



A Rubik's Cube Solution Using Deep Learning and Robotic Arm Coordination

Group 5-11

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1.1 Introduction: Motivation and Objective

- Motivation

Due to the rapid development of human-robot collaboration in recent years, we are now able to utilize robotic arms for more human-centered applications. Therefore, we aim to guide individuals in solving a Rubik's Cube through the integration of robotic arms, image recognition systems, and algorithms designed for solving the cube.

- Objective

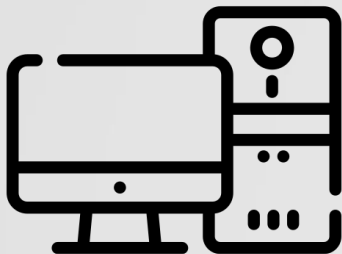
We are developing a Rubik's Cube collaboration system that integrates various software and hardware technologies to achieve human-robot interaction for solving the cube.

- 1.Sensors: RGB-D Depth Camera Realsense D435
2. Robotic Arm: TM Robot
- 3.Image Processing: OpenCV
- 4.Algorithm: Kociemba's two-phase algorithm
- 5.Deep Learning: PointNetGPD

2.1 Hardware : System Setup

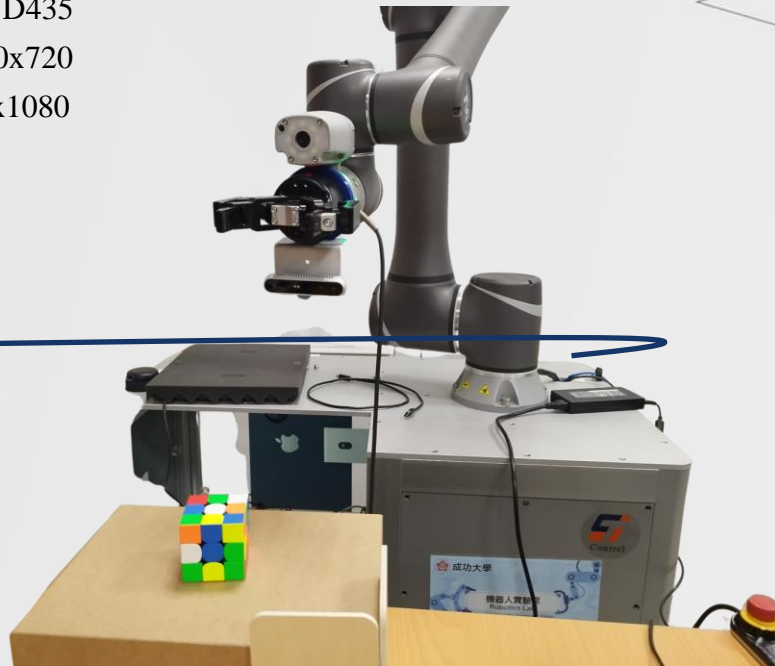
Sensor: Obtain the position and orientation of a Rubik's Cube.

- Intel® RealSense™ Depth Camera D435
- Depth output resolution: Up to 1280x720
- RGB frame resolution: Up to 1920x1080

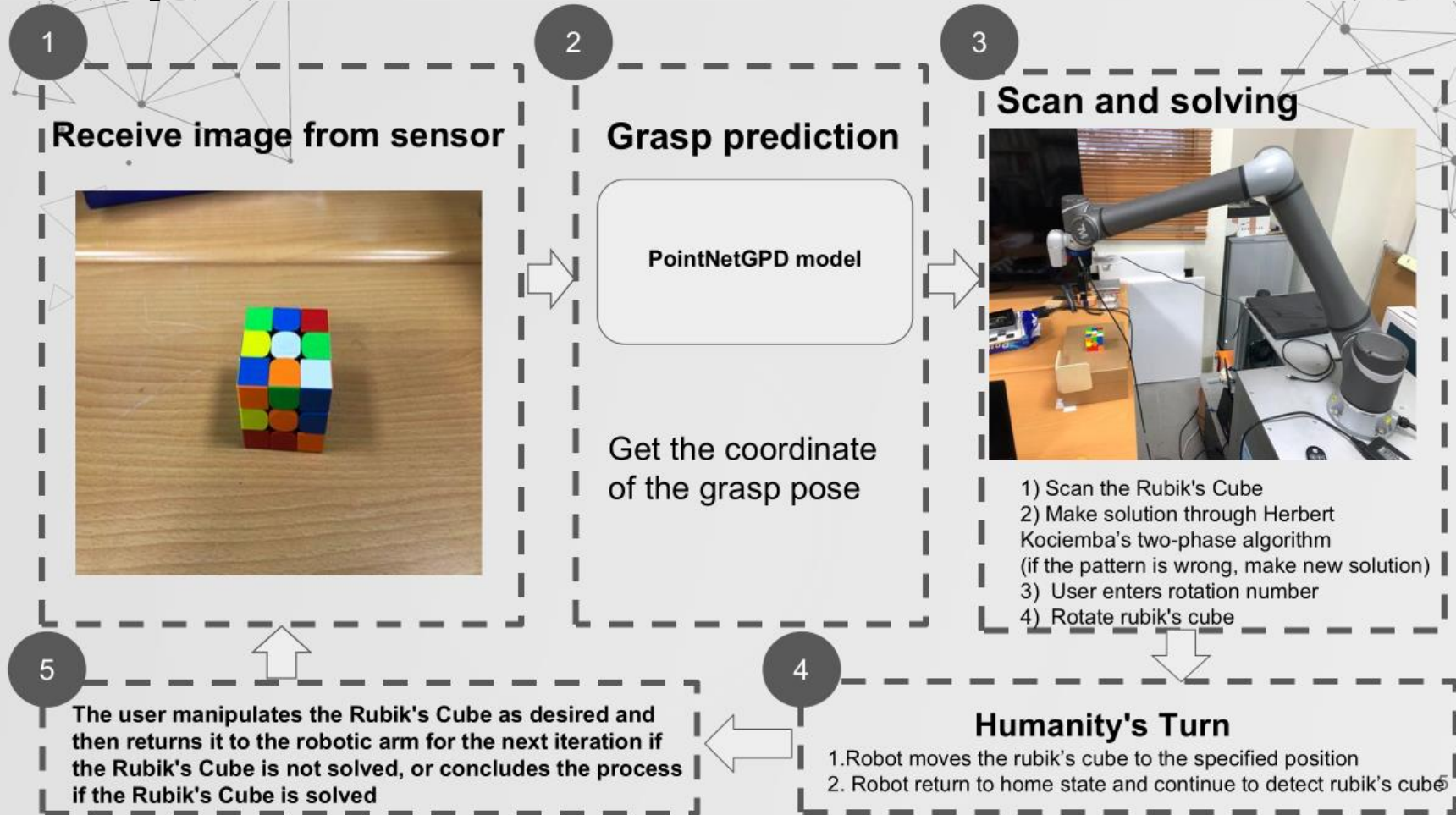


Computer: Visualize and Solve the Rubik's Cube

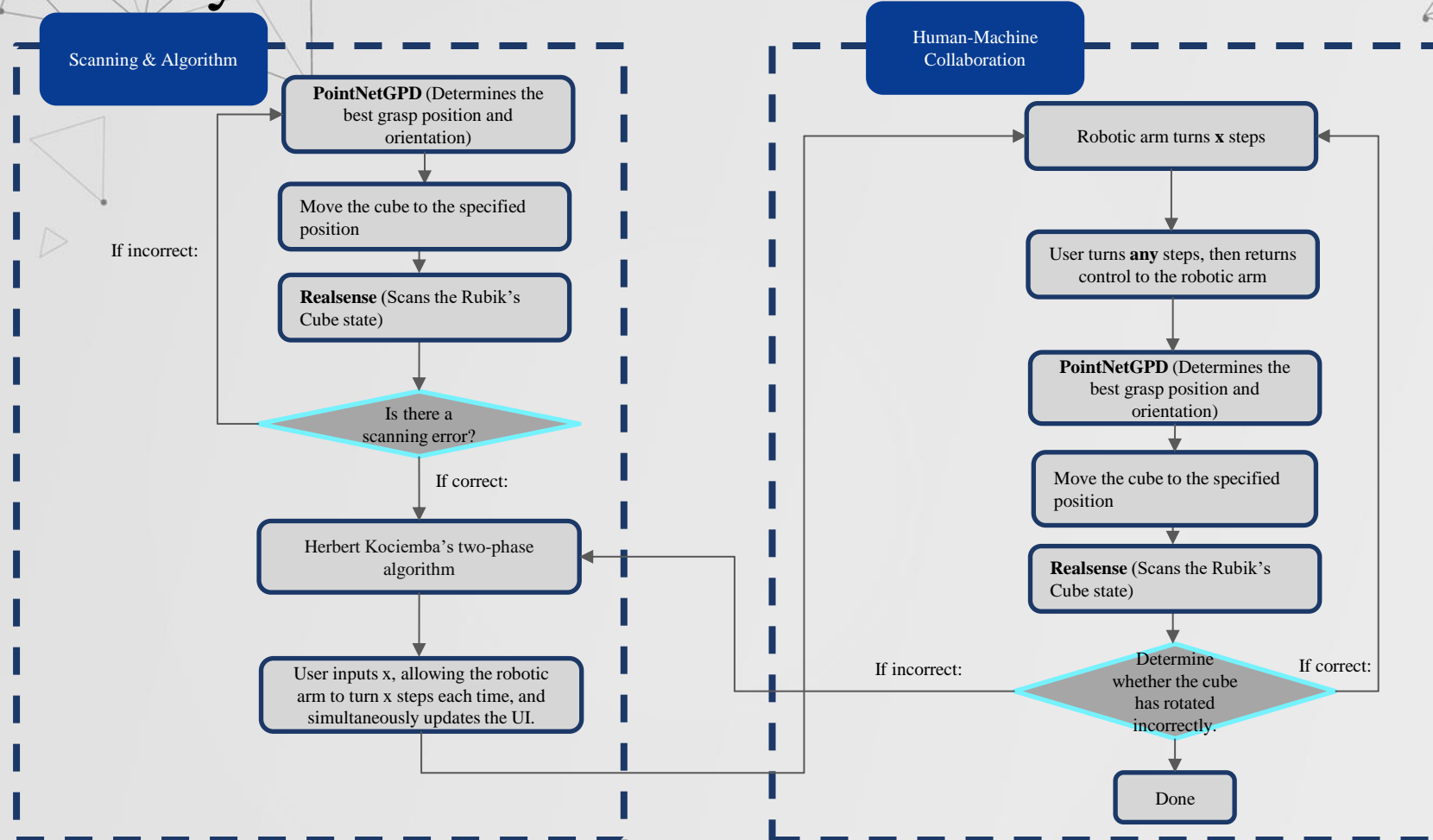
- Ubuntu 20.04.6 LTS
- Intel® Core™ i7-10750H CPU @ 2.60GHz × 12
- NV166 / Mesa Intel® UHD Graphics (CML GT2)



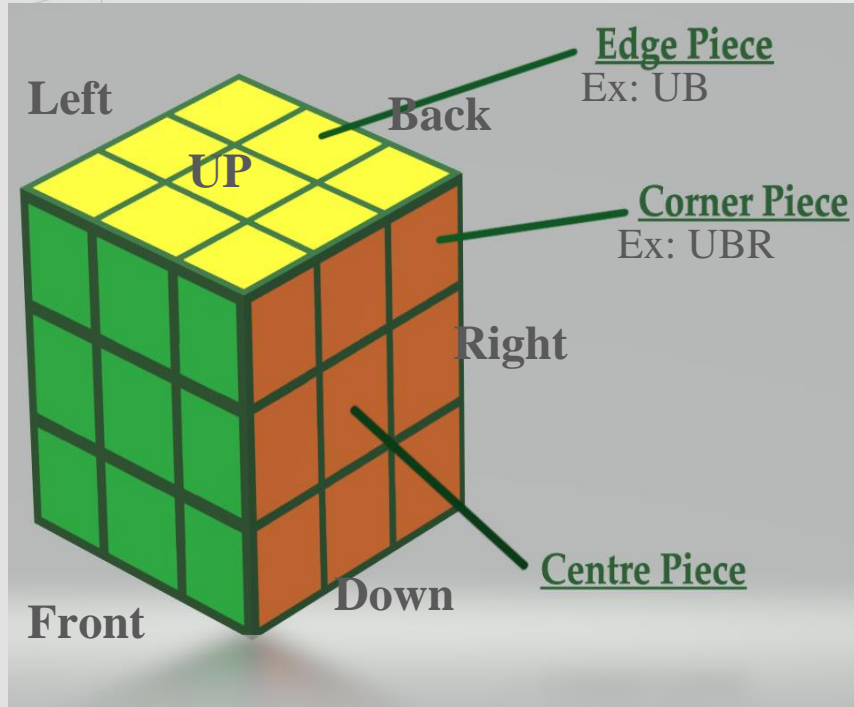
3.1.1 System Framework



3.1.2 System Workflow



3.2.1 Rubik's cube



Signmaster Notation & Moves

F = Front

R = Right

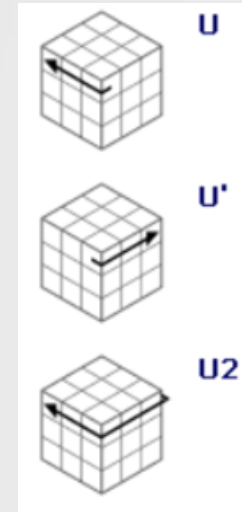
B = Back

U = Up

L = Left

D = Down

Ex: U moves



3.2.2 The Two-Phase-Algorithm-Implementation

Initial step

Defining basic moves and
the coordinates
 $G = \langle U, D, R, L, F, B \rangle$

Initializing the move
tables and pruning
tables

For each input, **try every basic move**
with move table

Finding its distance with
pruning table

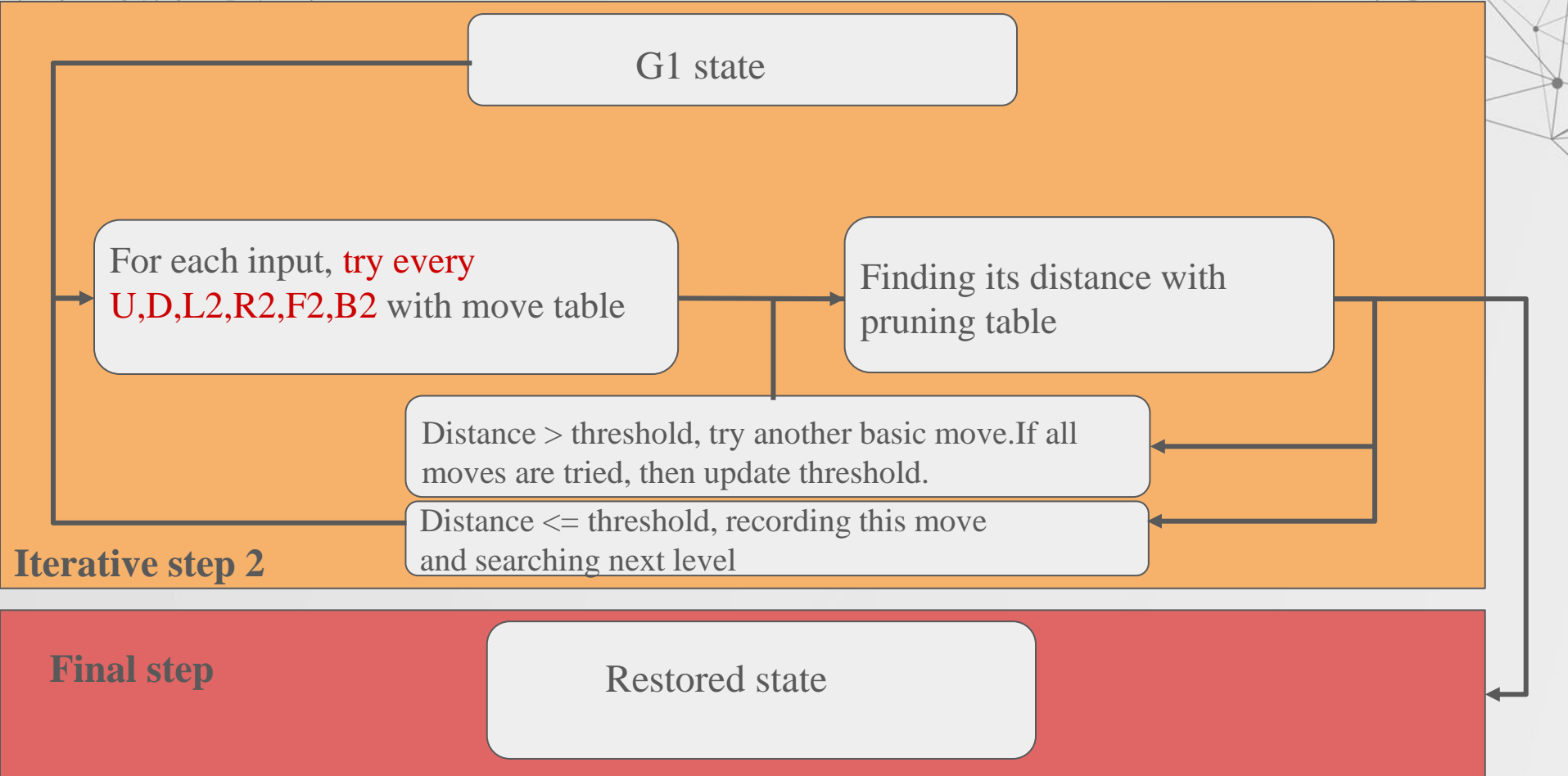
Distance > threshold, try another basic move. If all
moves are tried, then update threshold.

Distance ≤ threshold, recording this move
and searching next level

$G1 = \langle U, D, L2, R2, F2, B2 \rangle$
state

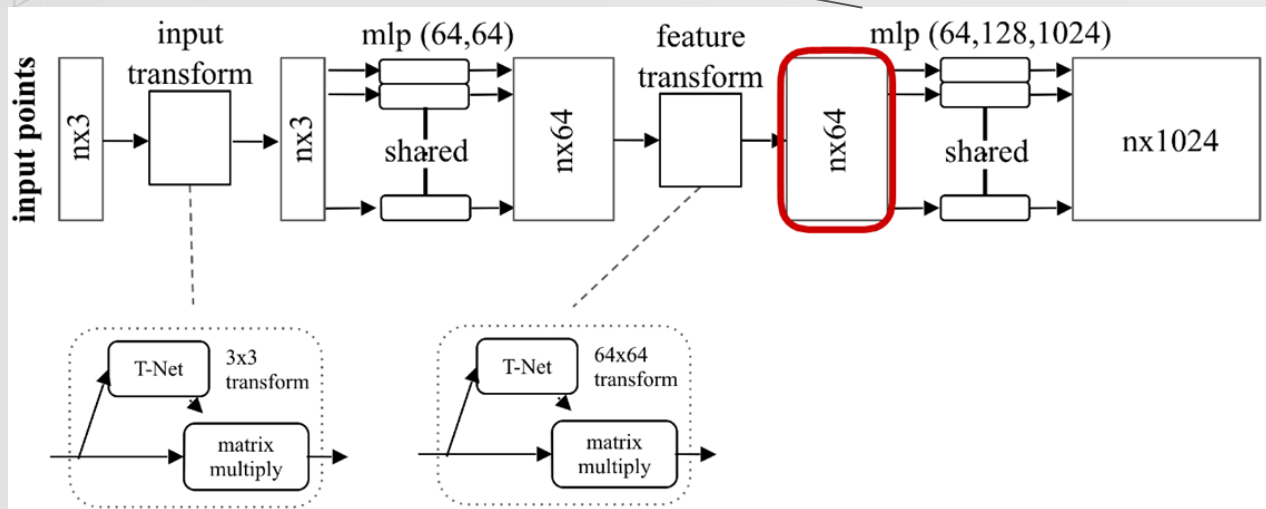
Iterative step 1

3.2.2 The Two-Phase-Algorithm-Implementation

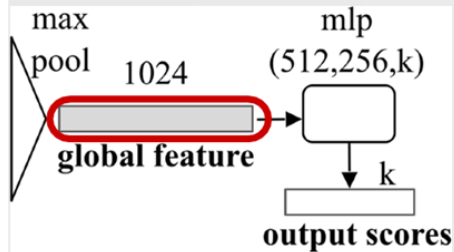


3.3.1 Pointnet(Classification)-Concept

convolutional+batch normalization+activation function(relu)

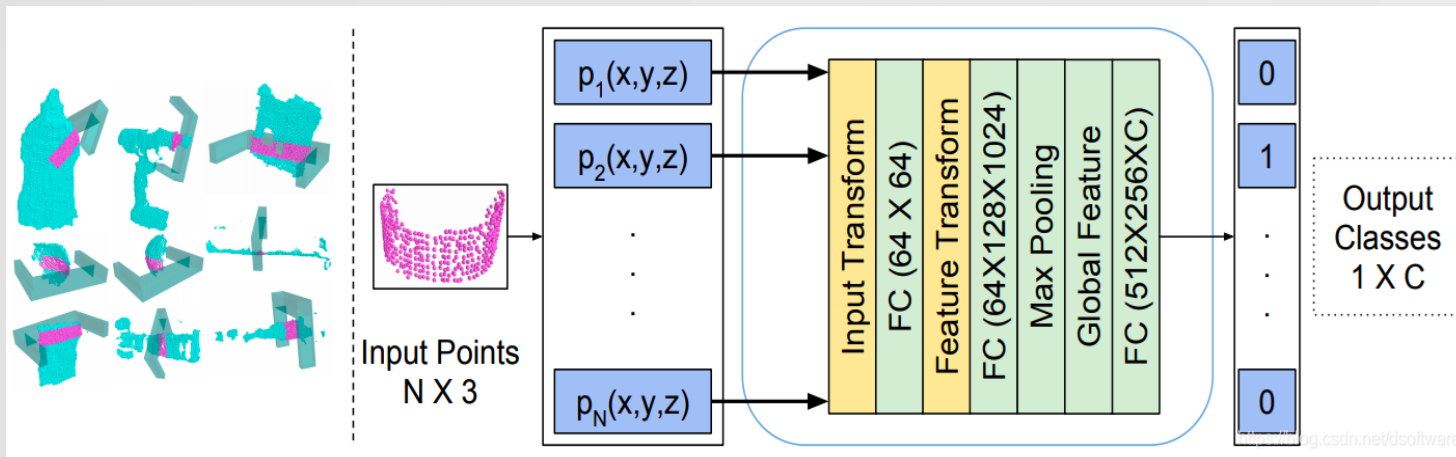


fully connected+
batch normalization+
activation function(relu)

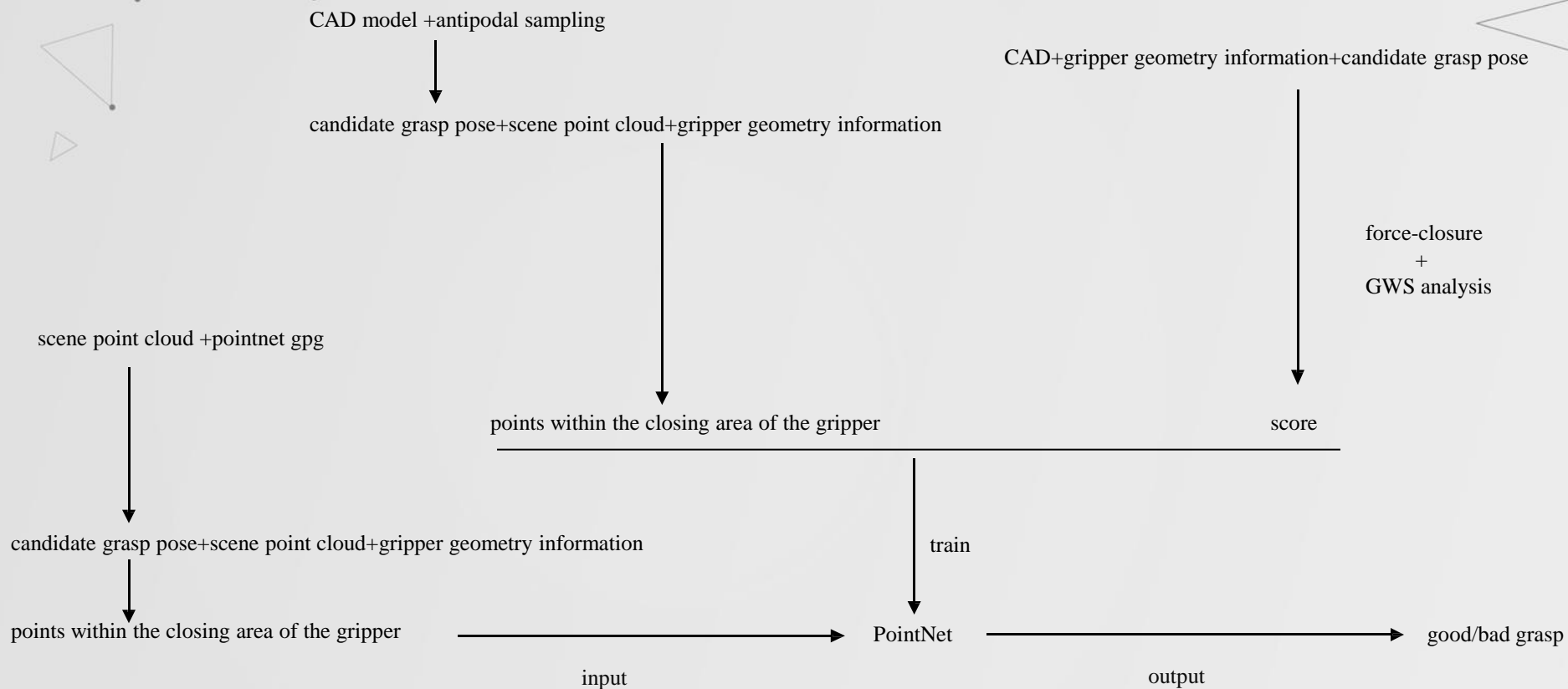


3.3.2 PointnetGPD-Concept

- step1 : Taking raw sensor input from a common RGB-D camera, convert the depth map into a point cloud
- step2 : several grasp candidates will be sampled with essential geometry information as constraints.
- step3 : For each candidate, the point cloud within the gripper will be cropped and transformed into local gripper coordinate and finally fed into our grasp quality evaluation network.
- step4 :The grasp with the highest probability will be executed.



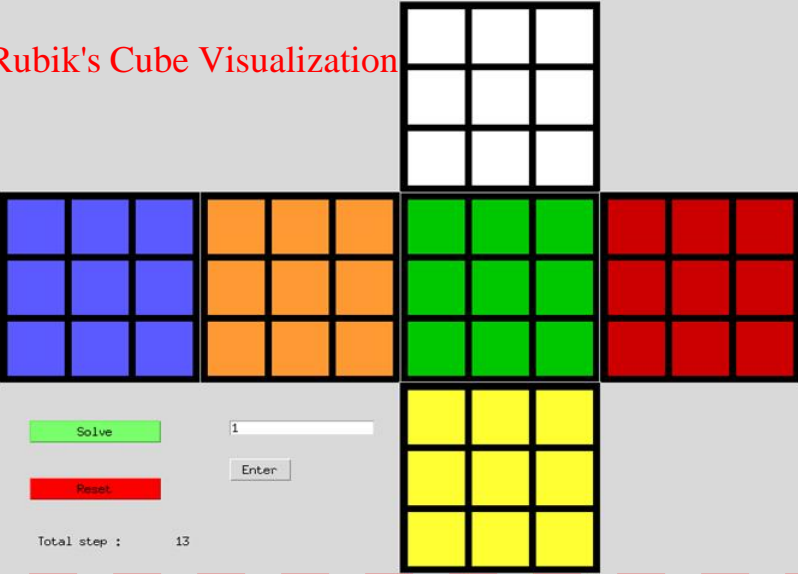
3.3.3 PointnetGPD-Implementation



3.4 User Interface

Cube Status

Rubik's Cube Visualization

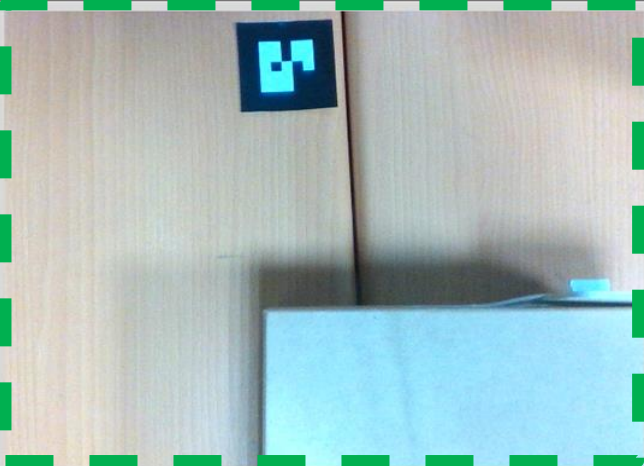


Solve 1

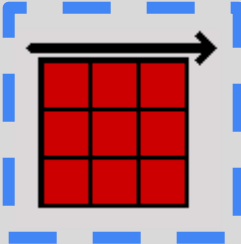
Reset Enter

Total step : 13


Rubik's Cube Scanning Area



Current Step



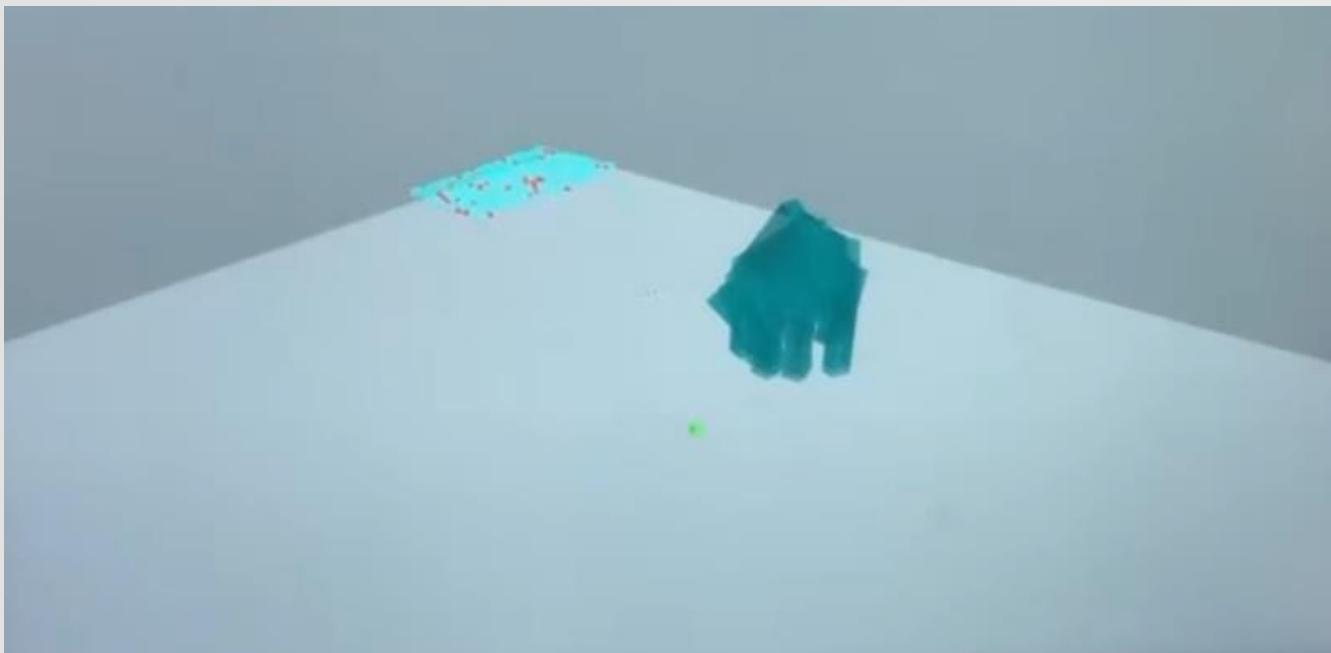
Solution Step Flowchart



4.1 Experimental Results

Grasping Pose Candidates Produced by PointNetGPD:

The image below displays the predicted good grasping pose candidates generated by the PointNetGPD model. Since multiple good candidates may exist, overlapping instances can occur in the image. The model selects the candidate with the highest score as the final output.



5 Reference

1. Kociemba's two-phase algorithm

<http://kociemba.org/cube.htm>

<https://github.com/hkociemba/RubiksCube-TwophaseSolver>

2. Pointnet

<https://arxiv.org/pdf/1612.00593>

<https://github.com/charlesq34/pointnet>

3. Pointnetgpd

<https://arxiv.org/pdf/1809.06267>

<https://github.com/lianghongzhuo/PointNetGPD>