

# 5ELEN018W - Robotic Principles

## Lecture 5: Inverse Kinematics

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where  $\theta_i, \alpha_i, r_i, d_i$  are the DH parameters.

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For example, for 6-joint manipulator:

$${}^0 \mathbf{T}_6 = {}^0 \mathbf{T}_1 \cdot {}^1 \mathbf{T}_2 \cdot {}^2 \mathbf{T}_3 \cdot {}^3 \mathbf{T}_4 \cdot {}^4 \mathbf{T}_5 \cdot {}^5 \mathbf{T}_6 \quad (2)$$

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2. often, there are multiple solutions (i.e. multiple sets of joint angles) that can place the end effector at the desired position.
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3. It is possible that no solutions exist

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- ▶ They are not general, but robot dependent.
- ▶ To calculate, they take advantage of particular geometric features of specific robot mechanisms.
- ▶ As the number of joints increases, this becomes increasingly difficult.
- ▶ For some serial-link robot manipulators, no analytical (closed form) solution exists!

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## Solution:

$$\theta_i = 2 \tan^{-1} \left( \frac{C_2 \pm \sqrt{C_2^2 - C_3^2 + C_1^2}}{C_1 - C_3} \right)$$

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only one solution:

$$\theta_i = \text{atan2}(-C_1 C_4 - C_2 C_3, C_2 C_4 - C_1 C_3)$$

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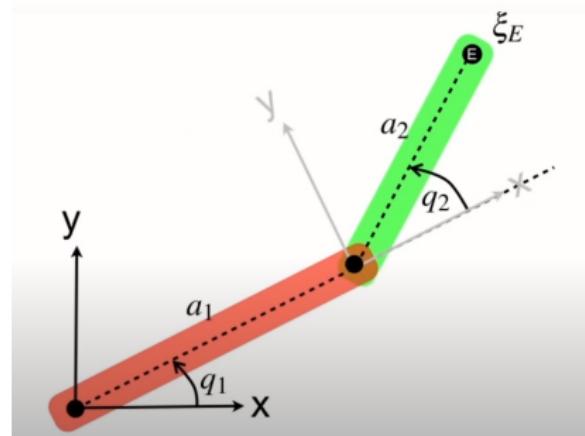
→ often results to the decomposition of the spatial problem into separate planar problems.

- ▶ Decomposition of the full problem into inverse position kinematics and inverse orientation kinematics.
- ▶ The solution is derived by rewriting equation (2) as:

$${}^0 \mathbf{T}_6 \cdot {}^6 \mathbf{T}_5 \cdot {}^5 \mathbf{T}_4 \cdot {}^4 \mathbf{T}_3 = {}^0 \mathbf{T}_1 \cdot {}^1 \mathbf{T}_2 \cdot {}^2 \mathbf{T}_3 \quad (3)$$

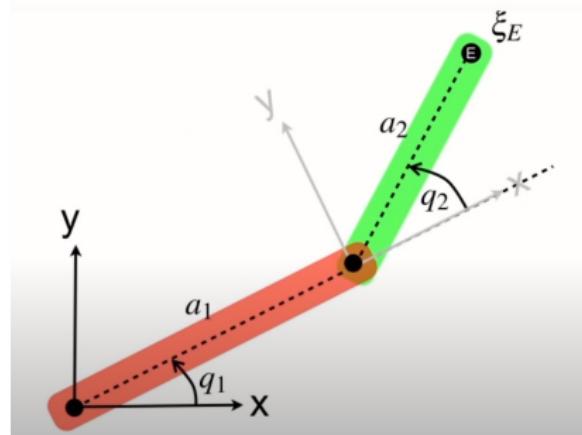
# Calculating Analytical Solutions in the Python Robotics Toolbox

## Consider a 2-joint Planar (2D) Robot



# Calculating Analytical Solutions in the Python Robotics Toolbox

Consider a 2-joint Planar (2D) Robot



Given the position of the end-effector  $(x_E, y_E)$  calculate the required joint angles to achieve this position.

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# create symbols for lengths of the 2 links
>>> a1 = Symbol('a1')
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>>> TE = e.fkine([q1, q2])

# translation part of matrix gives the position (x_fk, y_fk) of the
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>>> eq1 = (x_fk**2 + y_fk**2 - x**2 - y**2).trigsimp()
```

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>>> print(q2_sol)
[-acos(-(a1**2 + a2**2 - x**2 - y**2)/(2*a1*a2)) + 2*pi,
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# expand the two equations x_fk=x, y_fk=y
>>> eq2 = tuple(map(sympy.expand_trig, [x_fk - x, y_fk - y]))
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(a1*cos(q1) + a2*(-sin(q1)*sin(q2) + cos(q1)*cos(q2)) - x,
 a1*sin(q1) + a2*(sin(q1)*cos(q2) + sin(q2)*cos(q1)) - y)

# solve for sin(q1), cos(q1)
>>> q1_sol = sympy.solve(eq2, [sympy.sin(q1), sympy.cos(q1)])
>>> print(q1_sol) # dictionary containing sin(q1) and cos(q1)
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# tan(q1) = sin(q1)/cos(q1)
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# solve for q1
>>> sympy.atan2(q1_sol[sin(q1)], q1_sol[cos(q1)]).simplify()
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**How?** Minimise the error between the forward kinematics solution and the desired end-effector pose  $\xi_E$ :

$$\mathbf{q}^* = \arg \min_{\mathbf{q}} (FK(\mathbf{q}) - \xi_E)$$

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- ▶ Newton-Raphson: first order approximation of original equations
- ▶ Levenberg–Marquardt optimisation: using the second order derivative for the approximation of the original system.

# The Newton-Raphson Algorithm

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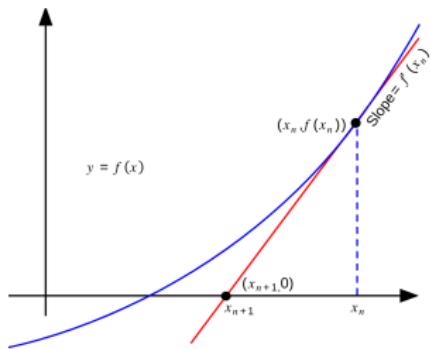
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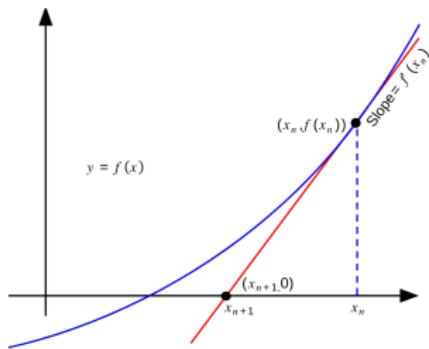
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Then the approximated solution for finding the root of  $f$  (where  $f(x) = 0$ ) can be calculated iteratively by:

$$x_{n+1} = x_n - \frac{f(x_n)}{f'(x_n)} \quad (5)$$

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# define the error (E) function
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- Usage of the inverse of the Jacobian matrix

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