





























































Kaggle Kuzushiji
Recognition
Challenge

5th place solution



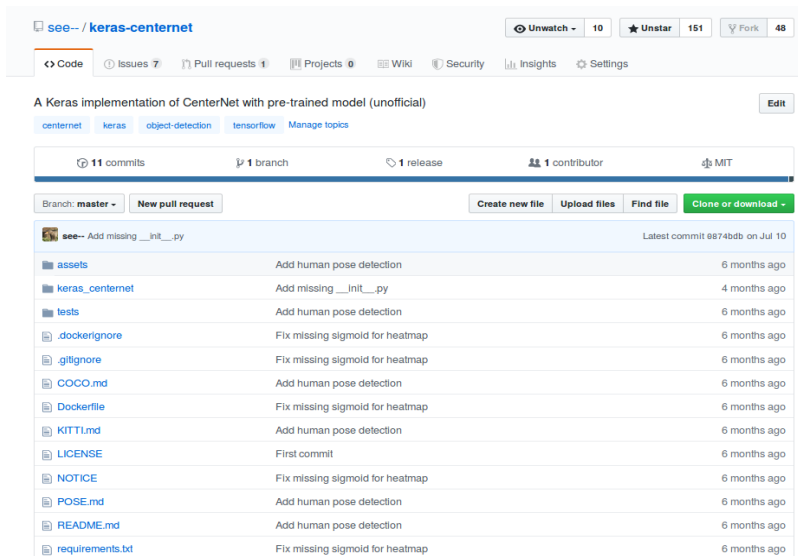
Background

- Kaggle Top 100
- Gold medals in computer vision and speech recognition competitions

95			JiLian	joined 8 months ago	 3	 2	 0	41,520
96			Shize Su	joined 6 years ago	 17	 20	 7	41,509
97			Sergey Bryansky	joined 4 years ago	 2	 6	 3	41,114
98			Nat Bel ML Fun	joined 3 years ago	 0	 9	 14	41,103
99			See--	joined 3 years ago	 2	 7	 2	40,879
100			Paulo Pinto	joined 4 years ago	 1	 12	 13	40,855
101			Igor Krashenyi	joined 5 years ago	 3	 10	 5	40,801
102			Jun Koda	joined 3 years ago	 2	 0	 0	40,638
103			Daniel FG	joined 5 years ago	 9	 11	 4	40,618
104			YouHan Lee	joined 2 years ago	 3	 6	 5	40,281
105			Konstantin Lopuhin	joined 8 years ago	 5	 2	 2	40,171
106			Nima Shahbazi	joined 5 years ago	 9	 8	 0	39,806

Motivation

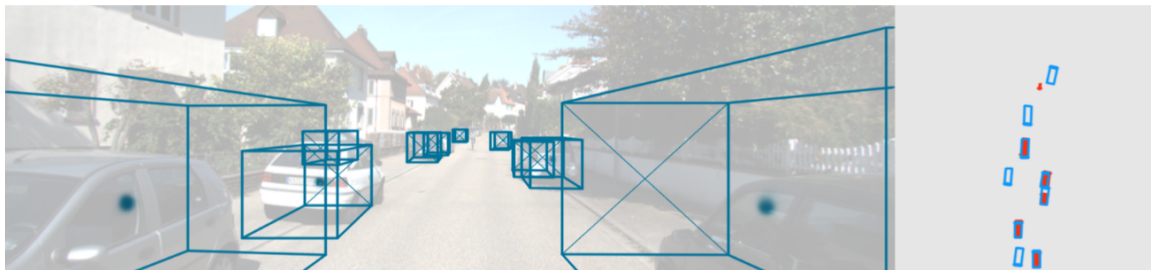
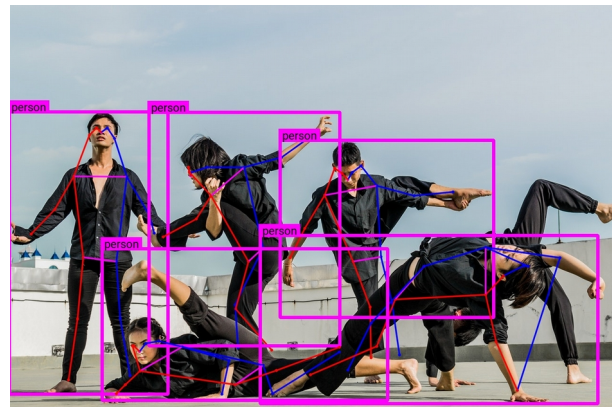
- Created an inference Keras port of CenterNet¹
- Implement the training part
- <https://github.com/see--/keras-centernet>



¹ <https://arxiv.org/abs/1904.07850>

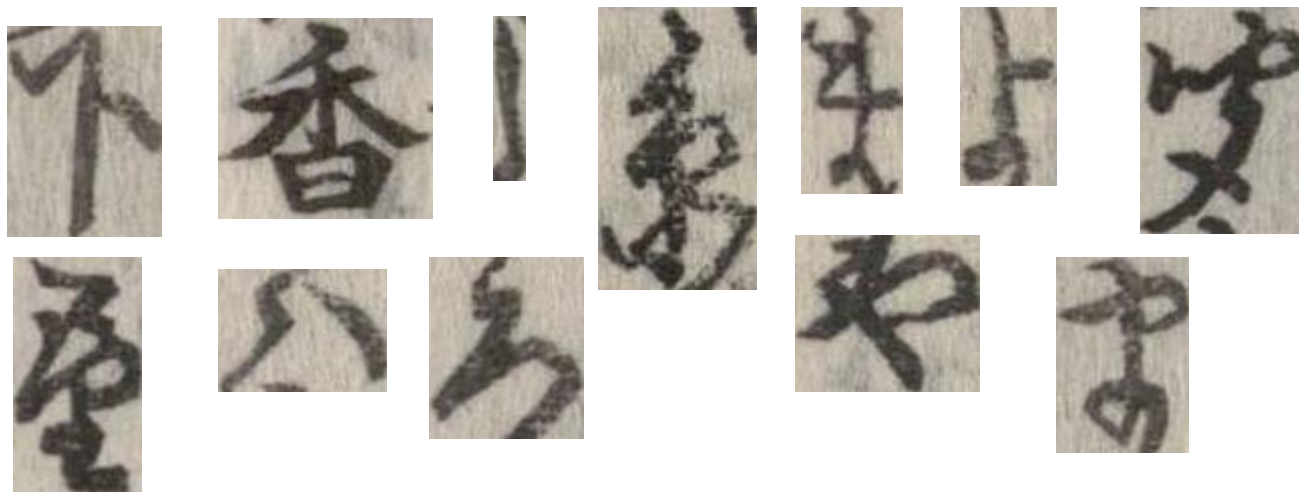
CenterNet

- Strong and fast one-stage detector: 45.1% AP on COCO
- Meta-algorithm for various object detection tasks



Summary

- Kuzushiji Recognition is 2d-detection with many classes: 4212
- 5th place with 0.94 F1-score
- 8 hours using one V100 GPU and mixed precision training¹



¹ <https://github.com/NVIDIA/apex>

Engineering














- No pre- or post-processing
- Train on smaller crops and inference on full images
- Lots of augmentations



- Many classes are no problem (4212 vs 80 on COCO)
- Context is very important for Kuzushiji Recognition
- Crop based classifier only reached 0.85 F1-score
- CNNs work well with very imbalanced datasets

Shakeup

- Little shakeup
- Public and private scores are close
→ Great dataset!

#	Δ_{pub}	Team Name	Notebook	Team Members	Score ?	Entries	Last
1	—	tascj			0.950	13	24d
2	—	Konstantin Lopuhin			0.950	60	23d
3	—	Kenji			0.944	161	23d
4	▲1	YoudaoOCR			0.942	49	23d
5	▼1	See--			0.940	42	25d
6	—	abc			0.939	15	23d
7	—	K_mat			0.934	20	23d
8	—	t-hanya			0.920	21	23d
9	—	Ollie, Nanashi, and Tom			0.910	35	23d
10	—	Zenkei_R&D			0.903	144	23d
11	—	masayai			0.903	12	23d
12	▲5	Kirill Brodt (shad nsk)			0.901	4	1mo
13	▲1	James Day			0.901	33	23d

Solution sharing

- Code and trained models are available
- <https://github.com/see--/kuzushiji-recognition>



Thanks