

# RVOS: End-to-End Recurrent Network for Video Object Segmentation



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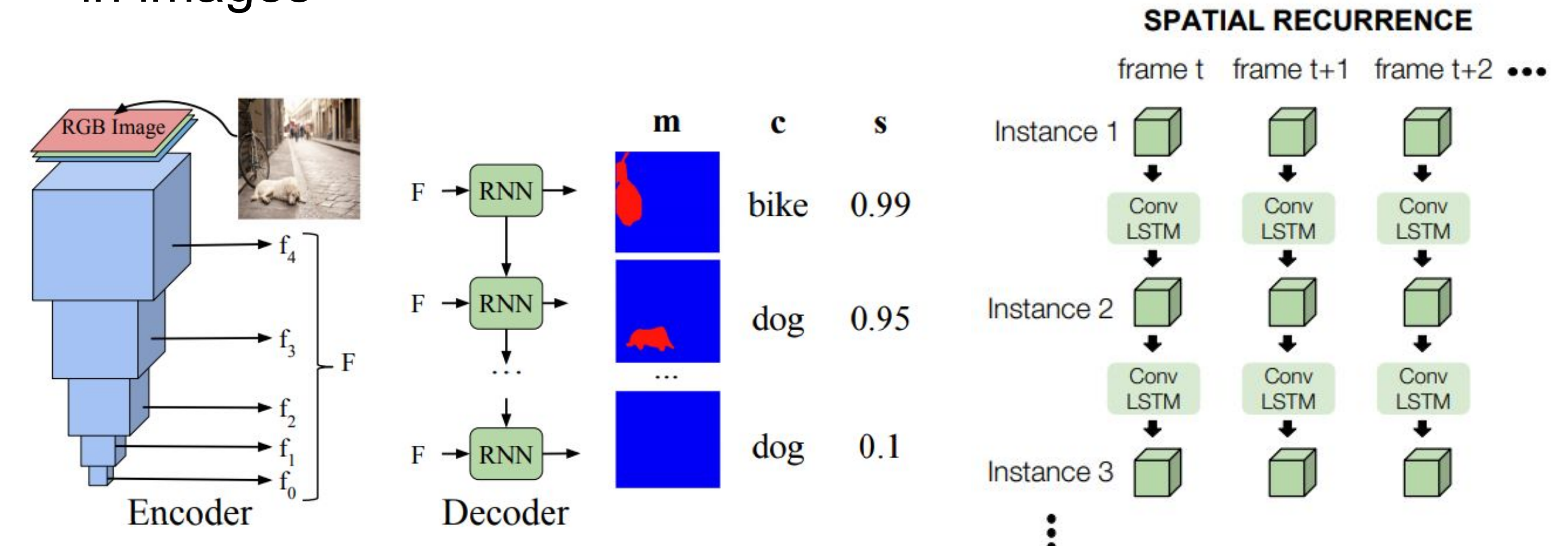
## Summary

**Multiple object video object segmentation** is a challenging task, specially for the zero-shot case, when no object mask is given at the initial frame and the model has to find the objects to be segmented along the sequence. In our work, we propose a Recurrent network for multiple object Video Object Segmentation (RVOS) that is **fully end-to-end trainable**. Our model incorporates **recurrence** on two different domains: (i) the **spatial**, which allows to discover the different object instances within a frame, and (ii) the **temporal**, which allows to keep the coherence of the segmented objects along time.

## Previous work: Spatial Recurrence

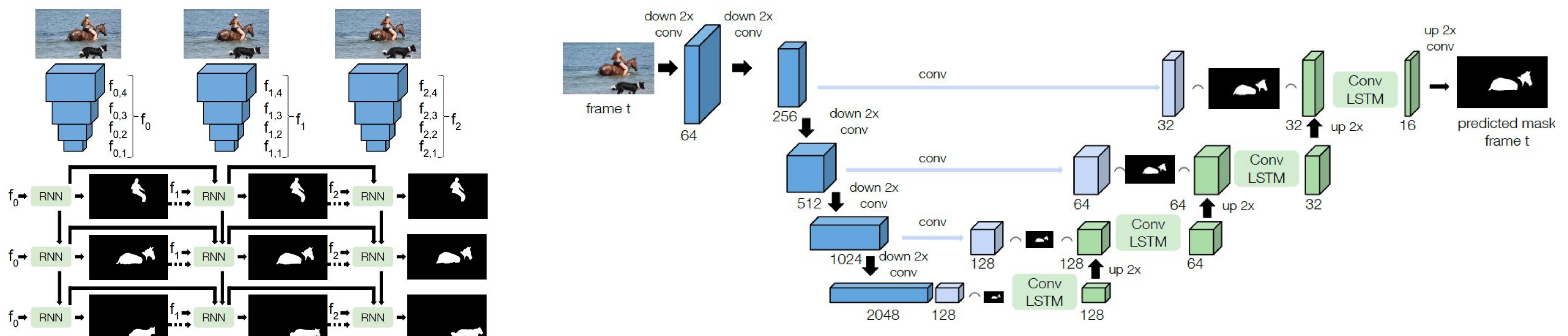
### Recurrent Semantic Instance Segmentation (RSIS)

- Model based on spatial recurrence for instance segmentation in images



## Proposed Model: Spatio-temporal Recurrence

We propose to extend RSIS (spatial recurrent model for images) to RVOS (spatio-temporal recurrent model for videos):

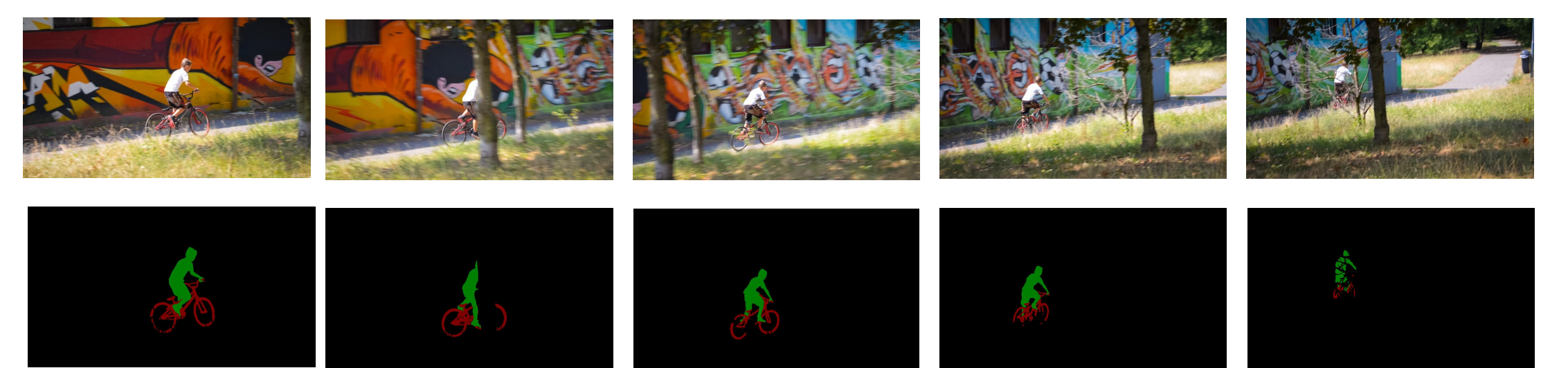


## Experimental Results

### ONE-SHOT VIDEO OBJECT SEGMENTATION

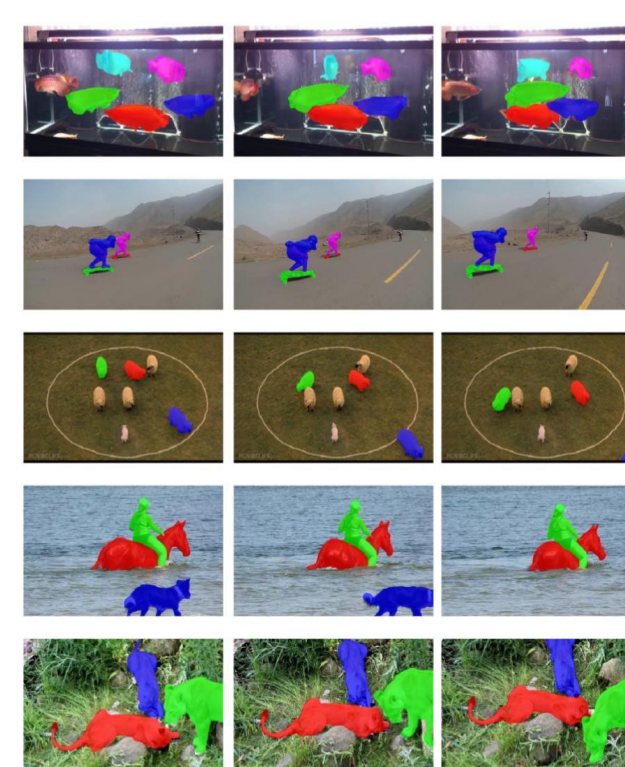


### ZERO-SHOT VIDEO OBJECT SEGMENTATION

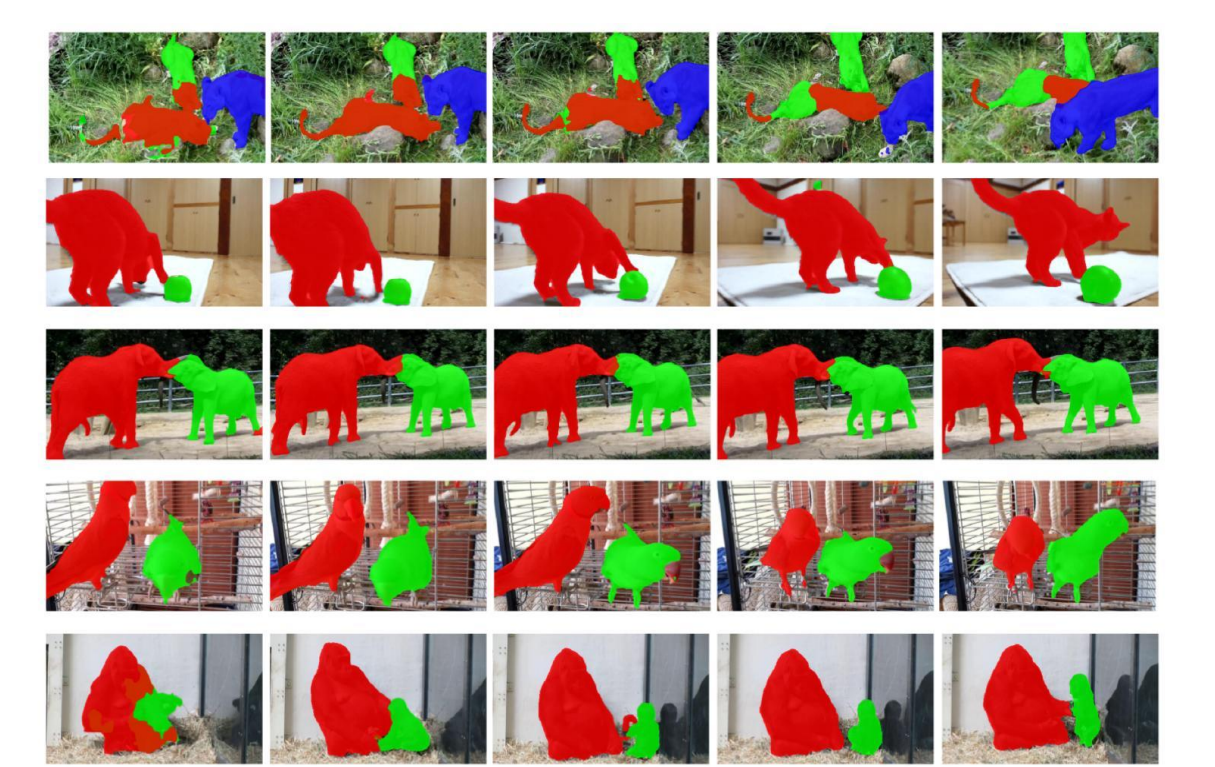


YOUTUBE-VOS

	OL	YouTube-VOS one-shot				Inference time (s/frame)
		$J_{seen}$	$J_{unseen}$	$F_{seen}$	$F_{unseen}$	
OSVOS [3]	✓	59.8	<b>54.2</b>	60.5	<b>60.7</b>	10
MaskTrack [20]	✓	59.9	45.0	59.5	47.9	12
OnAVOS [30]	✓	<b>60.1</b>	46.6	<b>62.7</b>	51.4	13
S2S w/o OL [33]	✗	<b>66.7</b>	<b>48.2</b>	65.5	50.3	0.160
OSMN [34]	✗	60.0	40.6	60.1	44.0	0.065
RVOS-Mask-ST+	✗	63.6	45.5	<b>67.2</b>	<b>51.0</b>	<b>0.044</b>

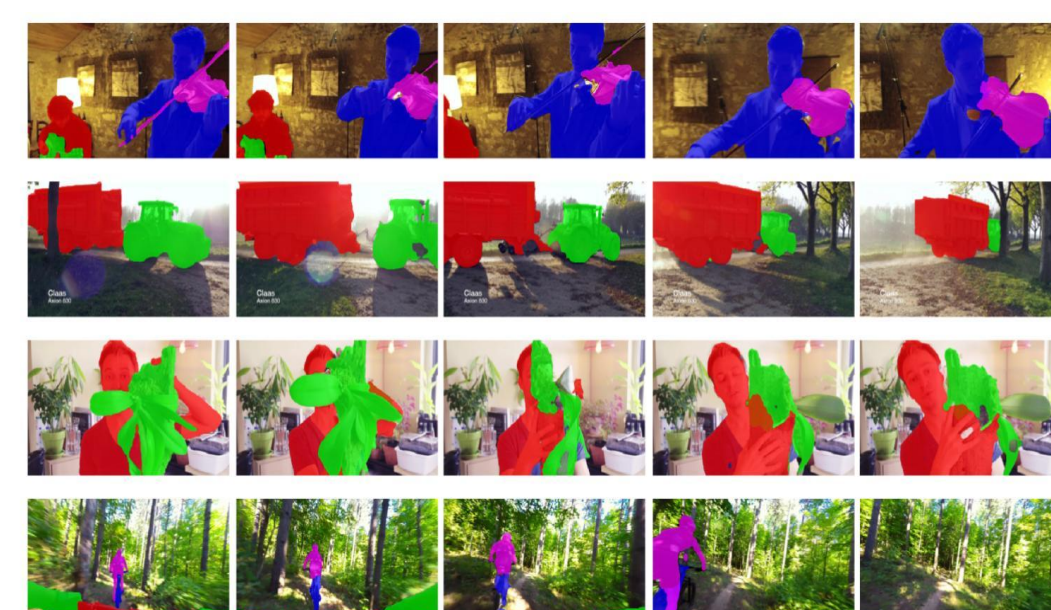


	YouTube-VOS zero-shot			
	$J_{seen}$	$J_{unseen}$	$F_{seen}$	$F_{unseen}$
RVOS-S	40.8	19.9	43.9	23.2
RVOS-T	37.1	20.2	38.7	21.6
RVOS-ST	<b>44.7</b>	<b>21.2</b>	<b>45.0</b>	<b>23.9</b>



DAVIS 2017

	OL	DAVIS-2017 one-shot	
		$J$	$F$
OSVOS [3]	✓	47.0	54.8
OnAVOS [30]	✓	49.9	55.7
OSVOS-S [17]	✓	52.9	62.1
CINM [2]	✓	<b>64.5</b>	<b>70.5</b>
OSMN [34]	✗	37.7	44.9
FAVOS [4]	✗	42.9	44.2
RVOS-Mask-ST+ (pre)	✗	46.4	50.6
RVOS-Mask-ST+ (ft)	✗	<b>48.0</b>	<b>52.6</b>



	DAVIS-2017 zero-shot	
	$J$	$F$
RVOS-ST (pre)	21.7	27.3
RVOS-ST (ft)	<b>23.0</b>	<b>29.9</b>



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