Supplementary Material: Unsupervised Hard Example Mining from Videos for Improved Object Detection

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In the attached video, <code>suppVideo.mp4</code>, we have visualized how a large number of hard negatives can be obtained <code>automatically</code> by analyzing the output of a trained detector on video sequences. Red boxes denote the detections that are <code>isolated in time</code> due to "detector flicker" (i.e. <code>hard negatives</code>), among the high confidence detections (<code>green boxes</code>). Additionally, some of the hard negatives from the video are visualized in this document in Fig. 1-8 for faces and Fig. 9-11 for pedestrians. We also demonstrate the presence of "hard positives" (shown near the end of the video from <code>2:01-2:20</code>), which are positive examples that are surrounded in time by correct detections.

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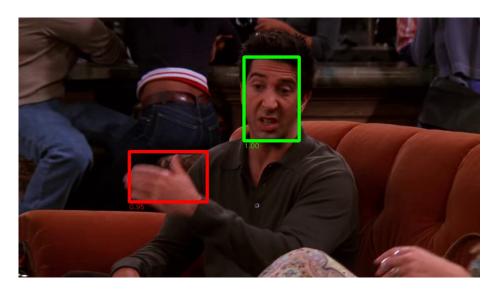


Fig. 1

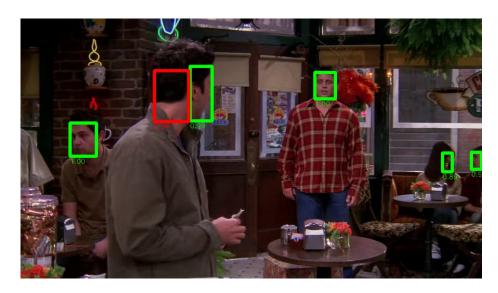


Fig. 2

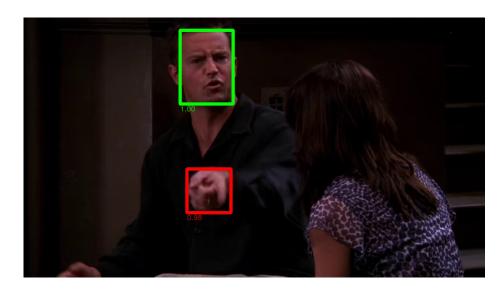


Fig. 3

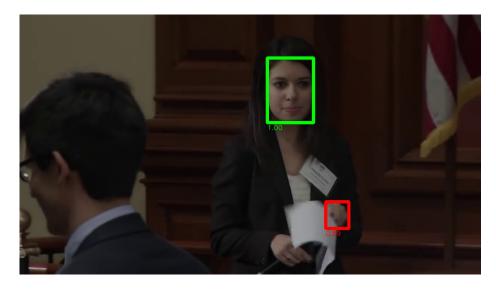


Fig. 4

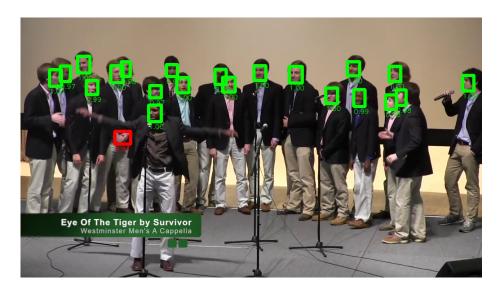


Fig. 5

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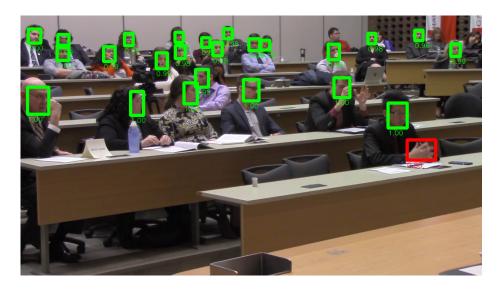


Fig. 6

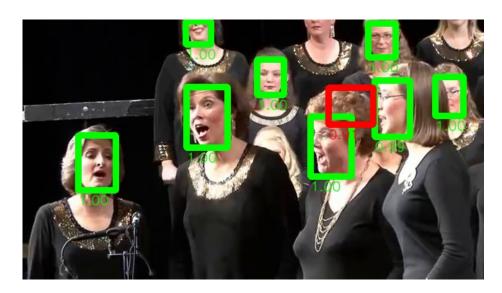


Fig. 7

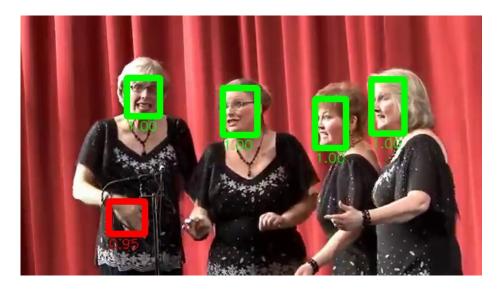


Fig. 8



Fig. 9



Fig. 10

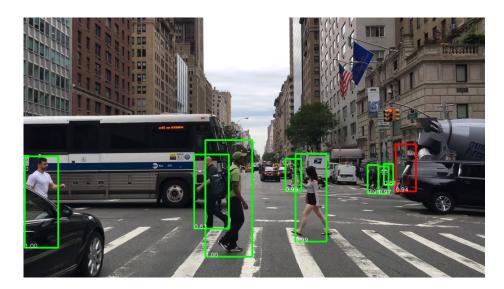


Fig. 11