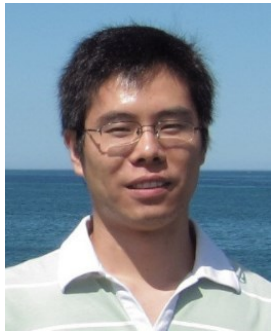
ISDA: POSITION-AWARE INSTANCE SEGMENTATION WITH DEFORMABLE ATTENTION

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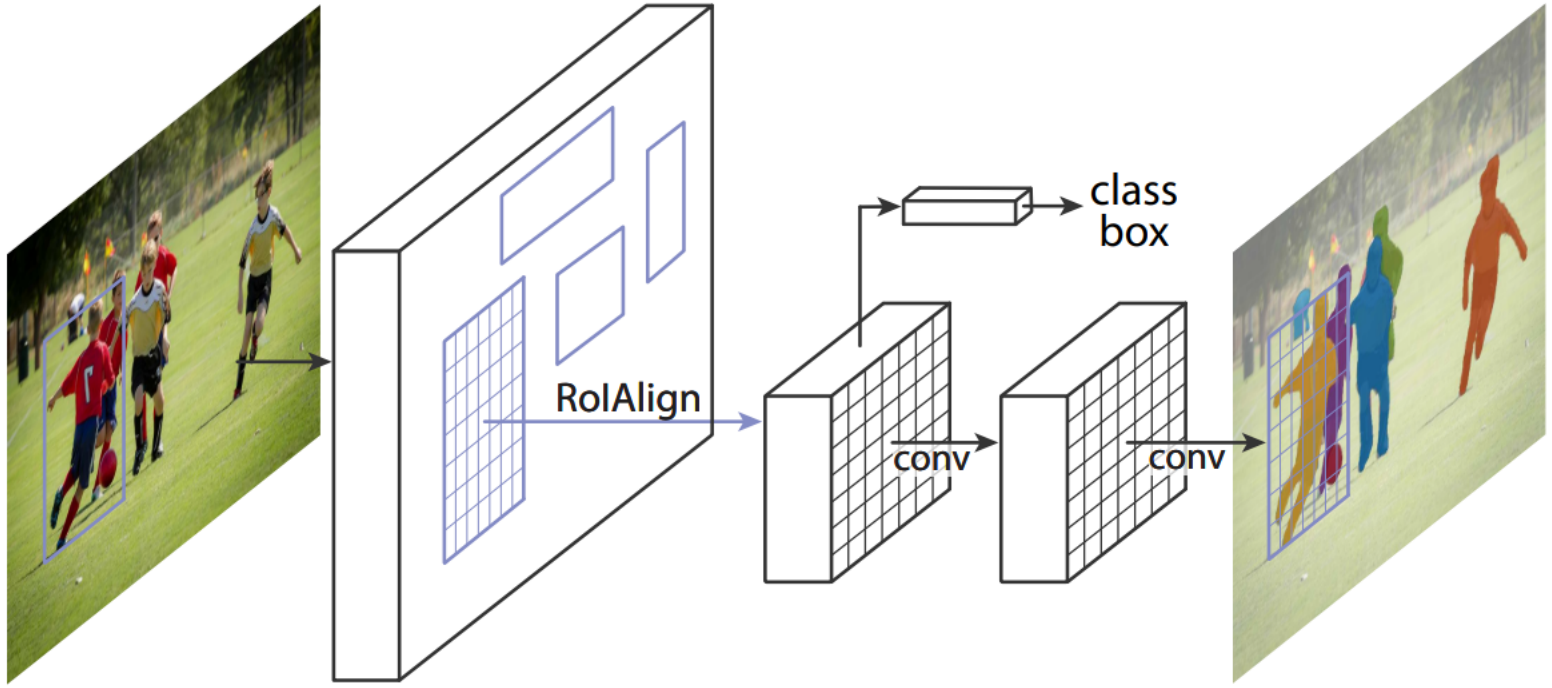
Instance Segmentation

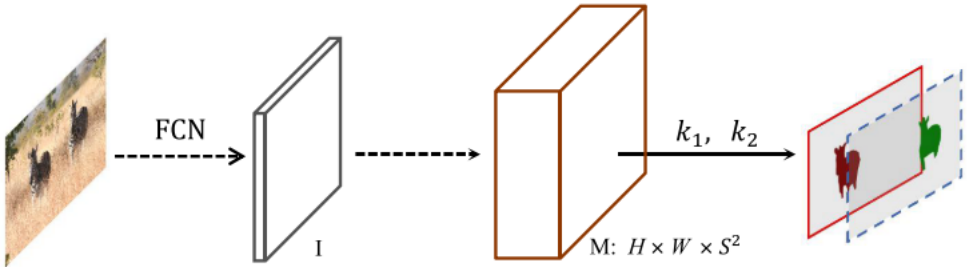
Difficulties: Require both **instance-level (holistic and coarse)** and **pixel-level results (local and fine).** In contrast, object detection only requires instance-level results, and semantic segmentation only requires pixel-level result.

Mask R-CNN

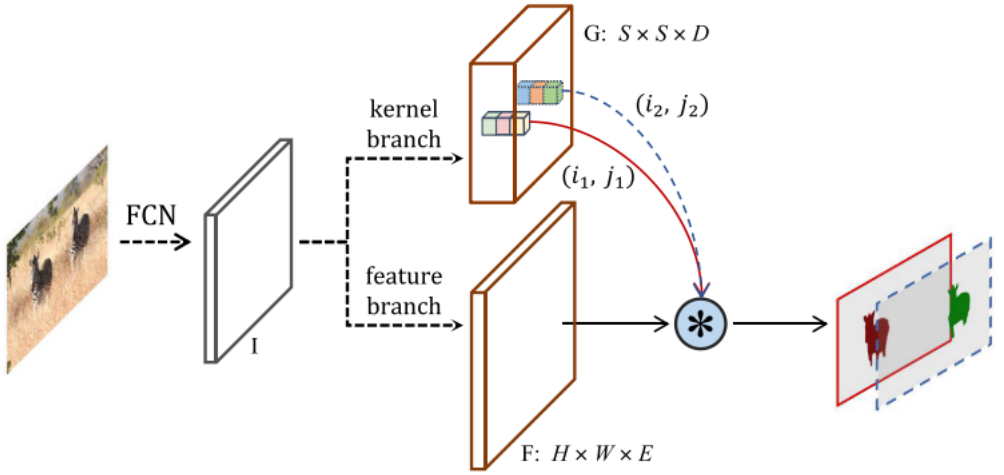


Challenge: RPN and NMS block end-to-end

Segmenting objects by locations



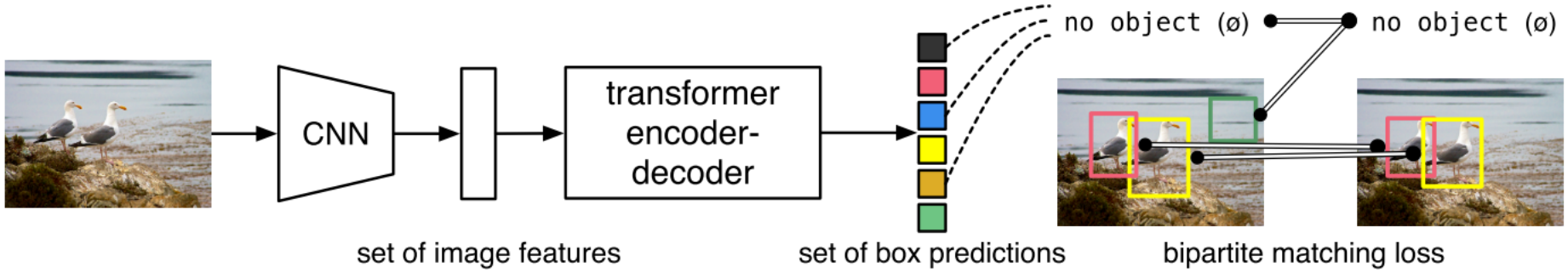
SOLO

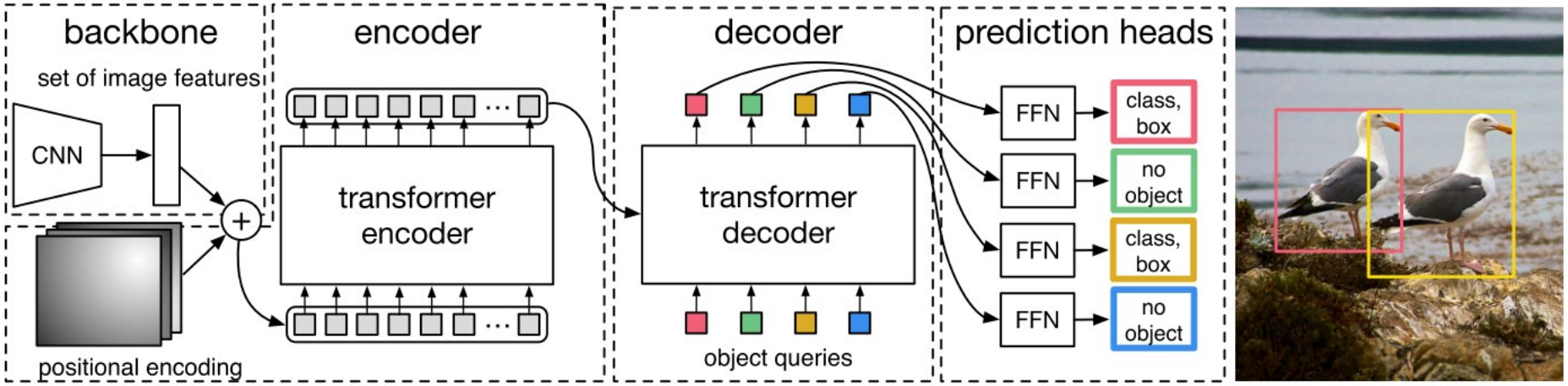


SOLOv2

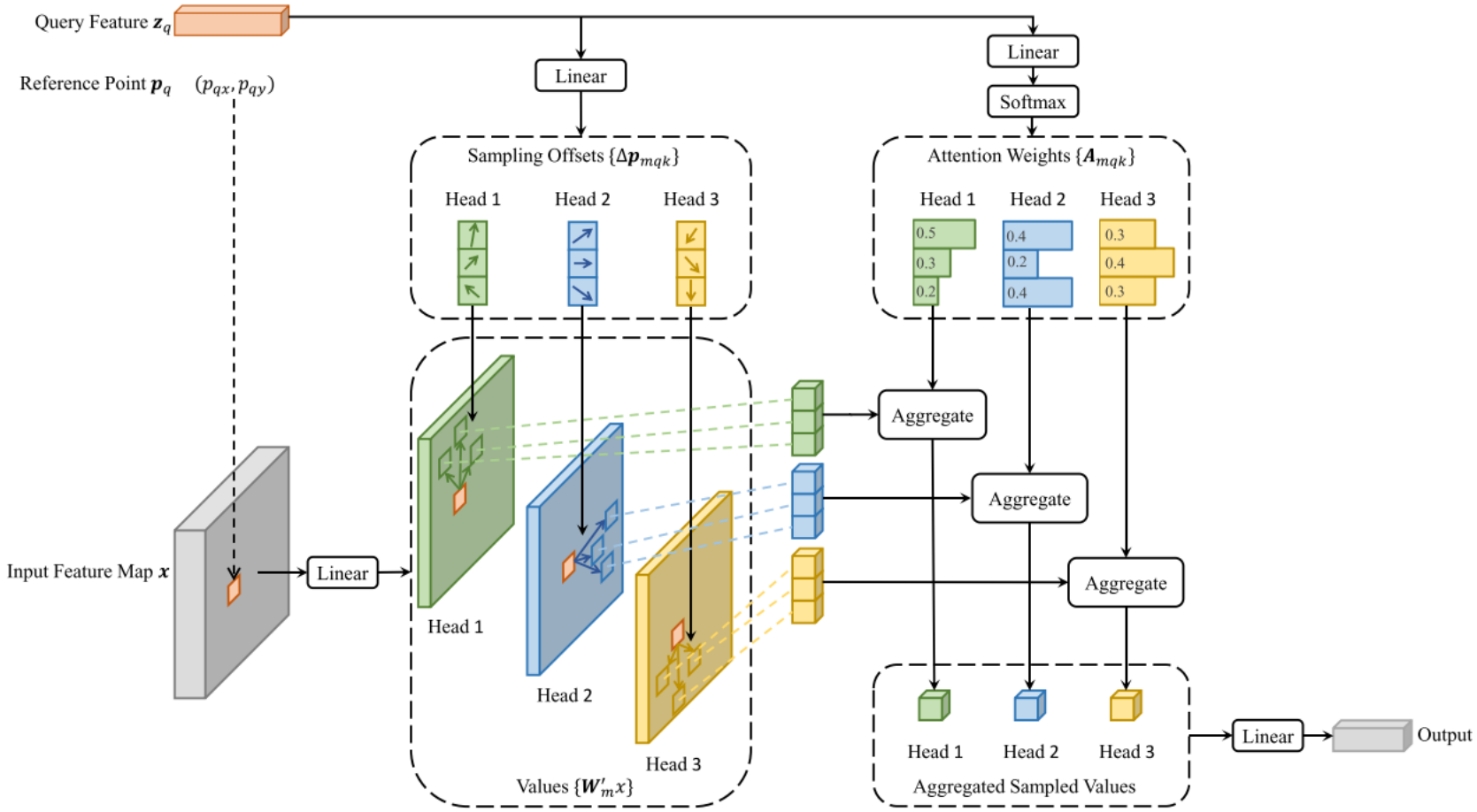
NMS still exits!

Detection Transformer

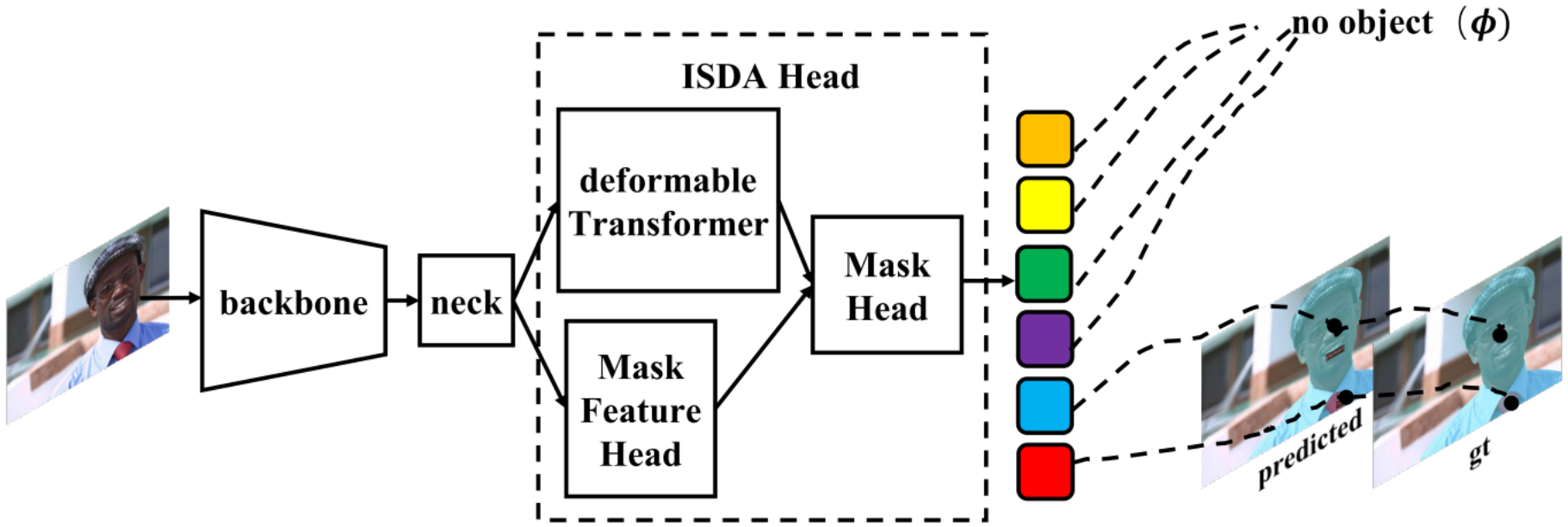




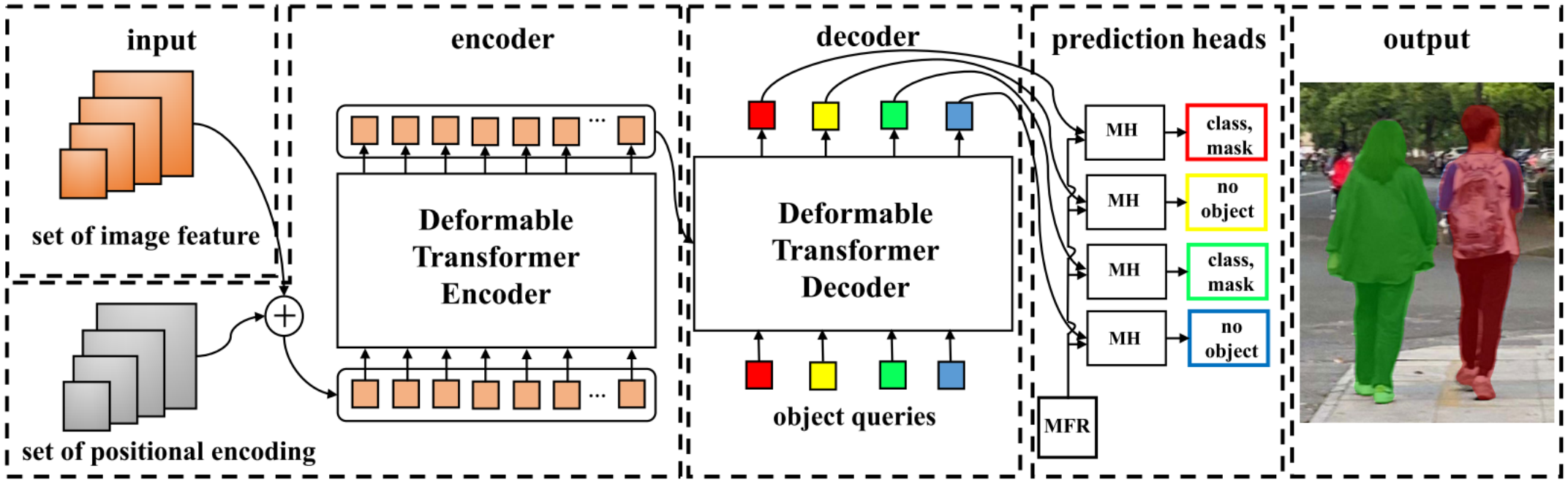
Deformable DETR



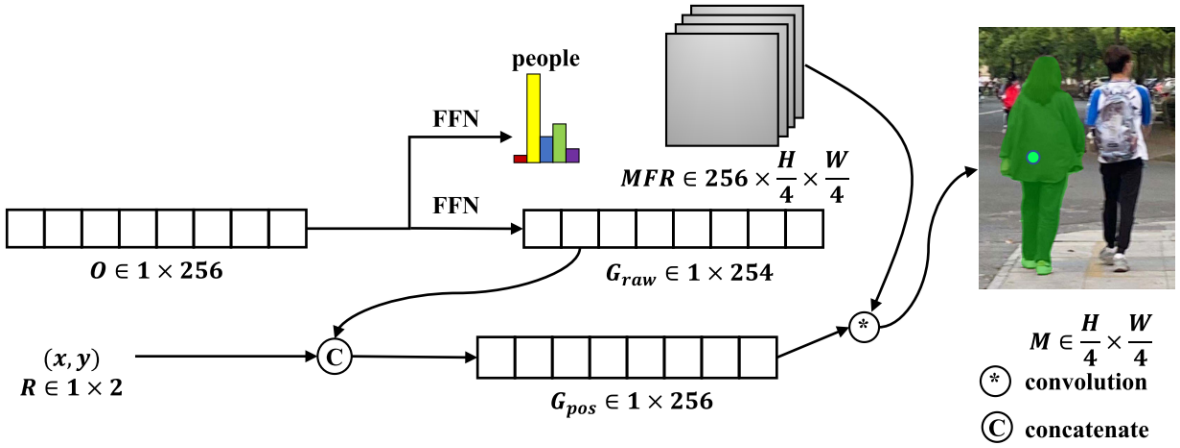
ISDA Overview



ISDA Head


input
encoder
decoder
prediction heads
output
set of image feature
set of positional encoding
Deformable Transformer Encoder
Deformable Transformer Decoder
object queries
MH
MH
MH
MH
MFR
class, mask
no object
class, mask
no object

Mask Head


people
FFN
FFN
$MFR \in 256 \times \frac{H}{4} \times \frac{W}{4}$
$O \in 1 \times 256$
$G_{raw} \in 1 \times 254$
(x, y)
$R \in 1 \times 2$
C
$G_{pos} \in 1 \times 256$
*
$M \in \frac{H}{4} \times \frac{W}{4}$
* convolution
C concatenate

Quantitative results

Ablation Study on mask resolution

Resolution	AP	AP_{50}	AP_{75}	AP_S	AP_M	AP_L
1/8	35.0	58.3	35.9	14.6	38.5	**54.7**
1/4	**36.5**	**58.9**	**38.3**	17.4	**39.5**	54.6
1/2	36.4	58.7	38.3	**17.6**	39.3	53.8

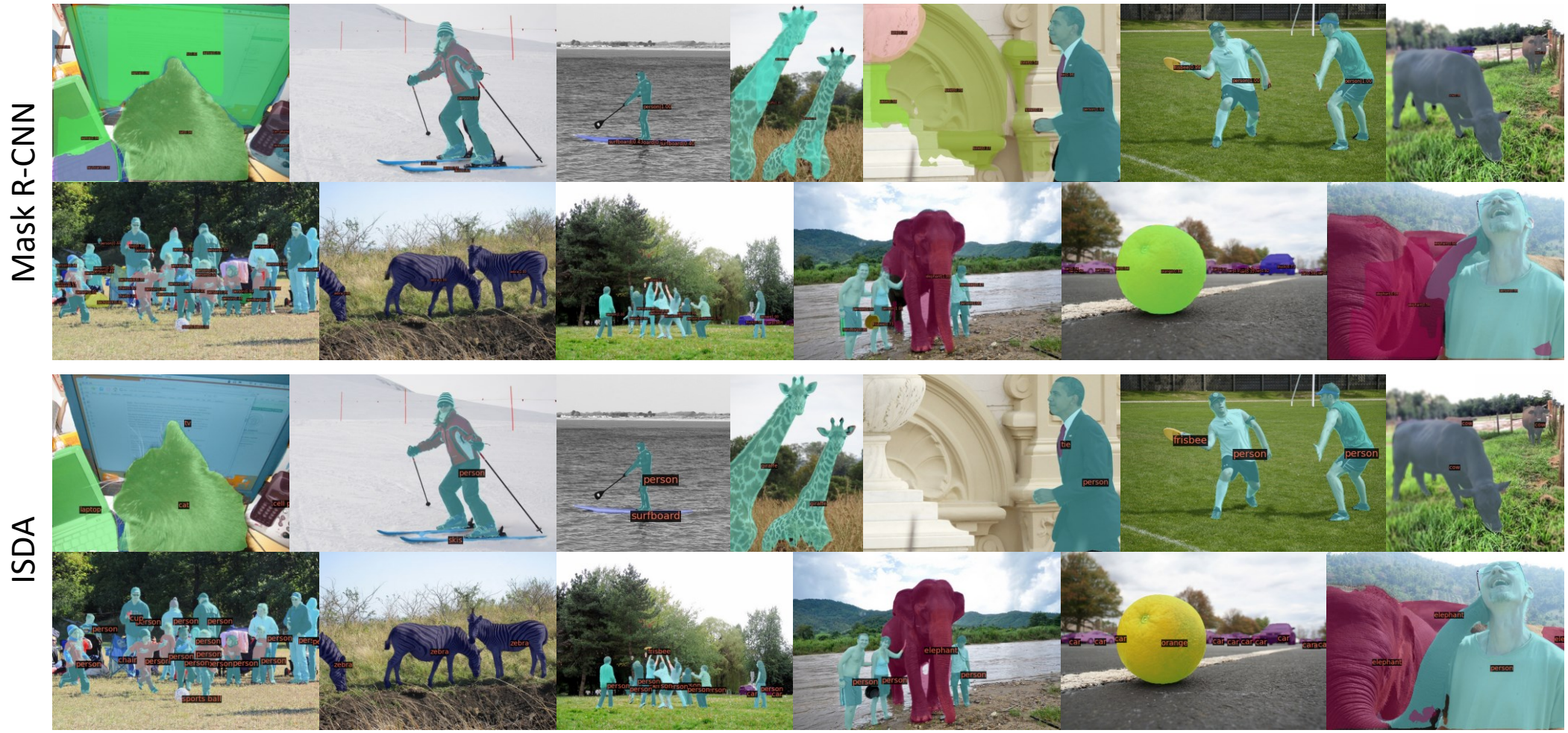
Ablation Study on positional information

MP	KP	Delta	AP	AP_{50}	AP_{75}	AP_S	AP_M	AP_L
		0	32.4	56.9	32.2	15.6	35.5	47.4
✓		+3.7	36.1	58.5	37.9	16.6	39.0	54.5
	✓	-0.6	31.8	56.0	31.9	15.4	34.8	47.1
✓	✓	+4.1	**36.5**	**58.9**	**38.3**	**17.4**	**39.5**	**54.6**

Result on MS COCO

Method	AP	AP_{50}	AP_{75}	AP_S	AP_M	AP_L
Mask R-CNN [7]	36.1	58.2	38.5	20.1	38.8	46.4
SOLO [12]	35.1	55.9	37.4	13.7	37.6	51.6
SOLOv2 [13]	37.4	58.4	40.1	15.4	40.2	**57.4**
CondInst [33]	36.9	58.2	39.6	19.8	39.3	48.0
BlendMask [34]	37.0	58.0	39.4	19.5	39.9	53.1
ISTR [29]	37.6	-	-	**22.1**	40.4	50.6
ISDA (**ours**)	**38.7**	**62.0**	**41.1**	17.0	**41.2**	55.7

Qualitative results



Compare with Mask R-CNN

Qualitative results

More results

Conclusion

- ISDA introduced a Transformer-style framework for instance segmentation, which effectively removed NMS and achieved end-to-end training and inference
- ISDA is able to distinguish similar objects better by learning extra positional features
- ISDA gives SOTA results

Thank you!