

The Kaldi Speech Recognition Toolkit

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<http://kaldi.sf.net>

Features of Kaldi

- Integration with Finite State Transducers
- Extensive linear algebra support
- Extensible design
- Open license
- Complete recipes
- Thorough testing

External Libraries

BLAS/LAPACK

OpenFST

Kaldi C++ Library

Matrix

Utils

LM

Tree

FST ext

Feat

GMM

SGMM

HMM

Transforms

Decodable

Decoder

Kaldi C++ Executables

(Shell) Scripts

The Kaldi Decoder

Databases

- Resource Management (RM)
 - ▷
 - ▷
- Wall Street Journal (WSJ)
 - ▷

Comparison with previously published results									
	Test set						Test set		
							Nov'92	Nov'93	
	Feb'89	Oct'89	Feb'91	Sep'92	Avg				
HTK	2.77	4.02	3.30	6.29	4.10	Bell	11.9	15.4	
Kaldi	3.20	4.21	3.50	5.86	4.06	HTK (+GD)	11.1	14.5	
						KALDI	11.8	15.0	

Standard ASR techniques supported in Kaldi

- Acoustic front-end supports MFCC and PLP features, with cepstral mean and variance normalization, LDA, STC/MLLT, HLDA, VTLN, etc.
- HMM/GMM acoustic models
- No language modeling code, but support converting ARPA format LMs to FSTs.

Other Results			
► AR-Face: 110 classes, 110 train (“one-shot” training), 550 test			
	RM (Avg)	WSJ Nov'92	WSJ Nov'93
Triphone	3.97	12.5	18.3
+ fMLLR	3.59	11.4	15.5
+ LVTLN	3.30	11.1	16.4
Splice-9 + LDA + MLLT	3.88	12.2	17.7
+ SAT (fMLLR)	2.70	9.6	13.7
+ SGMM + spk-vecs	2.45	10.0	13.4
+ fMLLR	2.31	9.8	12.9
+ ET	2.15	9.0	12.3

Features unique to Kaldi

- SGMM acoustic models
- Exponential transform

Conclusions

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