Team DISTIL

(Dlalectal Speech Transcription in Indian Languages) SLT 2022

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TECHNOLOGY FOR THE NEXT BILLION USERS

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LANGUAGES OF THE WORLD

Motivation

In countries, like India, with low literacy and high rates of digital adoption, digital interfaces will need to be **voice driven & conversational in local languages**

India has **337 million**^{1,2} **low literate, vernacular speaking internet users**, the largest population globally.

Non-English users are on the rise with **9 out of 10³ new internet users** likely to be **Indian language users**.

Voice-search is a need, not a convenience with Google recording a **270%**⁴ **y-o-y growth in voice search** in India, with **Hindi voice search alone growing by 400%**⁵ over the same period.



Indic languages: Dialectal diversity is very high



* These languages are part of the ongoing voice collection efforts as the part of RESPIN Project



Disparity in availability of data for **English** vs some **low-resource Indian languages**

* well known labeled corpora like Librispeech, Fisher English, Switchboard, TEDLIUM etc

^Maithili: TDIL, ULCA, Magahi: Low-resource corpus , Bhojpuri:ULCA, Low-resource corpus

Dataset - <u>RESPIN</u>*

Language	Dialect	#speakers	#sentences	#utterances	Duration (hours)
Bengali	D1	405	4313	164254	206.40
Bengali	D2	407	4106	197659	271.45
Bengali	D3	419	4300	192024	283.17
Bengali	D4	425	4089	159803	216.14
Bengali	D5	437	5151	157053	236.08
Total		2093	21959	870793	1213.23
Bhojpuri	D1	601	8285	261768	351.25
Bhojpuri	D2	725	7849	325605	417.74
Bhojpuri	D3	705	7782	279246	347.97
Total		2031	23916	866619	1116.95



* RESPIN

Speech Recognition in Agriculture and Finance for the Poor in India

IISc Bangalore (SPIRE Lab)





Navana Tech

Funding: Bill & Melinda Gates Foundation

Dataset - <u>RESPIN</u>

Bengali Dialects



Bhojpuri Dialects







Dataset - <u>RESPIN</u>

Bengali Dialects





Duration in hours



Existing model performance

Bhojpuri (With Hindi Models)	WER (%)	CER (%)
Google Cloud ASR API ¹	61.42	37.54
Whisper - large (v1) ²	66.54	36.15
Vakyansh ³	49.6	37.54

Bengali	WER (%)	CER (%)	
Google Cloud ASR API ¹	41.67	16.37	
Whisper - large (v1) ²	135.25	130.06	
Vakyansh ³	65.93	23.72	



Existing Speech Recognition APIs

1 https://cloud.google.com/speech-to-text

- 2 https://github.com/openai/whisper
- 3 https://github.com/Open-Speech-EkStep/vakvansh-models

Results on test set



Framework / Architecture	%WER Bengali	%WER Bhojpuri	
Kaldi TDNN	19.27	19.00	
ESPnet multi-gated encoder	18.60	18.20	
Huggingface XLSR fine tuned	21.63	20.06	
Nemo conformer RNN-T	19.21	17.65	

Dialect specific models - Bengali

Kaldi: Dialect-specific AMs with common LM

	% W	% C	Dialect level CER				
	E R	E R	D1	D2	D3	D4	D5
D1	21.83	7.61	7.0	4.7	7.8	9.9	8.8
D2	22.74	8.19	8.7	4.0	7.8	11.7	8.7
D3	22.47	8.11	8.6	3.8	6.8	12.0	9.3
D4	23.49	8.64	9.2	6.4	9.4	8.1	10.4
D5	21.96	7.9	8.8	4.2	8.0	11.1	7.3

Kaldi: Dialect-specific both AMs and LMs

	% W	% C		Diale	ect level	CER	
	E R	E R	D1	D2	D3	D4	D5
D1	28.18	9.91	7.9	6.2	10.5	13.2	12.2
D2	28.72	10.32	11.4	4.3	9.5	14.3	12.2
D3	28.2	10.33	11.7	4.8	7.6	14.7	12.8
D4	37.41	14.38	16.4	12.8	17.6	8.6	17.1
D5	30.32	11.01	12.7	6.5	12.0	15.4	8.2

ESPnet: Dialect-specific AMs without LM

	% W	% C		Diale	ect level	CER	
	E R	E R	D1	D2	D3	D4	D5
D1	38.33	14.40	12.3	9.4	15.2	17.6	18.7
D2	40.11	15.54	17.9	8.4	13.9	18.8	19.5
D3	44.30	18.90	22.8	10.7	14.6	23.8	23.0
D4	50.37	20.35	23.3	18.4	22.5	13.4	25.5
D5	40.81	15.21	17.2	10.8	15.9	19.7	12.1

Dialect specific models - Bhojpuri

Dial	W C		Dialect level CER		
	R	R	D1	D2	D3
D1	20.28	8.01	7.39	8.28	8.32
D2	19.28	7.33	7.94	6.68	7.33
D3	20.14	7.73	8.39	8.43	6.58

Kaldi: Dialect-specific AMs with common LM

Kaldi: Dialect-specific both AMs and LMs

Dial	W	C	Diale	ct level	CER
	R	R	D1	D2	D3
D1	24.9	9.7	7.8	10.9	10.6
D2	24.7	9.5	10.8	6.9	10.5
D3	24.3	9.3	10.2	11.2	7.0

ESPnet: Dialect-specific AMs without LM

Dial	Dial W E		Dialect level CER			
	R	R	D1	D2	D3	
D1	31.22	11.95	9.5	12.6	13.6	
D2	30.89	11.78	12.8	8.0	13.9	
D3	30.02	11.27	12.4	12.8	9.1	



Kharagpur Lakshmi, 36

Meet Lakshmi. She runs a street food stall and has studied till grade 10. She speaks Bengali fluently. She has her own bank account which her husband or daughter help to manage. She uses her smartphone for simple tasks and prefers WhatsApp to chat with her family and friends.

She has to travel around 45 mins to reach the bank for any service/query. She wishes to be able to clarify concerns and fetch details in her fingertips.



Low to Intermediate level of digital confidence

Uses smartphone in a limited capacity for low risk tasks such as messaging, watching videos and making calls.



Early stages of financial literacy

Is part of the banking ecosystem but not actively managing it. Knows basic concepts of banking and would like to have the independence to manage finances oh their own.

90% Indians

10% users speak English¹ and the rest are distributed across 22 languages with 100+ dialects. **300+** Million

Emergent users like Lakshmi have access to smartphone.



Lakshmi (Text): Hi

Bot (Image): Namaste, I am bankdidi! I can help you with questions regarding Funds transfer, Ioan application, Ioan payments.

Bot (Voicenote): Namaste, I am bankdidi! I can help you with questions regarding Funds transfer, Ioan application, Ioan payments. Tap on the mic button and send me a audio message with your questions.

Lakshmi (Voicenote): When do I need to pay my loan EMI for this month?

Bot (Voicenote): I've shown below the details of your loan EMI including EMI Amount and due date for payment. If you have any more doubts, send me a voice note and I'll help you out!

Bot (Text): Payment due in 7 days!

Loan name: Education Ioan Loan number: EL-14530295

💰 EMI Amount: ₹2890

📅 Due date: 18th January

Lakshmi (Voicenote): How many more EMI payments are left to finish my loan?

Bot (Voicenote): You're paying off your loan on time! I've shown below the details of how many payments are pending for you to finish off your loan.

Bot (Text): You have 5 more EMI Payments to complete your loan.



In this demo, Lakshmi enquires about her upcoming EMI and the status of her loan by sending voice messages to the bot.

Try out the bot by sending voice notes For **()** Agriculture and **(s)** Banking use cases in 2 languages



Scan for Bhojpuri



Scan for Bengali

Try out Streaming ASR in Bengali and Bhojpuri



Visit our Website https://sites.google.com/view/slt-team

- To know more about our experiments, more demo videos, resources for custom implementations of models and demos

