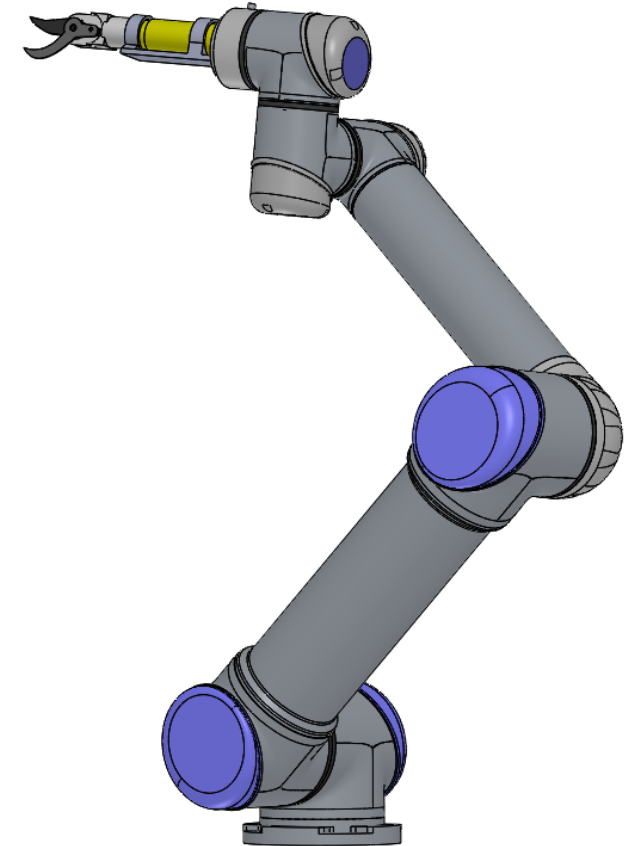


Collision free path planning of a robotic manipulator for pruning apple trees

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Penn State University



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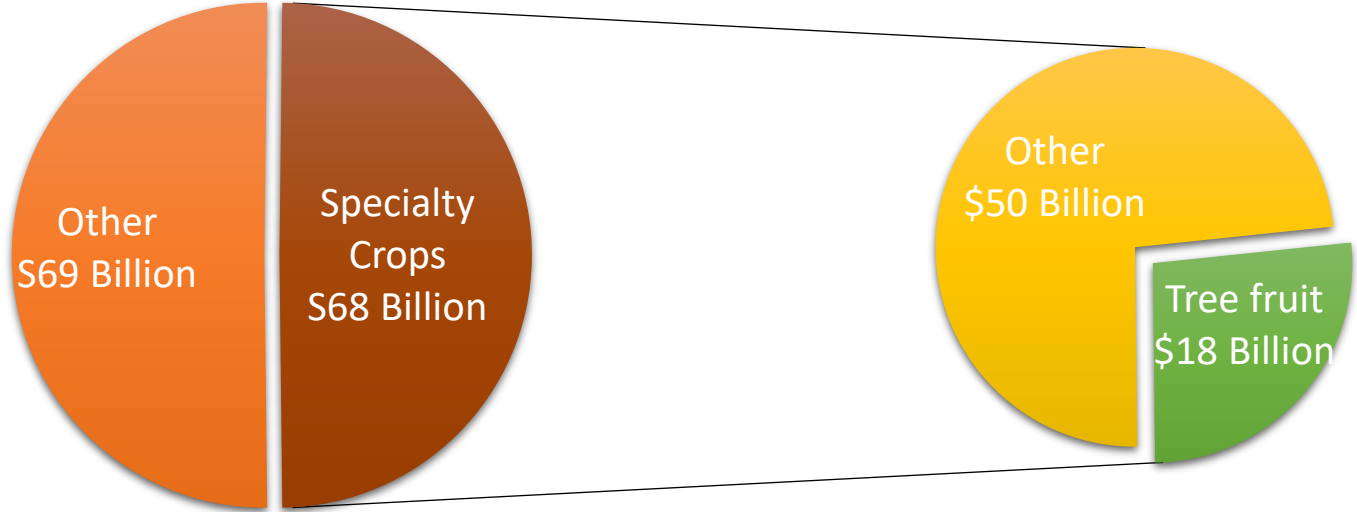


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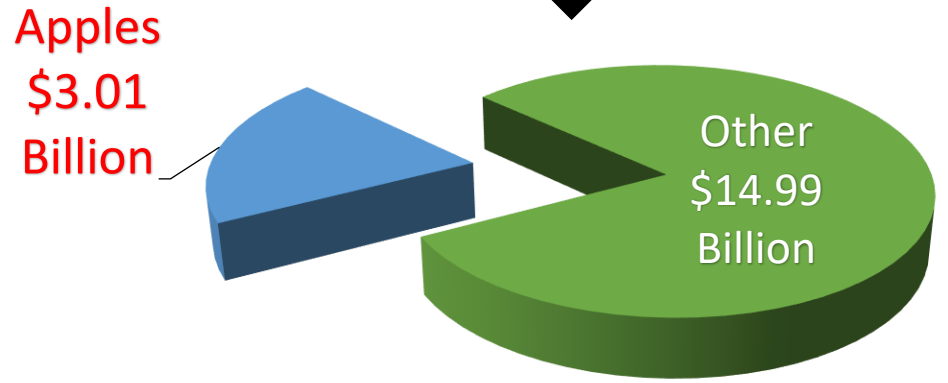
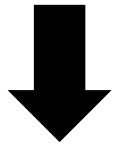


Introduction/ Background

Introduction: Specialty Crop Industry (U.S.)



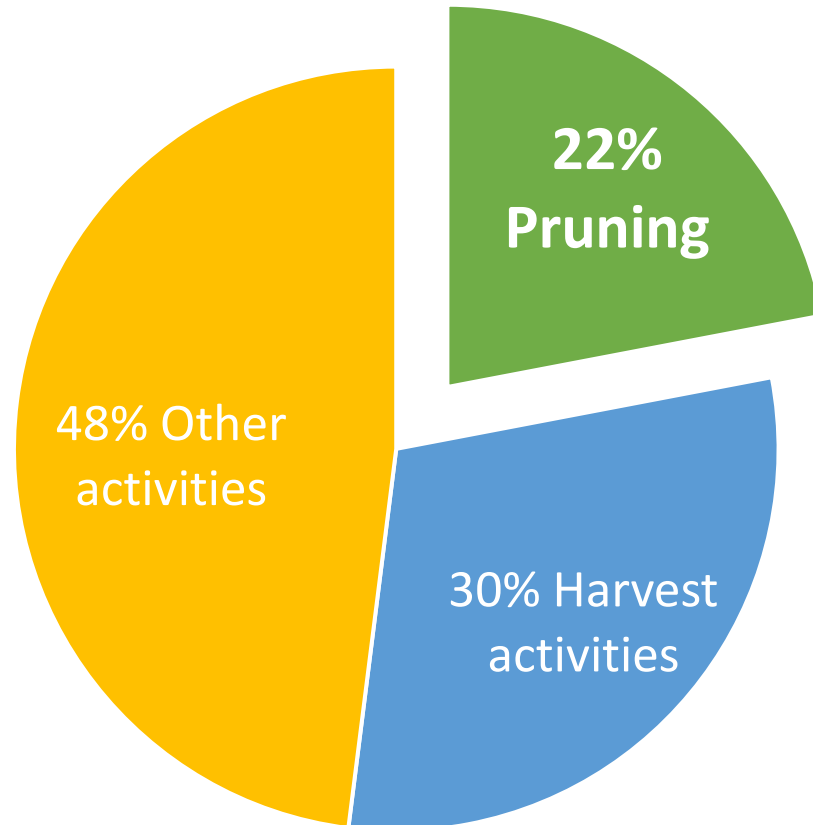
Farms Contribution to the US Economy



Tree Fruit Industry in the US Economy

(USDA-NASS, 2019)

Introduction: Cost Breakdown and Labor Availability



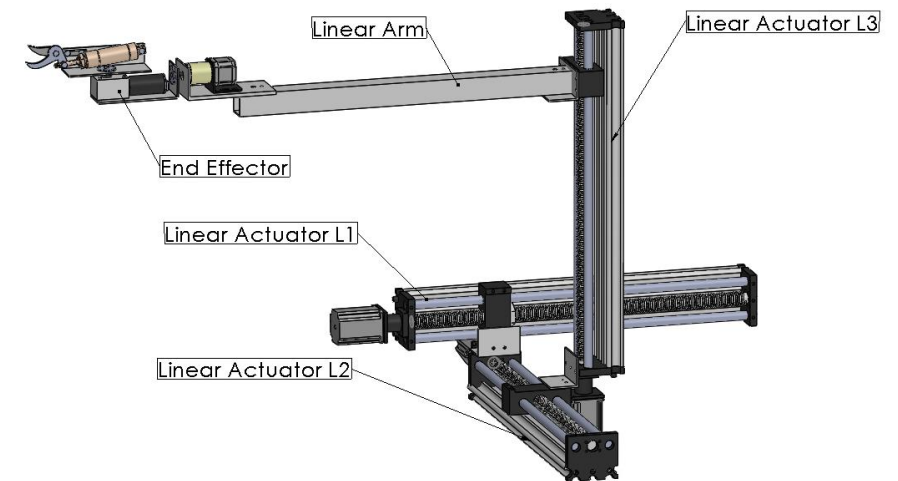
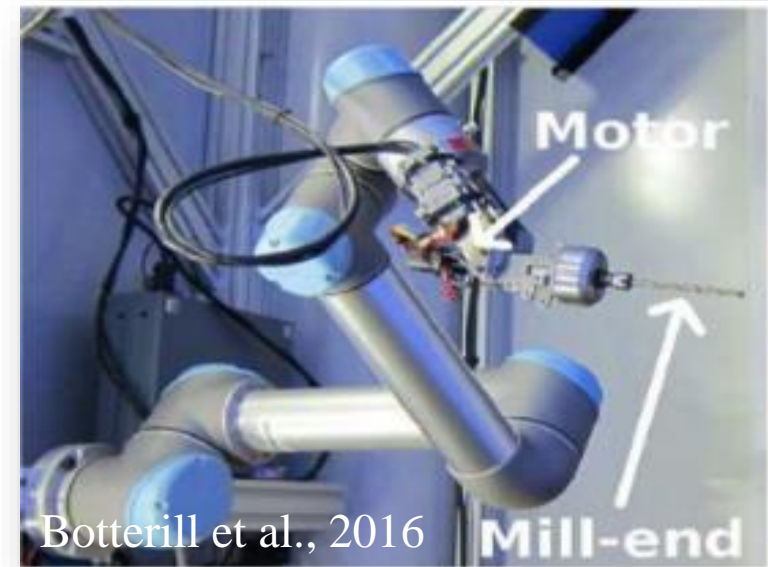
- Pruning ~ 20% of total labor cost
 - ~ 80-120 working hours per hectare
- Available labor decreasing!***

Production cost breakdown in percentage for each category Gallardo et al., (2010)

(Mika *et al.* 2016)

Introduction: Potential Solution and Challenges

- Robotic pruning → selective pruning
- Challenges in robotic pruning
 - Detection and identification of pruning branches
 - Spatial requirements and path planning of manipulation system
- Researchers developed vision algorithms using different camera sensors
- No study has been reported on path planning for tree pruning



(Zahid et al., 2020)

Objectives of the study

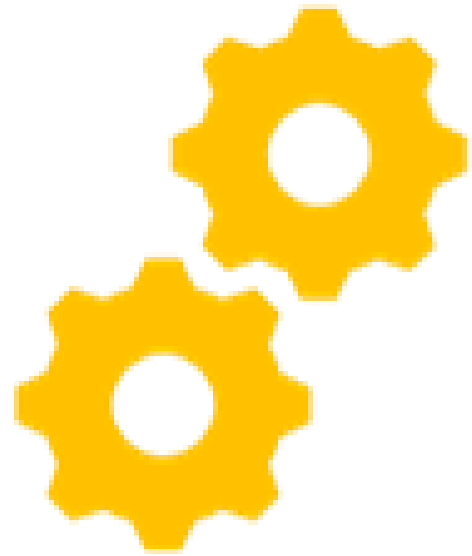


Objectives of the study

1. Developing a simplified virtual environment including a robotic manipulator and a tree section for simulation in MATLAB
2. Establishing a collision-free trajectory for reaching the targeted pruning points

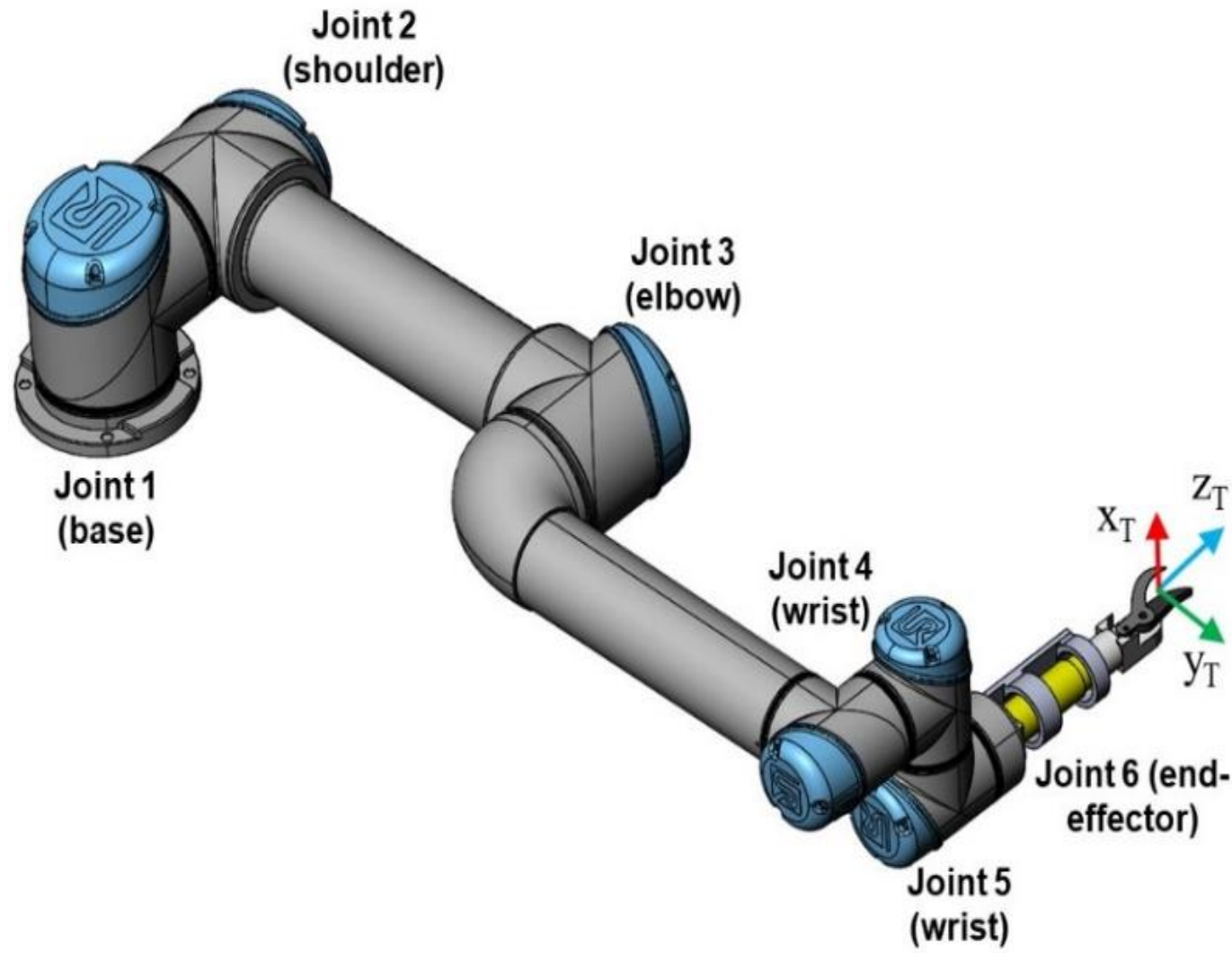


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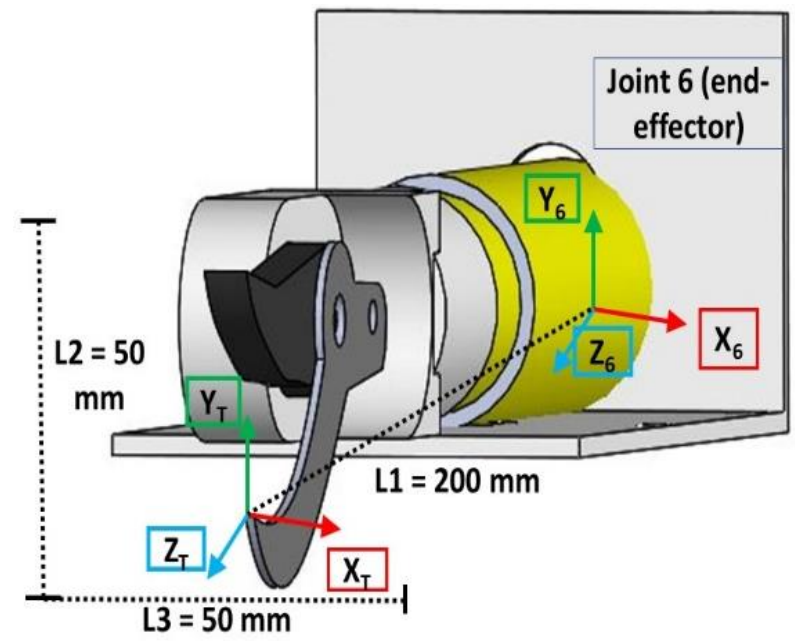


Methodology

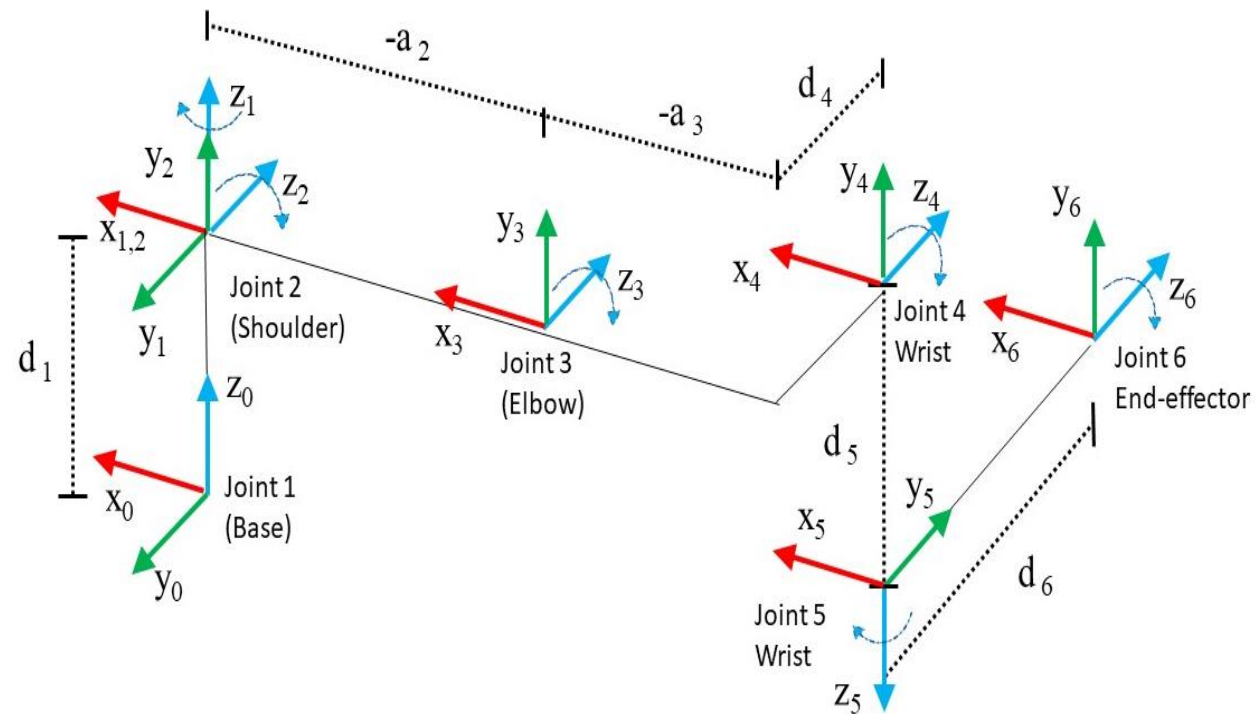
Robotic Manipulator



End-effector



Coordinate Frames of the Manipulator



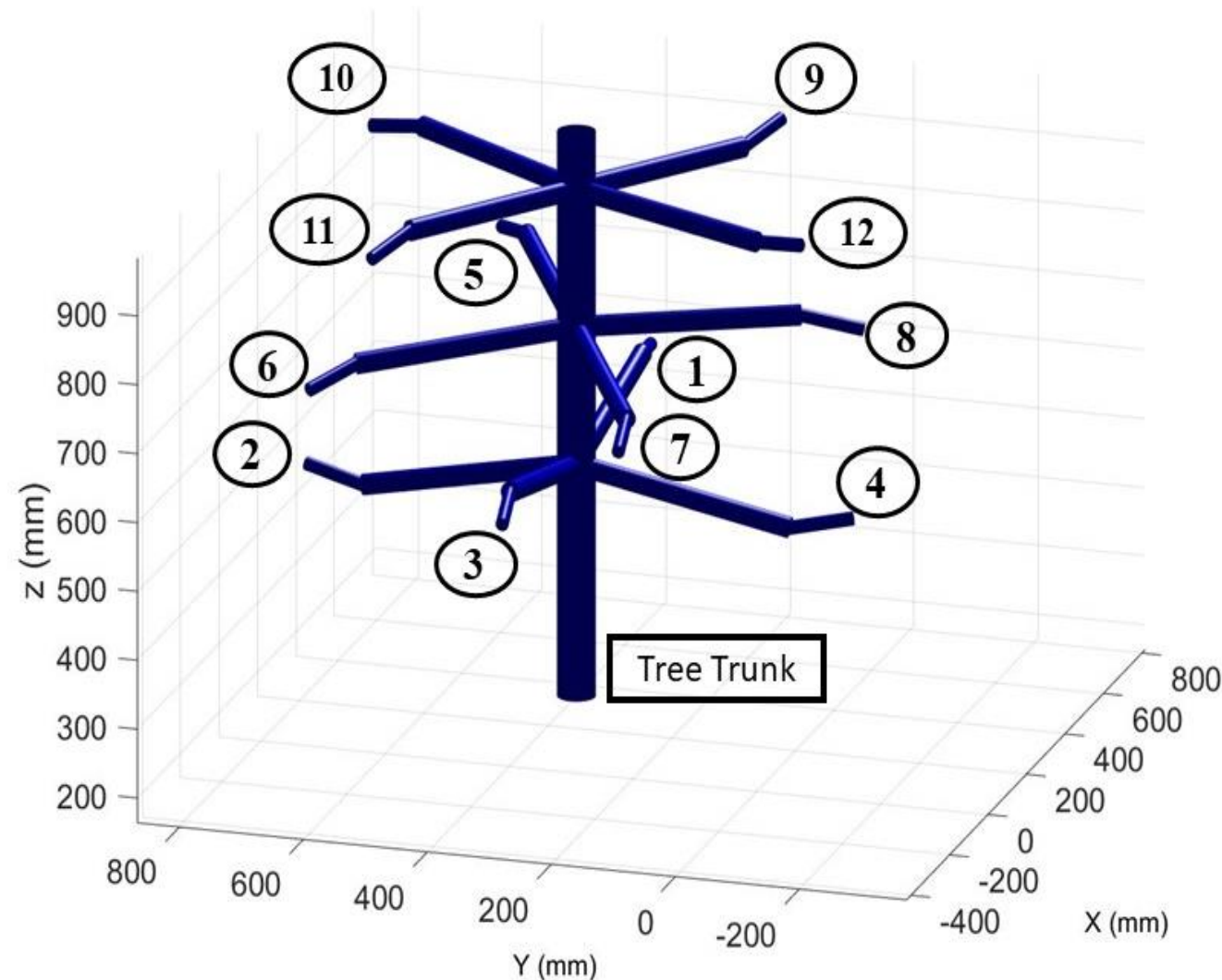
Denavit-Hartenberg Parameters

Joints	Joint angle θ_i (rad)	Link length a_{i-1} (m)	Link offset d_i (m)	Link twist α_{i-1} (rad)
Joint 1 (Base)	θ_1	0	0.1625	$\pi/2$
Joint 2 (Shoulder)	θ_2	-0.425	0	0
Joint 3 (Elbow)	θ_3	-0.3922	0	0
Joint 4 (Wrist)	θ_4	0	0.1333	$\pi/2$
Joint 5 (Wrist)	θ_5	0	0.0997	$-\pi/2$
Joint 6 (End-effector)	θ_6	0	0.0996	0

- Find the inverse kinematics of the manipulator
- Trajectory generation in Matlab

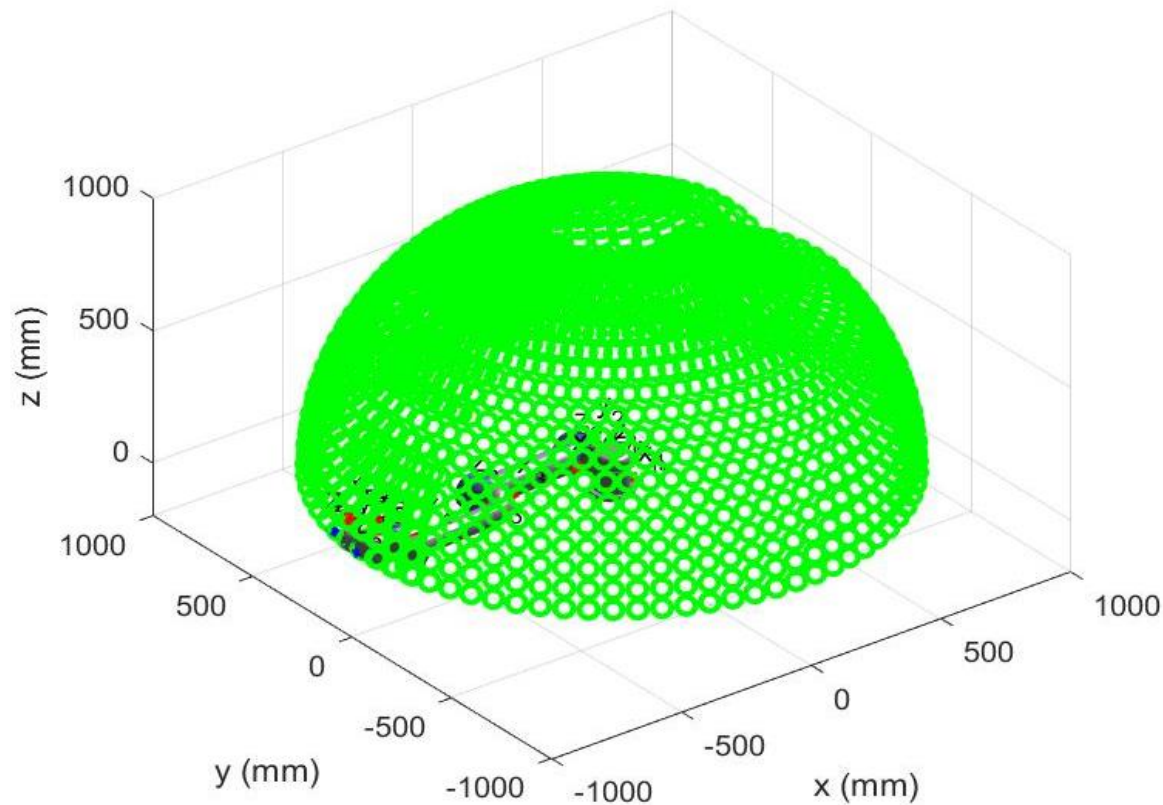
(UR-Robotics, 2020)

Simulation Model Establishment: Virtual Tree Model



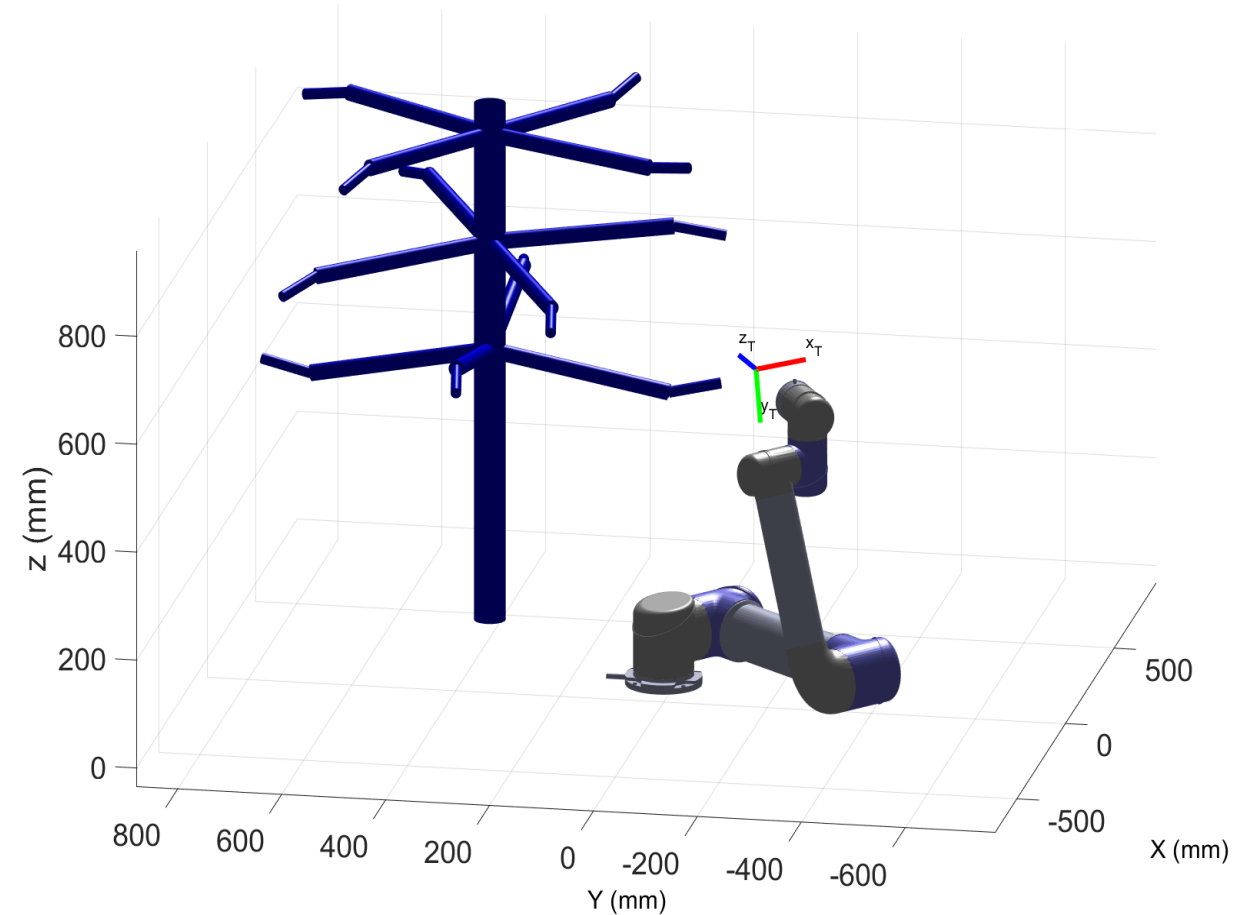
- 13 obstacles (→ 1 trunk and 12 primary branches)
- Canopy height = 600 mm
- Canopy depth = 700 mm

Workspace Envelope



- Reachable workspace width = 800 mm

Simulation Environment



- Manipulator position $\rightarrow (x, y) = (0,0)$ mm
- Virtual tree position $\rightarrow (x, y) = (400,400)$ mm

Path Planning Algorithm: Path Planning Method

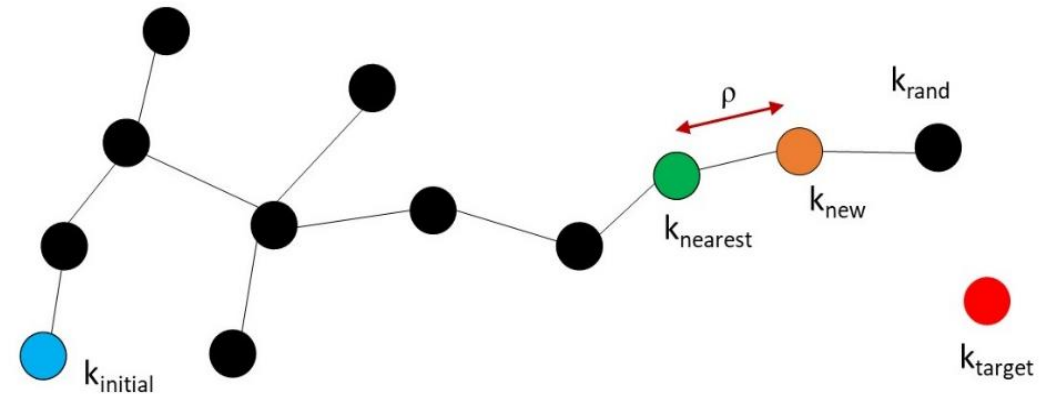
Collision Checks

- Collision free path for the end effector tool
- Manipulator body side collision with branches

RRT Path Planning

- Starting from the node k_{initial}
- From k_{rand} tree expanded to k_{nearest}
- If exist in collision free space, k_{new} is added
- Path is found by connecting all k_{new}

RRT Path Exploration



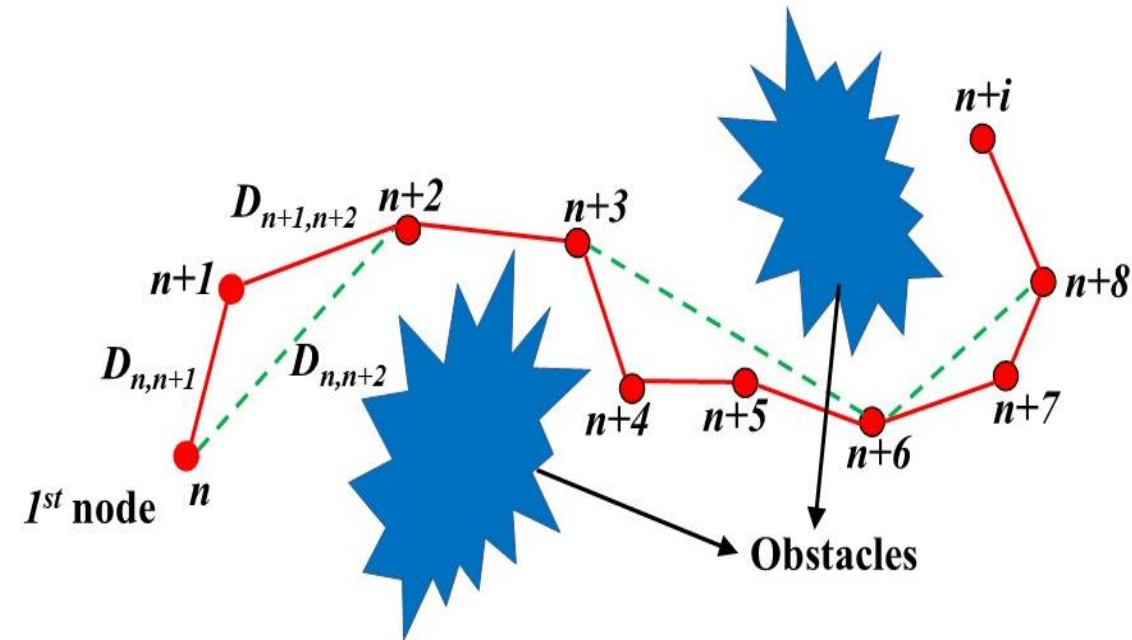
RRT Smoothing

- Distance between three consecutive nodes
- If the new distance is less to the sum, collision check performed

Path Optimization

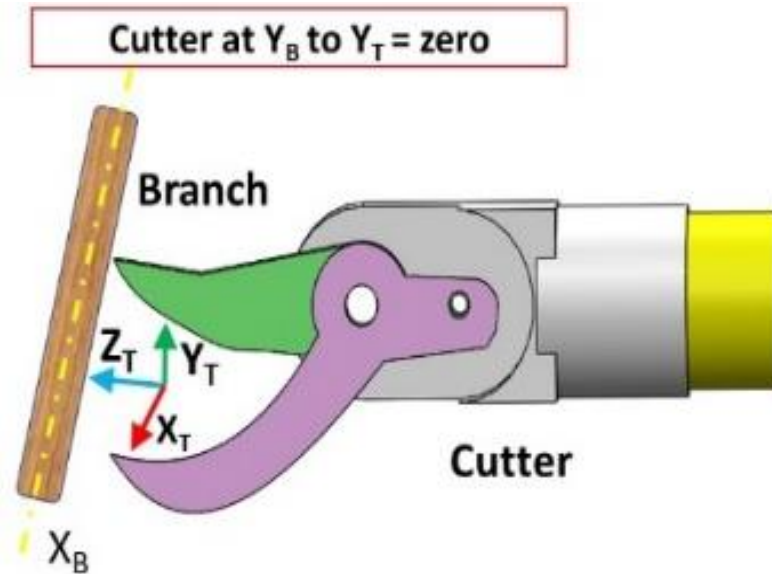
- Non-linear optimization algorithm
- Objective function, and constraint functions
- Other parameters: Lower and upper boundaries, and min. distance from obstacles

Illustration for Path Smoothing

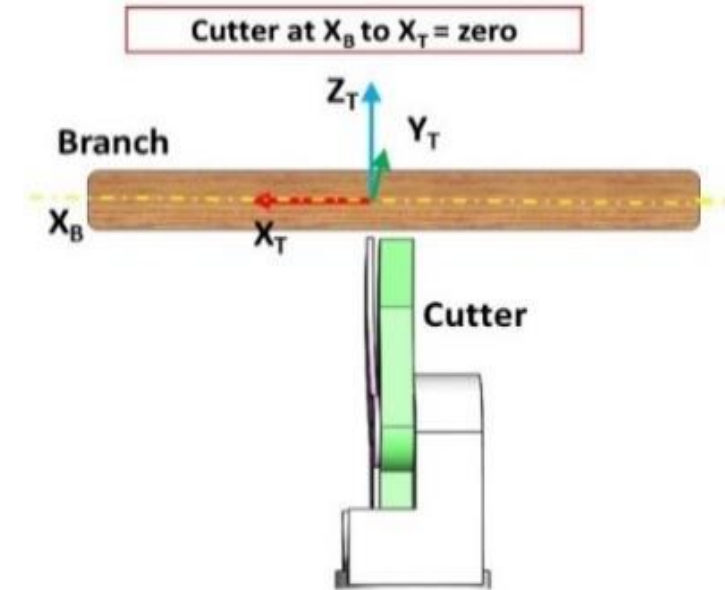


Simulation for Branch Accessibility: Ideal Pose

Side View

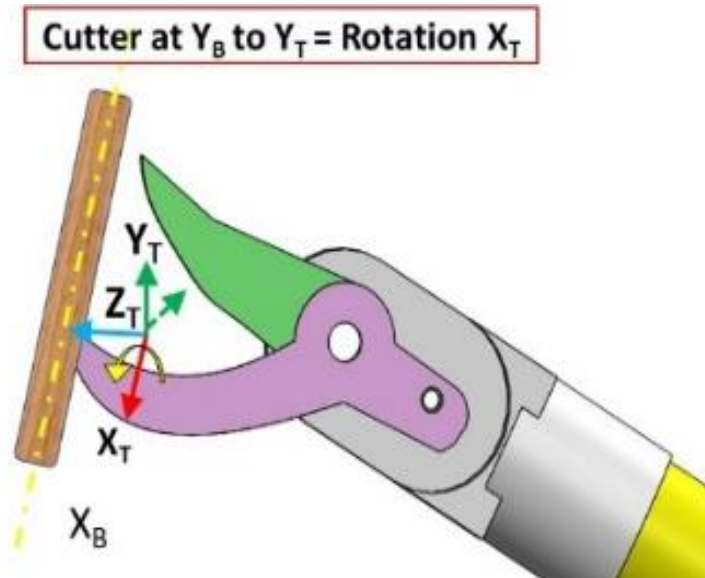


Top View



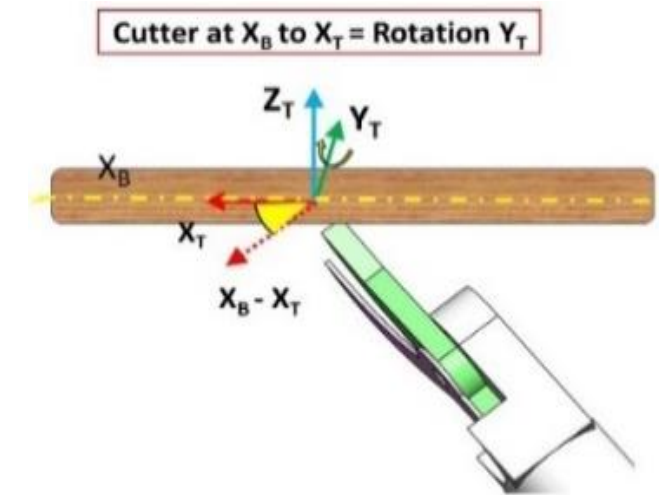
- Three target branches selected
(branch 2, 6 and 8)
- Target point: 50 mm from the trunk
- Pose approach: Ideal cutting pose
(Cutter plane perpendicular to branch axis)
- No. of simulation trials = 10

1st Pose



- Rot (X_T) = $+45^\circ$
- X_T and X_B parallel

2nd Pose

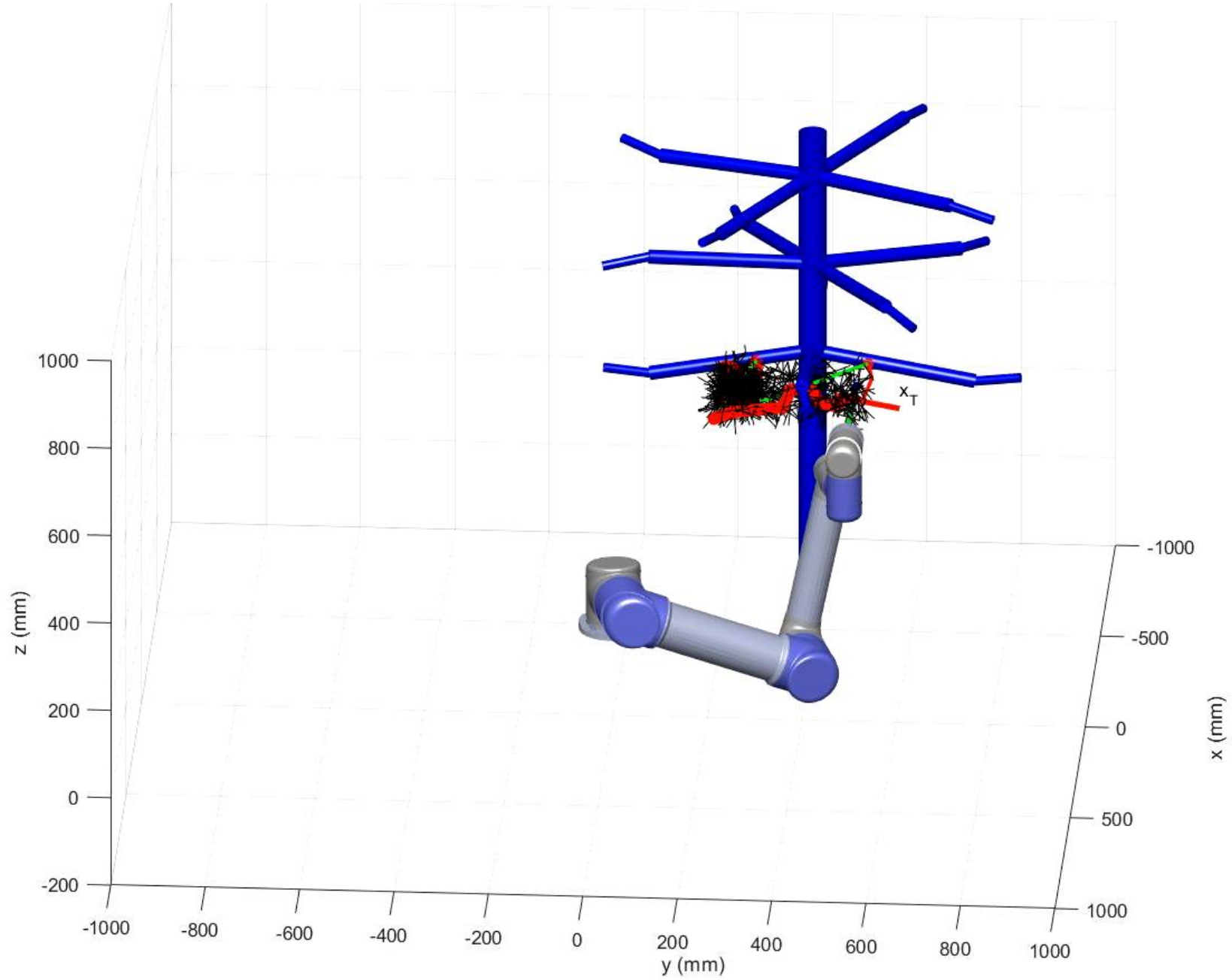


- Rot (Y_T) = $+30^\circ$
- X_T to X_B deviates equally

Results



Results Comparison for RRT, RRT Smoothing, and Optimization



Results Comparison for RRT, RRT Smoothing, and Optimization

Simulation results for path planning and smoothing for different target branches

Branch No.	No. of Obstacles	RRT path (mm)		RRT smoothing path		Optimized path (mm)	
		Length (mm)	Time (Sec)	Length (mm)	Time (Sec)	Length (mm)	Time (Sec)
2	1	390	19	257	21	278	36
8	1	*		*		*	
6	2	496	25	382	29	397	24
Method				Branch 2		Branch 6	
				Variation coefficient (CV)			
RRT path				0.066		0.058	
RRT smoothing path				0.042		0.039	
Optimized path				0.037		0.031	

*Fail to find the path

Maximum path length

Minimum path length

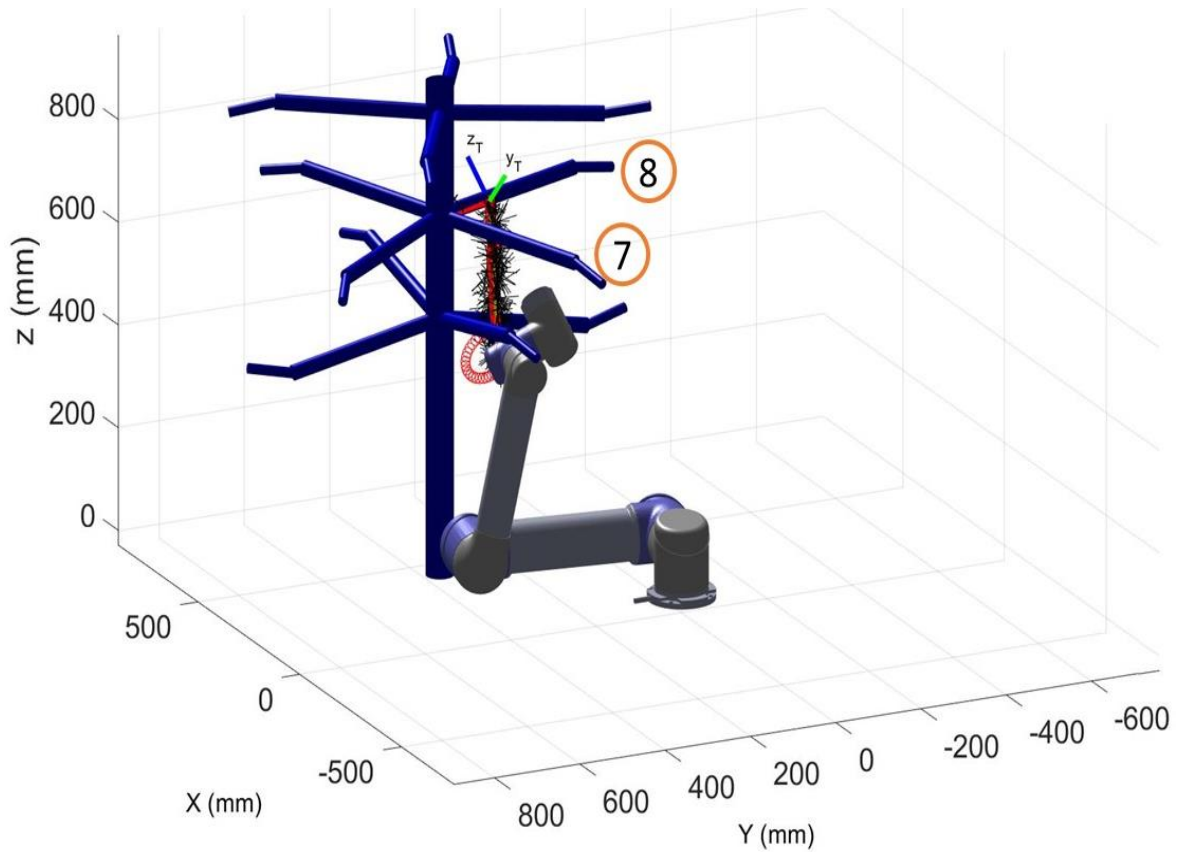
Lowest cv and St. dev

Results and Observations

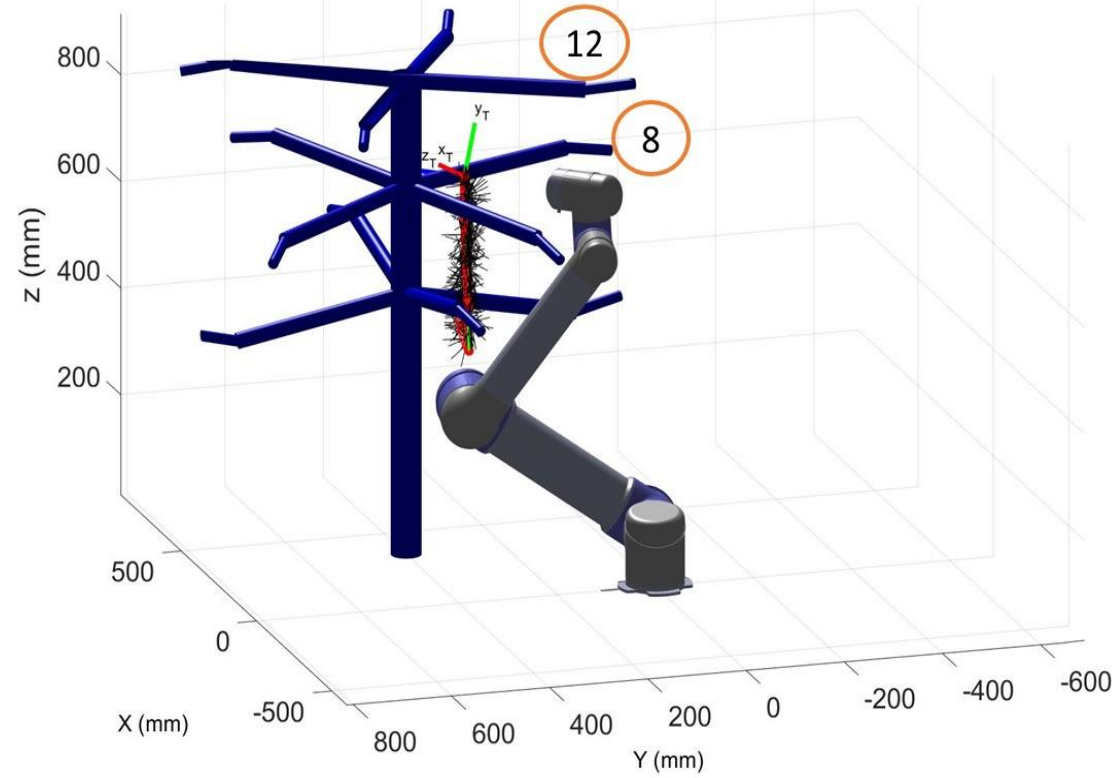
- Smoothing reduced length → 34% and 22% for branch 2 and 6 respectively
- Optimization reduced length → 29% and 20% for branch 2 and 6 respectively
- Computational time depends on the step size, number of obstacles, distance between start and endpoint of the path

Results Effect of Approach Angle

Rot (X_T) = +45°



Rot (Y_T) = +30°



Results Effect of Approach Angle

Simulation results for RRT path planning and smoothing for different target branches

Branch No.	No. of Obstacles	Approach pose with x-axis rotation ($X_T = +45^\circ$)		Approach pose with y-axis rotation ($Y_T = +30^\circ$)	
		Length (mm)	Time (Sec)	Length (mm)	Time (Sec)
2	1	427	28	382	27
8	1	485	27	478	23
6	2	531	31	566	29

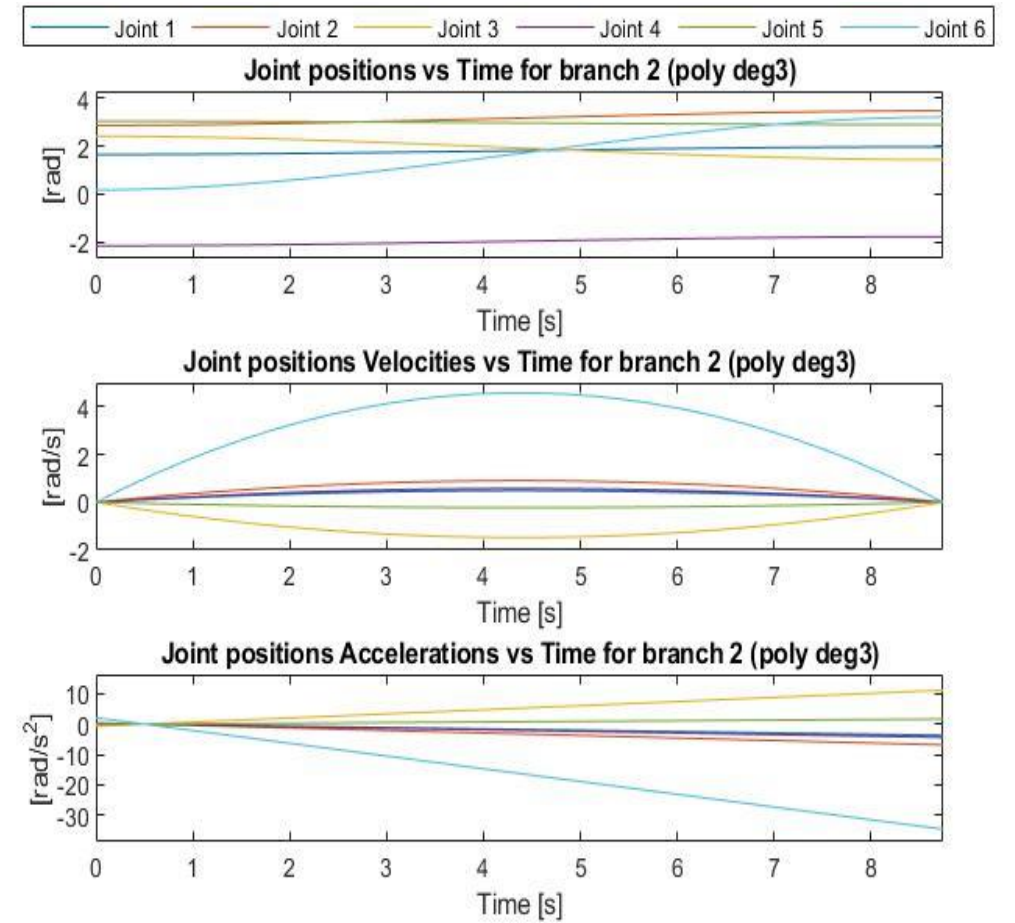
Successful to find path

Results and Observations

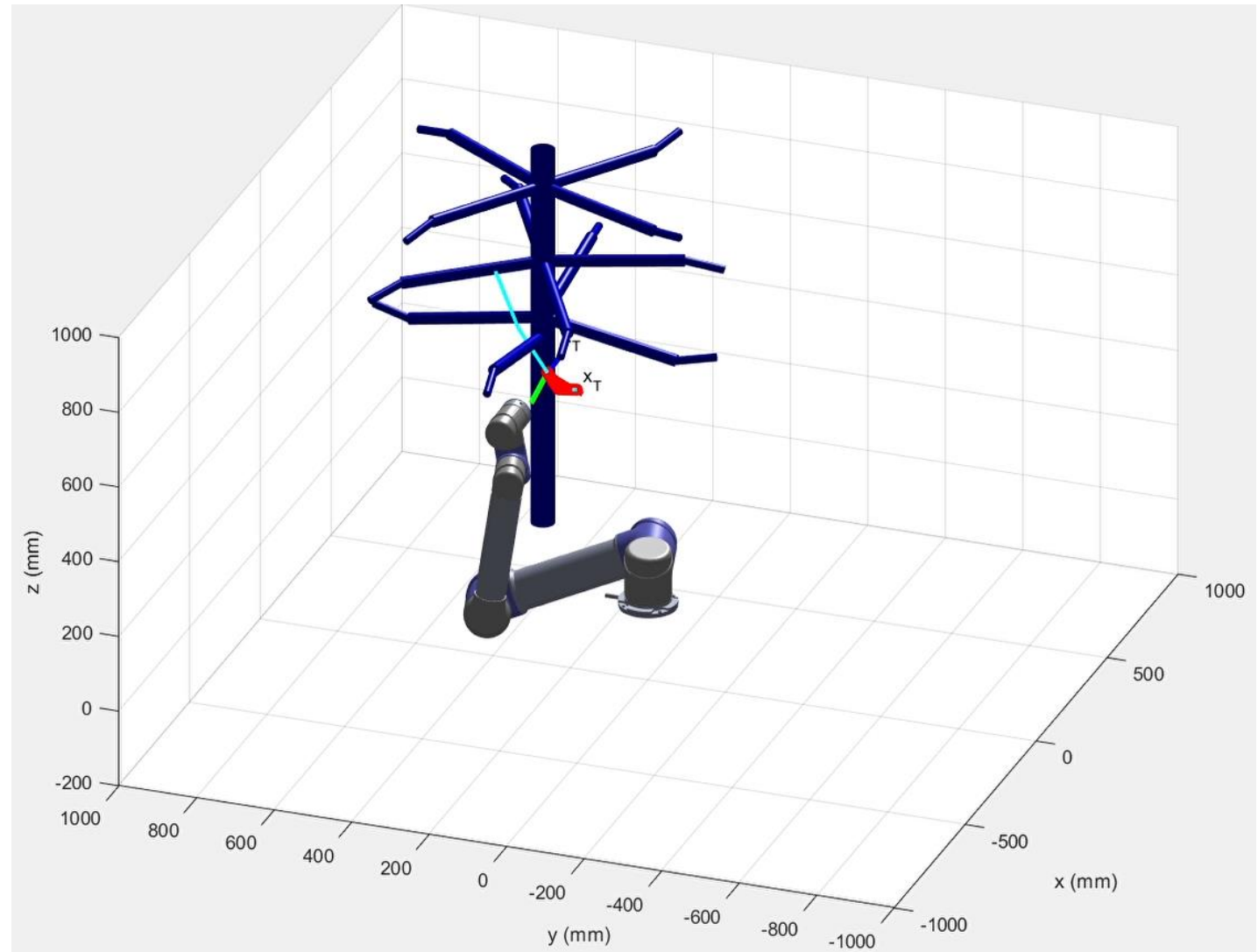
- Improves the path finding success
- Smoothing reduced the path length considerably
- Computational time was approximately similar for all approaches
- Computational time depends on how much manipulator move sideways for each pose

Validation: Path planning using UR5

Hardware Interface



Validation: Path planning using UR5



- The RRT algorithm was successful in finding a collision-free path
- The smoothing method successfully reduced the RRT path lengths
- The alternate poses improves the path finding success
- A modified RRT is suggested with optimization algorithms (Genetic Algorithm) to stabilize and improve the obstacle avoidance

Future Work: Tests will be conducted to validate the simulation results using a UR5 manipulator

Acknowledgements

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- Northeast Sustainable Agriculture Research and Education (SARE)



United States Department of Agriculture
National Institute of Food and Agriculture



Thank you!