# Qualconn





# **Any3DIS**

# Class-Agnostic 3D Instance Segmentation by 2D Mask Tracking

https://any3dis.github.io/

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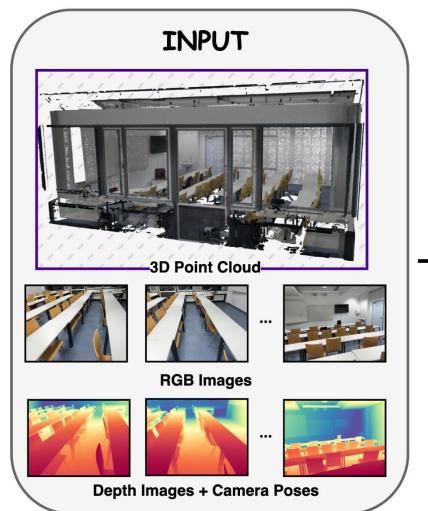


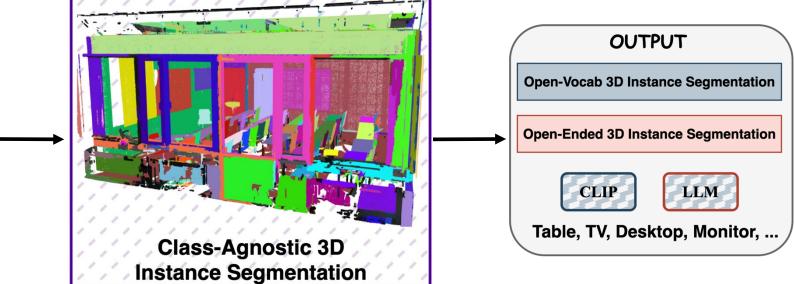




#### Our proposed Any3DIS







Given a **3D** point cloud with the corresponding **RGB-D** sequences, Any3DIS generates a set of class-agnostic **3D** proposals and a featurized point cloud for open-vocabulary/open-ended queries

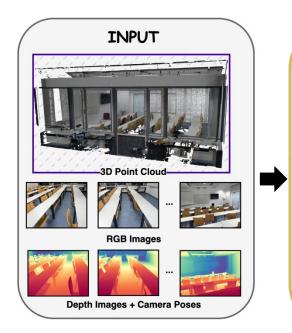
#### **Motivations**



- Any3DIS outperforms existing training-free
   SOTA methods on ScanNet200 and ScanNet++
  - √ about ~1.2x in average precision
  - √ about ~10x in speed

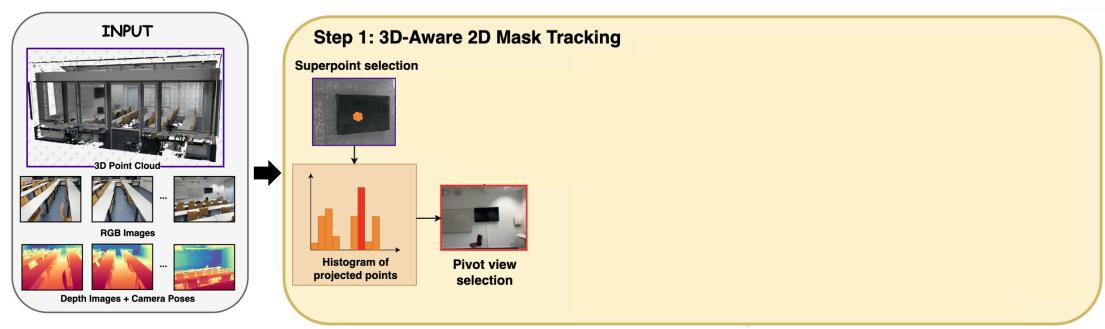






Step 1: 3D-Aware 2D Mask Tracking



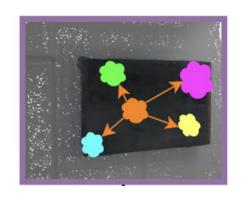


Camera Calibration

$$ho_t^l = \Pi(\mathbf{S}_l, \mathbf{K}, \mathbf{E}_t, \mathbf{D}_t).$$

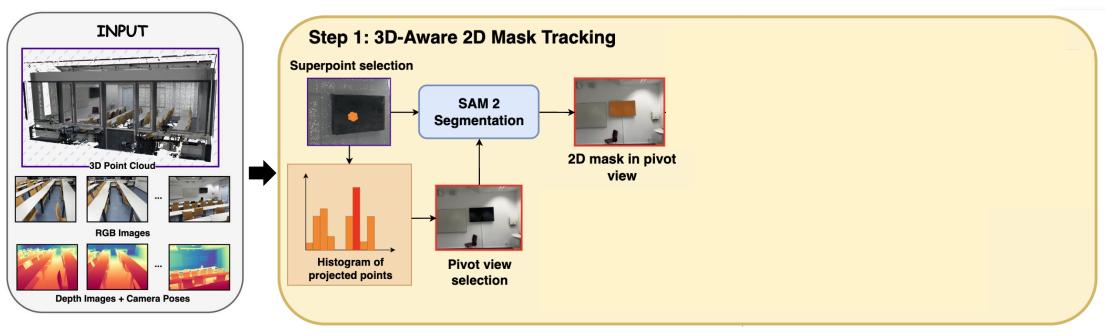
Weighted Distribution

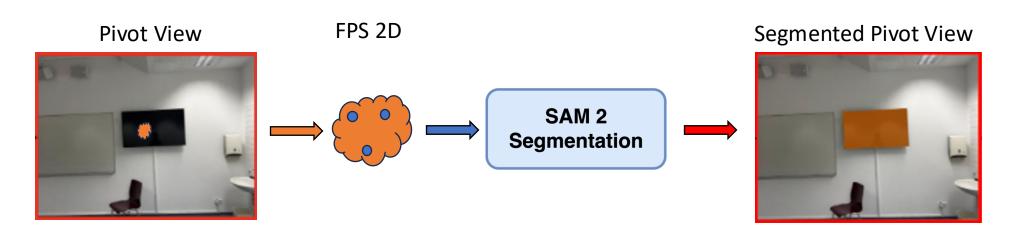
$$s_t^l = \frac{\sum_{k \in \text{KNN}(\mathbf{S}_l)} \left| \rho_t^k \right| / N_{\mathbf{S}_k}}{\kappa}.$$



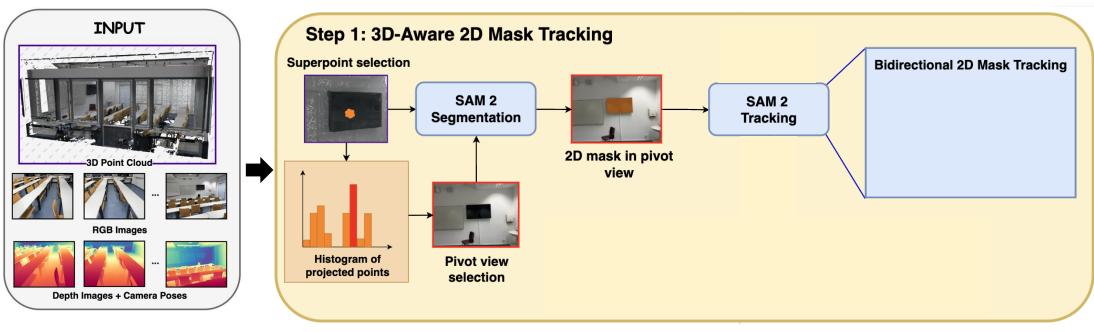
$$\operatorname{pivot}(l) = \operatorname{argmax}_t \psi_t^l.$$



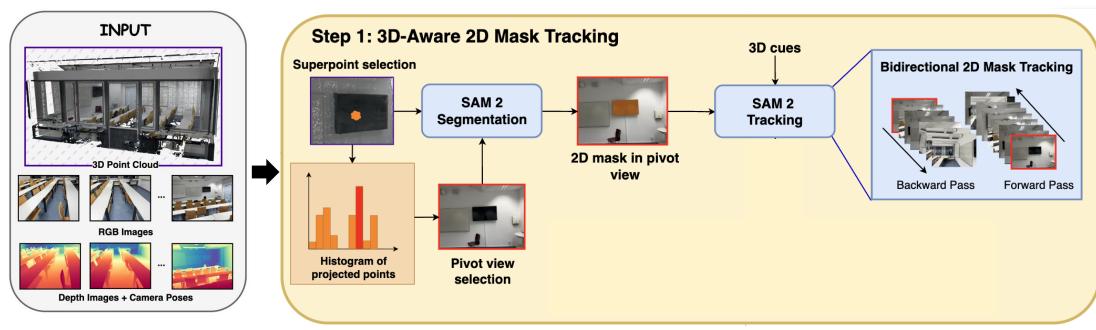












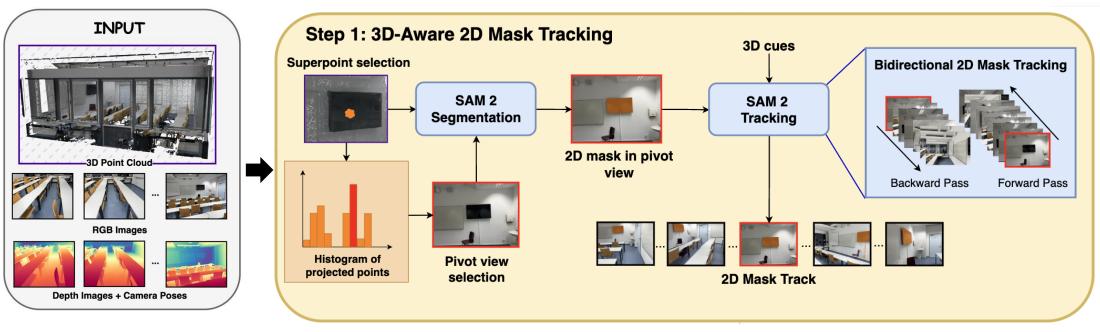


Backward Video Forward Video

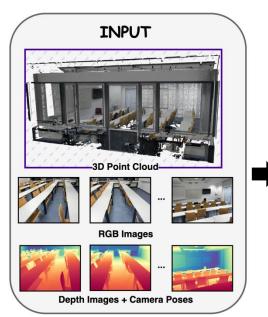
#### 3D-Aware Video Prompting

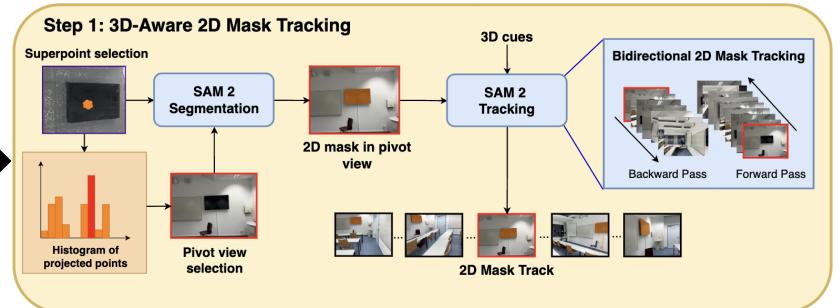






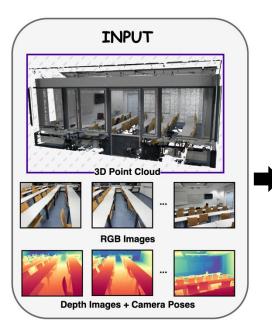


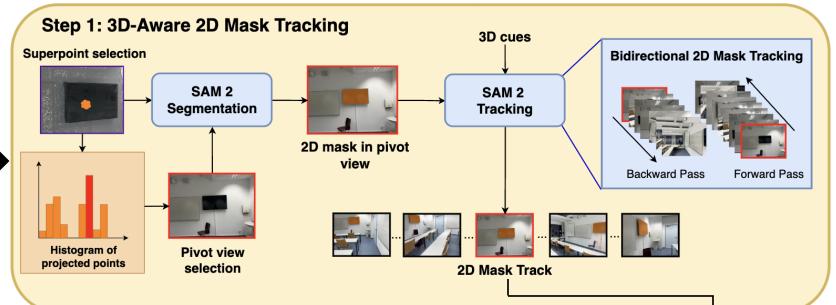




**Step 2: 3D Proposal Refinement Via Mask Optimization** 

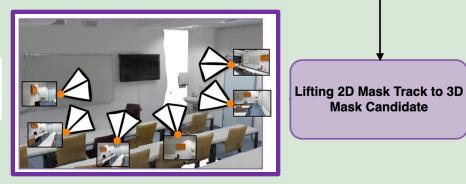




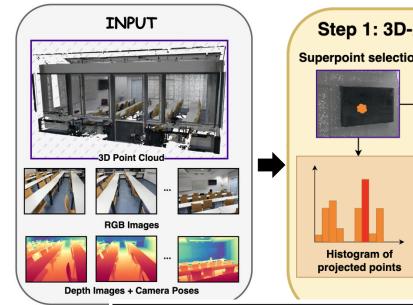


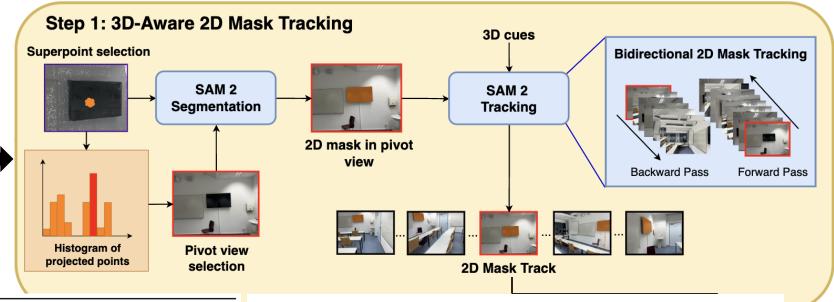
#### **Step 2: 3D Proposal Refinement Via Mask Optimization**

$$\overline{\mathbf{M}}_q^{t,l} = egin{cases} 1, & ext{if } \mathrm{IOU}(
ho_t^l, \mathbf{m}_q^t) \geq au \ 0, & ext{otherwise} \end{cases} ext{ for } l \in [1..L].$$





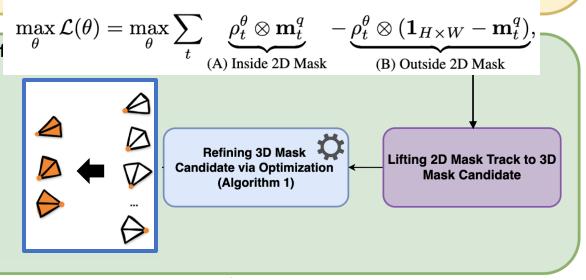


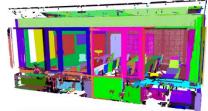


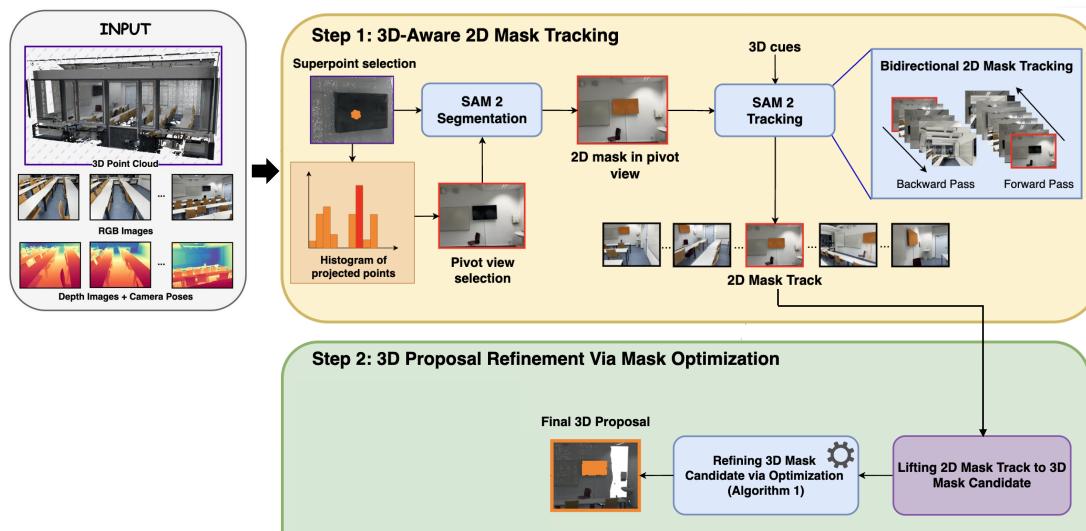
**Algorithm 1** Algorithm of 3D Mask Optimization.

**Input:** Visibility vector  $\overline{\mathbf{M}}_{a}^{t}$  in Eq. (3)

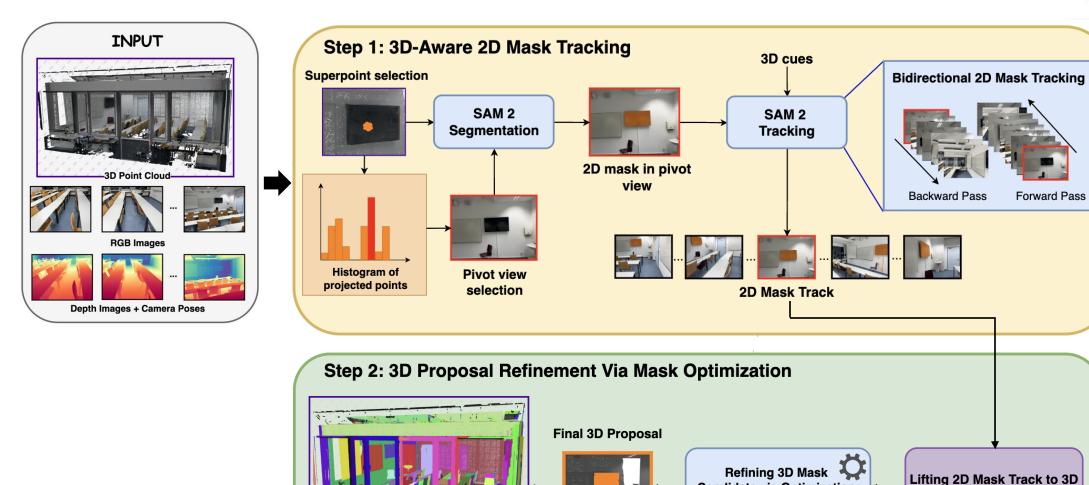
- 1: **initialize:** Objective value  $C_0 = 0$  and current solution  $\theta_0 = \mathbf{0}$ .
- 2: for t = 1 to T do
- Option 1 Retain current solution:  $\theta_t^1 = \theta_{t-1}, \quad \mathbf{C}_t^1 = \mathbf{C}_{t-1}$
- 4: Option 2 Add all superpoints in  $\overline{\mathbf{M}}_q^t$  to current so-
- lution:  $\theta_t^2 = \theta_{t-1} \vee \overline{\mathbf{M}}_q^t$ ,  $\mathbf{C}_t^2 = \mathcal{L}(\theta_t)$  in Eq. (4) 5: **If**  $\mathbf{C}_t^1 > \mathbf{C}_t^2$  **then:**  $\theta_t = \theta_t^1$ ,  $\mathbf{C}_t = \mathbf{C}_t^1$  **else:**  $\theta_t = \theta_t^2$ ,  $\mathbf{C}_t = \mathbf{C}_t^2$
- 6: end for
- 7: **return**  $\theta_T$









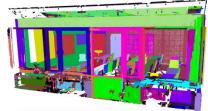


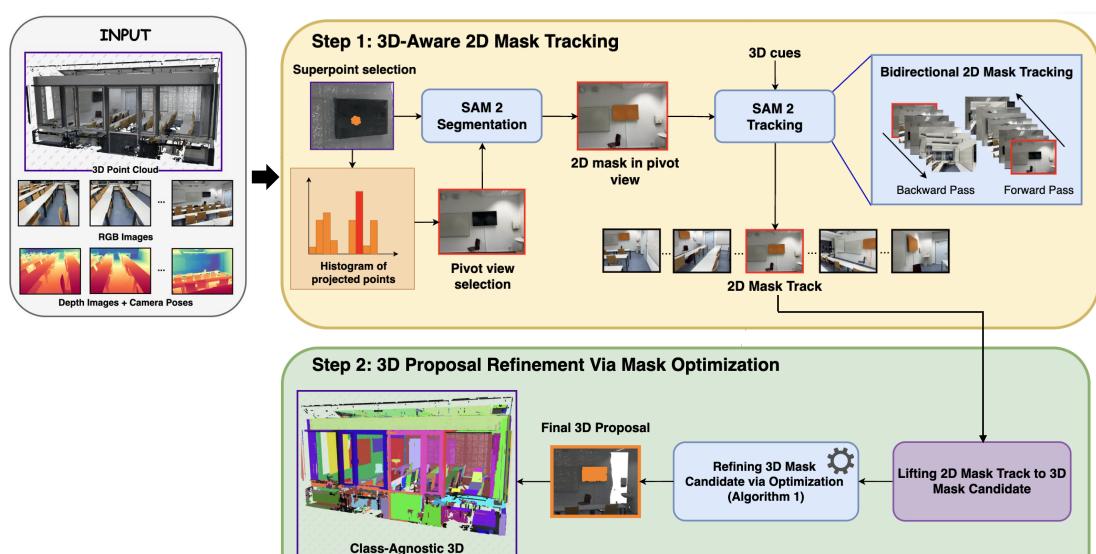
Class-Agnostic 3D Instance Segmentation

**Candidate via Optimization** 

(Algorithm 1)

**Mask Candidate** 

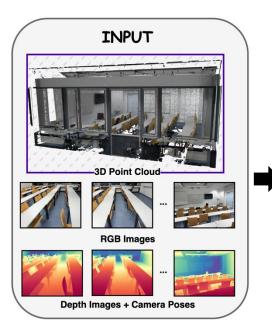


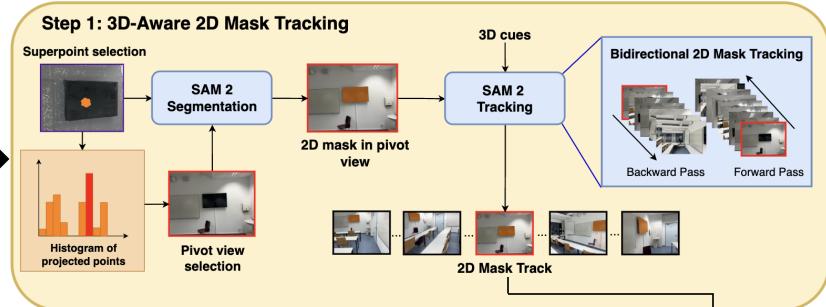


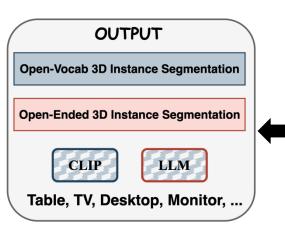
**Instance Segmentation** 

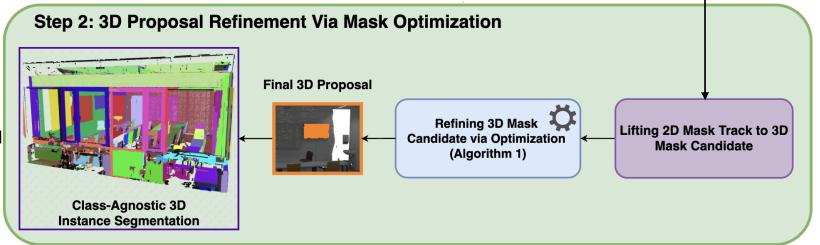
#### Our proposed Any3DIS



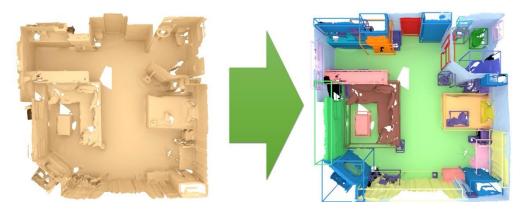








#### **Result on ScanNet200**



Method	2D Segmenter	AP	$\mathbf{AP}_{50}$	$\mathbf{AP}_{25}$
OVIR-3D [17]	SAM-HQ	14.4	27.5	38.8
Open3DIS [19]		31.5	45.3	51.1
Open3DIS [19] Any3DIS (ours)	SAM2-L	26.7 <b>32.5</b>	40.2 <b>45.2</b>	53.8 <b>55.0</b>
ISBNet [29] Open3DIS [19] Any3DIS (ours)	3D	40.2	50.0	54.6
	3D + SAM-HQ	41.5	<b>51.6</b>	<b>56.3</b>
	3D + SAM2-L	<b>42.5</b>	51.2	54.5

Table 2. Results of class-Agnostic 3DIS on ScanNet200, benchmarking on 198 classes



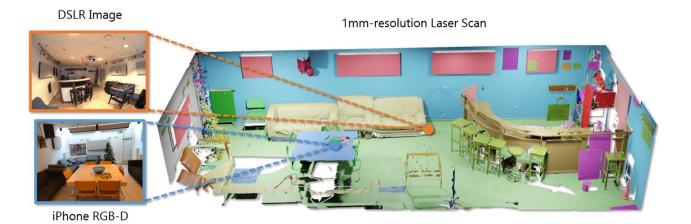
Method	Segmenter	AP	$\mathbf{AP}_h$	$\mathbf{AP}_c$	$\mathbf{AP}_t$
Search3D [28] OpenMask3D [27]	Mask3D [25]	14.3 15.4	16.1 17.1	13.6 14.1	12.9 14.9
SAI3D [35] OVIR-3D [17]	SAM-HQ	12.7 11.2	12.1 12.6	10.4 11.5	16.2 10.3
Open3DIS [19] Any3DIS (ours)	SAM-HQ SAM2-L	18.2 <b>19.1</b>	<b>18.9</b> 17.5	16.5 <b>17.2</b>	19.2 <b>23.3</b>
Open3DIS [19] Any3DIS (ours)	3D + SAM-HQ 3D + SAM2-L	23.7 <b>25.8</b>	<b>27.8</b> 27.4	21.2 <b>23.8</b>	21.8 <b>26.4</b>

Table 4. Results of Open-Vocabulary 3DIS on ScanNet200, benchmarking on 198 classes.

Method	Setting	AP	$\mathbf{AP}_h$	$\mathbf{AP}_c$	$\mathbf{AP}_t$
Large-Vocab [18]	21K+ classes	8.5	9.9	7.2	8.3
Image-Tagging [18]	RAM++	10.7	11.6	11.0	9.3
Mask-Wise [18]	OSM	14.4	18.9	13.5	10.2
Point-Wise [18]	OSM	16.0	20.0	14.3	13.2
Any3DIS (ours)	OSM	19.1	18.2	16.9	22.8

Table 6. Results of Open-Ended 3DIS on ScanNet200, benchmarking on 198 instance classes.

#### Result on ScanNet++



Method	2D Segmenter	AP	$\mathbf{AP}_{50}$	$\mathbf{AP}_{25}$
Segment3D [12]		19.0	29.7	41.6
SAM-Graph [10]		15.3	27.2	44.3
SAM3D [33]	CAM HO	8.3	17.5	33.7
SAMPro3D [31]	SAM-HQ	16.9	31.7	48.6
SAI3D [35]		17.1	31.1	49.5
Open3DIS [19]		20.7	38.6	47.1
Open3DIS [19]	SAM2-L	17.9	30.4	39.7
Any3DIS (ours)	SAWIZ-L	22.2	35.8	47.0

Table 1. **Results of Class-Agnostic 3DIS on ScanNet++**, benchmarking on 1554 classes



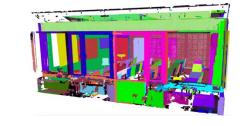
Method	2D Segmenter	AP	$\mathbf{AP}_{50}$	$\mathbf{AP}_{25}$
OVIR-3D [17]		3.6	5.7	7.3
Segment3D [12]	SAM-HQ	10.1	17.7	20.2
Open3DIS [19]		11.9	18.1	21.7
Any3DIS (ours)	SAM2-L	12.9	19.0	21.9

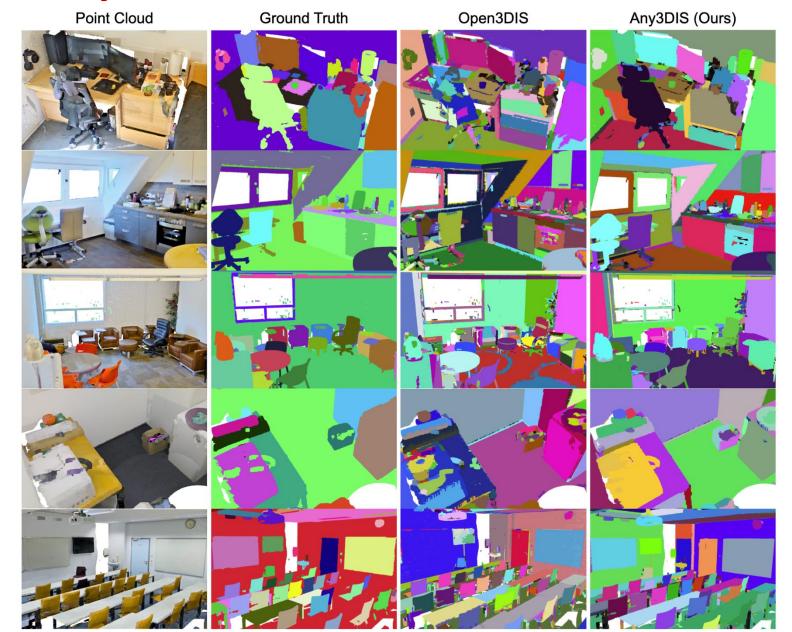
Table 3. **Results of Open-Vocabulary 3DIS on ScanNet++**, benchmarking a subset of 100 classes.

Method	Setting	AP	$\mathbf{AP}_{50}$	$\mathbf{AP}_{25}$
Large-Vocab [18]	21K+ classes	7.3	11.9	15.2
Image-Tagging [18]	RAM++	9.1	15.5	19.1
Mask-Wise [18]	OSM	16.3	24.8	29.0
Point-Wise [18]	OSM	18.4	29.4	33.6
Any3DIS (ours)	OSM	20.1	30.4	35.5

Table 5. **Results of Open-Ended 3DIS on ScanNet++**, benchmarking a subset of 100 classes.

# **Qualitative Any3DIS**



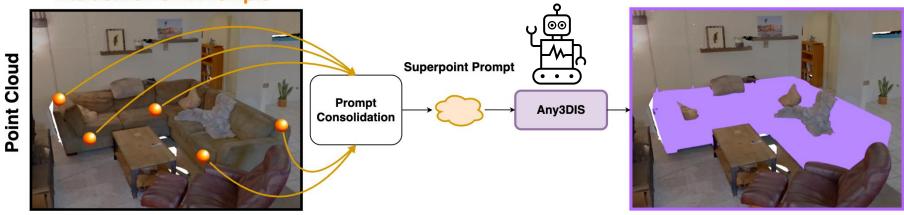


#### **Application Any3DIS**





#### **Interactive Point Prompts**



**Interactive 3D Instance Segmentation** 







Is this a chair?

**√** 

Is this a television?

X

Is this a couch?

 $\checkmark$ 

It is a sofa

 $\sqrt{\phantom{a}}$ 

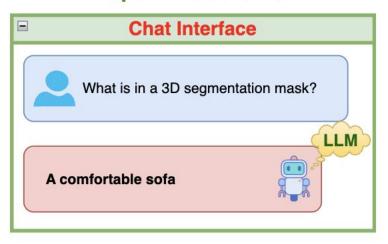
This is a picture



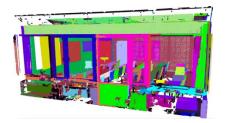
#### 3D Point Cloud



#### **Open-Ended 3DIS**



#### **Summary**



 We introduce Any3DIS to address the class-agnostic 3D instance segmentation task with a novel strategy to generate high-quality 3D proposals from pretrained 2D model.

4,226s/scene

 Our approach achieves state-of-the-art performance on 2 different indoor datasets.

 Future research on adapting Any3DIS for other 3D representation such as 3D Gaussian Splatting would be an interesting exploration.

