

① Add notes to each slide.

② 20 minutes (15-18 slides)

③ Use SHREC'18 track slides template

## Sketch/Image-Based 3D Scene Retrieval:

### Benchmark, Algorithm, Evaluation

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Move down

## Introduction

- **2D Scene Sketch/Image-Based 3D Scene Retrieval** (Scene\_SBR\_IBR) focuses on retrieving relevant 3D scene models using scene sketches/image(s) as input
- **Motivation:**
  - o Vast applications: 3D scene reconstruction, autonomous driving cars, 3D geometry video retrieval, and 3D AR/VR Entertainment
- **Challenges**
  - o 2D sketches/images lack 3D scene information they are supposed to present
  - o Semantic gap between 2D scene iconic sketches or realistic images and accurate 3D scene models
  - o Brand new research topic in the field of sketch/image-based 3D object retrieval (Scene\_SBR\_IBR)
    - ✓ A query sketch/image contains several objects
    - ✓ Objects may overlap with each other
    - ✓ Relative context configurations among the objects
- To promote this challenging research direction, we built the most comprehensive and largest 2D scene sketch/image-based benchmark 3D scene retrieval benchmark, **Scene\_SBR\_IBR**.

① Make each slide simple, not crowded.  
② So, divide this slide into two separate ones.

④ provide a highlighted/noted paper to or. for reference to show important parts, sentences, words, and etc.

## Outline

- Introduction
- Benchmark
- Evaluation
- Method
- Results
- Conclusions and Future Work

only one proposed method.

Use the same name as the paper

2D Scene Sketch Query Images

50% [1]

Insert outline slide before each section.

Highlight the current one.

## Scene\_SBR\_IBR Benchmark (1/3)

- 2D scene sketch dataset SBR benchmark [21], augmented further with 500 sketches from Flickr and Google Images
  - 750 2D scene sketches
  - 30 classes (25 sketches per class)

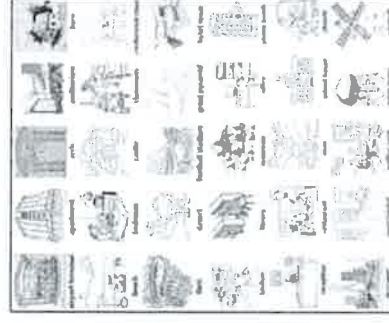


Fig. 1 Example 2D sketches (1 per class)

[21] - J. Yuan and et al. SHREC'18 track: 2D scene sketch-based 3D scene retrieval. In 3DOR, pages 1-8, 2018

Then benchmark overview one separate building process Benchmark detail

5

## Scene\_SBR\_IBR Benchmark (2/3)

### 2D scene image dataset

- Places88 [23] → *aid*
- 30,000 images *some*
- 30 classes (1,000 images per class) *explain*

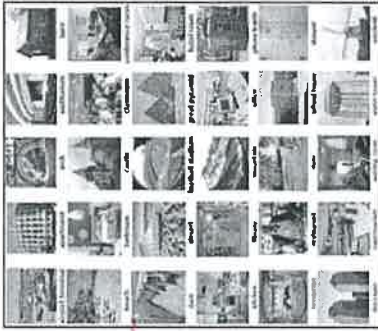


Fig. 1 Example 2D scenes (1 per class)

[23] B. Zhou and et al. Places: A 10 million image database for scene recognition. IEEE Trans. Pattern Anal. Mach. Intell., 40(6):1452–1464, 2018

*On Separate*

6

## Scene\_SBR\_IBR Benchmark (3/3)

### 3D scene model dataset

- 3D Warehouse [1] → *aid*
- 3000 scene models
- 30 classes (100 models per class) *Some explain*

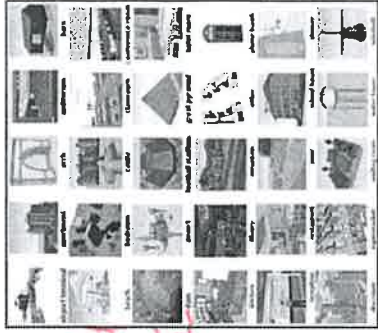


Fig. 1 Example 3D scenes (1 per class)

[1] 3D Warehouse. <http://3dwarehouse.sketchup.com/> 2018.

*Testing > learning  
Trans - based!*

*Table 1.*

*Our Retrieval Algorithm*

**View and Majority Vote VMV-VGG**

**Steps:**

- Incorporates two different VGG-16 based models [10] (VGG1 and VGG2)
- M. Eitz and et al. How do humans sketch objects? ACM Trans. Graph., 31(4):44:1–44:10, 2012.
- (1) Scene view sampling
  - Automate sample through QMacro script
  - Uniformly sample 12 views along the equator of the sphere.
- (2) Data Augmentation
  - Perform random rotations, reflections and translations to augment each dataset's size by 500 times

*font.*

*Do not put citation directly into the text.*

*organize them left in a separate workspace*

*VMV-VGG*

[10] K. Simonyan and A. Zisserman. Very deep convolutional networks for large-scale image recognition. CoRR, abs/1409.1556, 2014.

Move it to right after slide 7.

Ask Juefei's comments during and after slides creation.

## VMV-VGG contd.

- (3) Pre-Training on VGG1 and VGG2
  - For sketch-based retrieval VGG1 is pretrained only on the TU-Berlin dataset [6] for 500 epochs
  - VGG2 is trained on the Places data set for just 100 epochs
  - #ASK We use Places to pretrain both VGG1 and VGG2 for the first 100 epochs
- (4) Fine-tuning
  - #ASK fine-tune the pre-trained VGG1/VGG2 models each 100/50 epochs

font.

confirm with Juefei

[6] M. Eliz and et al. How do humans sketch objects? ACM Trans. Graph., 31(4):44:1-44:10, 2012.

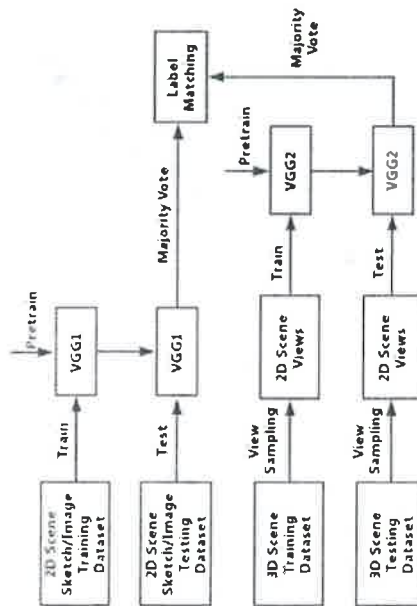
## VMV-VGG contd.

- (5) Sketch/Image/View Classification
  - We feed the well-trained model (VGG1/VGG2) alongside its corresponding testing query sketch/image or target scene view to obtain two classification vectors.
- (6) Majority vote-based label matching
  - We generate a rank list for each query by using a majority vote-based label matching method based on the query's classification vector and the target 3D scene's 13 classification vectors.

Combine all the steps into one slide. Use short sentences to conclude each slide. put complete presentations into eff.

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## VMV-VGG Architecture



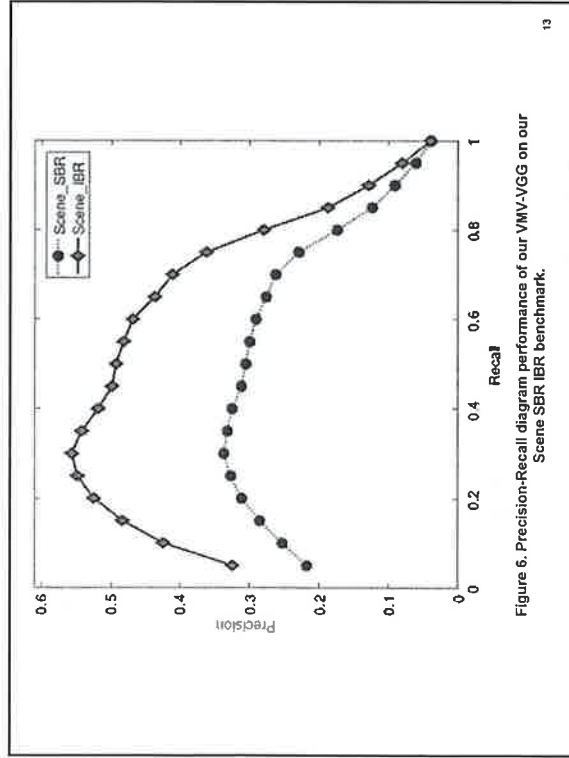
## Evaluation

- Seven commonly adopted performance metrics in 3D model retrieval technique [2, 21]:
  - Precision-Recall plot (PR)
  - Nearest Neighbor (NN)
  - First Tier (FT)
  - Second Tier (ST)
  - E-Measures (E)
  - Discounted Cumulated Gain (DCG)
  - Average Precision (AP)
- We also have developed the code to compute them
  - <http://orca.st.usm.edu/~bli/SceneIBR2018/data.html>

[2] H. Abdul-Rashid and et al. SHREC'18 track: 2D scene image-based 3D scene retrieval. In 3DOR, pages 1-8, 2018.  
 [21] J. Yuan and et al. SHREC'18 track: 2D scene sketch-based 3D scene retrieval. In 3DOR, pages 1-8, 2018.

Make sure you also add the majority into scripts. In case there are questions from attendees.





## Results: Performance Metrics

Benchmark	NN	FT	ST	E	DCG	AP
Scene_SBR	0.081	0.281	0.369	0.280	0.533	0.244
Scene_IBR	0.122	0.458	0.573	0.452	0.644	0.392

Performance metrics generated by running our VMV-VGG on our Scene SBR IBR benchmark.

*Conclusion / Comparison on the evaluation*  
*① Much more challenging than SHAR (18)*  
*②*

## Conclusions

- **Objective:** To foster this challenging and interesting research direction: *Scene Sketch/Image-Based 3D Scene Retrieval*
- **Dataset:** Build *the current largest* 2D Scene sketch/image 3D scene retrieval benchmark *used on our work*
- **Method:** Baseline performance has been provided by VMV-VGG
- **Evaluation:** Performed a *comparative evaluation* on the accuracy
- **Impact:** Provided the *largest and most comprehensive common platform* for evaluating 2D scene sketch/image-based 3D scene retrieval

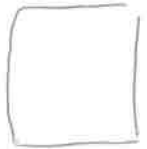
## Future Work

- Build a large-scale and/or multimodal 2D scene-based 3D scene retrieval benchmark
- Semantics-driven 2D scene image-based 3D scene retrieval

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*work*  
*Combine into one put complete into scripts*  
*Conclusion: Future work = The first step in building a large 3D scene retrieval benchmark*

References  
Slide



Thank you!  
Q&A?  
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