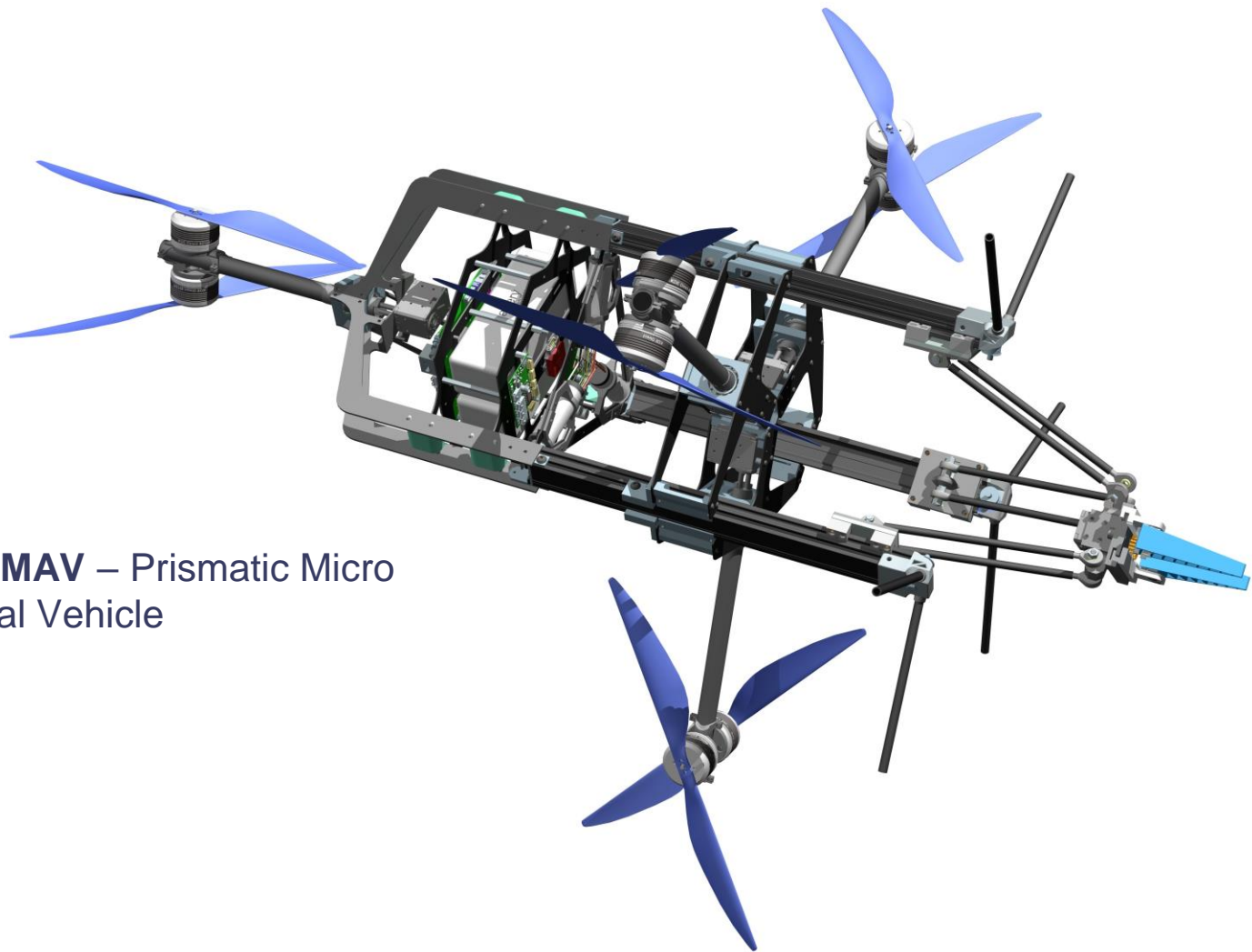


# Object Detection & Grasp Planning with an Omnidirectional Aerial Manipulator

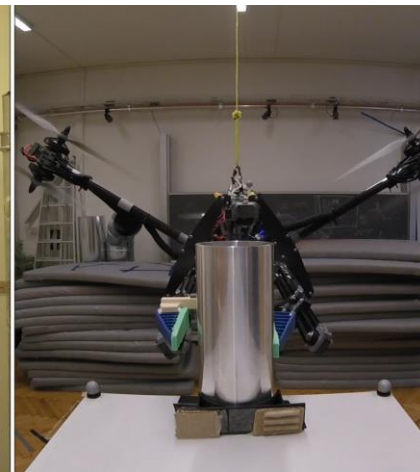
Bachelor Thesis – Final Presentation

Martin Inauen & Philippe Brigger



**PrisMAV** – Prismatic Micro  
Aerial Vehicle





# Object Detection & Grasp Planning with an Omnidirectional Aerial Manipulator

Bachelor Thesis – Final Presentation

Martin Inauen & Philippe Brigger

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Methods

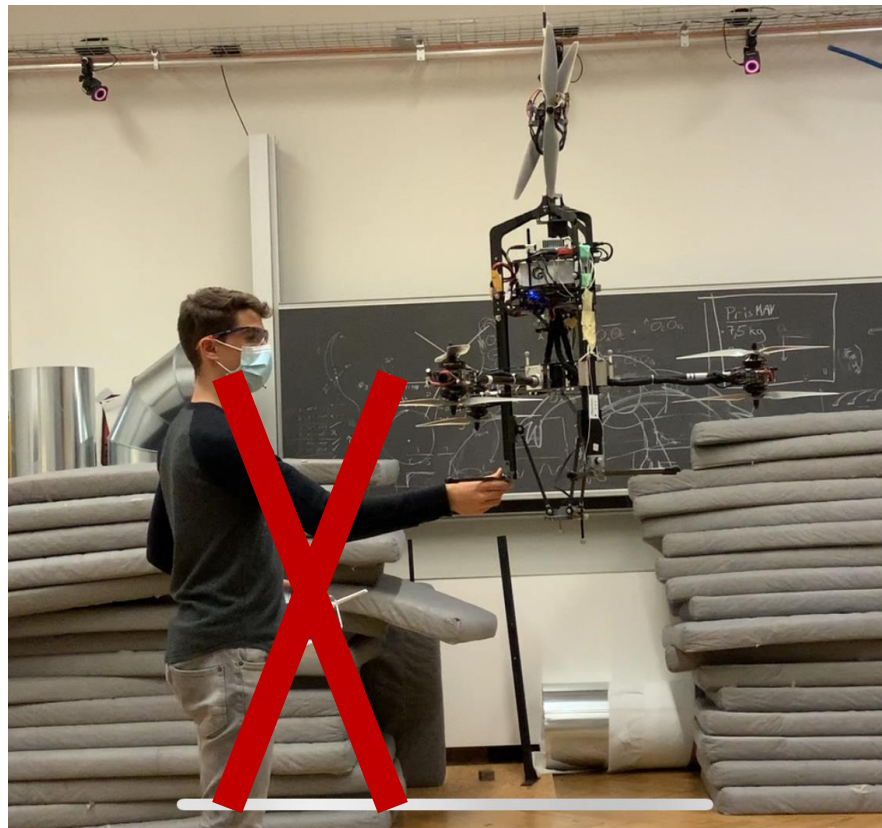


Results



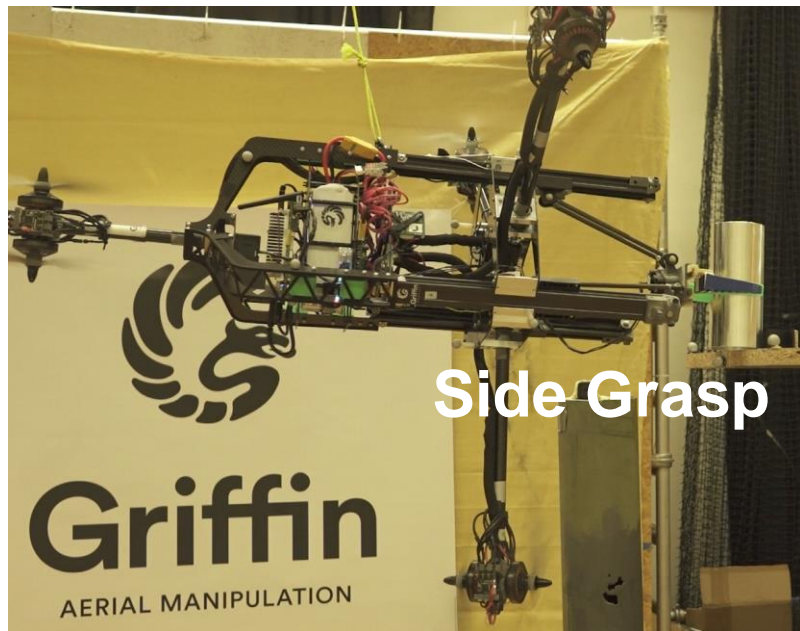
Outlook

# Autonomy





# Flexible Grasping





# Thesis Goals



Detect & locate target objects

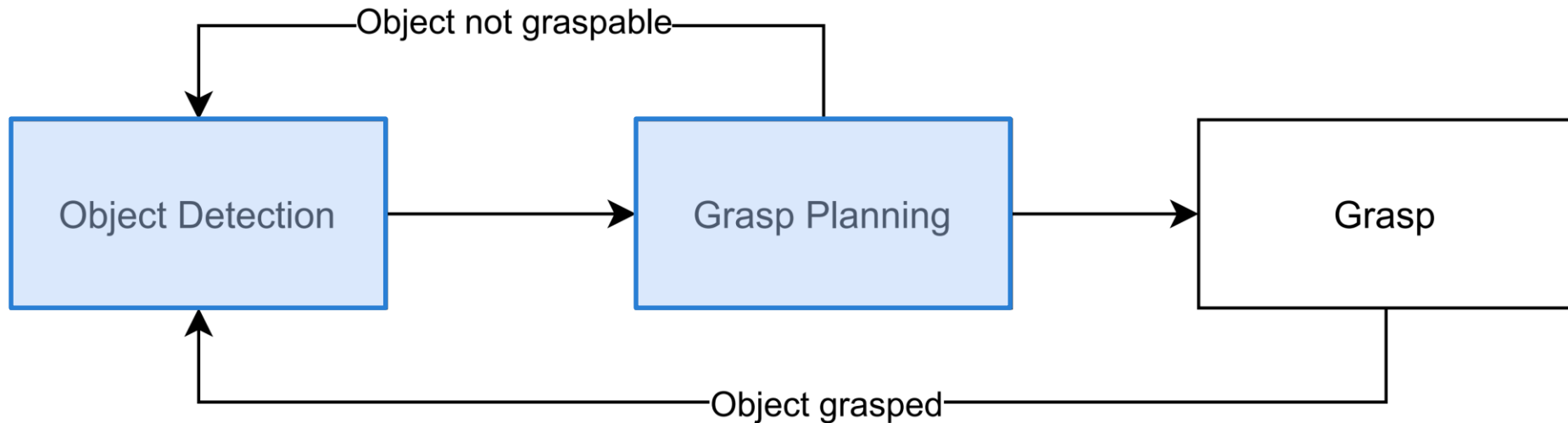


Optimal flight mode for grasp

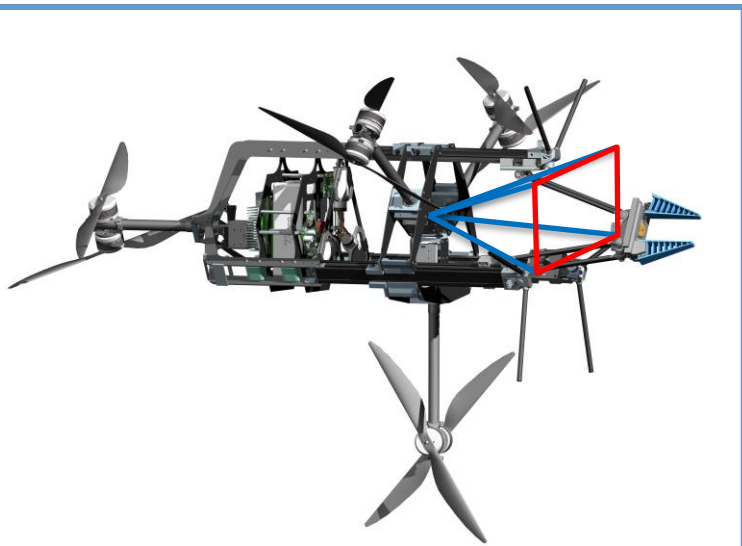


Calculate grasp point

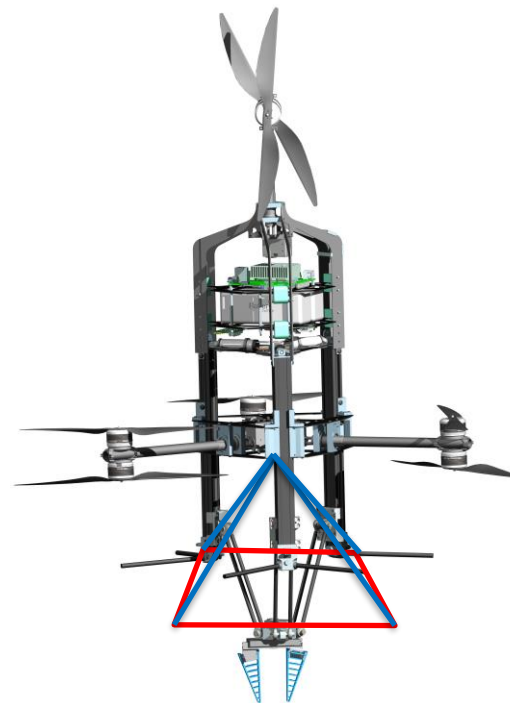
# Pipeline Overview



# Flight Modes

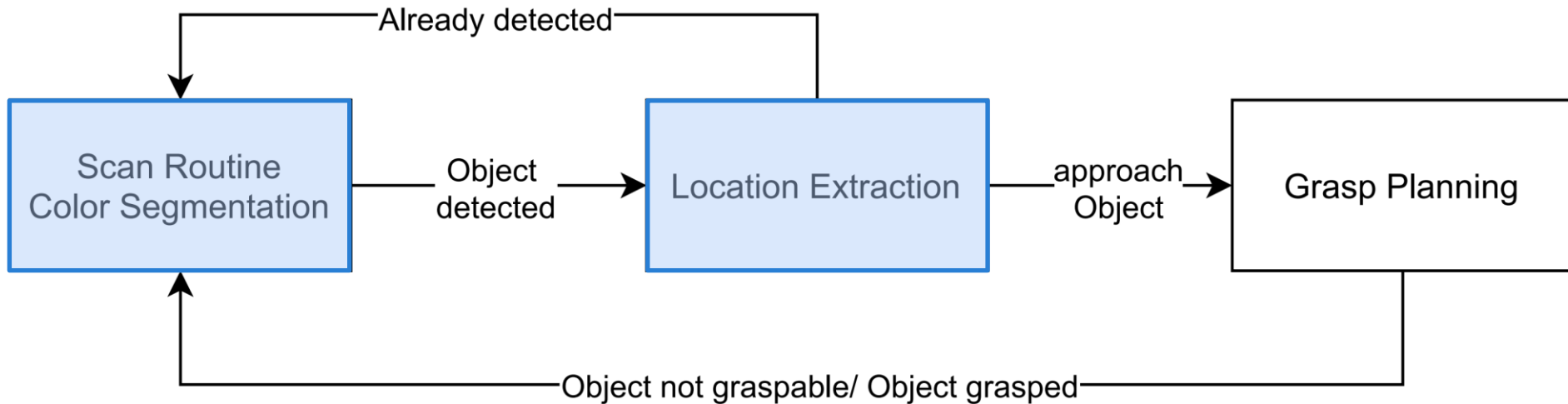


Horizontal Flight Mode

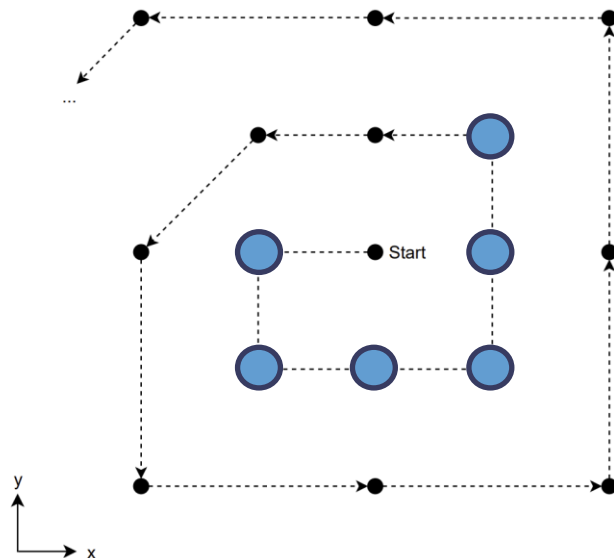
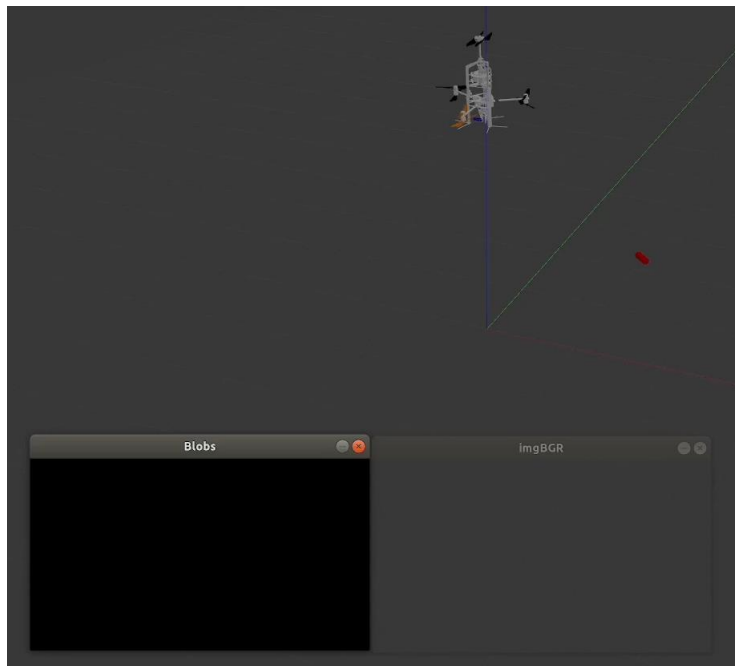


Tricopter Flight Mode

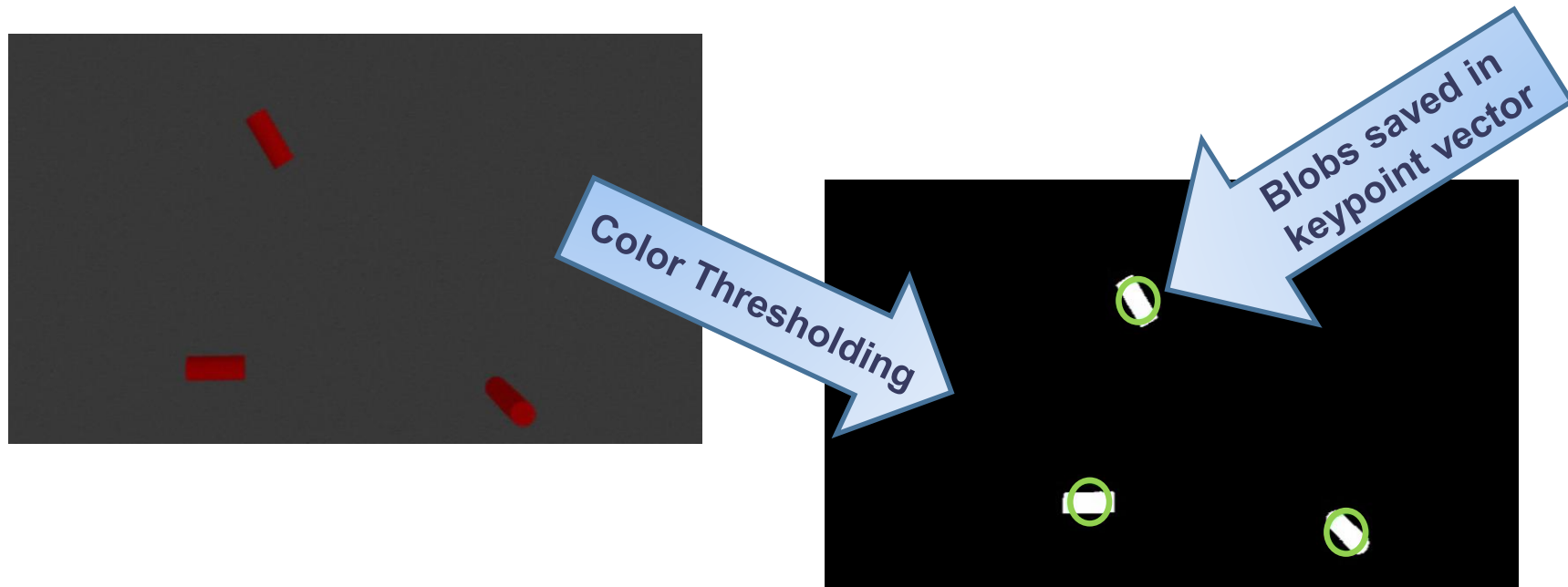
# Object Detection



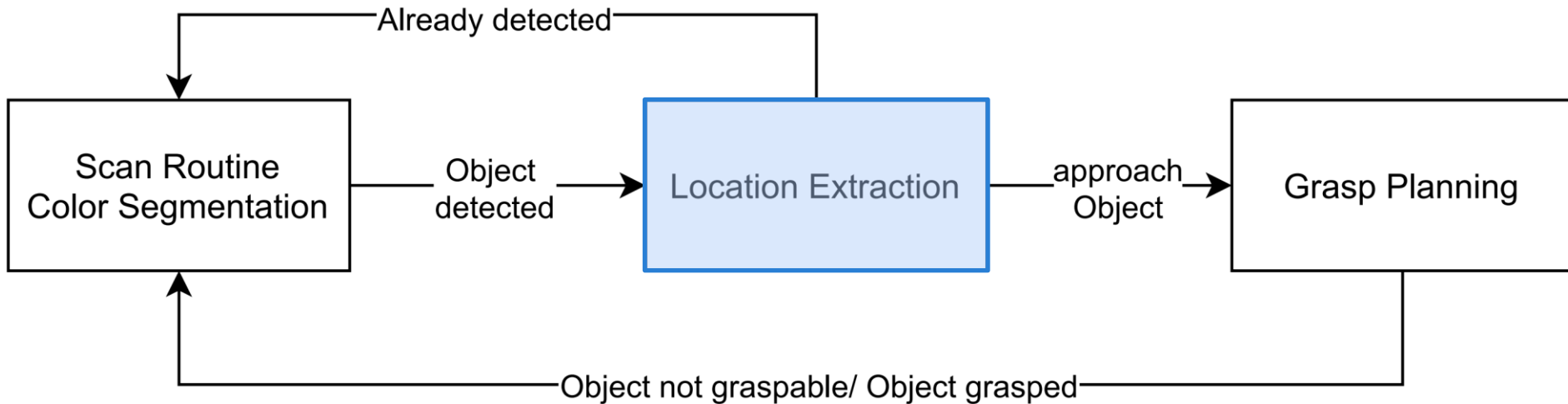
# Scan Routine & Color Segmentation



# Scan Routine & Color Segmentation

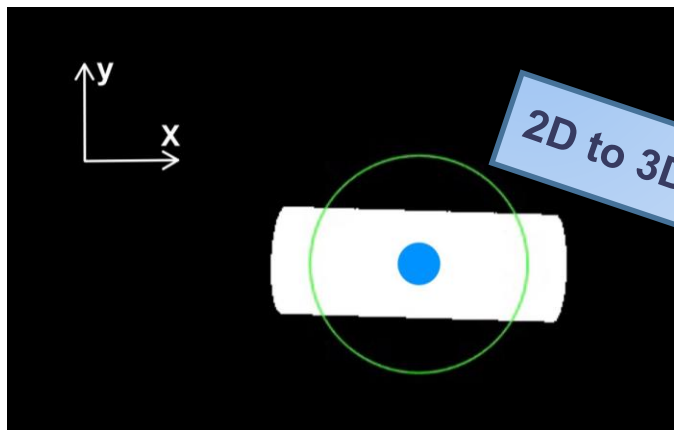


# Object Detection

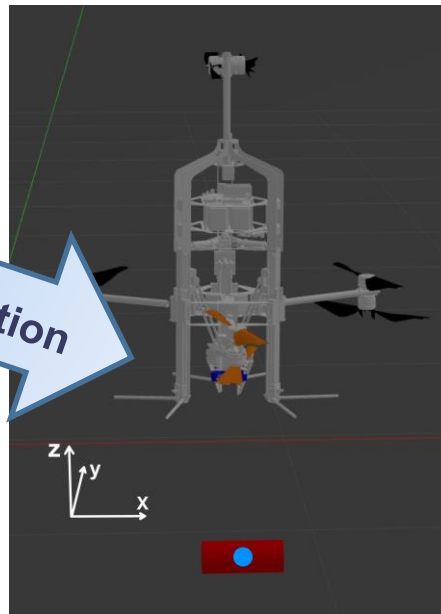




# Location – Blob Center

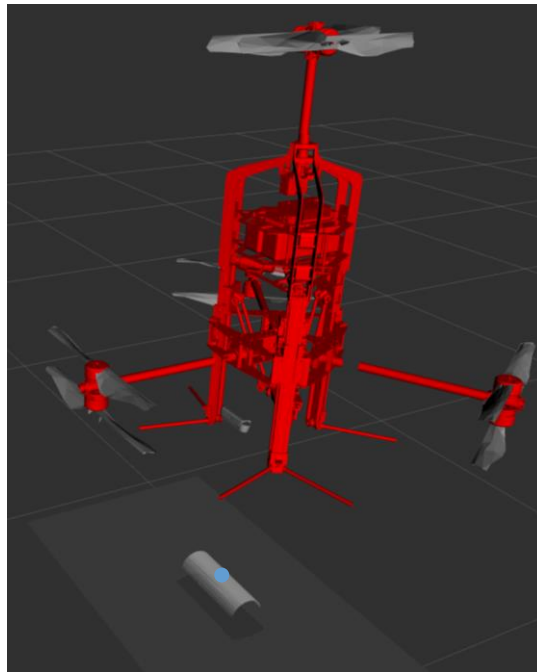


2D to 3D Transformation

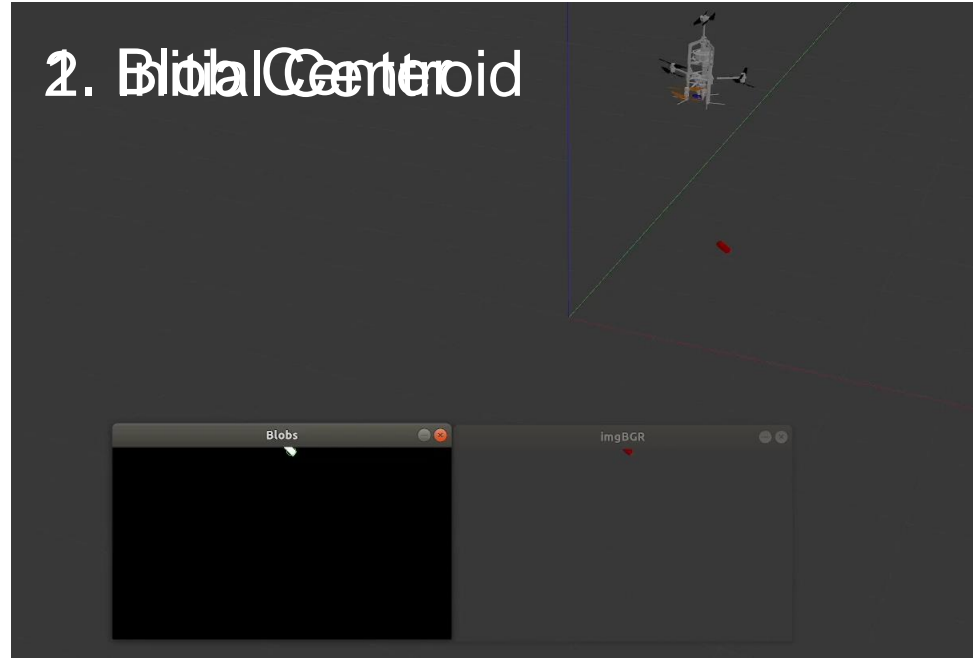


# Location – Initial Centroid

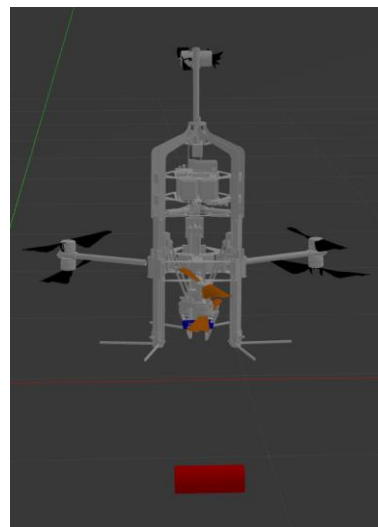
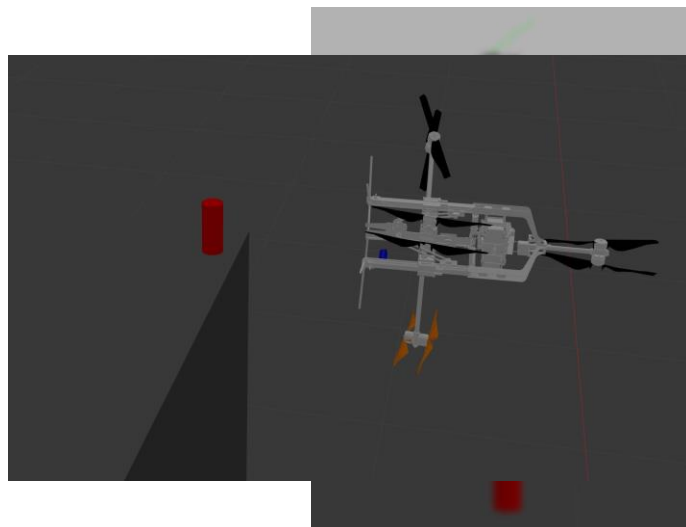
- 3D centroid from 3D point cloud



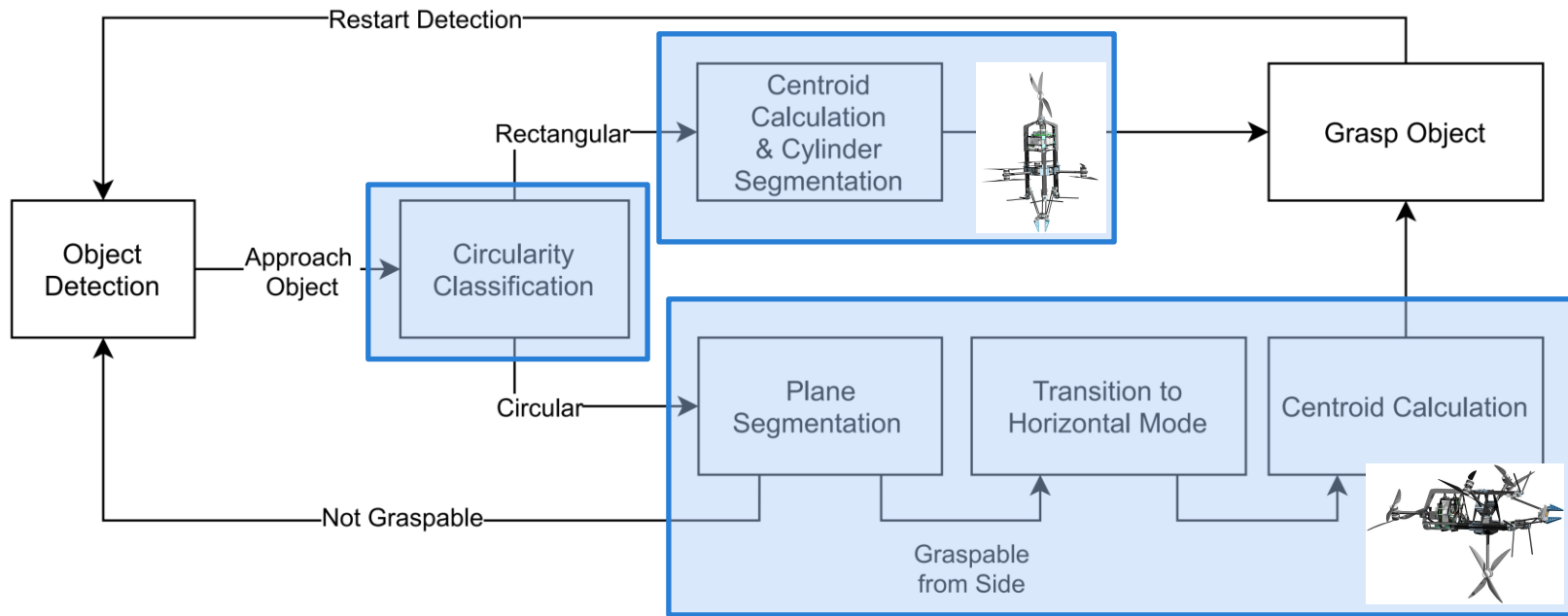
# Location – Approach & Centering



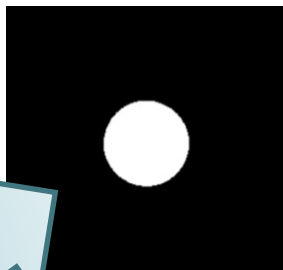
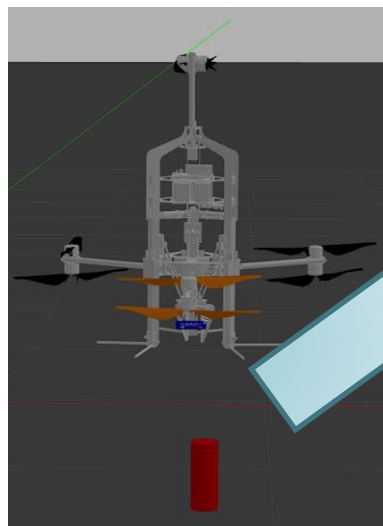
# Object Grasp



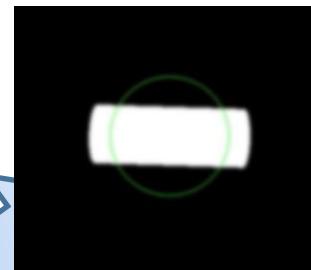
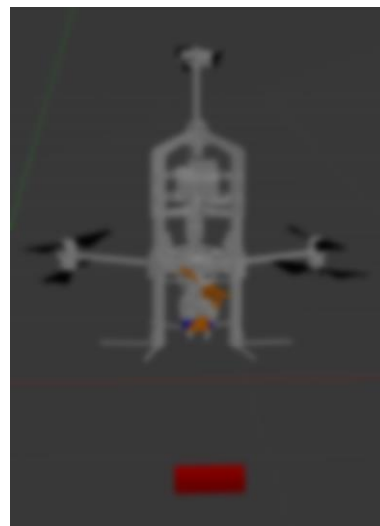
# Grasp Planning



# Circularity Classification

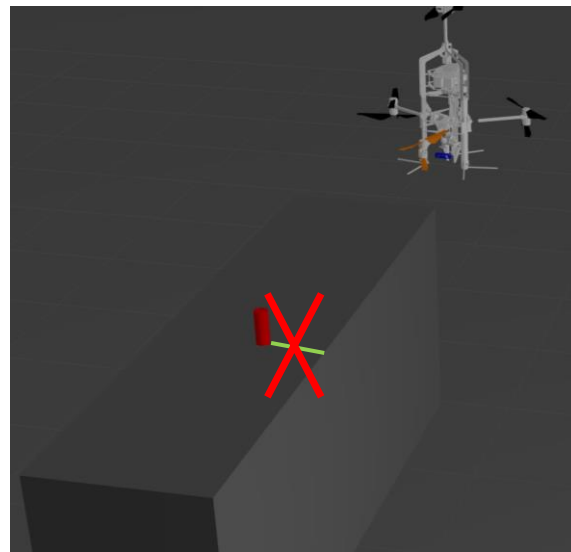
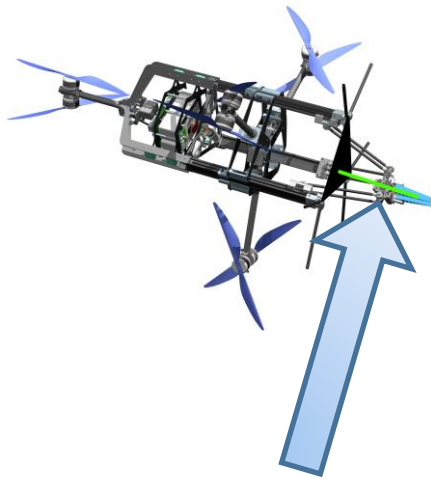
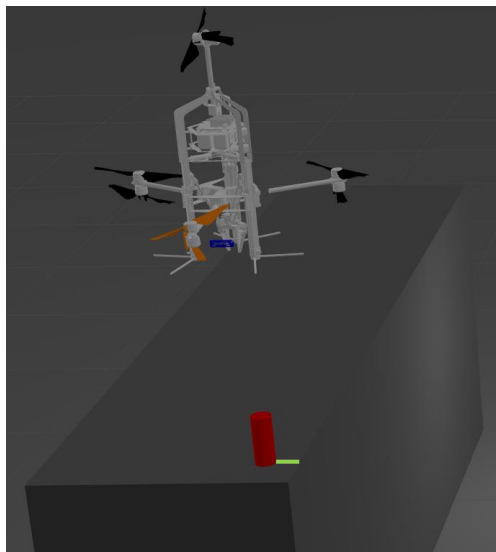


Potentially side  
graspable



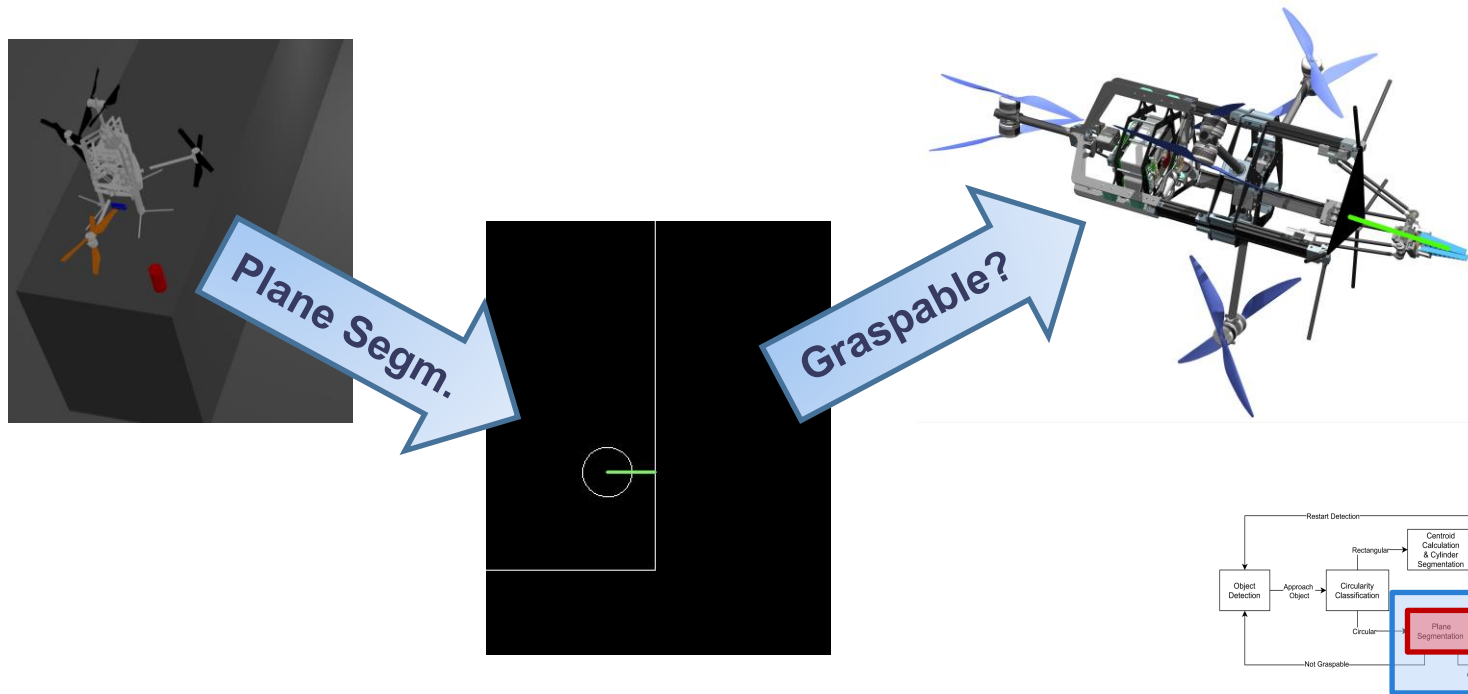
Graspable

# Graspable on shelf

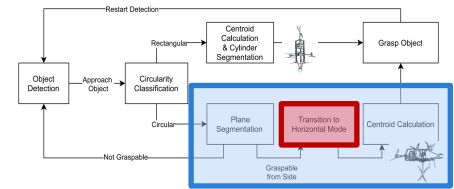
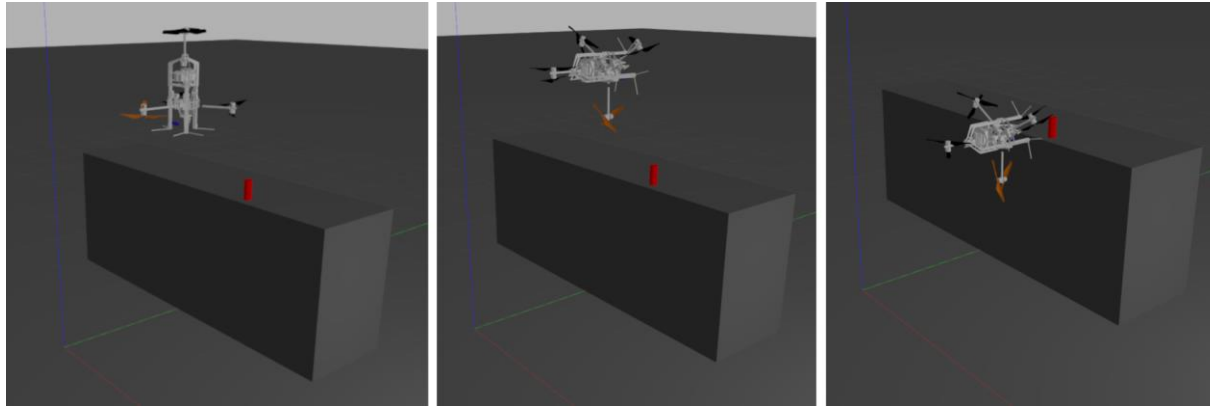




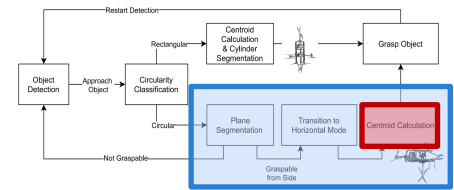
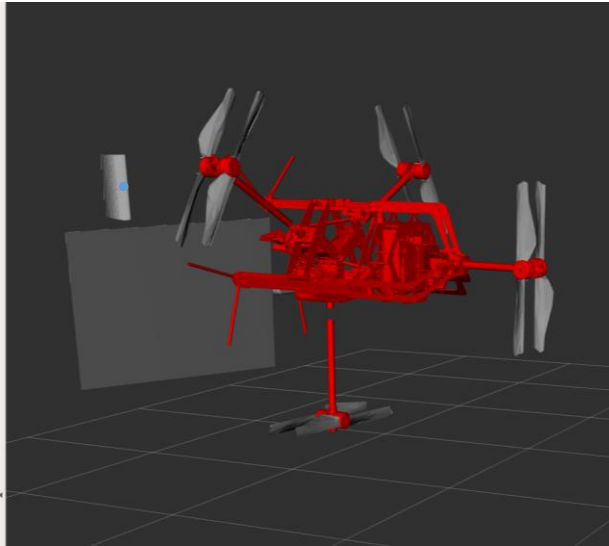
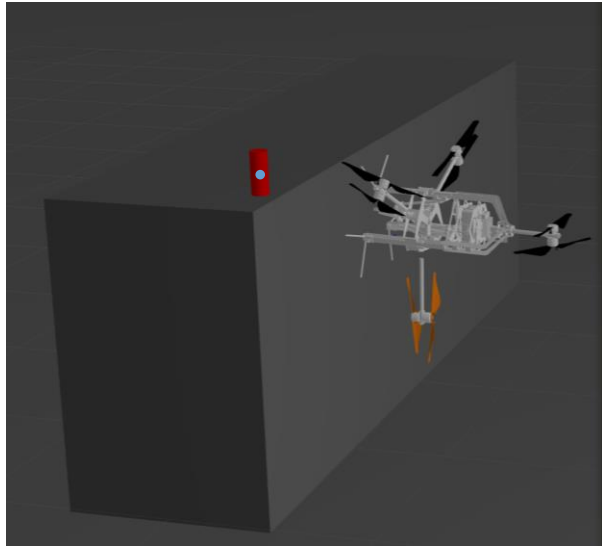
# Plane Segmentation – Side Grasp



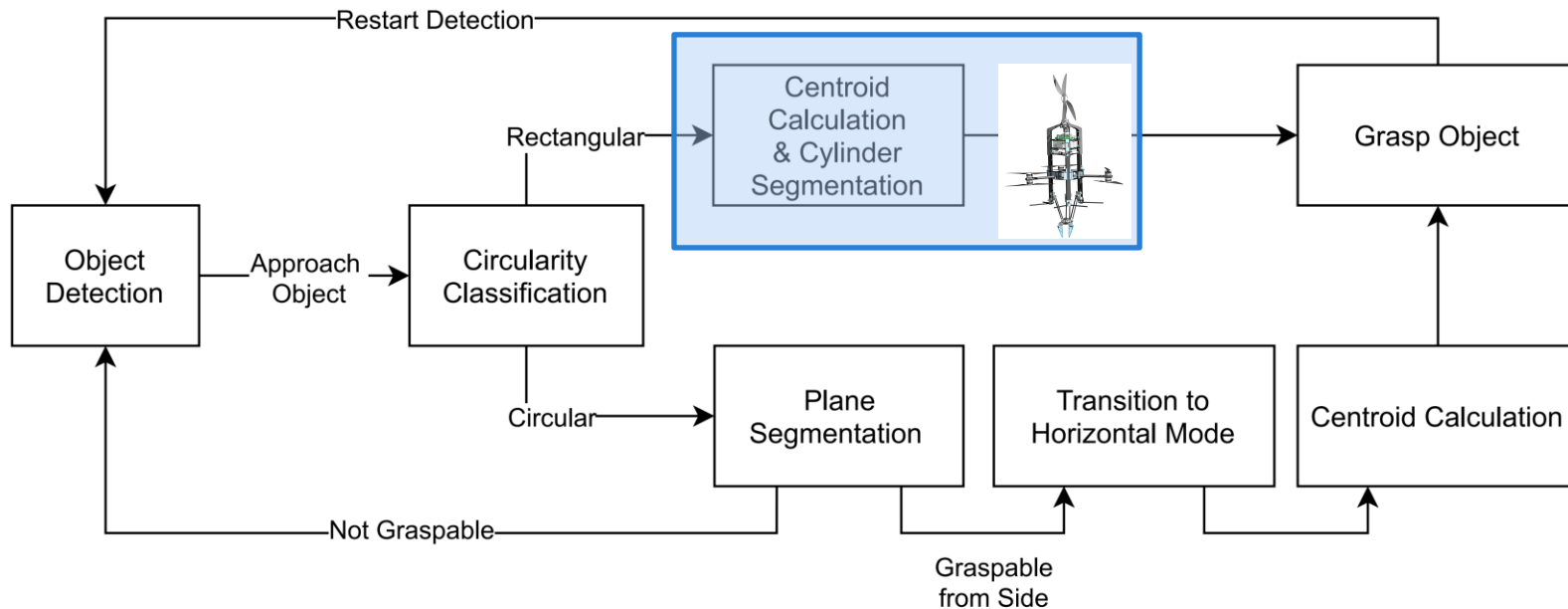
# Transition – Side Grasp



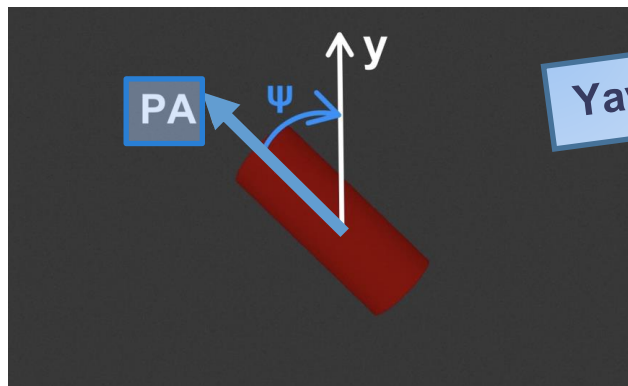
# Grasp Centroid – Side Grasp



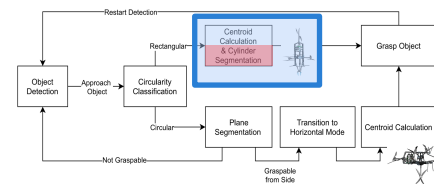
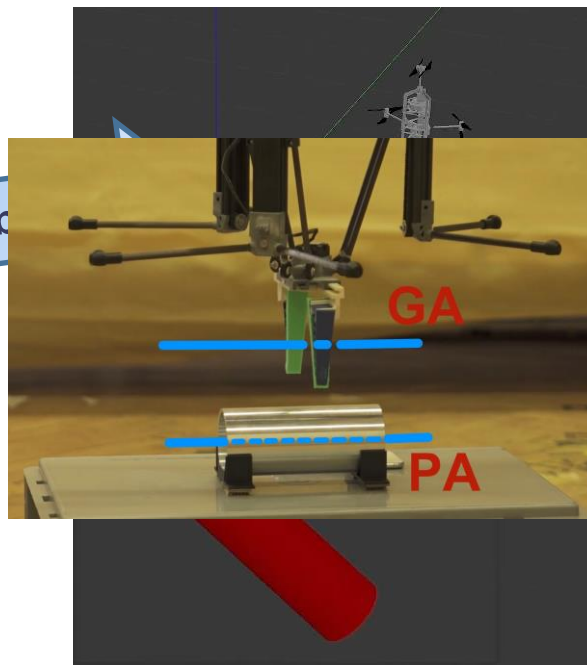
# Grasp Planning Step – Top Grasp



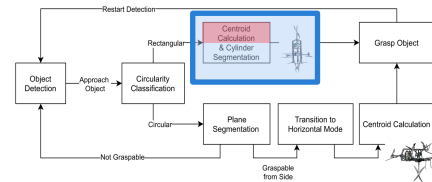
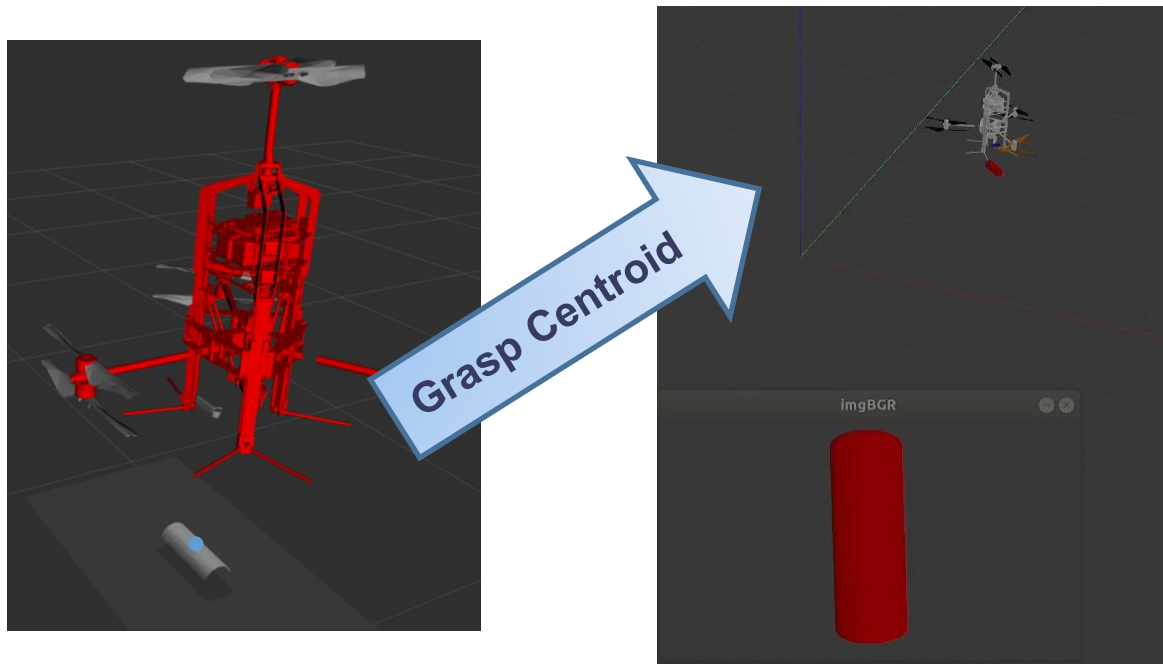
# Cylinder Segmentation – Top Grasp



Yaw b

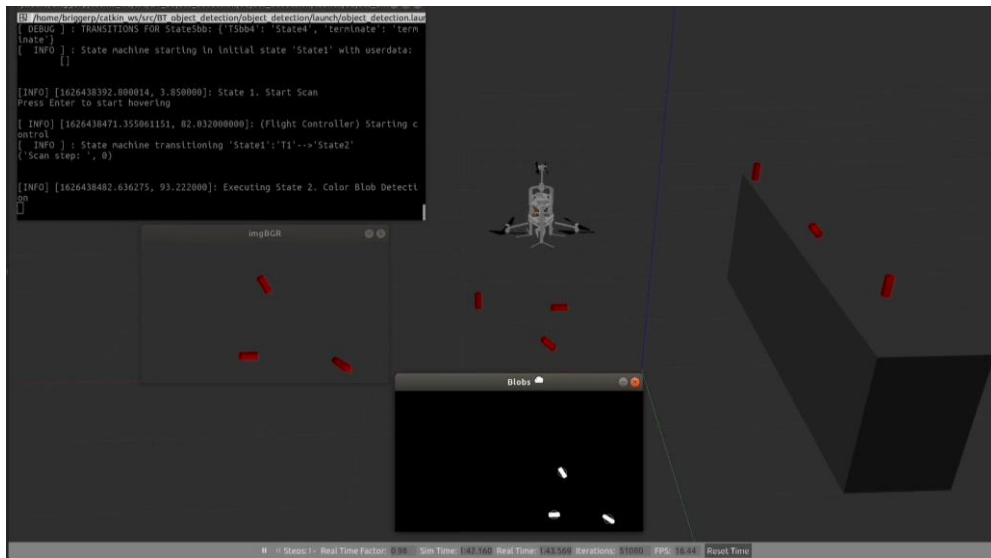


# Grasp Centroid – Top Grasp



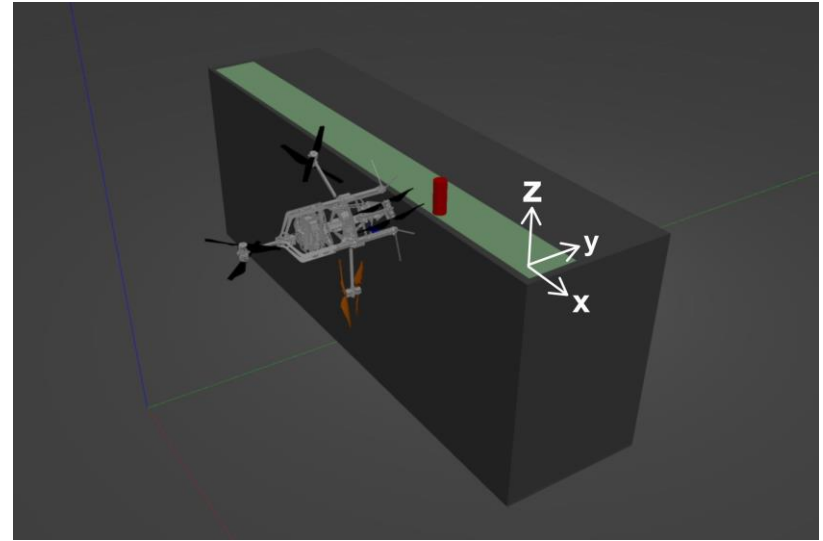
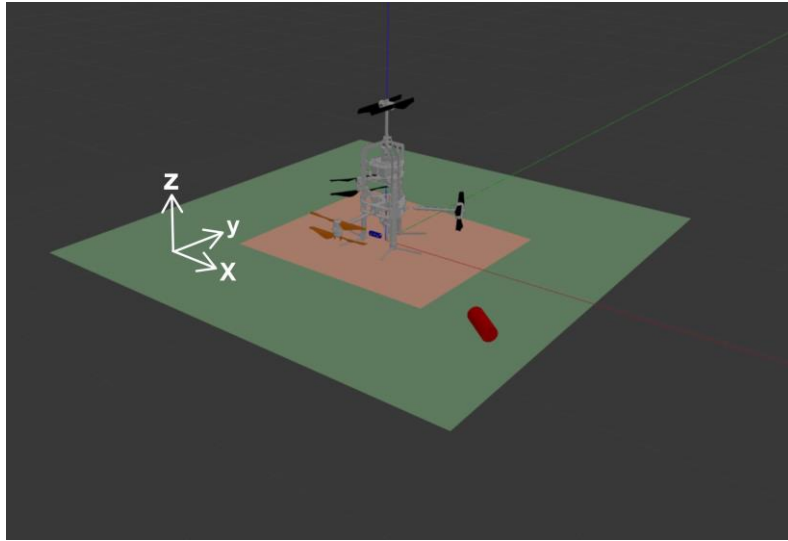
# Testing & Results

- Workflow
- Precision
  - Blob Center
  - Initial Centroid
  - Grasp Centroid

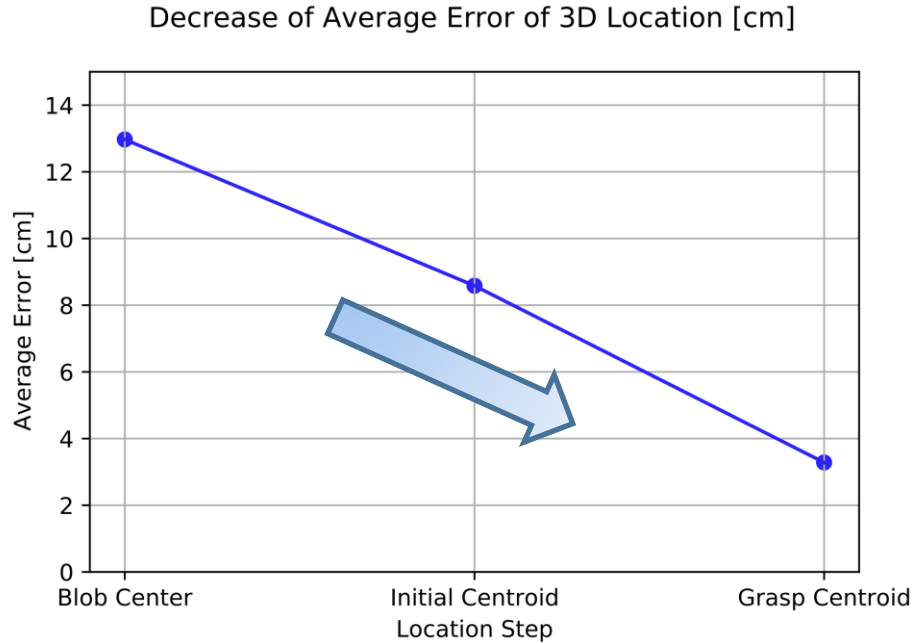




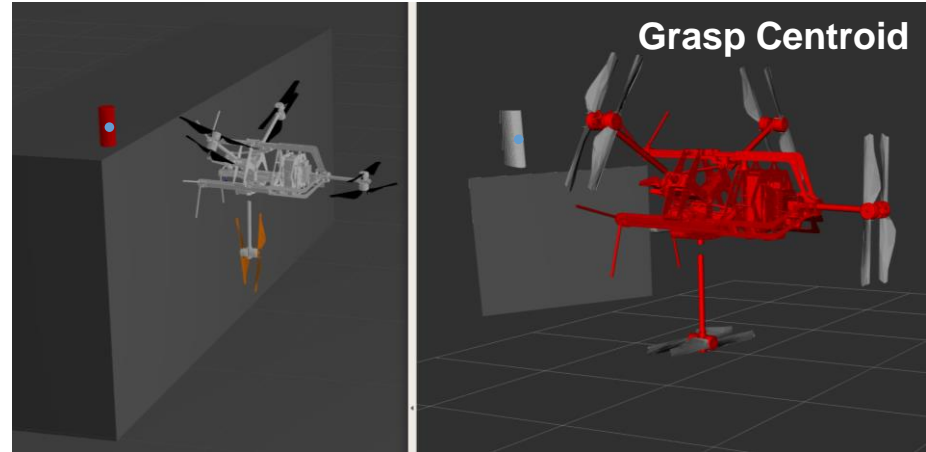
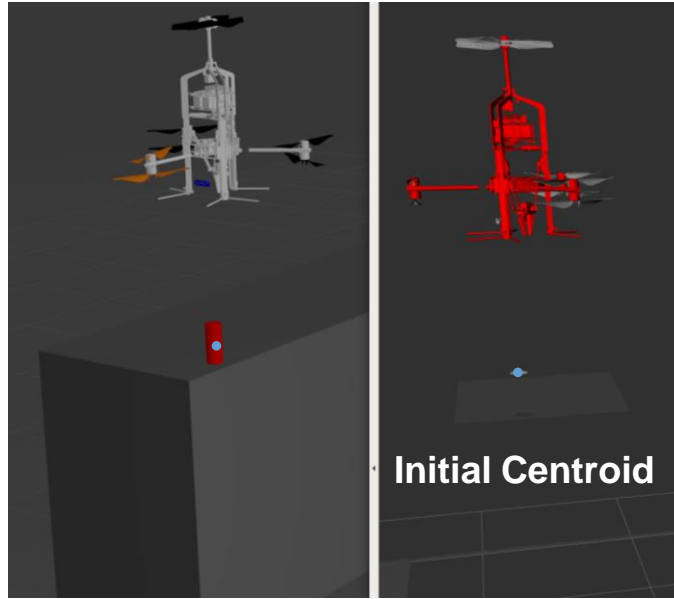
# Testing & Results – Precision



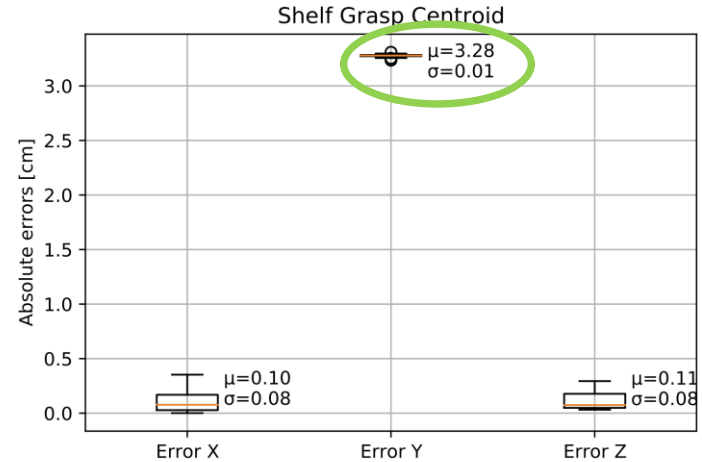
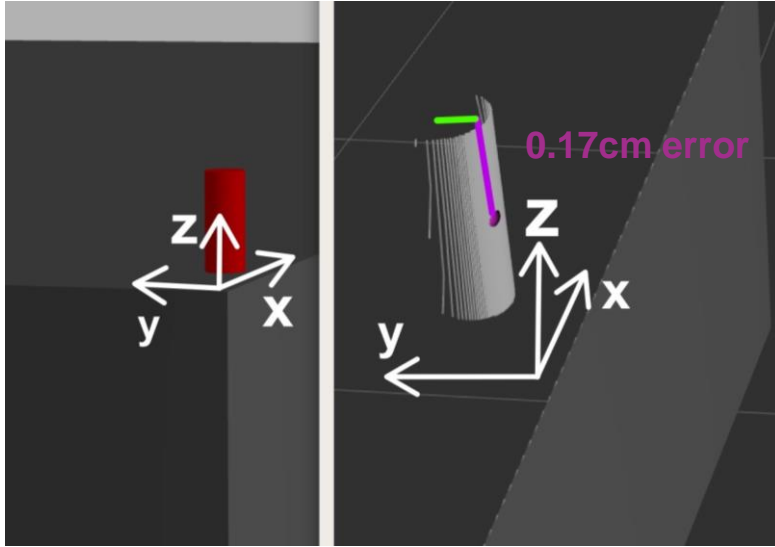
# Precision – Location Error of Side Grasp



# Precision – Location Error of Side Grasp

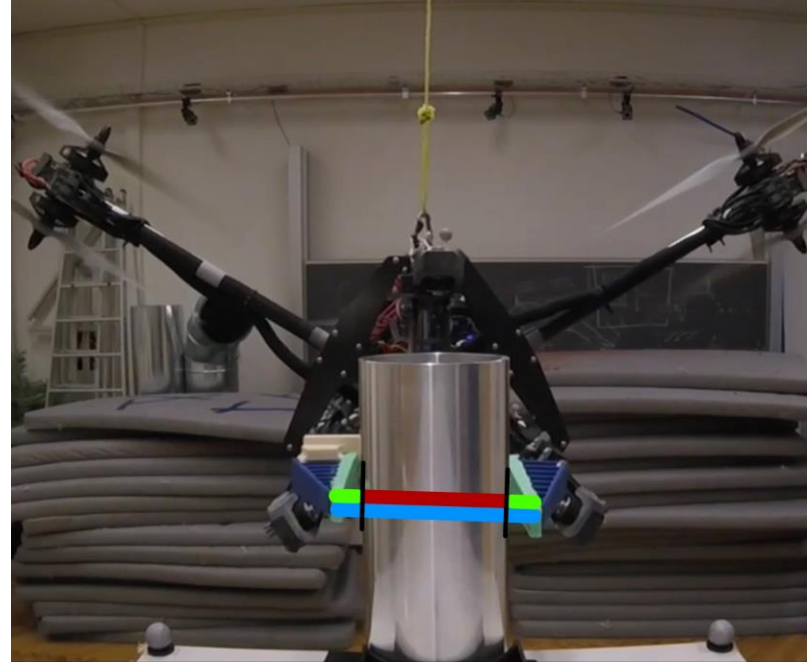


# Precision – Location Error of Side Grasp

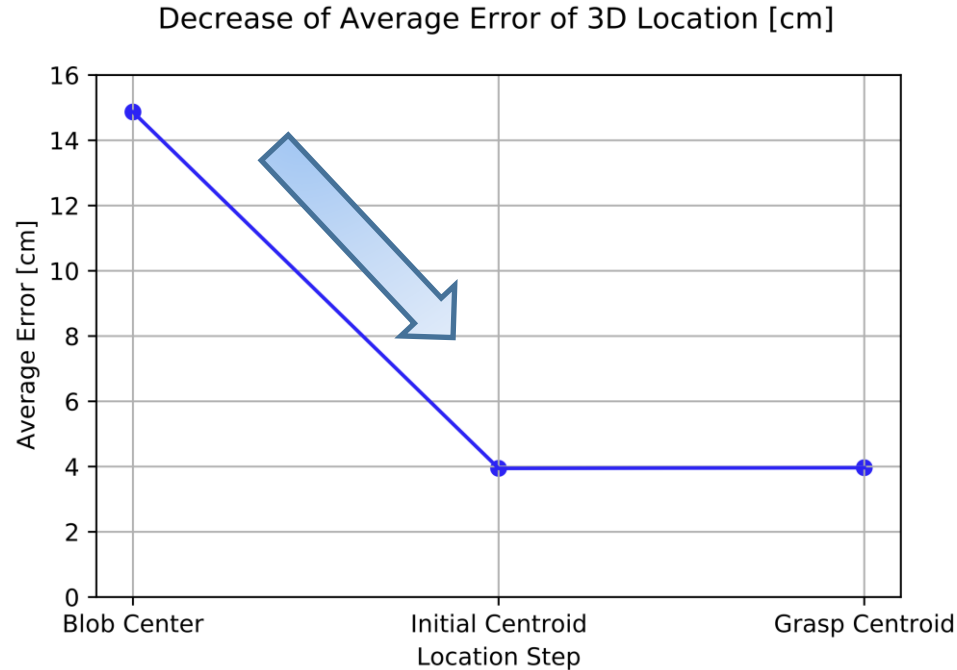


# Precision – Location Error of Side Grasp

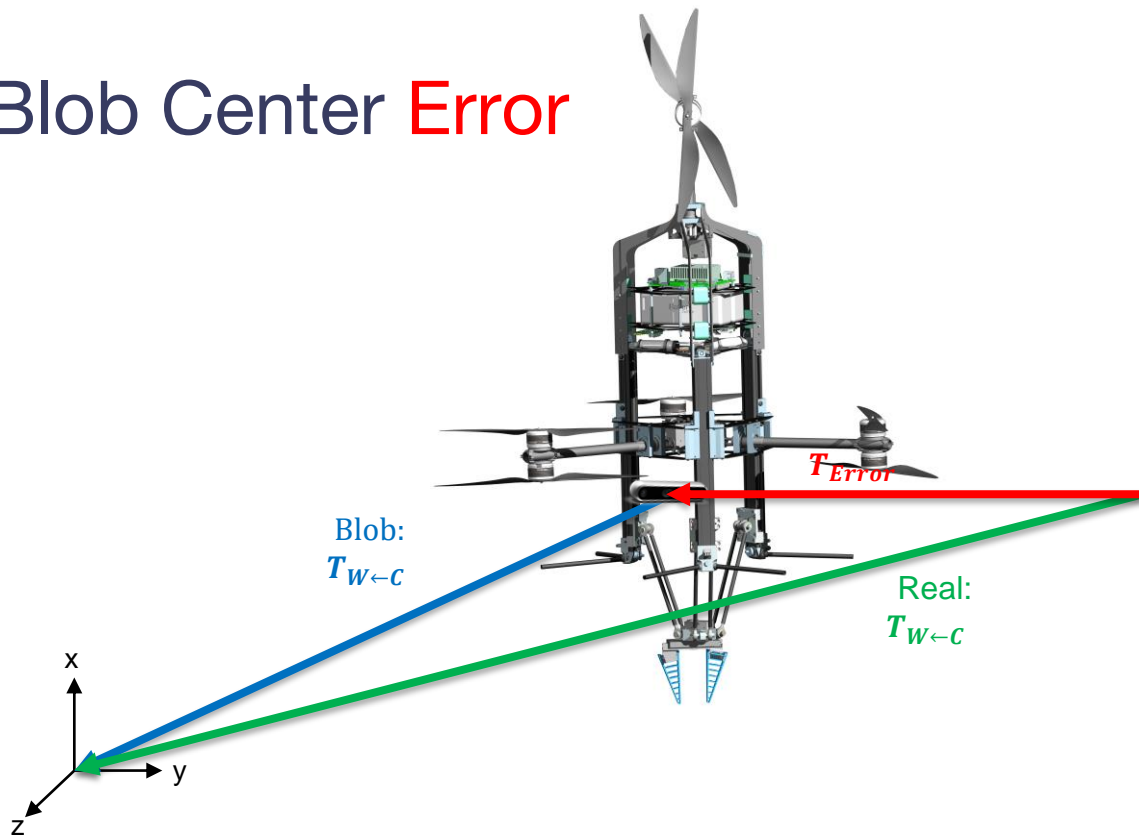
- To compensate pipeline error:
  - At least 0.5cm play in gripper opening width



# Precision – Location Error of Top Grasp

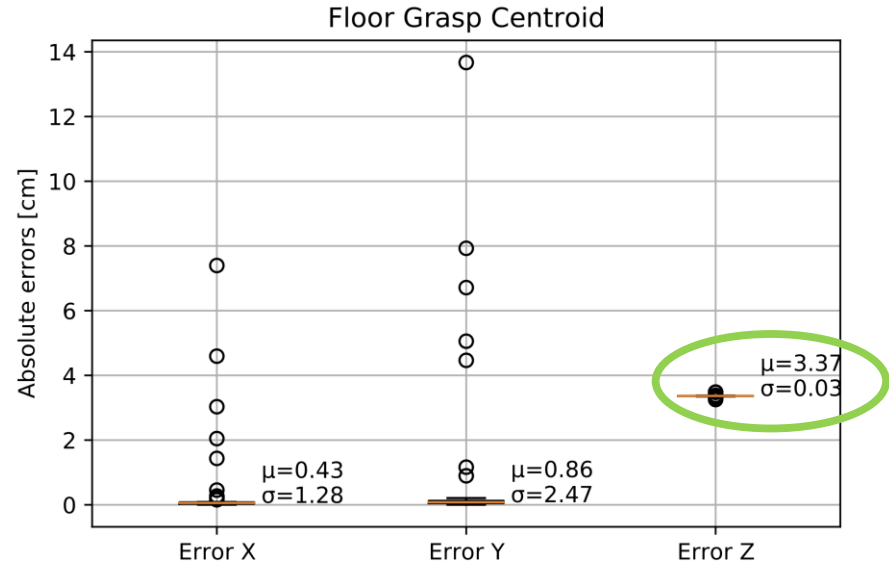
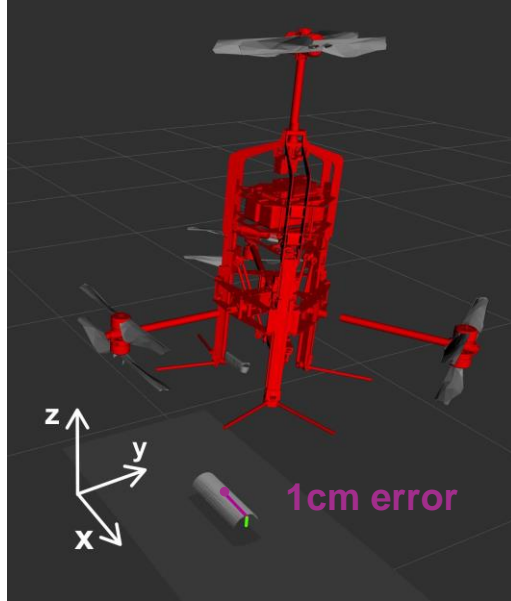


# Blob Center Error



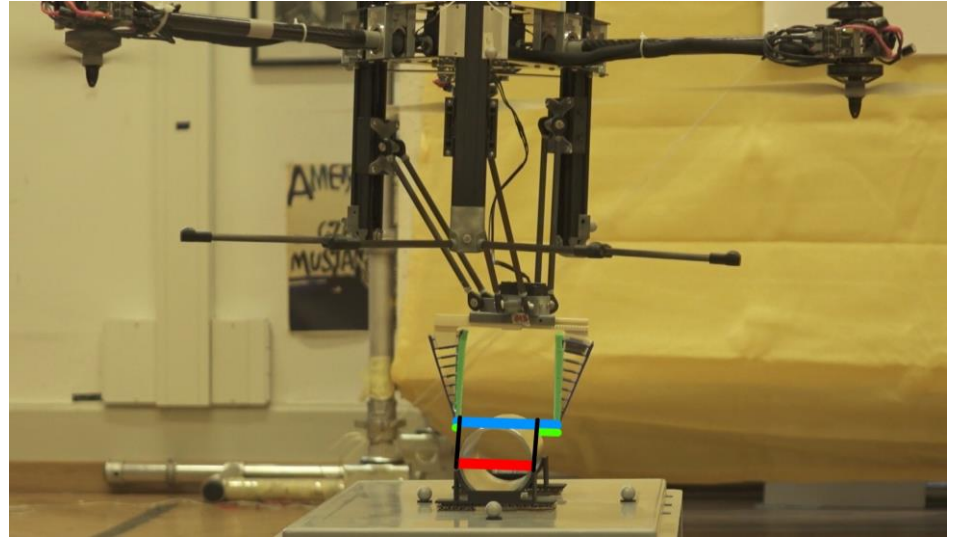


# Precision – Location Error of Top Grasp

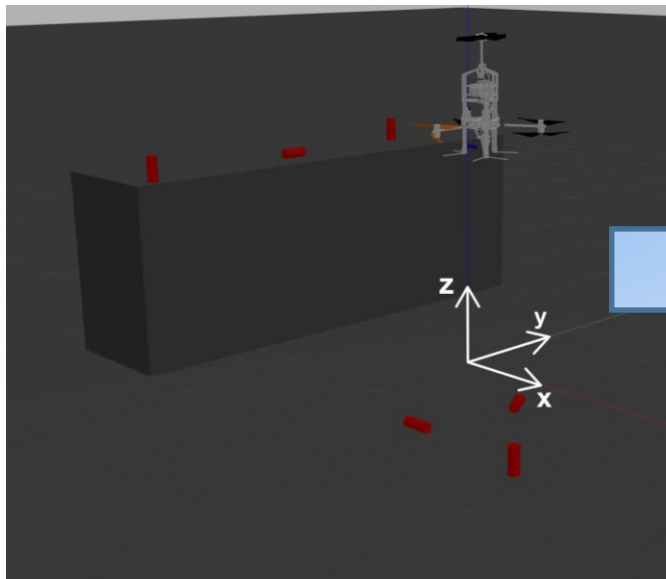


# Precision – Location Error of Top Grasp

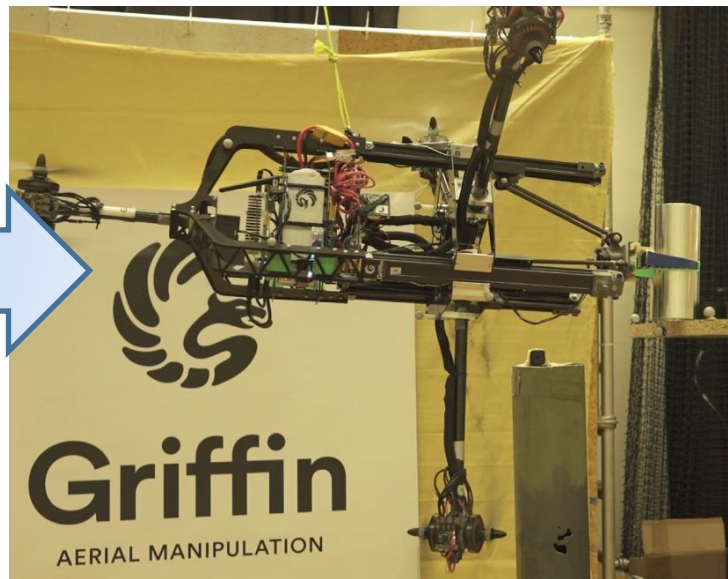
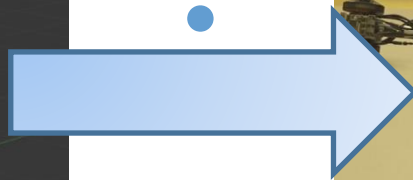
- To compensate pipeline error:
  - At least 2cm play in gripper opening width



# Outlook



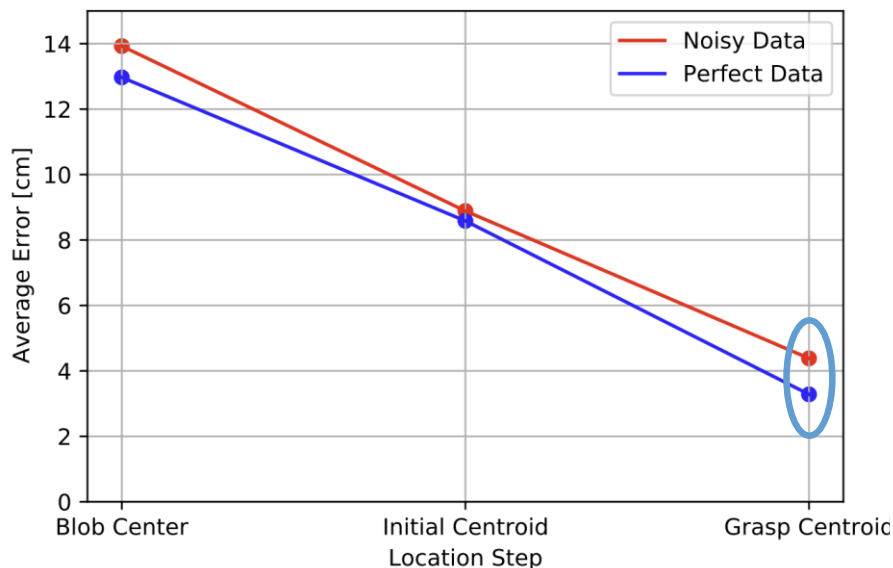
?



# Outlook – Noisy Odometry

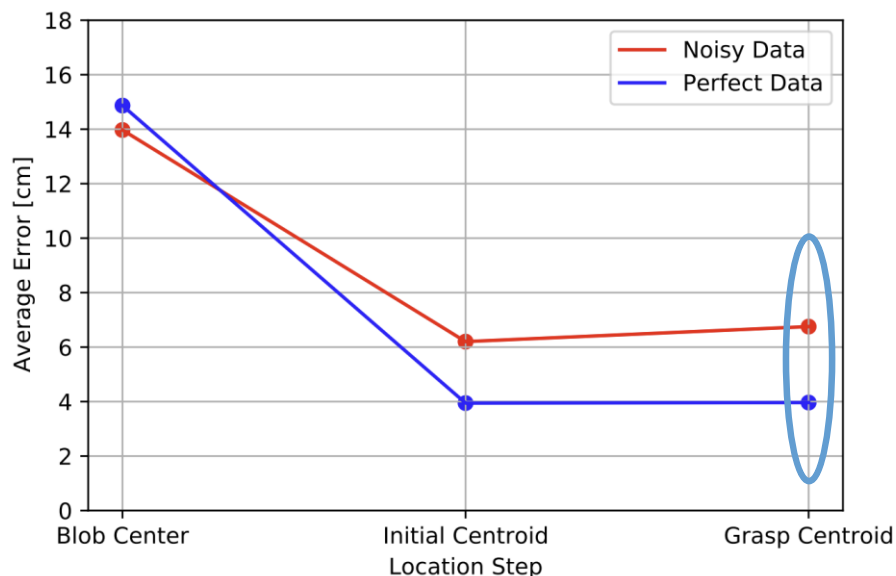
## Side Grasp

Decrease of Average Error of 3D Location [cm]

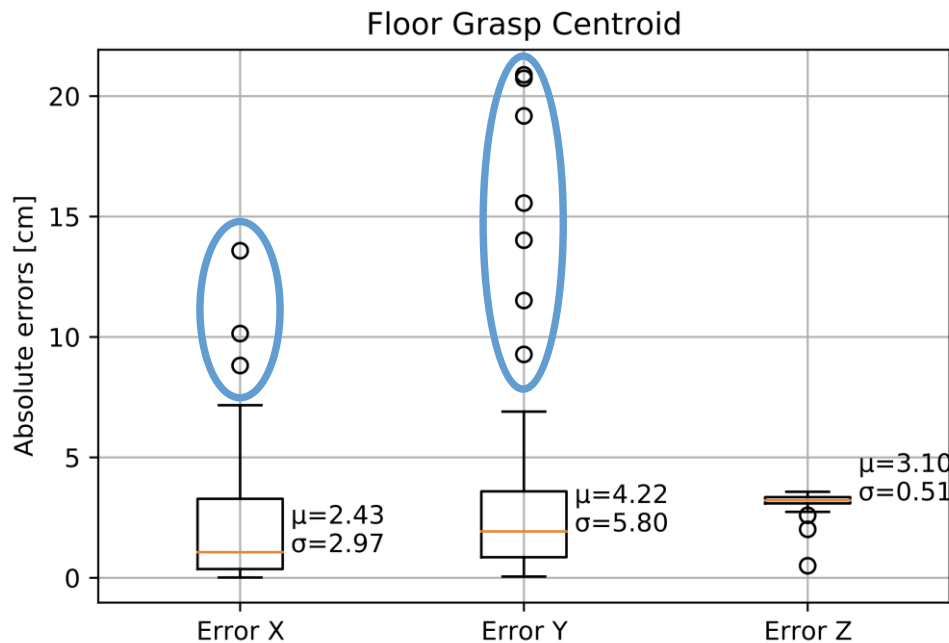


## Top Grasp

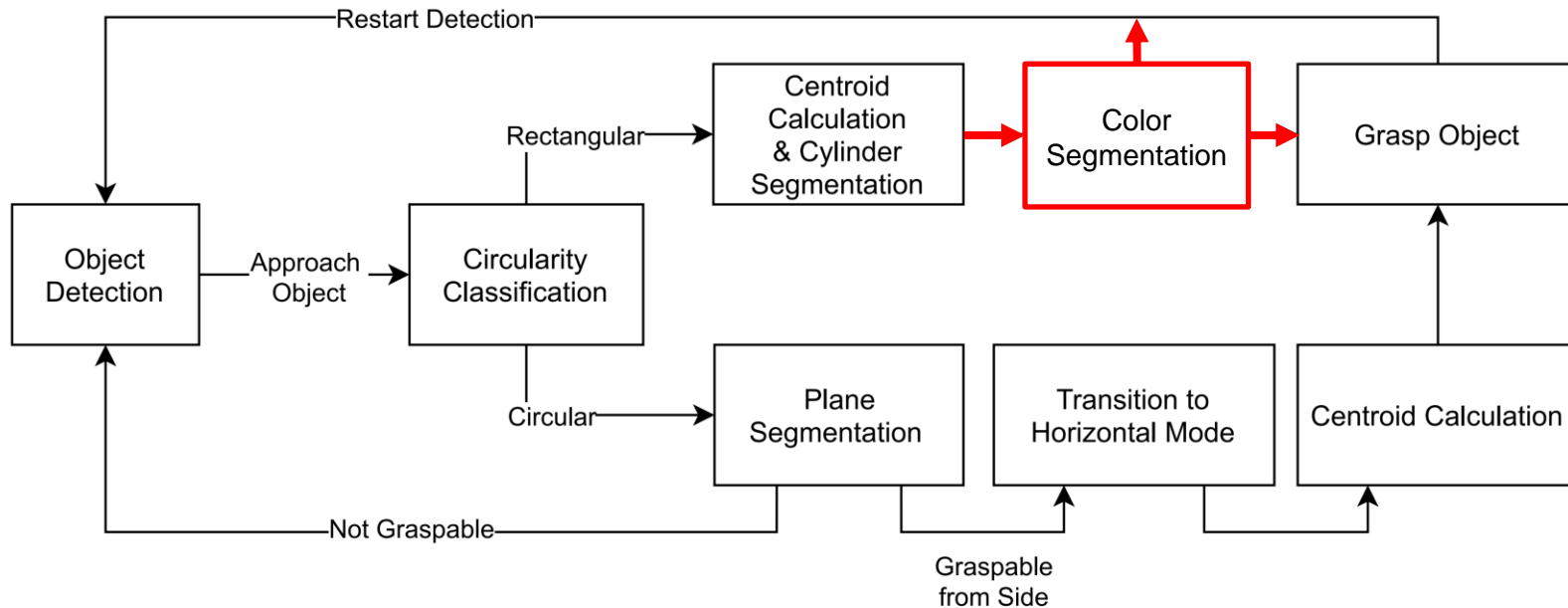
Decrease of Average Error of 3D Location [cm]



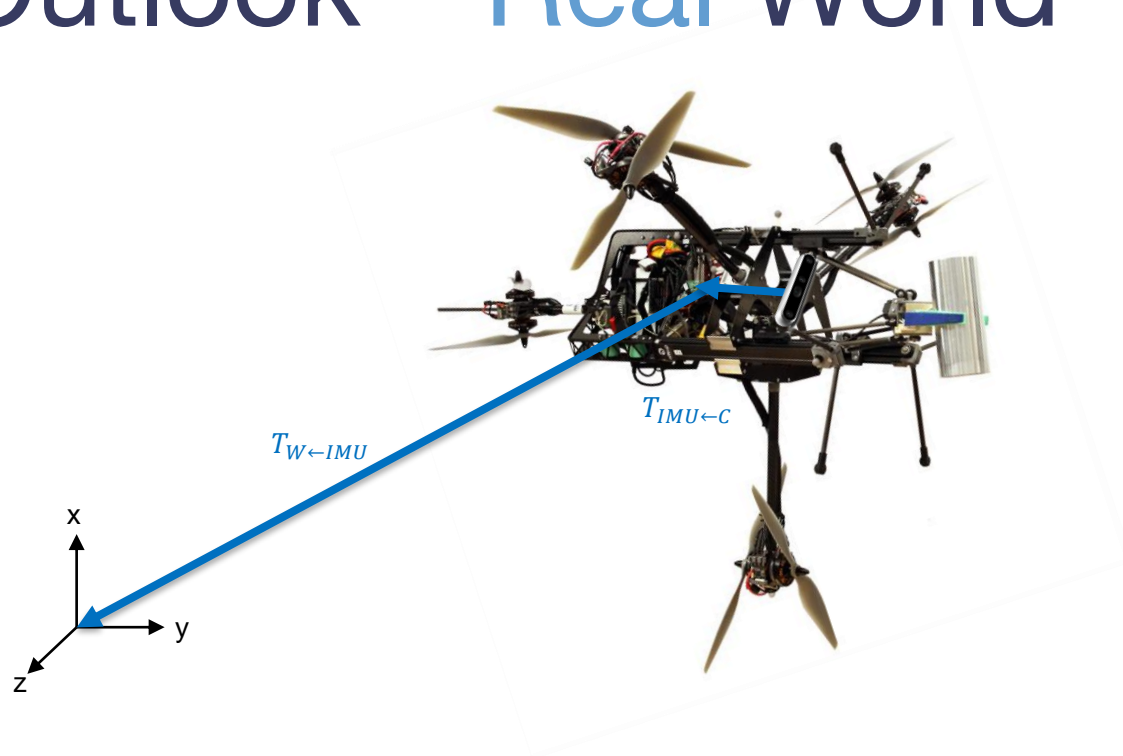
# Outliers – Noisy Odometry



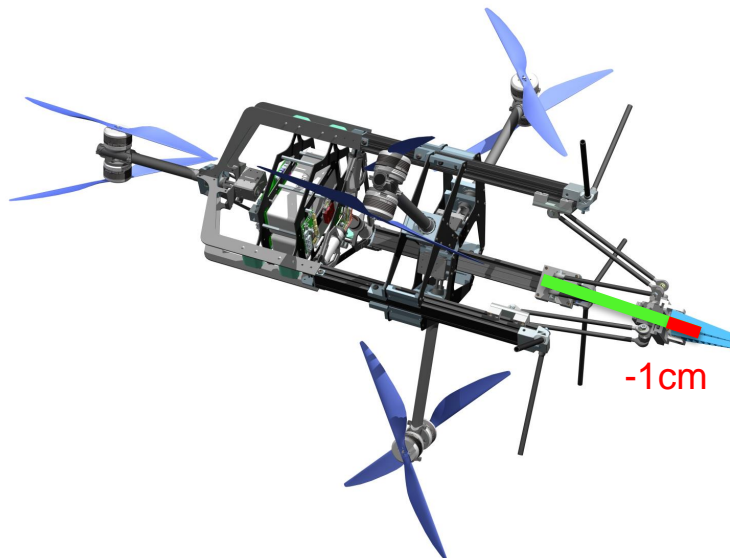
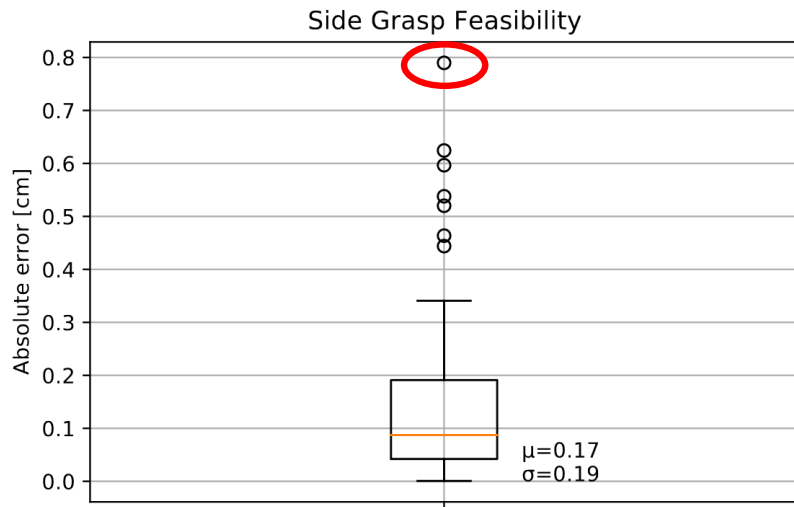
# Outlook – Outlier Rejection



# Outlook – Real World

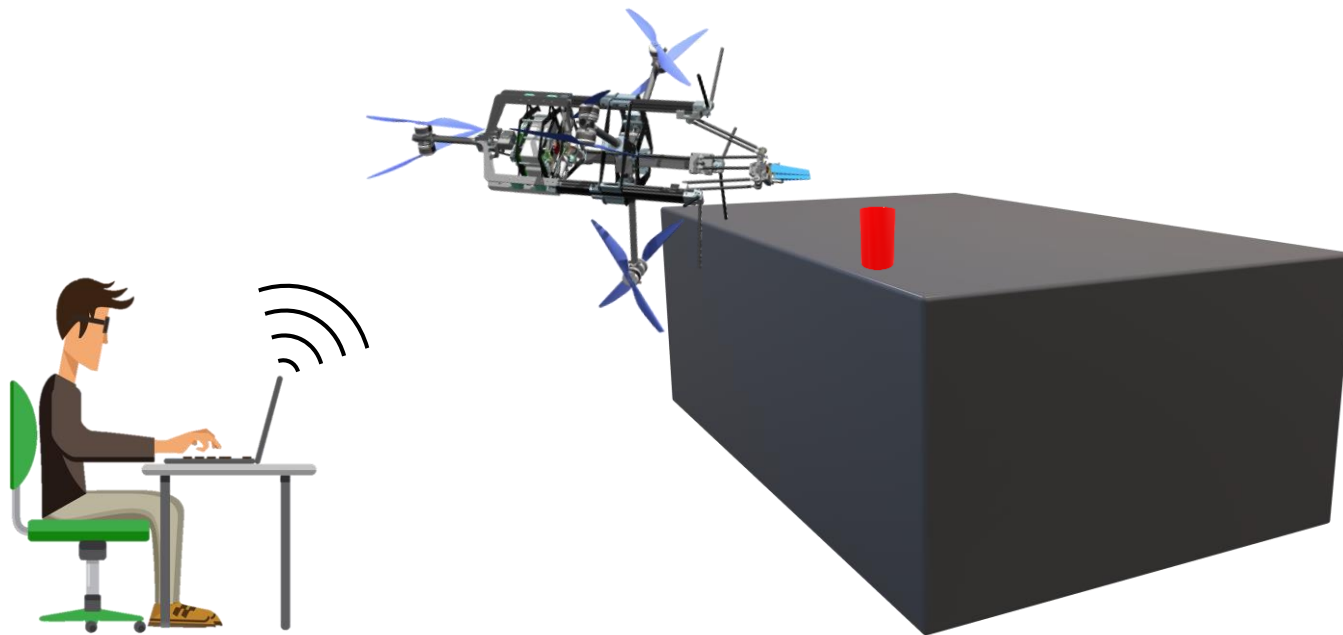


# Outlook – Real World





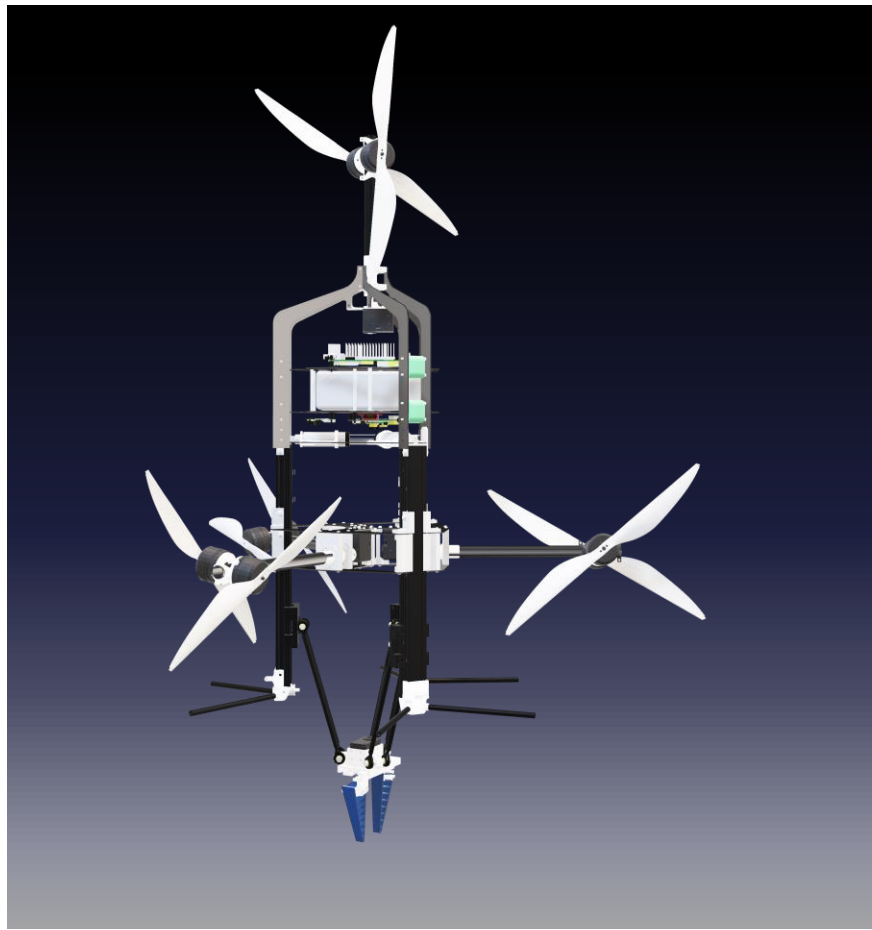
# Conclusion



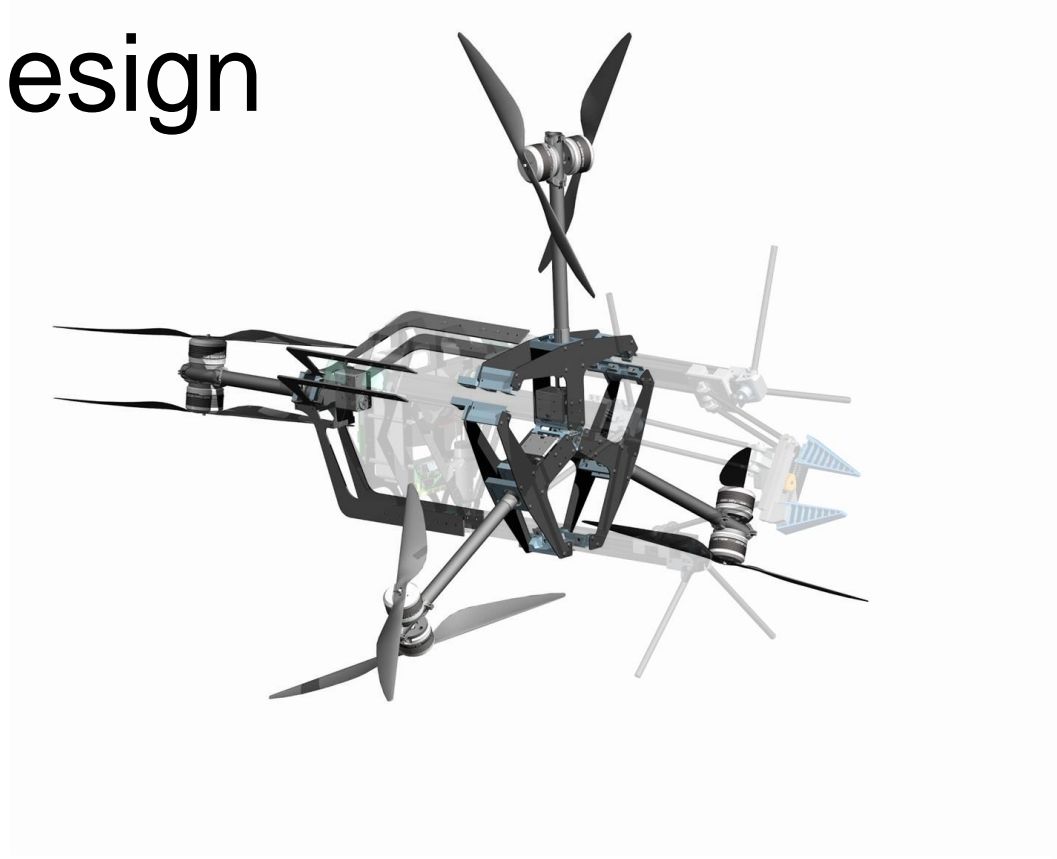
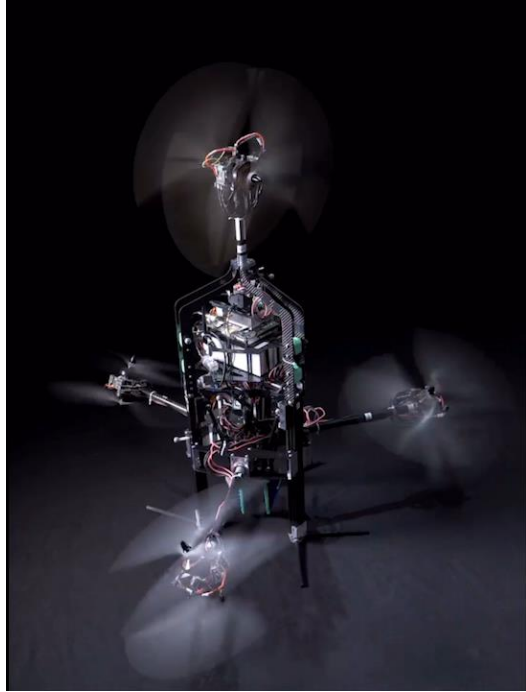
# Backup Slides

# PrisMAV

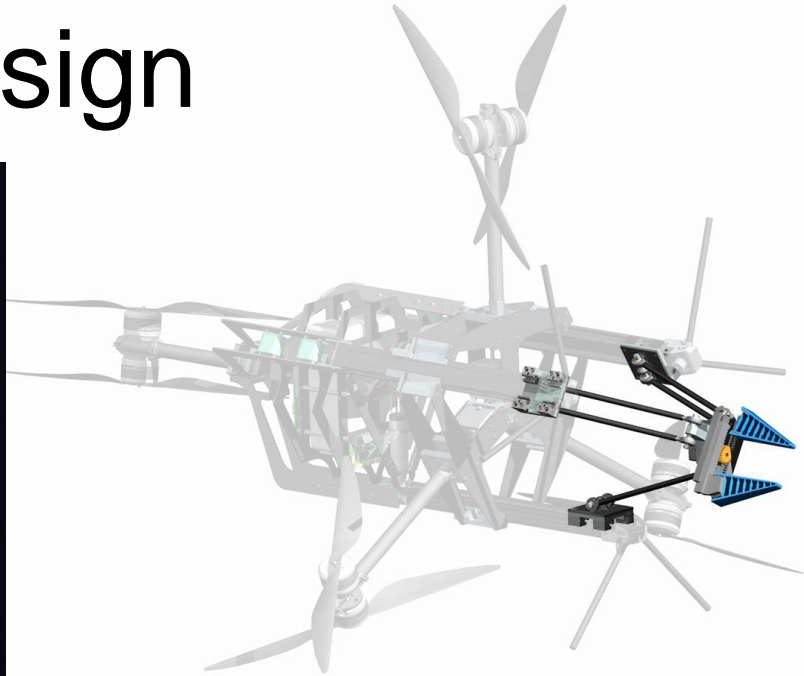
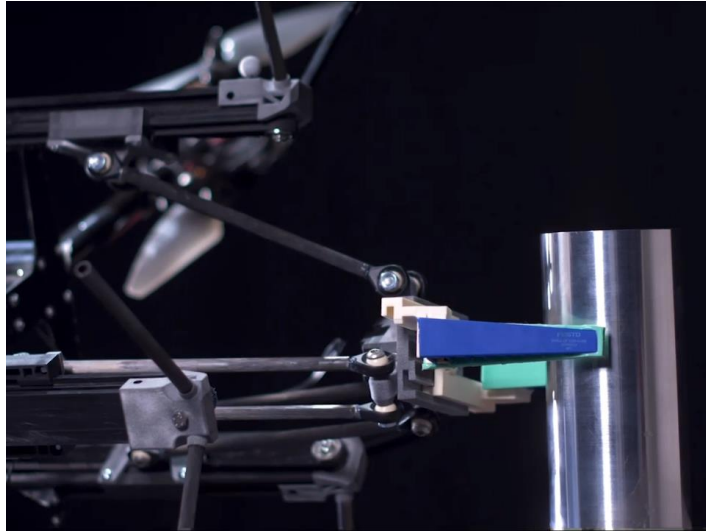
**P**rismatic **M**icro **A**erial **V**ehicle



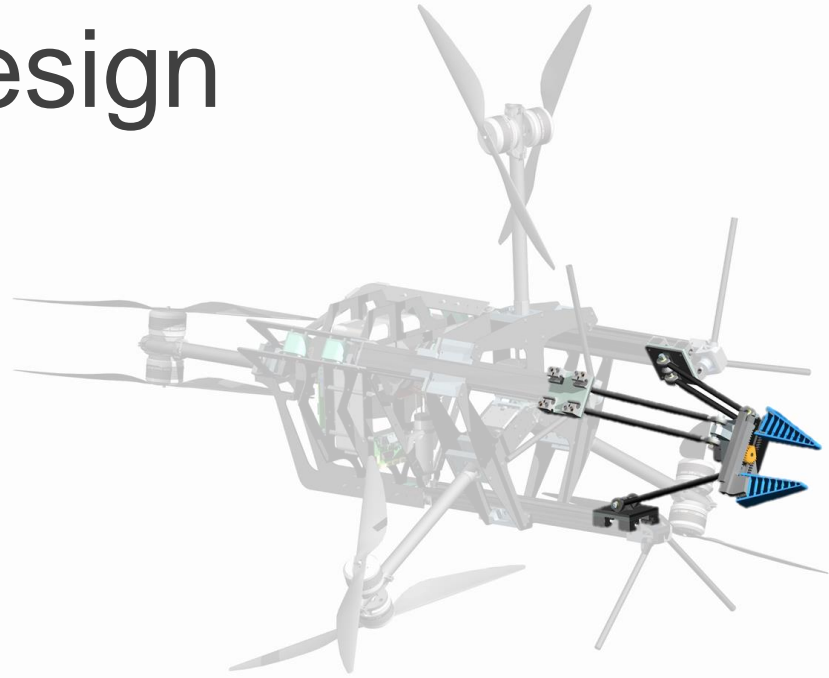
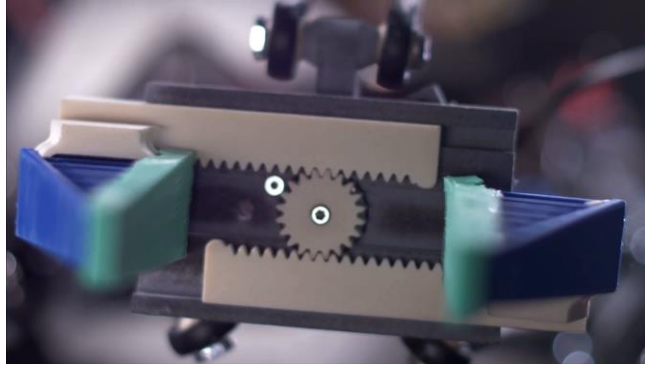
# PrisMAV – Design



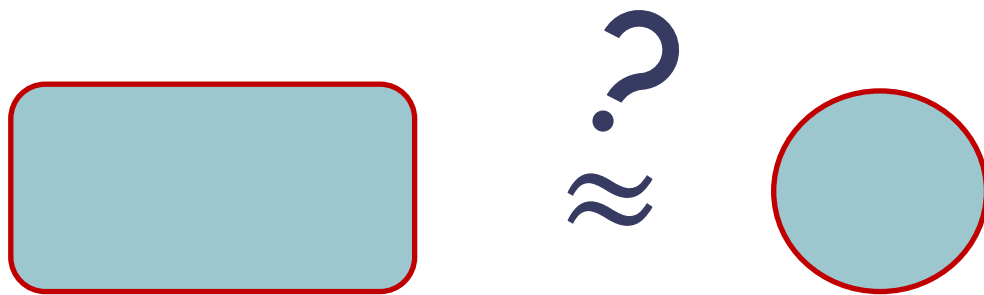
# PrisMAV – Design



# PrisMAV – Design



# Circularity Classification



$$C = \frac{4\pi * A}{P * P}$$

# Circularity Classification

- $C = \frac{4\pi * A}{P * P}$
- Threshold Value: Rectangle area and perimeter with  $l = 0.2\text{m}$  and  $w = 0.08\text{m}$

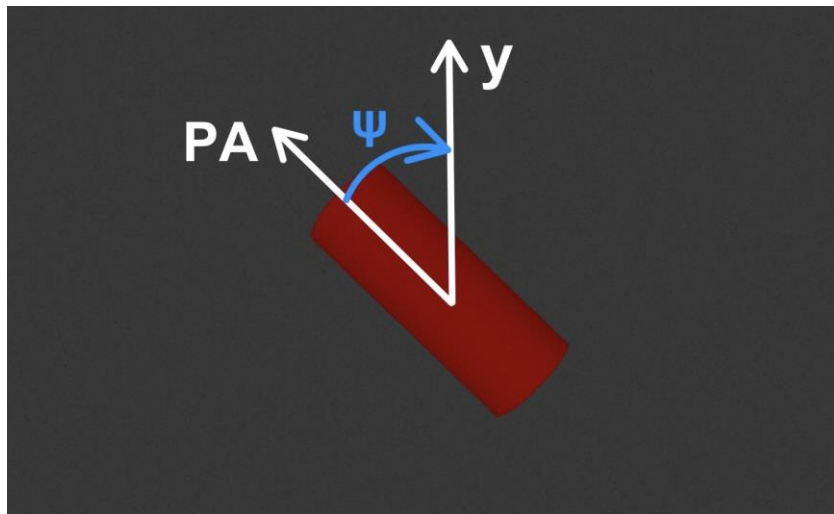
$$\Rightarrow C_{rec} = \frac{4\pi * l * w}{(2l + 2w)^2} = 0.64$$

$$\text{Safety Factor: } C_{max} = 1.25 * C_{rec} = 0.8$$



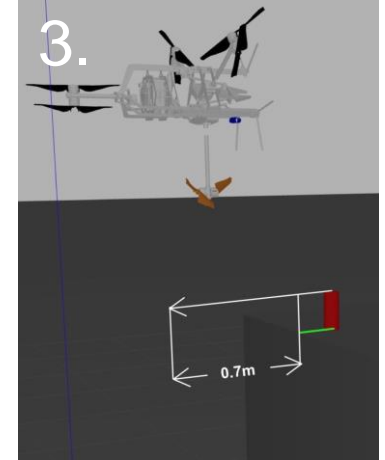
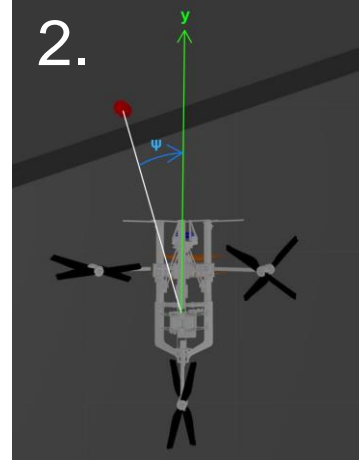
# Cylinder Segmentation

- Adapt yaw angle  $\psi$
- Principal Axis PA
- Camera axis  $y$
- $\psi = \cos^{-1} \left( \frac{PA \cdot y}{\|PA\| \cdot \|y\|} \right)$



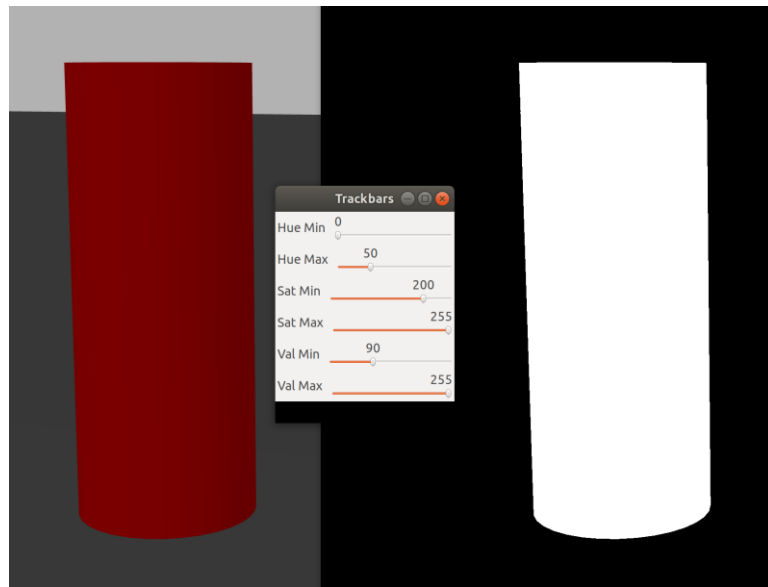
# Transition

1. Roll by 90 degrees
2. Adapt yaw angle
3. Approach grasp position



# Color Segmentation

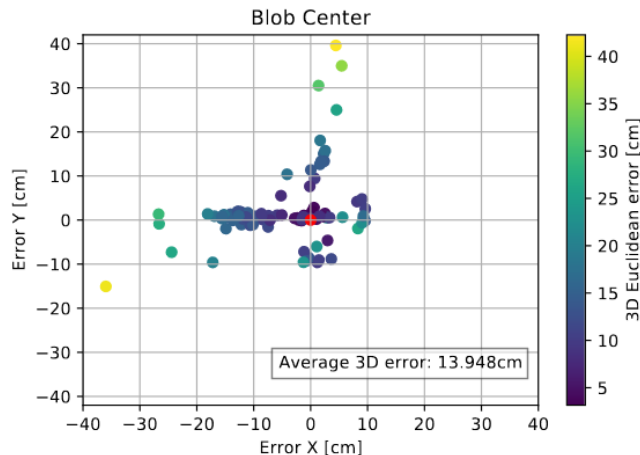
- Adapt threshold values  
=> Binary mask



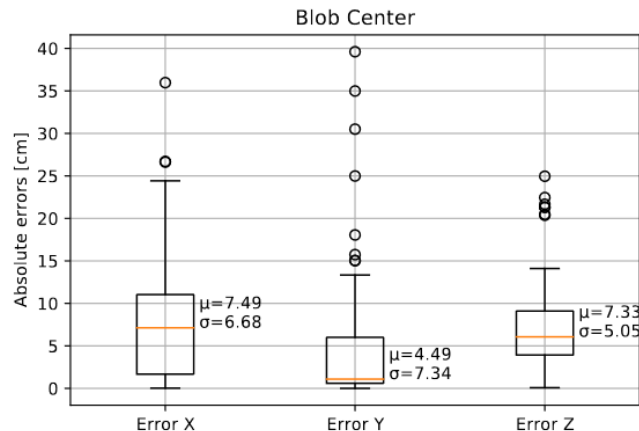
# Computational Effort

Pipeline Step	Computational Time [s]	Relative Time [%]
Color Segmentation	0.15	9.3
Centroid Calculation	0.01	0.6
Circularity Classification	0.15	9.3
Cylinder Segmentation	1.3	80.2
Plane Segmentation	0.01	0.6
<b>Overall</b>	<b>1.62</b>	<b>100.0</b>

# Blob Center Location Error

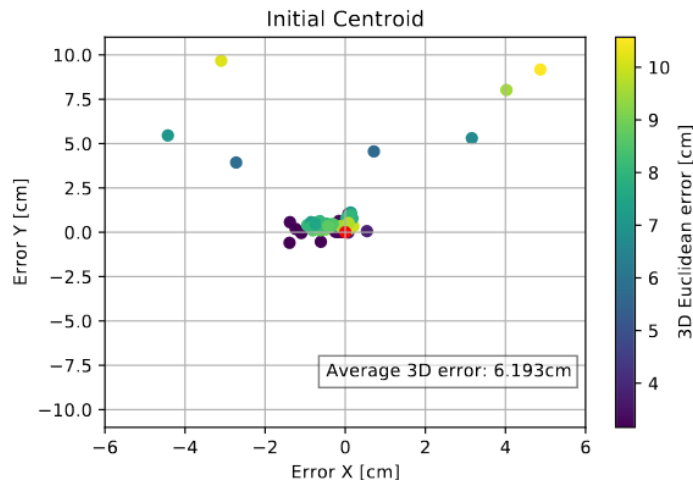


(a) Location error in  $xy$ -plane.

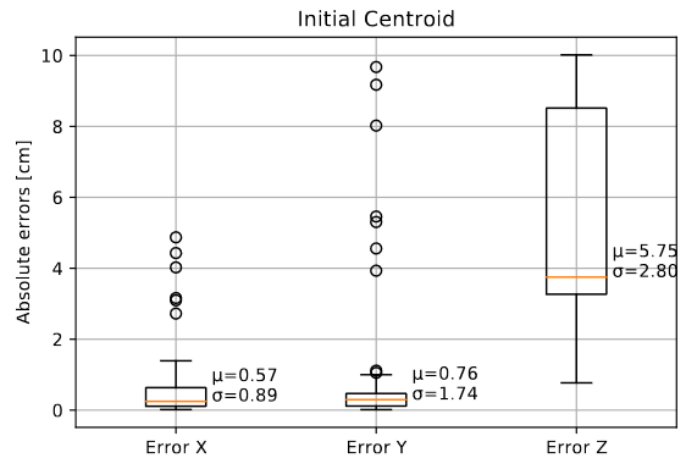


(b) Box plot with absolute errors in  $x$ ,  $y$  and  $z$  location

# Initial Centroid Location Error

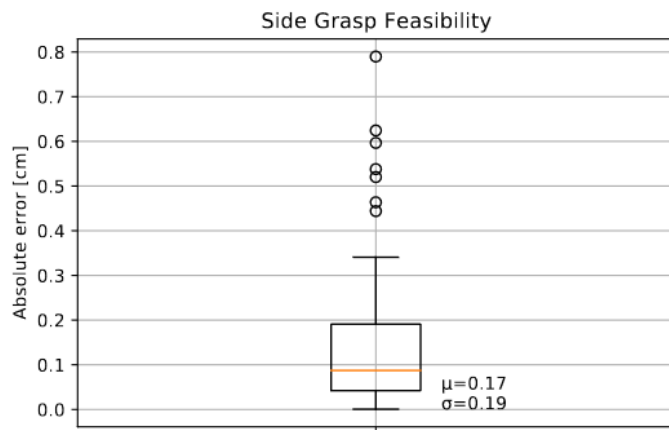


(a) Location error in  $xy$ -plane.

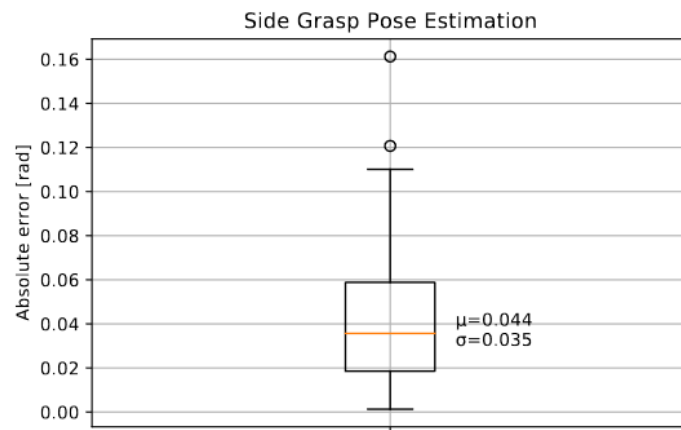


(b) Box plot with absolute errors in  $x$ ,  $y$  and  $z$  location

# Plane Segmentation Error



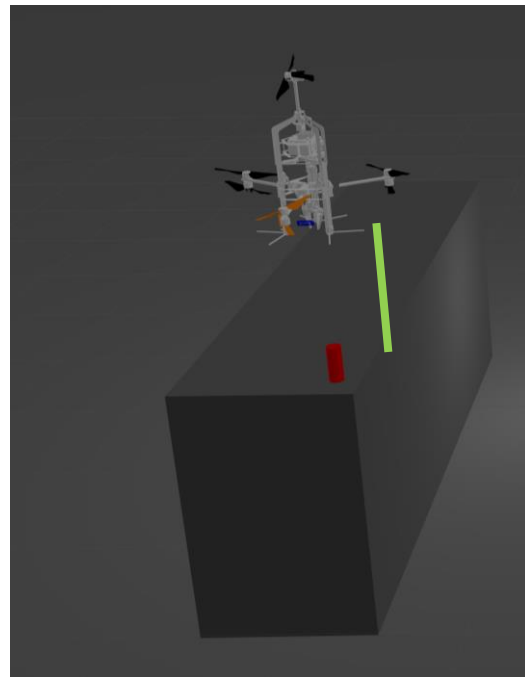
(a) Average error for distance from object center to plane edge used for side grasp feasibility



(b) Average error for angle between constructed line and reference frame used for side grasp pose

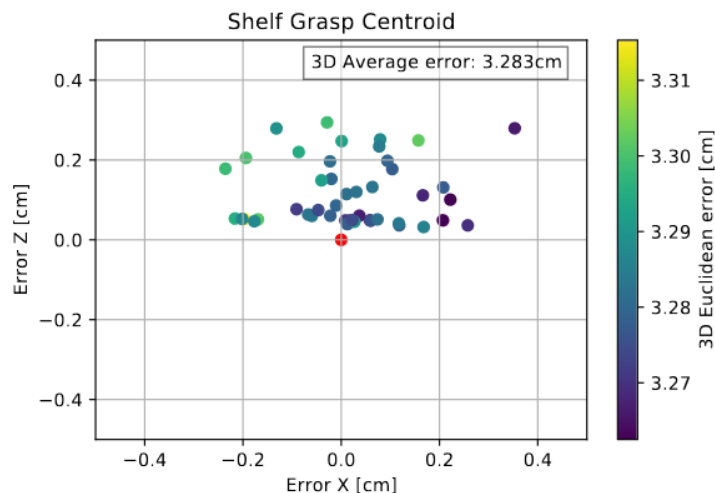
# Plane Segmentation

- **Threshold** Value for plane segmentation
  - Flight height
- Create binary mask
- Find contours

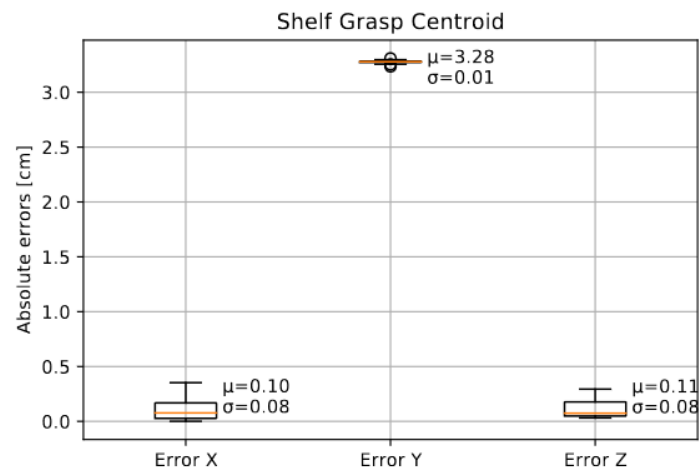




# Grasp Centroid Side Grasp

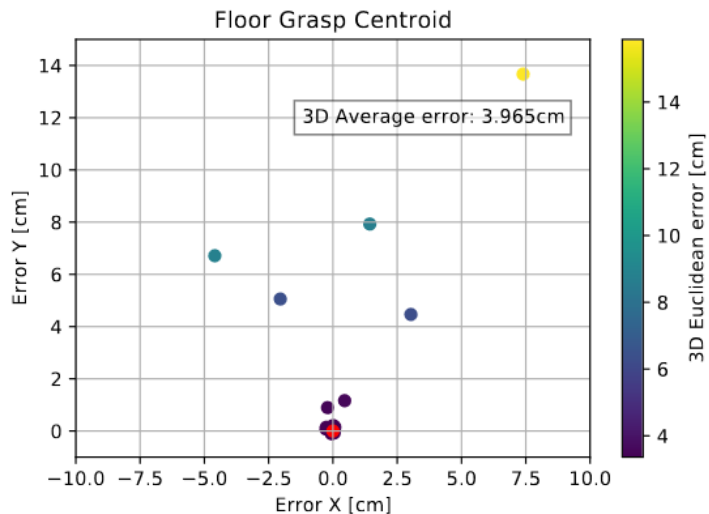


(a) Location error in  $xz$ -plane.

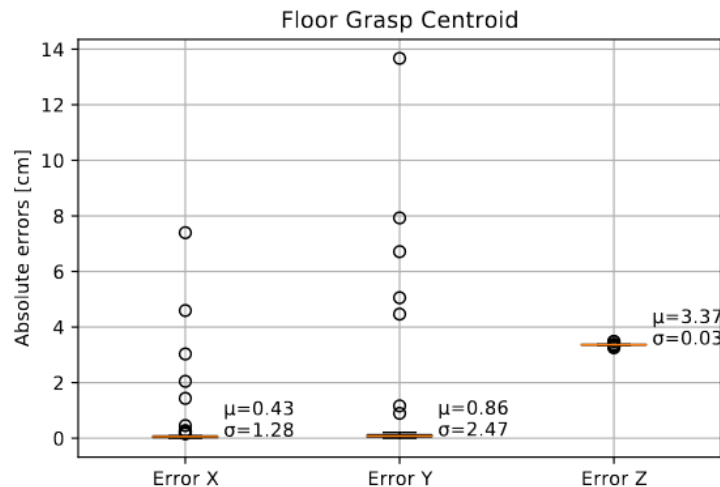


(b) Box plot with absolute errors in  $x$ ,  $y$  and  $z$  location

# Grasp Centroid Top Grasp



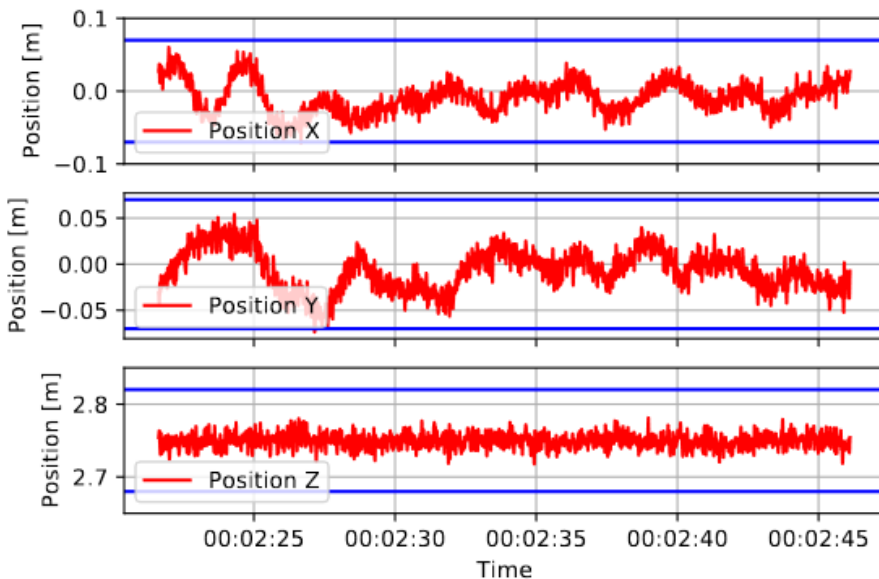
(a) Location error in  $xy$ -plane.



(b) Box plot with absolute errors in  $x$ ,  $y$  and  $z$  location

# Noise Replication

- $\pm 7\text{cm}$



# Error Developement Top Grasp without Outliers

2D:	Data	Blob Center Error	Initial Centroid Error	Grasp Centroid Error
	Perfect	10.93cm	1.36cm	0.99cm
	Noisy	13.08cm	4.26cm	2.29cm
	$\Delta$	+19.7%	+213.2%	+131.3%

3D:	Data	Blob Center Error	Initial Centroid Error	Grasp Centroid Error
	Perfect	14.87cm	3.95cm	3.97cm
	Noisy	15.50	5.42cm	4.12cm
	$\Delta$	+4.2%	+37.2%	+3.8%

# Error Developement Top Grasp

2D:	Data	Blob Center Error	Initial Centroid Error	Grasp Centroid Error
	Perfect	10.93cm	1.36cm	0.99cm
	Noisy	11.79cm	5.16cm	5.27cm
	$\Delta$	+7.9%	+279.4%	+432.3%
3D:	Data	Blob Center Error	Initial Centroid Error	Grasp Centroid Error
	Perfect	14.87cm	3.95cm	3.97cm
	Noisy	13.97cm	6.20cm	6.75cm
	$\Delta$	-6.1%	+57.0%	+70.0%

# Error Developement Side Grasp

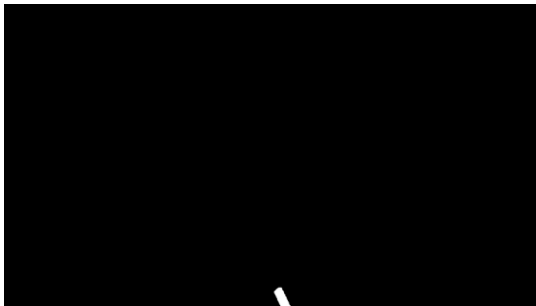
2D:	Data	Blob Center Error	Initial Centroid Error	Grasp Centroid Error
	Perfect	11.74cm	8.57cm	0.17cm
	Noisy	11.60cm	8.68cm	2.19cm
	$\Delta$	-1.2%	+1.3%	+1188.2%

3D:	Data	Blob Center Error	Initial Centroid Error	Grasp Centroid Error
	Perfect	12.97cm	8.58cm	3.28cm
	Noisy	13.93cm	8.89cm	4.38cm
	$\Delta$	+7.4%	+3.6%	+33.5%

# Floor Grasp Centroid Outliers

- Error from blob center propagates to grasp centroid approximation

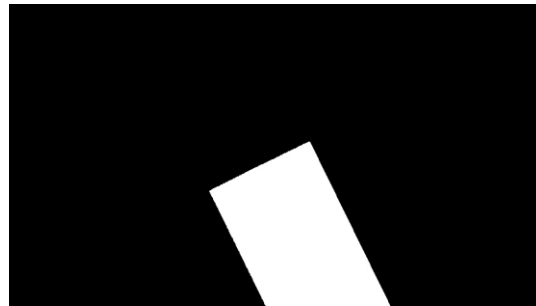
Blob Center



Initial Centroid



Grasp Centroid



# Cylinder Model Fitting

- Random Sample and Consensus Approach (RANSAC)

