

Two-Stage Seamless Text Erasing On Real-World Scene Images

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Task:
Text erasing is the task of removing all text found in an image and filling in the background pixels.

Challenges:

- Previous approaches perform poorly on real-world images:
 - Loss of fine detail
 - Inconsistent background colors
 - Failing to erase all text
- Fine detail inpainting requires computationally expensive models or complicated training procedures.

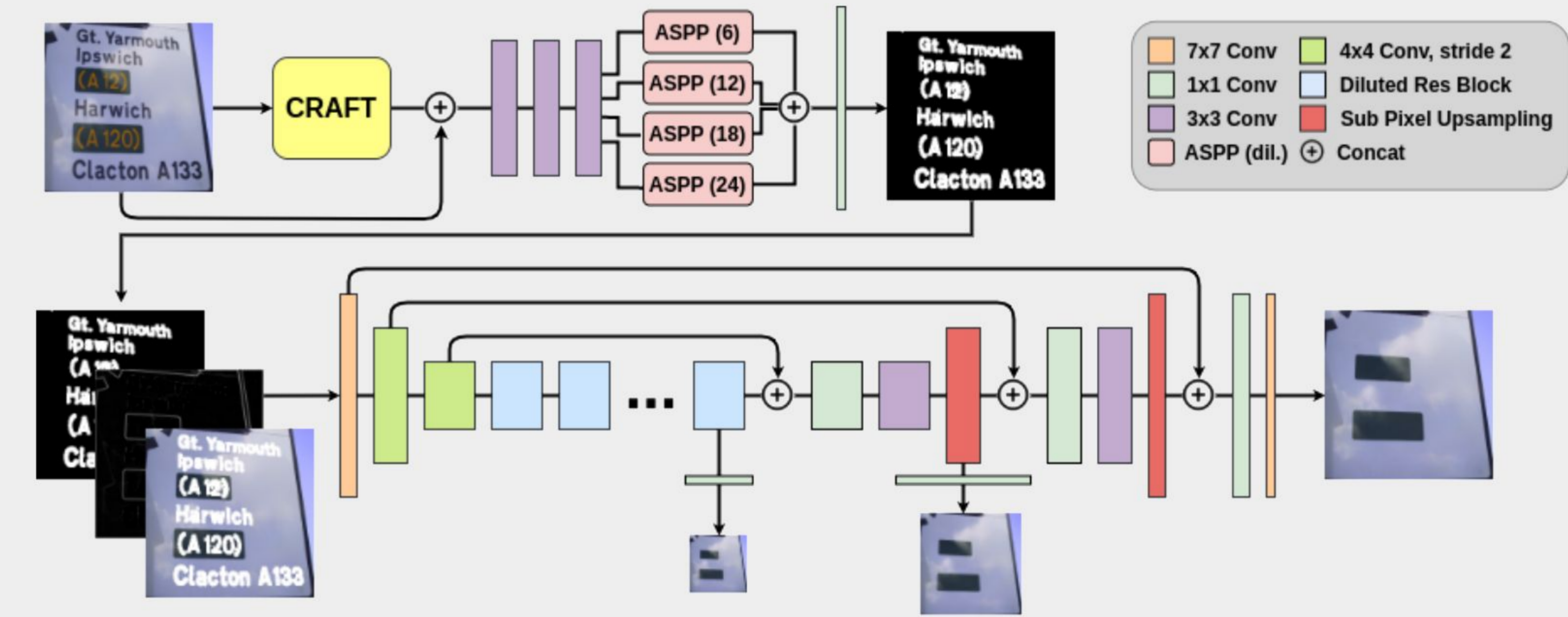
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Methodology

Stage 1: Text Mask Generator

- Generates a binary segmentation mask covering all pixels that contain a character.
- Network consists of a CRAFT text detector with a segmentation network head.
- Trained with Tversky loss to penalized false negatives more than false positives and ensure masks entirely cover each character.



Stage 2: Inpainting Model

- GAN model takes the masked image, image gradients and generated mask as input and produces a text-free version of the original image.
- Builds off the baseline encoder-decoder architecture by incorporating skip connections, sub-pixel upsampling and multiscale inpainting.
- Trained with novel multiscale gradient reconstruction loss to generate fine details and smooth surfaces without any significant computation cost.



$$L_{gr} = \frac{\sum_i \|\nabla I_{pred_i} - \nabla I_i\|_2^2}{S_i}$$

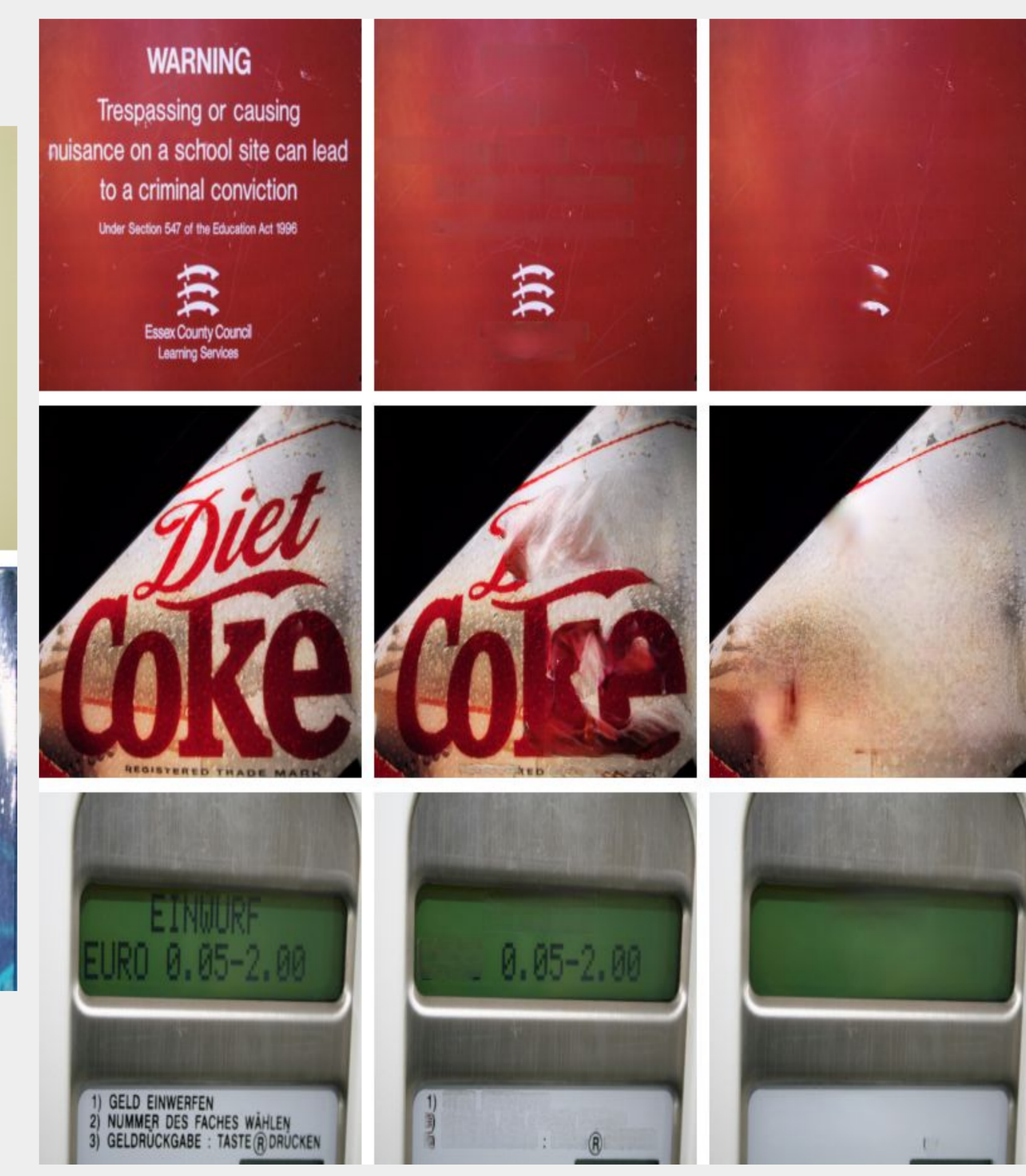
Results

Method				Reported	
	PSNR [†]	SSIM [†]	MAE*	PSNR [†]	SSIM [†]
EnsNet [2]*	31.18	91.12	0.018	37.36	96.44
MTRNet [3]	30.56	90.14	0.021	29.71	94.43
MTRNet++ [4]	33.43	93.10	0.015	34.55	98.45
WS-TE (ResNet-50) [5]*	30.73	93.43	0.016	37.44	93.69
WS-TE (ResNet-152) [5]	-	-	-	37.46	93.64
Ours	32.97	94.90	0.013	32.97	94.90

Results on SCUT synthetic text erasing dataset

Method	Recall
Nakamura <i>et al.</i> [1]	10.08
EnsNet [2]	5.66
MTRNet [3]	29.11
WS-TE (ResNet-50) [5]	2.47
WS-TE (ResNet-152) [5]	0.64
Ours	0.55

Results on ICDAR 2013 text detection benchmark



Method	# Images	% Votes
WS-TE (ResNet-50) [5]	12	18%
Ours	213	82%
Tie	8	-

Results of human perceptual study

→ **Matches SOTA on synthetic datasets.**
 → **Significantly preferred over previous SOTA on real-world images.**