

# Hilbert Curve-Encoded Rotation-Equivariant Oriented Object Detector with Locality-Preserving Spatial Mapping



Qi Ming<sup>†</sup>, Liuqian Wang<sup>†</sup>, Juan Fang\*, Xudong Zhao\*, Yucheng Xu, Ziyi Teng, Yue Zhou, Xiaoxi Hu, and Xiaohan Zhang, Yufei Guo

College of Computer Science, Beijing University of Technology  
School of Cyber Science and Engineering, Zhengzhou University  
chaser.ming@gmail.com, jeremy.wango126@gmail.com



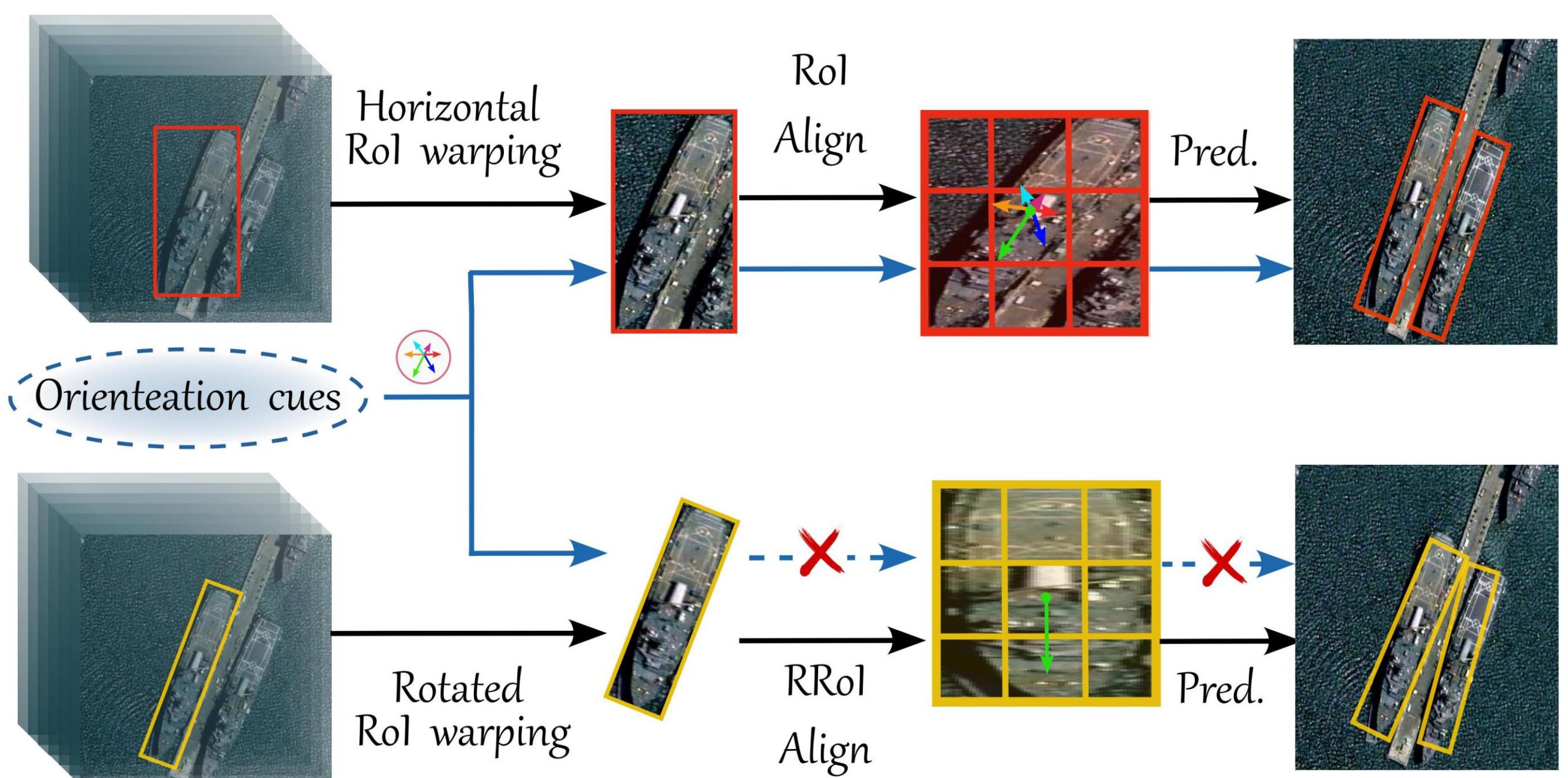
## Motivation

### ➤ Orientation Prediction Bottleneck

Two-stage AOOD frameworks use rotated RoI Align for joint classification and regression. It would *discards critical orientation information after cropping*, amplifying angle error.

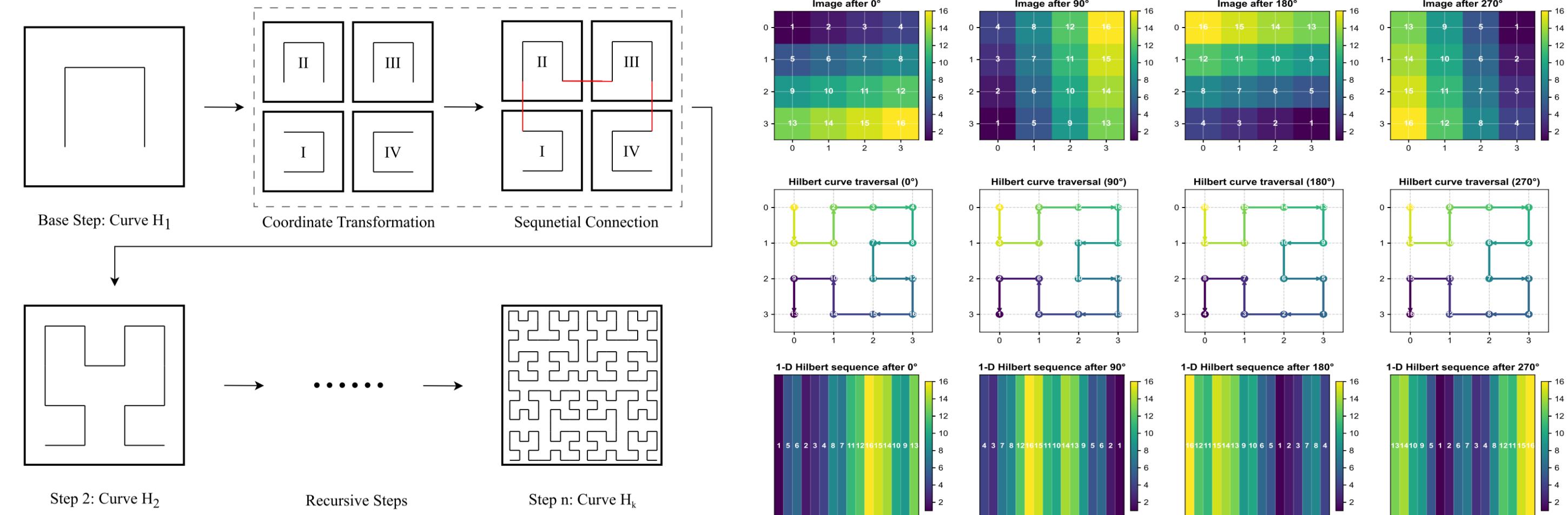
### ➤ Feature Representation Deficiencies

Standard convolution *fails to maintain spatial coherence or leverage context*, while flattening RRoI features in stage two disrupts intra-object structure and degrades regression precision.



## Preliminaries

### ➤ Definition and properties of Hilbert curves



### ■ Holder Continuity

$$\|\mathcal{H}(x) - \mathcal{H}(y)\| \leq 2\sqrt{d+3}|x - y|^{1/d}$$

### ■ Inverse locality

$$|\mathcal{H}^{-1}(Q_1) - \mathcal{H}^{-1}(Q_2)| \leq \phi \cdot \|Q_1 - Q_2\|^d$$

### ■ Scaling Property

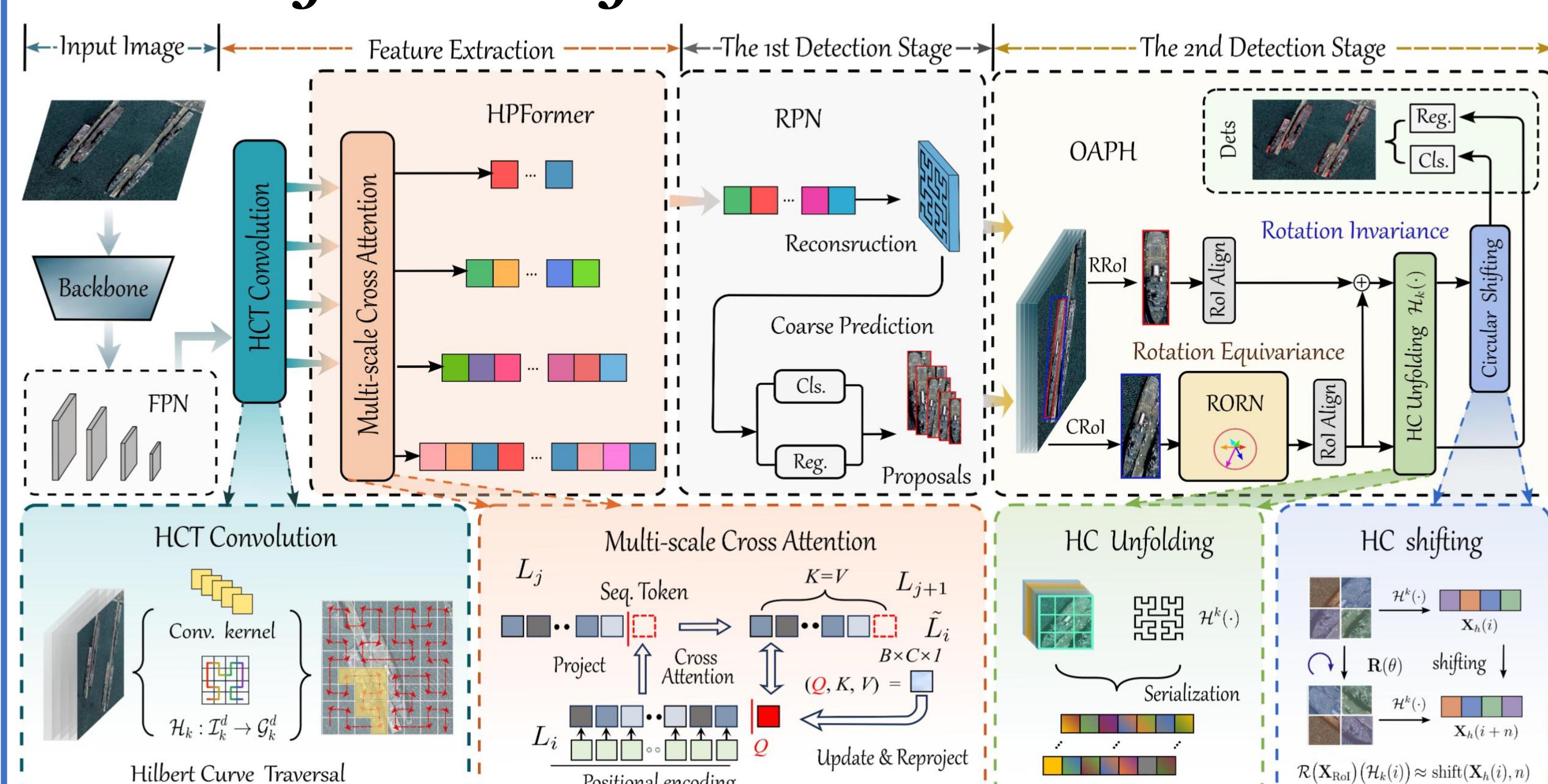
$$\|\mathcal{H}_k(x) - \mathcal{H}_k(y)\| = \sqrt{\alpha} \|\mathcal{H}_k(x/\alpha) - \mathcal{H}_k(y/\alpha)\|$$

### ■ Translation Property

$$\|\mathcal{H}_k(x) - \mathcal{H}_k(y)\| = \|\mathcal{H}_k(x + 1/\gamma) - \mathcal{H}_k(x + 1/\gamma)\|$$

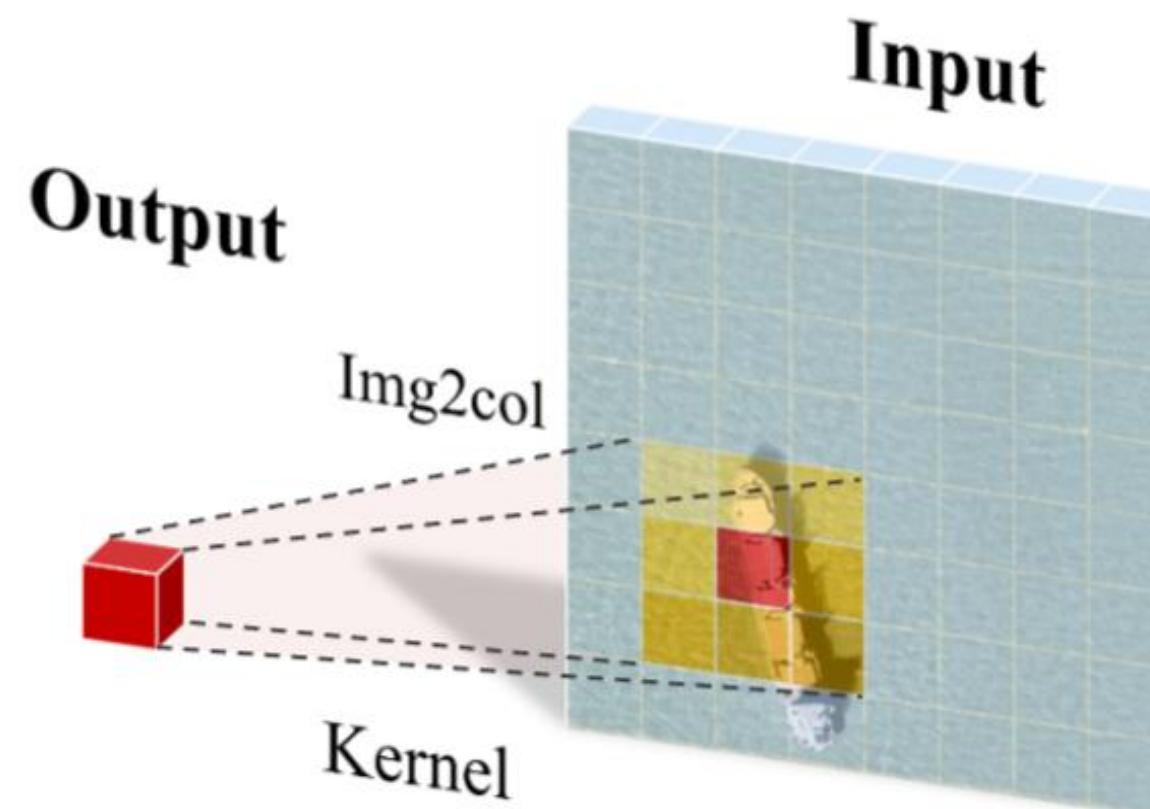
## Methodology

### ➤ Locality-Preserving HERO-Det

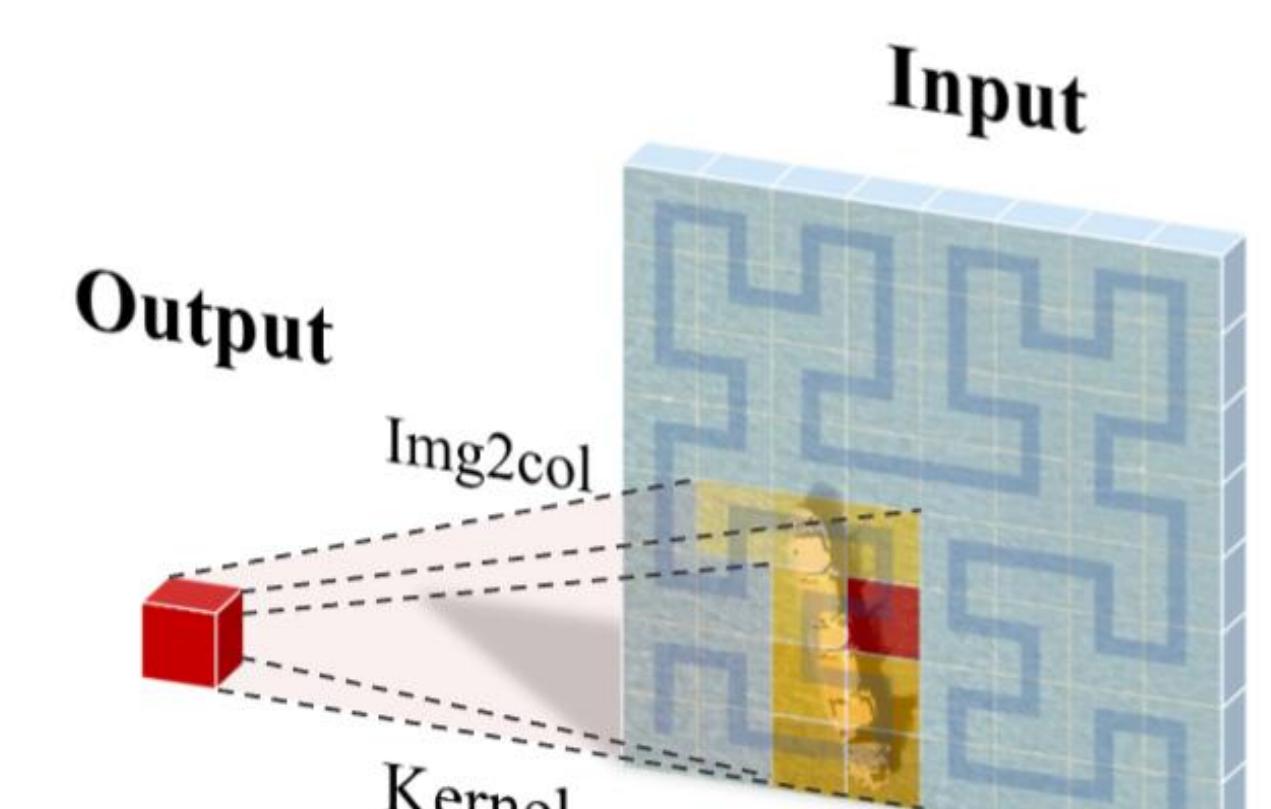


Based on FPN, HCTConv preserves locality, while cross-scale attention constructs HPformer. Coarse first-stage proposals are then processed via OAPH for rotation-aware prediction.

### ■ Hilbert Curve Traversal Convolution



(a) Standard Conv.



(b) Our HCTConv.

$$\mathbf{Y}(t, c_{\text{out}}) = \sum_{s \in \mathcal{N}(t)} \sum_{c=1}^{C_{\text{in}}} \mathbf{W}(s - t, c_{\text{in}}, c_{\text{out}}) \cdot \mathbf{X}(\mathcal{H}_k(s), c)$$

### ■ Hilbert Pyramid Transformer

$$\tilde{L}_i = \text{softmax} \left( \frac{(\tilde{L}_i W_Q) (L_{j+1} W_K)^\top}{\sqrt{d}} \right) \cdot (L_{j+1} W_V)$$

### ■ Orientation-Adaptive Prediction Head

- *Residual ORN*  $\mathcal{R}(\mathbf{X}_{\text{RoI}})(\mathcal{H}_k(i)) \approx \mathbf{X}_h((i + n \frac{N}{4}) \bmod N)$
- *Hilbert Curve Unfolding*  $\mathbf{X}_h^{(n)}(i) = \mathbf{X}_h((i + n \frac{N}{4}) \bmod N)$
- *Hilbert Circular Shifting*  $\tilde{\mathbf{X}}_{\text{RI}}(i) = \sum_{n=0}^3 \mathbf{X}_h^{(n)}(i)$

## Experiments

### ➤ Ablation Study

| Different Variants |          |      |     | Metric      |
|--------------------|----------|------|-----|-------------|
| HCTConv            | HPFormer | RORN | HCS | mAP(%)      |
| ✓                  |          |      |     | 67.5        |
| ✓                  | ✓        | ✓    |     | 69.1        |
|                    |          | ✓    | ✓   | 70.2        |
|                    |          | ✓    | ✓   | 68.6        |
| ✓                  | ✓        | ✓    | ✓   | 69.2        |
|                    |          | ✓    | ✓   | <b>70.7</b> |

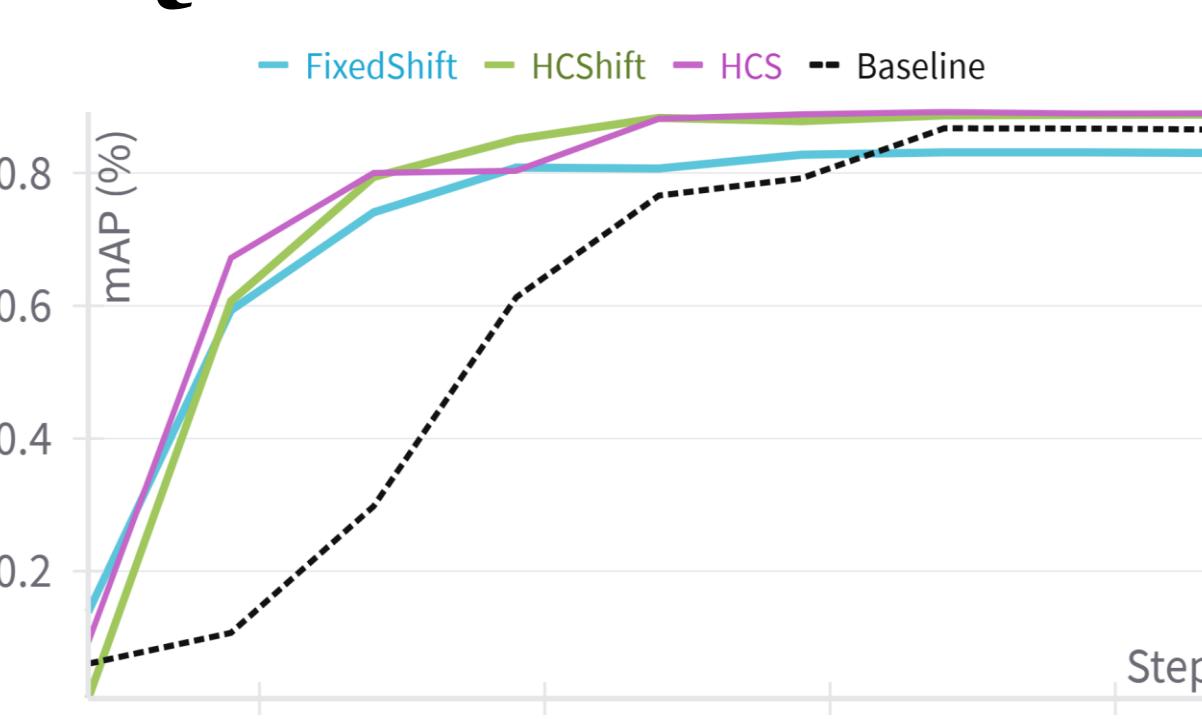
  

| ORN | RORN | HC Unfolding | mAP(%)      |
|-----|------|--------------|-------------|
| ✓   |      |              | 67.1        |
| ✓   |      | ✓            | 68.1        |
|     | ✓    |              | 67.5        |
|     | ✓    | ✓            | <b>68.6</b> |

| Flatten       | Reconstruct   | mAP(%)      |
|---------------|---------------|-------------|
| Raster Scan   | Raster Scan   | 67.5        |
| Hilbert curve | Raster Scan   | 67.2        |
| Hilbert curve | Hilbert curve | 68.7        |
| Hilbert curve | Hilbert curve | <b>69.1</b> |

### ➤ Qualitative Results

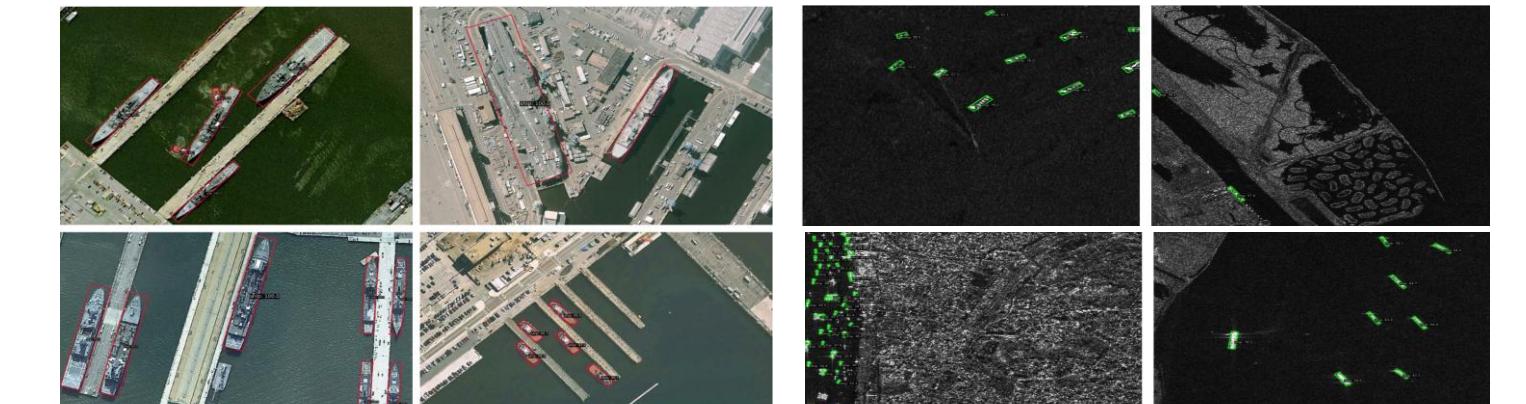


### ➤ Visualization Results

#### • Results on DOTA



#### • Results on Ship Datasets

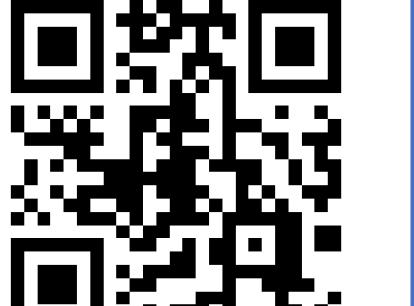


## Conclusion

- Proposed **HERO-Det**, a novel Hilbert curve-based framework for oriented object detection with locality-preserving property.
- Provided an **interesting idea** applying space-filling curves to optimize object detection.
- Several known challenges remain in our HERODet, discussions are welcome !



Code



Homepage