a_j + b_j x + c_j x^2 + d_j x^3$$

$$x_j \le x \le x_{j+1}$$
$$j = 1 \dots N$$

⇒ total 4N unknown coefficients



General Cubic Polynomials -2

Position conditions at both ends of each $s_i(x)$

⇒ 2N conditions

Velocity & acceleration continuity conditions at via points

 \Rightarrow 2(N-1) conditions

還需要 2 CONDITIONS 以求解

Revisit example: A trajectory with one via point

$$\begin{bmatrix} y_1 = s_1(x_1) & y_2 = s_2(x_2) \\ y_2 = s_1(x_2) & y_3 = s_2(x_3) \\ \dot{y}_2 = \dot{s}_1(x_2) = \dot{s}_2(x_2) \\ \ddot{y}_2 = \ddot{s}_1(x_2) = \ddot{s}_2(x_2) & \text{# 6 conditions} \\ \ddot{y}_2 = \ddot{s}_1(x_2) = \ddot{s}_2(x_2) & \text{# 6 conditions} \\ \end{bmatrix}$$



General Cubic Polynomials -3

最後 2 conditions 的選擇方法

(1)
$$\ddot{s}_1(x_1) = \ddot{s}_N(x_{N+1}) = 0$$

定義加速度,Natural cubic spline

(2)
$$\dot{s}_1(x_1) = u \quad \dot{s}_N(x_{N+1}) = v$$

(2) $\dot{s}_1(x_1) = u \quad \dot{s}_N(x_{N+1}) = v$ 定義速度,Clamped cubic spline

(3) if
$$s_1(x_1) = s_N(x_{N+1})$$

 $use \ \dot{s}_1(x_1) = \dot{s}_N(x_{N+1})$
 $\ddot{s}_1(x_1) = \ddot{s}_N(x_{N+1})$

週期運動的連續性,Periodic cubic spline

Note: Matlab[®] command *spline*

$$[YY] = spline(x, y, XX)$$

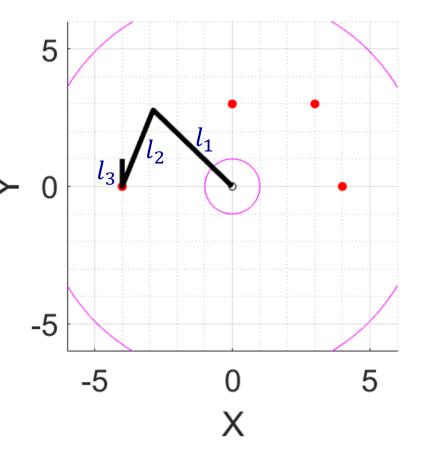


□ 平面RRR手臂長度: $l_1 = 4$, $l_2 = 3$, and $l_3 = 1$

下表定義 initial, via, via, 和 final points的位置

t	X	у	theta
0	-4	0	90
2	0	3	45
4	3	3	30
7	4	0	0

(X,Y) 定義在第二桿件的末端 Theta為第三桿件對X座標軸的夾角





- □ 方法一:以cubic polynomials在Cartesian-space下規劃軌跡
 - 1. 求出3個DOF (X, Y, θ) 各自cubic polynomials的coefficients 需通過4個點:每個DOF有3個cubic polynomials,共12個未知數

$$\Theta_{12\times 1} = T_{12\times 12}A_{12\times 1}$$

為 $(\Delta t_1, \Delta t_2, \Delta t_3)$ 函數
 $X/Y/\theta$

 $\Delta t_1 \quad \Delta t_1^2$ a_{11} 6 position a_{12} Δt_2^{3} Δt_2^2 B.C.s Δt_3^3 Δt_3^2 Δt_3 2 init., final $3\Delta t_3^2$ $2\Delta t_3$ vel. $3\Delta t_1^2$ $2\Delta t_1$ $6\Delta t_1$ a_{31} 0 4 vel. & acl. $3\Delta t_2^2 \quad 0 \quad -1 \quad 0$ a_{32} $2\Delta t_2$ continuity $[a_{33}]$ 2 0 $6\Delta t_2$



□ 方法一:以cubic polynomials在Cartesian-space下規劃軌跡

將三個DOF在各點的參數代入matlab後將會是:

$$\Theta_{12\times3} = T_{12\times12}A_{12\times3}$$

 $X Y \theta$

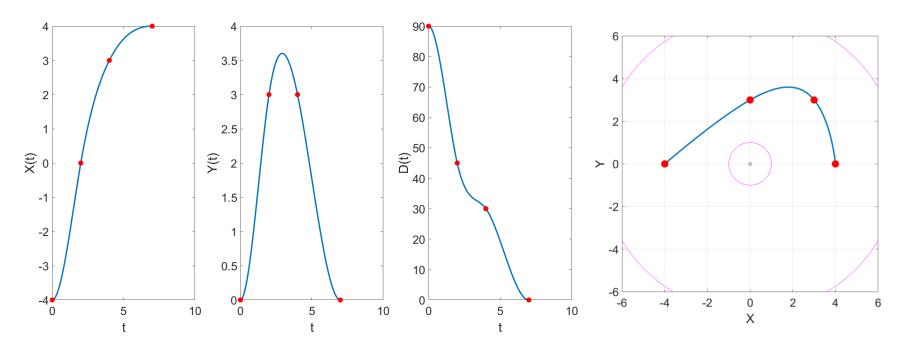
Г		-														
-4	0	90		1	0	0	0	0	0	0	0	0	0	0	0	
0	3	45		1	2	4	8	0	0	0	0	0	0	0	0	
0	3	45		0	0	0	0	1	0	0	0	0	0	0	0	
3	3	30		0	0	0	0	1	2	4	8	0	0	0	0	
3	3	30		0	0	0	0	0	0	0	0	1	0	0	0	
4	0	0	=	0	0	0	0	0	0	0	0	1	3	9	27	F
0	0	0		0	1	0	0	0	0	0	0	0	0	0	0	
0	0	0		0	0	0	0	0	0	0	0	0	1	6	27	
0	0	0		0	1	4	12	0	-1	0	0	0	0	0	0	
0	0	0		0	0	2	12	0	0	-2	0	0	0	0	0	
0	0	0		0	0	0	0	0	1	4	12	0	- 1	0	0	
0	0	0		0	0	0	0	0	0	2	12	0	0	-2	0	
L		_		L											_	L

41242



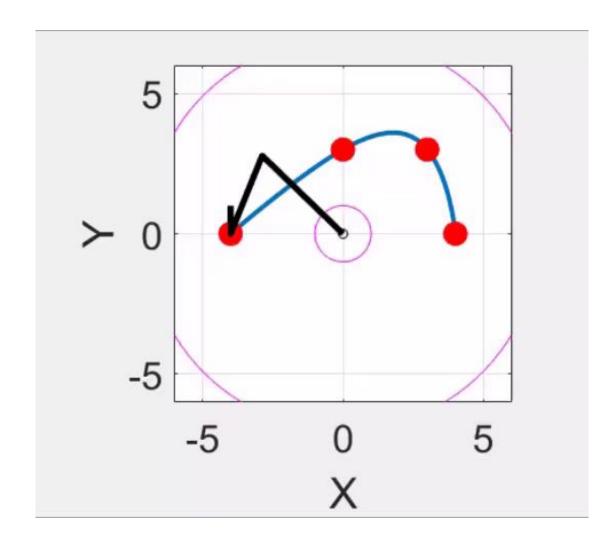
2. 對所有DOF規劃smooth trajectories

t	X	у	theta
0	-4	0	90
2	0	3	45
4	3	3	30
7	4	0	0





- 3. I.K.,找出各Joints的對應軌跡
- 4. 將Joints帶入手臂模擬動作,確認手臂末端點軌跡如規劃運作





position B.C.s

vel. & acl. continuity

Example: A RRR Manipulator -6

- □ 方法二:以cubic polynomials在Joint-space下規劃軌跡
 - 1. I.K.,求出initial、via、final points的Joint angles $(\theta_1, \theta_2, \theta_3)$
 - 2. 求出各 $(\theta_1, \theta_2, \theta_3)$ cubic polynomials的coefficients

需通過4個點:每個Joint angle有3個cubic polynomials,共12個未知數

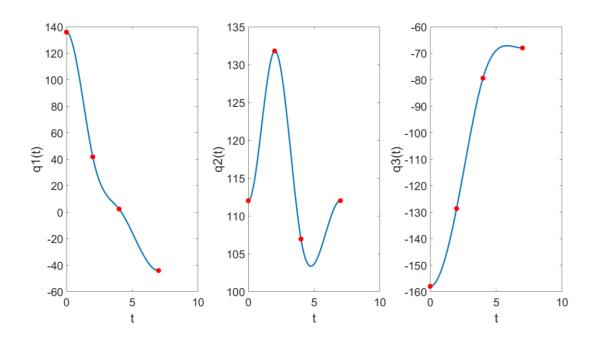
$$\mathbf{\Theta}_{12\times3} = T_{12\times12} A_{12\times3}$$

θ_1	$ heta_2$	θ_3													
2.3728 0.7297 0.7297 0.0426 0.0426 -0.7688 0 0 0	1.9552 2.3005 2.3005 1.8668 1.8668 1.9552 0 0 0	-2.7572 -2.2449 -2.2449 -1.3858 -1.3858 -1.1864 0 0	1 1 0 0 0 0 0 0 0	0 2 0 0 0 0 1 0 1 0	0 4 0 0 0 0 0 4 2 0	0 8 0 0 0 0 0 12 12 0	0 0 1 1 0 0 0 0	0 0 2 0 0 0 0 -1 0	0 0 4 0 0 0 0 0 -2 4 2	0 0 8 0 0 0 0 0 12 12	0 0 0 1 1 0 0 0	0 0 0 0 3 0 1 0 0	0 0 0 0 9 0 6 0 0	0 0 0 0 27 0 27 0 0	$A_{12\times3}$



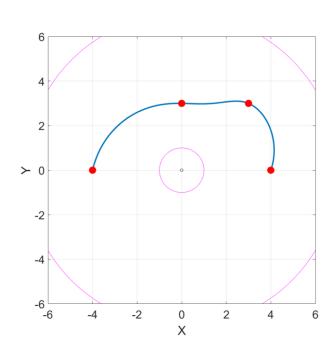
3. 對所有DOF規劃smooth trajectories

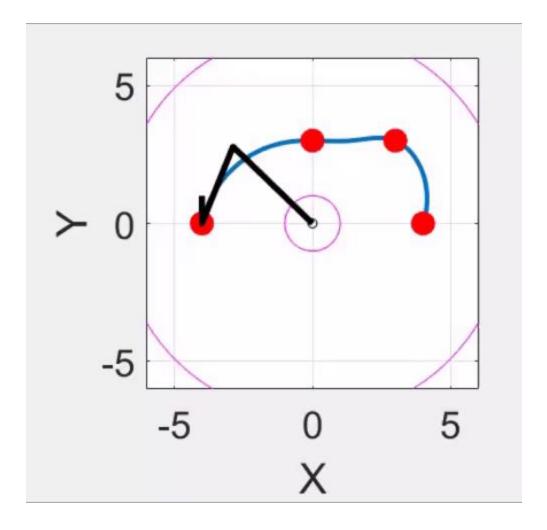
t	X	у	theta
0	-4	0	90
2	0	3	45
4	3	3	30
7	4	0	0





4. 将Joints带入手臂模擬動作,確認手臂末端點軌跡如規劃運作







High-order Polynomials

- □ 如果位置、速度、和加速度都必須要規劃
 - \Rightarrow Quintic polynomial $\theta(t) = a_0 + a_1t + a_2t^2 + a_3t^3 + a_4t^4 + a_5t^5 = \sum_{i=0}^{5} a_it^i$

有6個條件, quintic polynomial有6個未知數

$$\begin{cases} \theta_0 = a_0 \\ \theta_f = a_0 + a_1 \Delta t + a_2 \Delta t^2 + a_3 \Delta t^3 + a_4 \Delta t^4 + a_5 \Delta t^5 \\ \dot{\theta}_0 = a_1 \\ \dot{\theta}_f = a_1 + 2a_2 \Delta t + 3a_3 \Delta t^2 + 4a_4 \Delta t^3 + 5a_5 \Delta t^4 \\ \ddot{\theta}_0 = 2a_2 \\ \ddot{\theta}_f = 2a_2 + 6a_3 \Delta t + 12a_4 \Delta t^2 + 20a_5 \Delta t^3 \\ a_0 = \theta_0 \end{cases} \qquad \begin{aligned} & 1 \text{ linear } \\ & 2 \text{ quadratic } \\ & 4 \text{ quartic } \\ & 5 \text{ quintic } \\ & 6 \text{ hexic (sextic)} \\ & a_1 = \dot{\theta}_0 \qquad a_4 = \frac{30(\theta_0 - \theta_f) + (14\dot{\theta}_f + 16\dot{\theta}_0)\Delta t - (3\ddot{\theta}_0 - 2\ddot{\theta}_f)\Delta t^2}{2\Delta t^4} \qquad 7 \text{ heptic (septic)} \\ & a_2 = \frac{1}{2}\ddot{\theta}_0 \qquad a_5 = \frac{12(\theta_f - \theta_0) - (6\dot{\theta}_f + 6\dot{\theta}_0)\Delta t - (\ddot{\theta}_0 - \ddot{\theta}_f)\Delta t^2}{2\Delta t^5} \qquad 9 \text{ nonic } \\ & 1 \text{ linear } \\ & 2 \text{ quadratic } \\ & 4 \text{ quartic } \\ & 5 \text{ quintic } \\ & 6 \text{ hexic (sextic)} \\ & 7 \text{ heptic (septic)} \\ & 8 \text{ octic } \\ & 9 \text{ nonic } \\ & 10 \text{ decic} \end{aligned}$$