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Saliency Prediction in 360º Videos with Transformers

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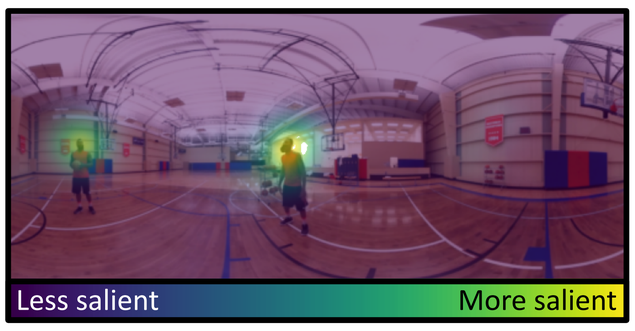
Motivation

- **Saliency** is the quality which makes some stimuli stand out and capture **human attention**.
- **Visual saliency** is used for studying **human visual behaviour** and **guiding user attention** in **Virtual Reality** applications.
- **Current methods** for saliency prediction in 360º videos have difficulties representing their **long-term temporal dependencies**.
- **Our method** is capable of representing the **spatio-temporal dependencies** of 360º videos by employing the **global attention** mechanism of the **Transformer** architecture.

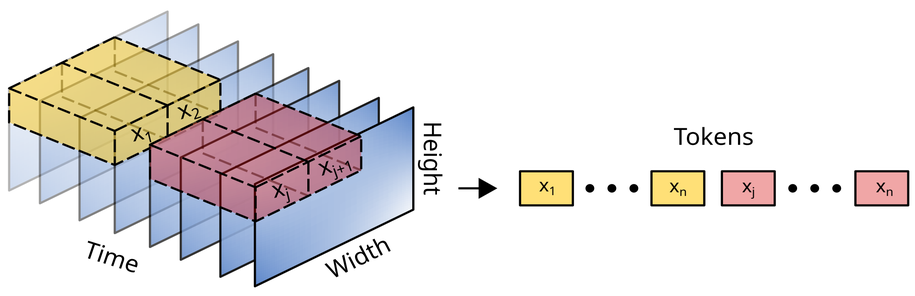
Example frame from 360º video [3]

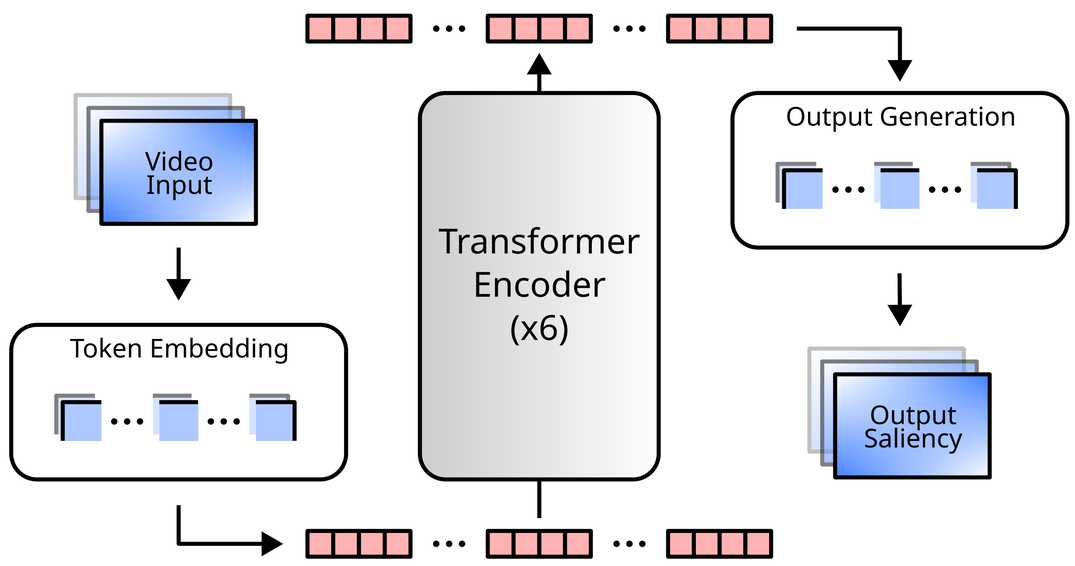
Visual attention (saliency)



Our Approach

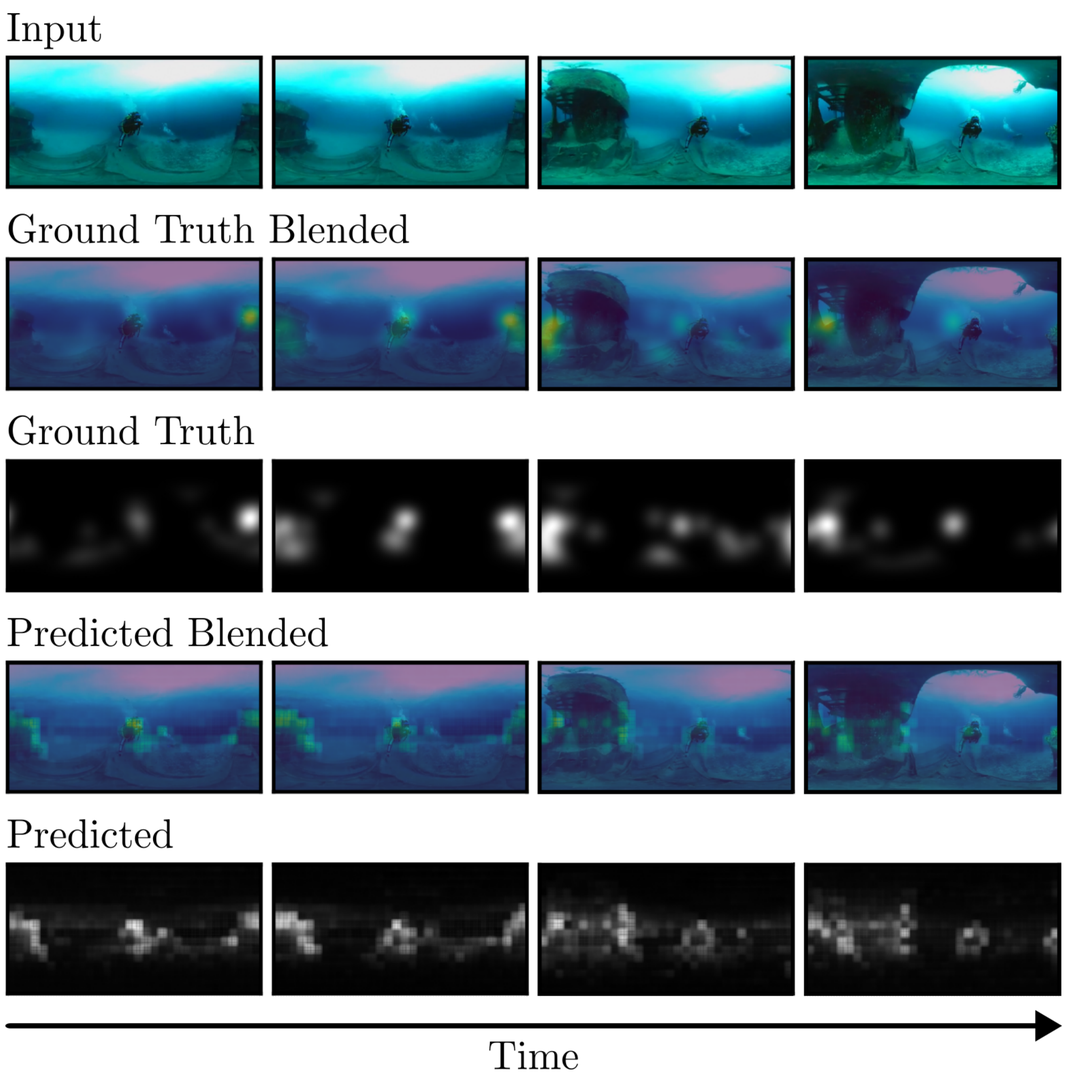
Based on the **Transformer** architecture [1], we employ the **global attention** mechanism in order to represent the **spatio-temporal dependencies** of visual attention in videos. We train our model with the **VR EyeTracking dataset** [3], by using **Mean-Square-Error (MSE)** as the loss function. To use the Transformer encoder, we first convert the input videos into a sequence of **spatio-temporal tokens** [1].





Results

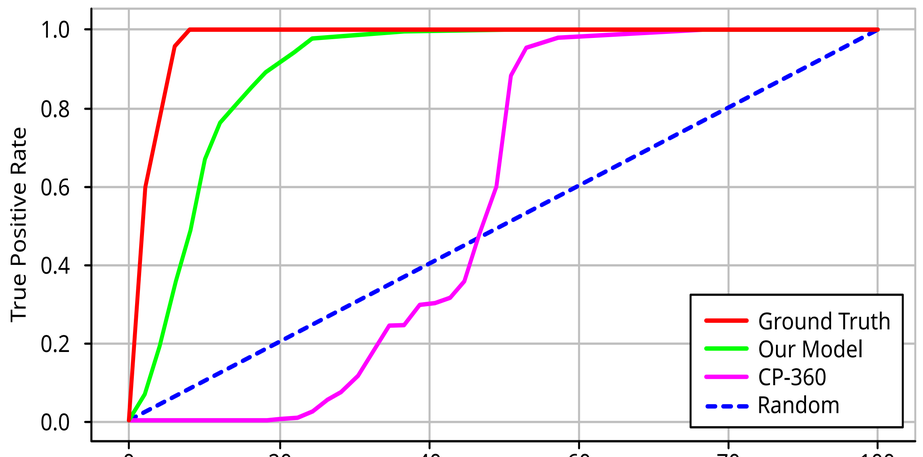
Our model generates output saliency maps that **resemble human visual attention** in 360º videos.



Evaluation

We compare our model with a current **state-of-the-art** model [4] by measuring a series of metrics for the generated saliency maps and the ground truth saliency maps of the **Sports360 dataset** [2], outperforming it for **all metrics measured**.

	SIM ↑	CC ↑	KLD ↓	NSS ↑
OurModel	**0.3375**	**0.3048**	**6.3080**	**1.3870**
CP-360 [4]	0.2761	0.2338	8.3600	0.9515



Resulting Receiver Operating Characteristic (ROC) Curves. Our model produces a curve **closer to the ground truth** than the compared model, achieving **over 90% of recall with only 20% of the most salient regions**.

References

[1] ARNAB A., DEHGHANI M., HEIGOLD G., SUN C., LUČIĆ M., SCHMID C.: ViViT: A Video Vision Transformer. *IEEE/CVF International Conference on Computer Vision (ICCV)*. 2021
[2] XU Y., DONG Y., WU J., SUN Z., SHI Z., YU J., GAO S.: Deep 360 Pilot: Learning a Deep Agent for Piloting through 360° Sports Videos. IEEE Conference on Computer Vision and Pattern Recognition. 2017
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[4] CHENG, H., CHAO, C., DONG, J., WEN, H.K., LIU, T.L., and SUN, M.: Cube Padding for Weakly-Supervised Saliency Prediction in 360° Videos. Proceedings of the IEEE Computer Society Conference on Computer Vision and Pattern Recognition. 2018

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