

Table 1: **Additional ablation studies.** "Med." is short for "Medium".

Metrics	MSE ↓				MAE ↓				NLL ↓				AUSE ↓			
	All	Many	Med.	Few	All	Many	Med.	Few	All	Many	Med.	Few	All	Many	Med.	Few
VIR w/o VAE & NIG	112.62	94.21	140.03	210.72	8.18	7.44	9.52	11.45	3.787	3.689	3.912	4.234	0.451	0.460	0.399	0.565
VIR w/o NIG	87.48	73.72	107.64	161.69	7.17	6.63	8.06	9.80	3.722	3.604	3.821	4.209	0.441	0.457	0.334	0.426
VIR w/o VAE	96.46	86.72	102.56	171.52	7.51	7.08	7.93	10.45	3.784	3.685	3.866	4.218	0.439	0.459	0.385	0.423
VIR (OURS)	81.76	70.61	91.47	142.36	6.99	6.39	7.47	9.51	3.703	3.598	3.805	4.196	0.434	0.456	0.324	0.414

Table 2: **Comparison for different numbers of bins.** "Med." is short for "Medium".

Metrics	Bins	MSE ↓				MAE ↓				GM ↓			
		All	Many	Med.	Few	All	Many	Med.	Few	All	Many	Med.	Few
RANKSIM	100	83.51	71.99	99.14	149.05	7.02	6.49	7.84	9.68	4.53	4.13	5.37	6.89
VIR (OURS)	100	81.76	70.61	91.47	142.36	6.99	6.39	7.47	9.51	4.41	4.07	5.05	6.23
RANKSIM	33	109.45	91.78	128.10	187.13	7.46	6.94	8.42	10.66	5.13	4.70	5.23	8.21
VIR (OURS)	33	84.77	77.29	95.66	125.33	7.01	6.70	7.45	8.74	4.36	4.20	4.73	4.94
RANKSIM	20	98.71	84.38	107.89	171.04	7.32	6.78	8.35	10.57	5.33	4.51	5.69	7.92
VIR (OURS)	20	84.05	72.12	100.49	151.25	7.06	6.50	7.90	10.06	4.49	4.05	5.34	7.28

Table 3: **Comparison with DIR + Deep Ensemble.** "Med." is short for "Medium".

Metrics	MSE ↓				MAE ↓				NLL ↓				AUSE ↓			
	All	Many	Med.	Few	All	Many	Med.	Few	All	Many	Med.	Few	All	Many	Med.	Few
DIR + DEEP ENS.	94.10	80.24	109.45	182.52	7.51	6.94	8.25	10.83	5.069	4.772	4.574	5.236	0.463	0.471	0.424	0.438
VIR (OURS)	81.76	70.61	91.47	142.36	6.99	6.39	7.47	9.51	3.703	3.598	3.805	4.196	0.434	0.456	0.324	0.414

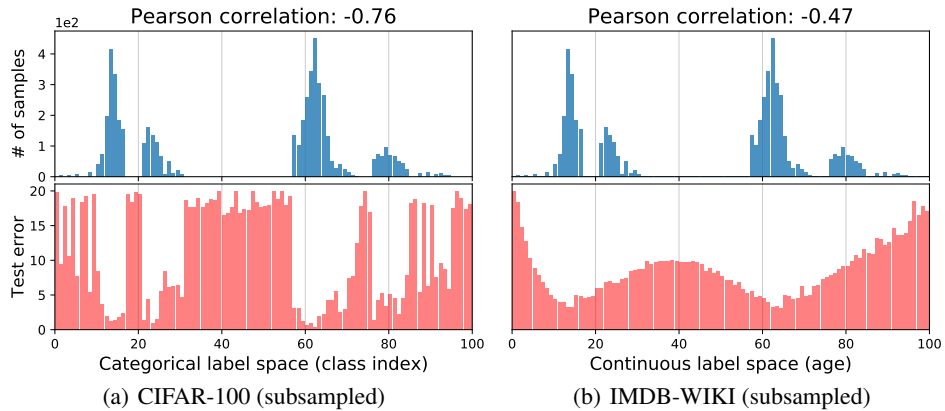


Figure 1: Comparison on the test error distribution (bottom) using same training label distribution (top) on two different datasets [1]: (a) CIFAR-100, a classification task with categorical label space. (b) IMDB-WIKI, a regression task with continuous label space.

1 References

- 2 [1] Y. Yang, K. Zha, Y. Chen, H. Wang, and D. Katabi. Delving into deep imbalanced regression.
- 3 PMLR, 2021.