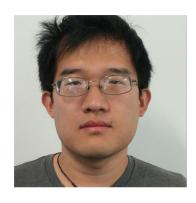
Improving Generalization Capability of Pre-trained Model



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Generalization Capability of Pre-trained Model

Pre-trained Model

HuBERT

E.g., clean

Domain mistatch

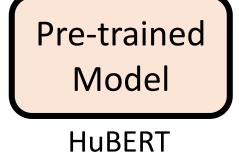
Testing
Data

Data

Domain mistatch

Different domains: speech distortions, speaking styles (read vs. spontaneous), accents/dialects, languages

Focus on speech distortion at the preliminary stage



Labeled Data clean Testing
Data

different distortions

	Intent Classification ↑			Emoti	on Recogn	ition ↑	Keyword Spotting ↑		
Testing Data	clean	m+g+r	fsd50k	clean	m+g+r	fsd50k	clean	m+g+r	Fsd50k
HuBERT	99.47	96.94	97.47	63.96	57.33	60.55	97.14	93.87	93.80

	Speak	er Identifica	ation ↑	ASR (WER) ↓					
Testing Data	clean	m+g+r	fsd50k	clean	m+g+r	fsd50k	CHiME3		
HuBERT	84.97	65.51	77.61	4.88	7.94	7.57	29.26		

Continuously train with noisy data (m+g+r)

Pre-trained Model

Labeled Data

clean

Testing Data

different distortions

	Intent Classification ↑			Emotion Recognition ↑			Keyword Spotting ↑		
Testing Data	clean	m+g+r	fsd50k	clean	m+g+r	fsd50k	clean	m+g+r	Fsd50k
HuBERT	99.47	96.94	97.47	63.96	57.33	60.55	97.14	93.87	93.80
HuBERT + m+g+r (100hr)	99.45	98.63	97.94	64.42	62.30	60.65	96.92	94.87	93.90
HuBERT + m+g+r (960hr)	99.39	98.84	97.89	67.28	67.47	65.62	97.12	96.11	94.77
	Speaker Identification ↑				ASR (
Testing Data	clean	m+g+r	fsd50k	clean	m+g+r	fsd50k	CHIME3		
HuBERT	84.97	65.51	77.61	4.88	7.94	7.57	29.26		
HuBERT + m+g+r (100hr)	87.02	70.91	80.96	4.87	6.47	6.38	24.27		
11452111 1111811 (100111)	07.02	70.51	00.50	1107	V	0.00			

m+g+r = Musan + Gaussian + reverberation

Continuously train with noisy data (m+g+r)

Pre-trained Model

Labeled Data

clean

Testing Data

different distortions

	Intent Classification ↑			Emotion Recognition ↑			Keyword Spotting ↑		
Testing Data	clean	m+g+r	fsd50k	clean	m+g+r	fsd50k	clean	m+g+r	Fsd50k
HuBERT	99.47	96.94	97.47	63.96	57.33	60.55	97.14	93.87	93.80
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	Speaker Identification 1				ASR (V				
Testing Data	clean	m+g+r	fsd50k	clean	m+g+r	fsd50k	CHIME3		
HuBERT	84.97	65.51	77.61	4.88	7.94	7.57	29.26		
HuBERT + m+g+r (100hr)	87.02	70.91	80.96	4.87	6.47	6.38	24.27		
HuBERT + m+g+r (960hr)	86.04	74.46	81.47	4.84	6.00	5.87	20.81		

m+g+r = Musan + Gaussian + reverberation

Continuously train with noisy data (m+g+r)

Pre-trained Model Labeled Data clean

Testing
Data

different distortions

Now you can use the model via S3PRL

model = torch.hub.load("s3prl/s3prl", "hubert base robust mgr")

Goal: Give us a pre-trained model (compressed, visual enhanced, etc.), we make it more robust.