

**NANYANG  
TECHNOLOGICAL  
UNIVERSITY**  
SINGAPORE



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**CVPR**



VANCOUVER, CANADA

# Learning Generative Structure Prior for Blind Text Image Super-resolution

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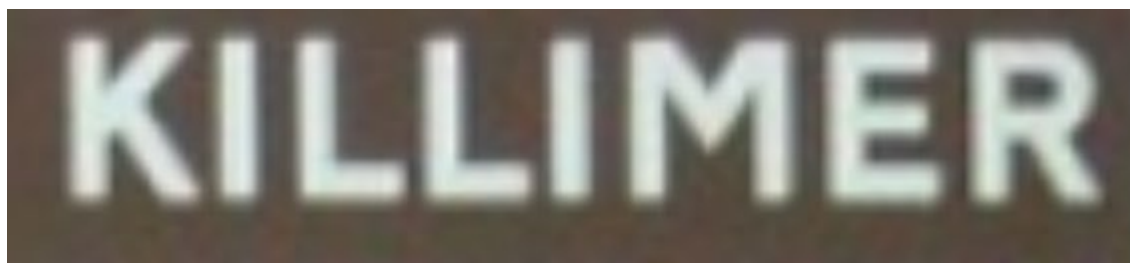
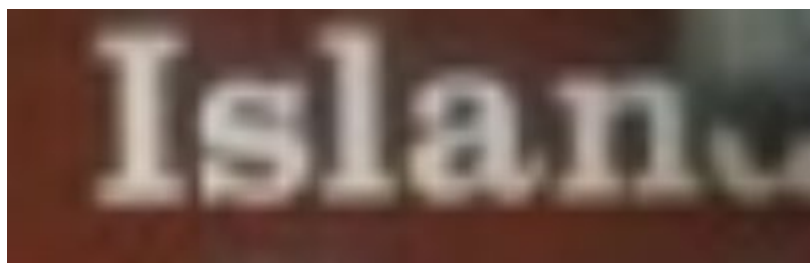
Project Page: <https://github.com/csxmli2016/MARCONet>



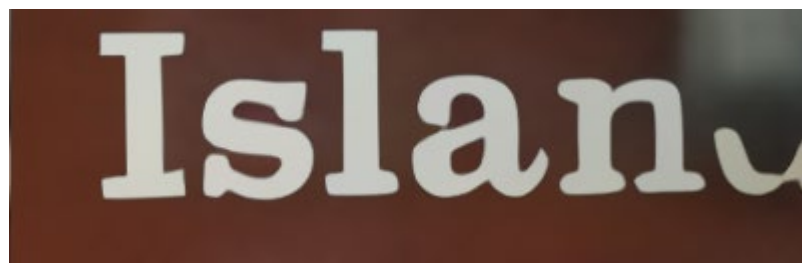
# Blind text image super-resolution

- If the structure of the character is simple:

Real-world LR Text Segment



BSRGAN Retrained on Text Image



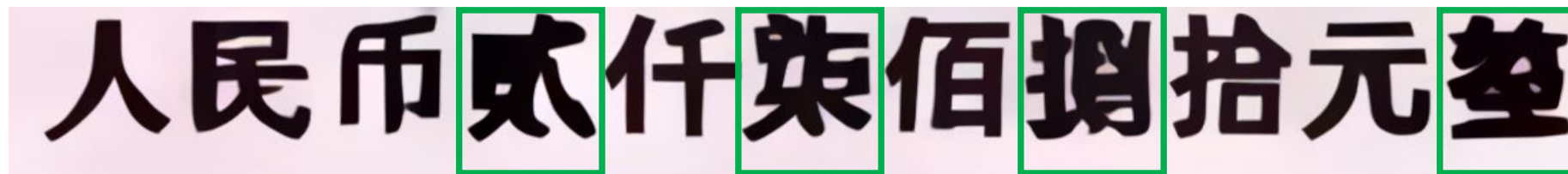


## Blind text image super-resolution

- If the structure of the character is complex (e.g., Chinese):



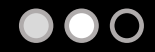
Real-world LR Text Segment



BSRGAN Retrained on Chinese Data

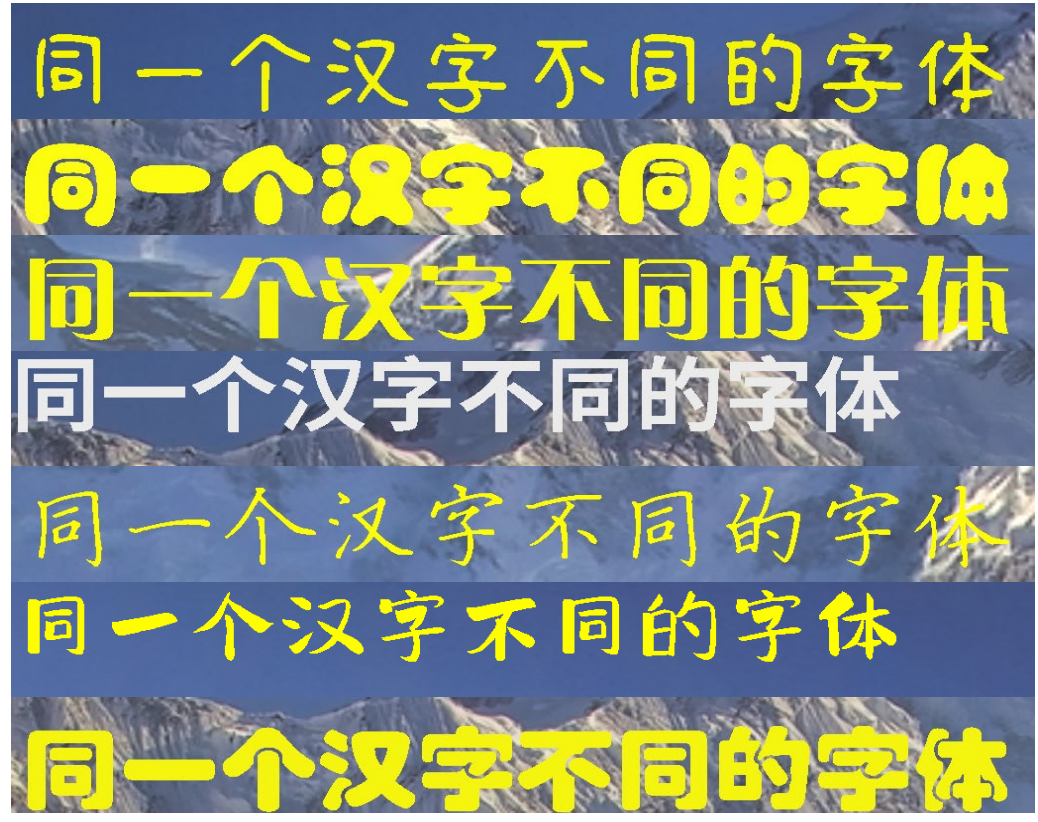
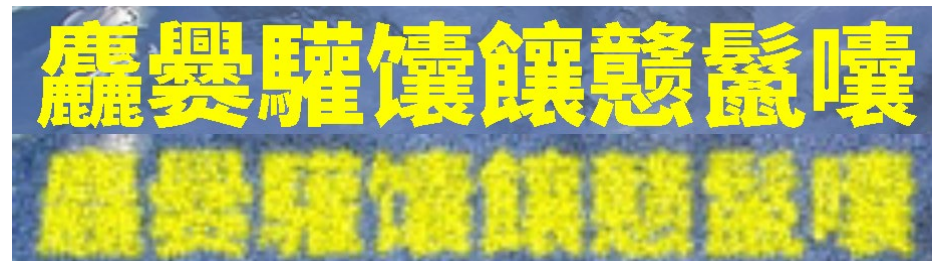


Structure Image from Human Perspective



# Challenge:

- Complex structure
- Diverse font styles
- Unknown degradation types on real-world scenarios





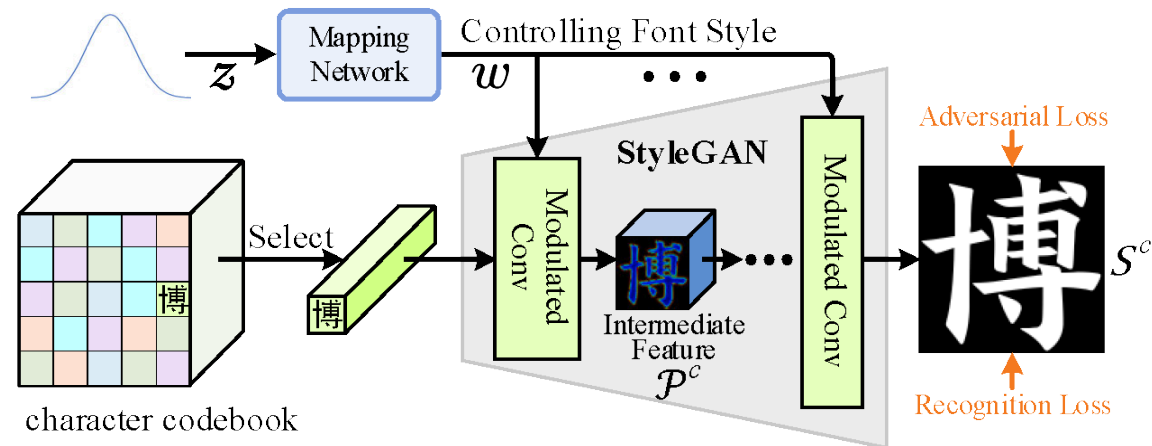
### Original StyleGAN:

- Powerful generation ability
- $\approx$  infinite representation

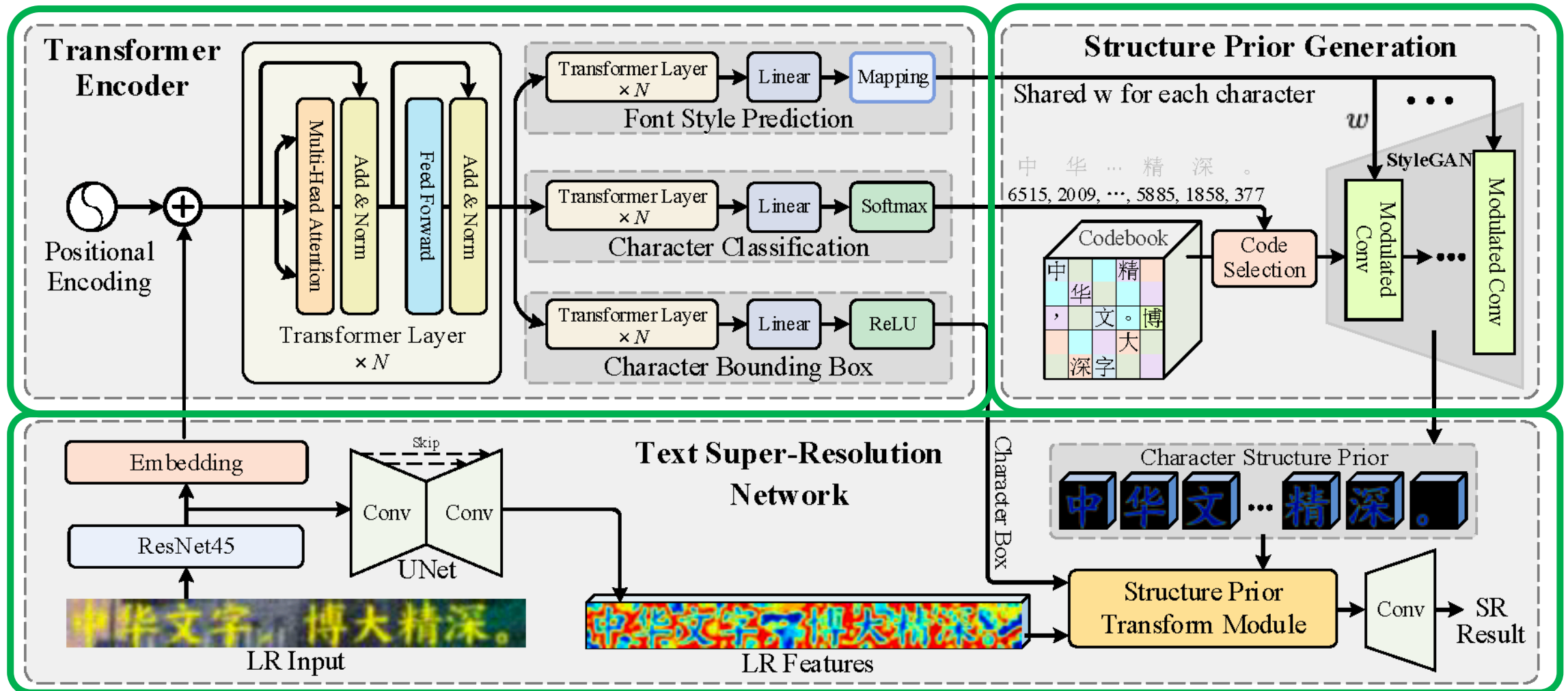


### Reformulated StyleGAN for Text:

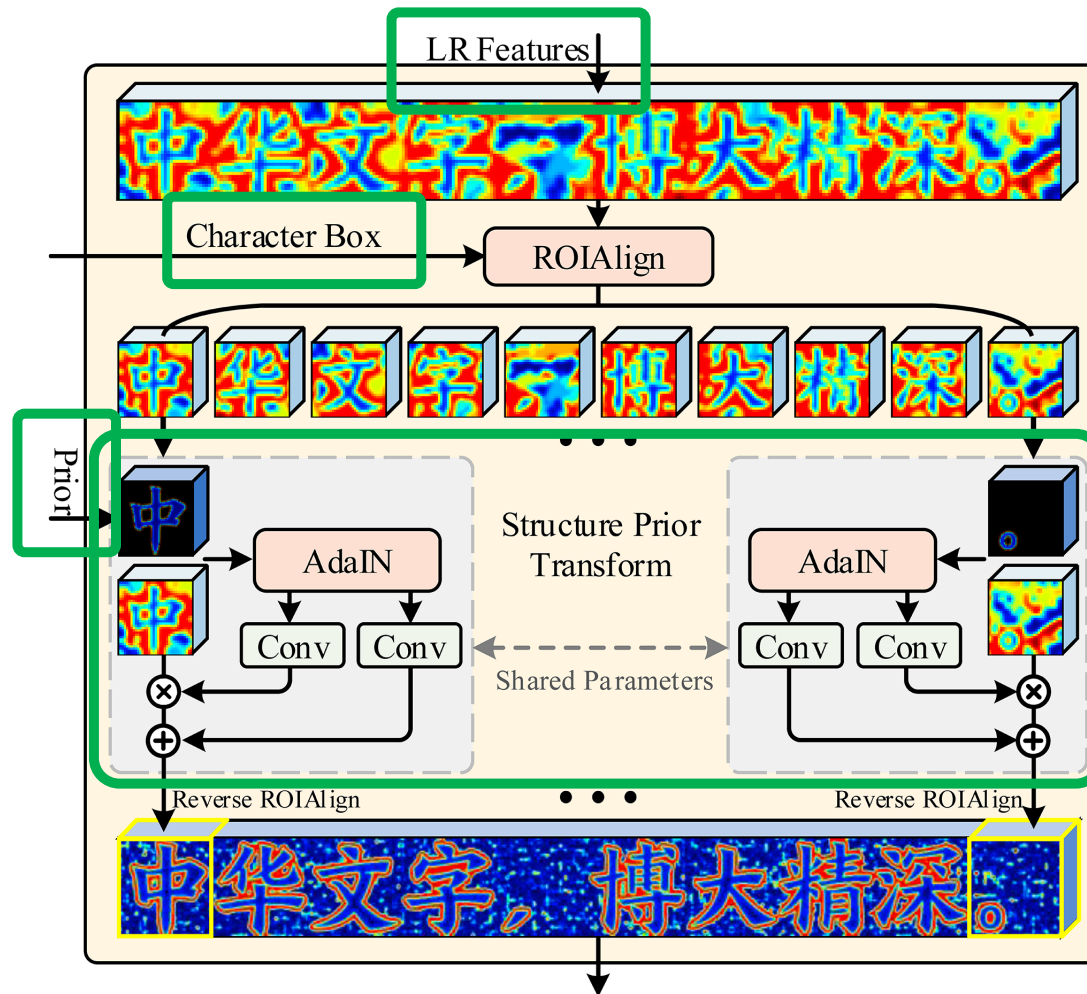
- Codebook for saving each character
- $W$  controls the diverse font style



Pre-training of generative structure prior for each character



The whole pipeline. It contains three parts, *i.e.*, (i) Transformer encoder for predicting the font style, classification and bounding boxes of each character from LR input, (ii) structure prior generation with pre-trained StyleGAN for generating reliable structure prior for each character, and (iii) the SR process for reconstructing the SR output with the incorporation of each characters' structure prior.



Structure prior transform module.



Pure Synthetic Text Images Using PIL package:

- More than 100 font styles;
- Background image is obtained from DF2K dataset

Ground-truth Image  
 $I_{HR}$



Structure Image  
of Each Character  
 $S_{HR}^c$



Index in Coodbook  
of Each Character

4868      6252      5692      6545      4318      4776      1035      1361

Bounding Box  
of Each Character

(6, 117)    (132, 252)    (259, 382)    (389, 506)    (515, 637)    (643, 763)    (771, 893)    (898, 1018)

Synthetic LR Input







Real LR		
Detected Bounding Box		
SR Result		
Structure Prior Image		
Real LR		
Detected Bounding Box		
SR Result		
Structure Prior Image		

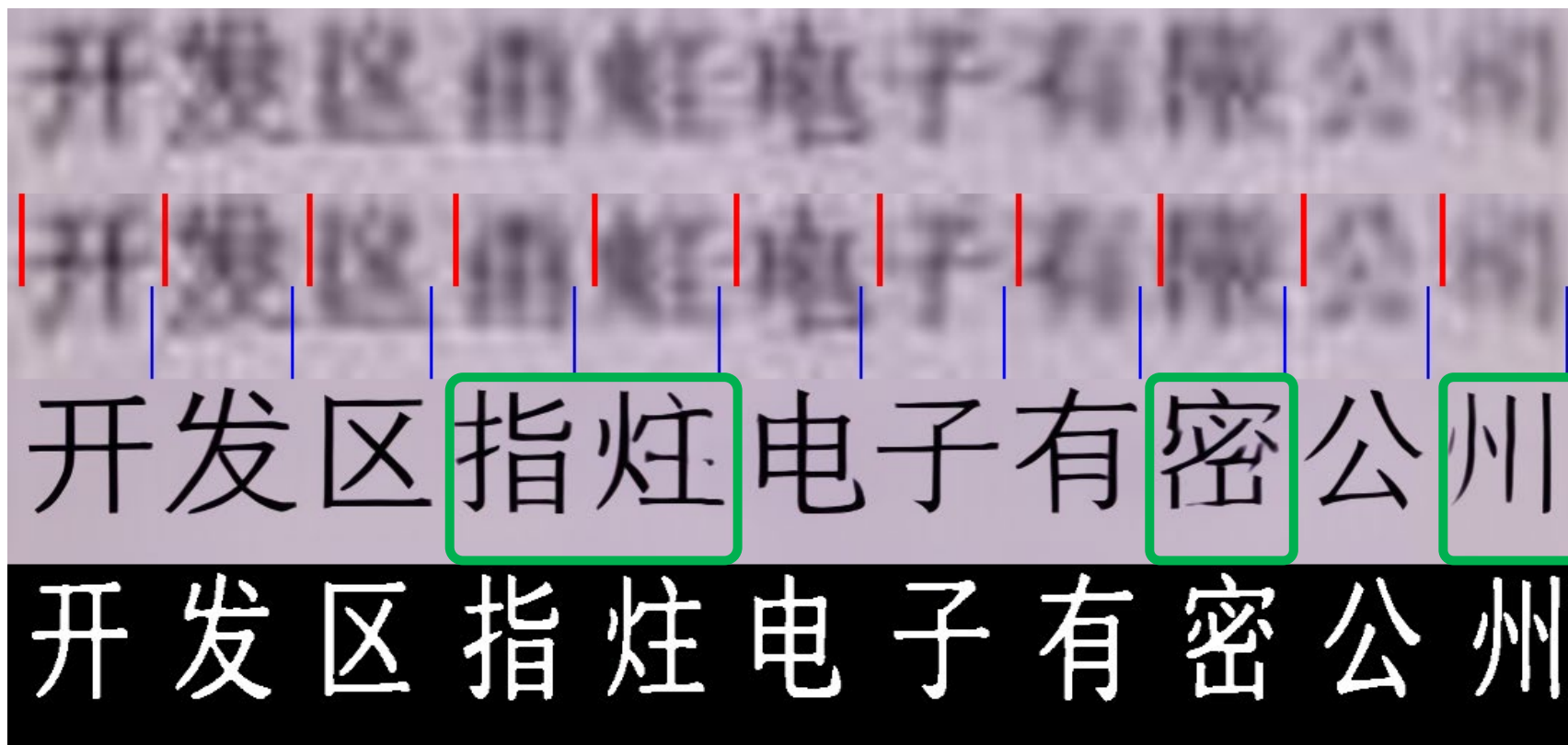


More SR results on real-world LR scenarios

发票号码:	兑奖联
发票号码:	兑奖联
	231000879251
	231000879251
付款单位(个人):	
付款单位(个人):	
经营项目:	21253632
收款单位(盖章有效)	
经营项目:	21253632
收款单位(盖章有效)	
刮开奖区覆盖层后显示	中奖后,在兑奖前不得
刮开奖区覆盖层后显示	中奖后,在兑奖前不得
学府路	学府路
江滨路	江滨路
宗泽路	宗泽路
象山路	象山路
谷阳路	谷阳路

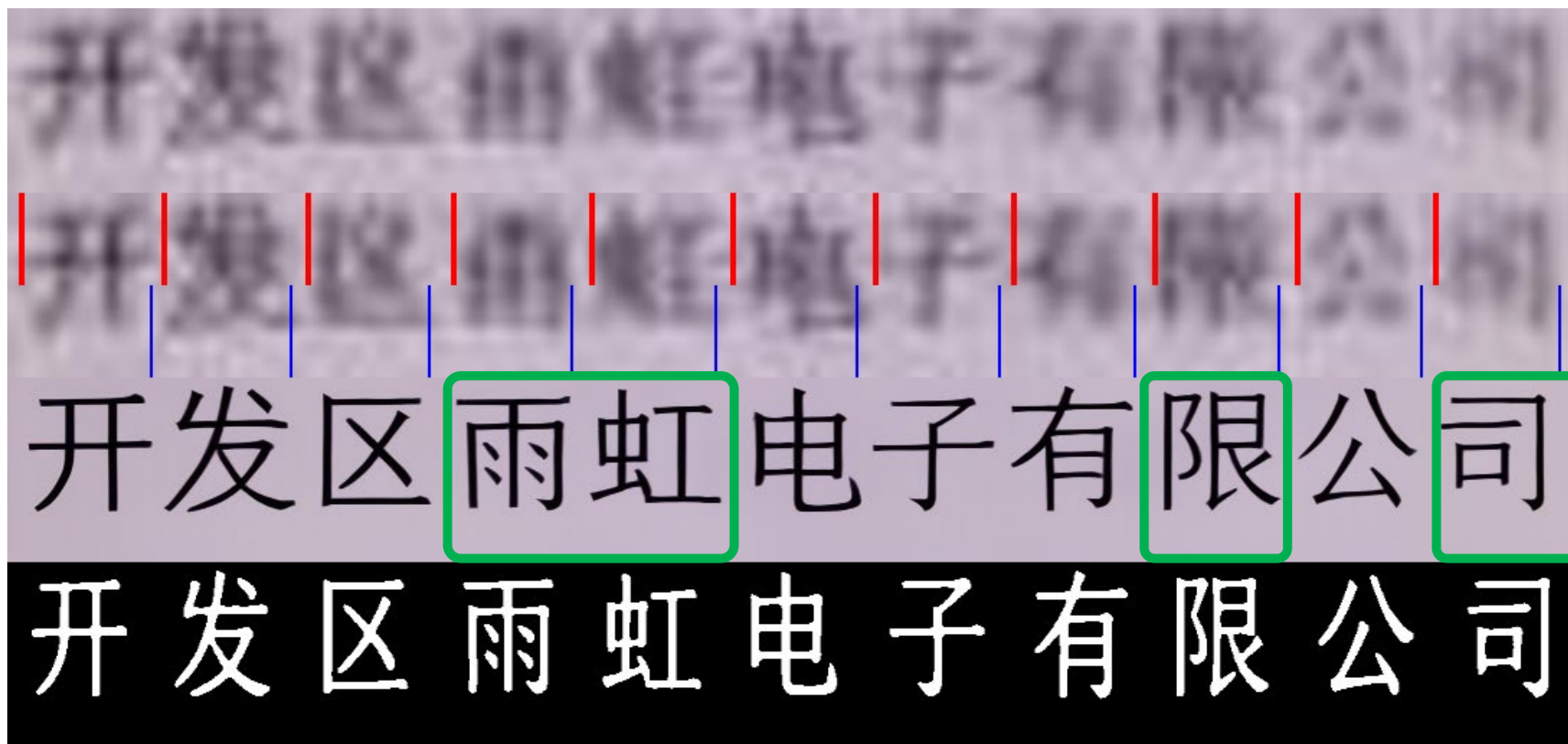


Wrong recognition when the degradation is severe.





Manually correct the character recognition result.





W interpolation for two text images with different font styles.

你的账号有一些不正确

你的账号有一些不正确

你的账号有一些不正确



W interpolation for two text images with different characters.

你的账号有一些不正确

人民币贰仟柒佰捌拾元整

人民币贰仟柒佰捌拾元整



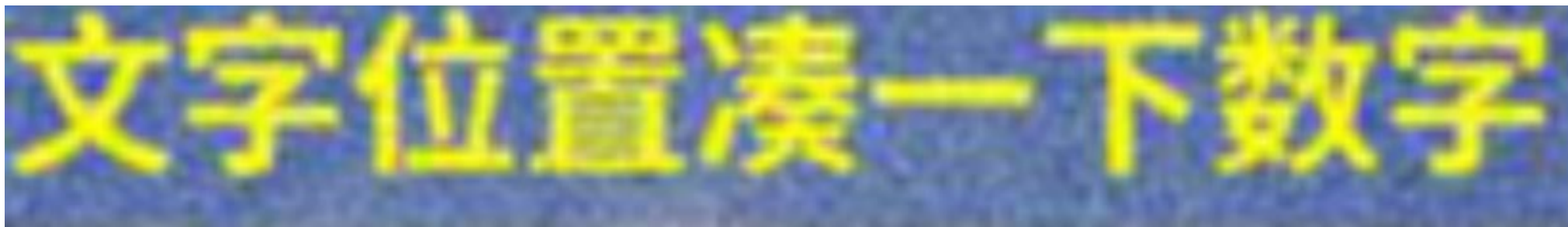
W interpolation for two text images with different locations:



你的账号有一些不正确



文字位置凑一下数字



文字位置凑一下数字

# Conclusion

- Embedding the generative structure prior for blind SR of text images
- The combination of a codebook for storing distinctive character specific codes and a retrofitted StyleGAN for controlling font style cope well with complicated structures
- Potentially extending to:
  - few-shot font generation
  - text image completion for ancient documents
  - font style transformation

A simple text image super-resolution package for post-processing text region:

```
pip install textbsr
```

Run on the terminal command

```
textbsr -i [LR_TEXT_PATH] -b [BACKGROUND_SR_PATH] -s
```

Run on the python environment

```
from textbsr import textbsr
textbsr.bsr(input_path='./LQs', bg_path='./RealESRGANResults', save_text=True)
```

Project Page





Whole LR Image



Any Blind Image SR Method



Post-process using our textbsr

