

Barcelona Supercomputing Center Centro Nacional de Supercomputación

## Automatic Validation of the Non-Validated Spanish Speech Data of Common Voice 17.0

Carlos Daniel Hernández Mena



- Mozilla Common Voice
- Validation Methodology
- Results
- Deliverables
- Discussion
- Conclusions and Further Work

# Mozilla Common Voice



## Validated Data in Different Languages

	Español		Inglés		Catalán		
	© <sub>Hours</sub> 2274	⅔ Hablantes 26437	© Hours 3680	≫ Hablantes 95965	© <sub>Hours</sub> 3373	≫ Hablantes 36638	
$\left( \right)$	Validation Progress	≝, Frases 1077425	<ul><li>𝔅 Validation Progress</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘</li><li>𝑘<!--</th--><th>≌ Frases 1601650</th><th><ul><li>𝔅 Validation Progress</li><li>𝔅 85%</li></ul></th><th>≒ Frases 1289896</th></li></ul>	≌ Frases 1601650	<ul><li>𝔅 Validation Progress</li><li>𝔅 85%</li></ul>	≒ Frases 1289896	
	CONTRIBUTE		CONTR	RIBUTE	CONTRIBUTE		

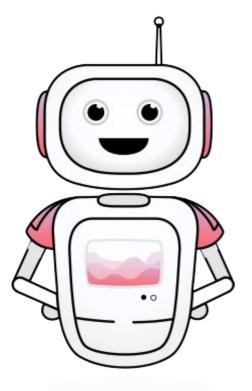
Italiano		Portugués		Francés		
⊕ <sub>Hours</sub> 443	े Hablantes 7272	© Hours 222	<sup>3</sup> Hablantes 3657	© Hours 1173	⅔ Hablantes 20053	
$\bigotimes$ Validation Progress $82\%$	≝, Frases 919722	$\bigotimes$ Validation Progress $80\%$	≝, Frases 43394	<sup>€</sup> Validation Progress 90%	≌ Frases 1604032	
CONTRIBUTE		CONT	TRIBUTE	CONTRIBUTE		



## **Common Voice 17.0 (Spanish)**

Versión	Fecha	Tamaño	Horas grabadas	Horas valida	das Licencia	Número de voces	Formato de audio		
<ul> <li>Common Voice Delta Segment 20.0</li> </ul>	11/12/2024	142,46 MB	8	4	CC-0	140	MP3		
Common Voice Corpus 20.0	11/12/2024	47,45 GB	2244	579	CC-0	26.290	MP3		
Common Voice Delta Segment 19.0	18/9/2024	152,66 MB	8	4	CC-0	43	MP3		
Common Voice Corpus 19.0	18/9/2024	47,31 GB	2237	576	CC-0	26.150	MP3		
Common Voice Delta Segment 18.0	19/6/2024	195,72 MB	10	10	CC-0	65	MP3		
Common Voice Corpus 18.0	19/6/2024	47,17 GB	2230	572	CC-0	26.107	MP3		
Common Voice Delta Segment 17.0	20/3/2024	445,95 MB	16	13	CC-0	347	MP3		
Common Voice Corpus 17.0	20/3/2024	46,97 GB	2220	562	CC-0	26.042	MP3		
				وع	ြီး main ~ common_voice_17_0 / audio / es ြ				
					<pre>   reach-vb HFSTAFF Upload es_other_9.tar 7503bd6 VERIFIED </pre>				
					<ul> <li>dev</li> <li>invalidated</li> <li>other</li> </ul>				
	$\mathcal{X}(\mathbb{Z})$								
					<ul> <li>test</li> <li>train</li> </ul>				
Barcelona Supercomputing									
Center Centro Nacional de Supercomputación	We worked	with the	version in HF	-!	validated				

## **Mozilla Common Voice**



### Categories

Validated (Train, Test and Validation are here): At least two more positive votes than negative ones.

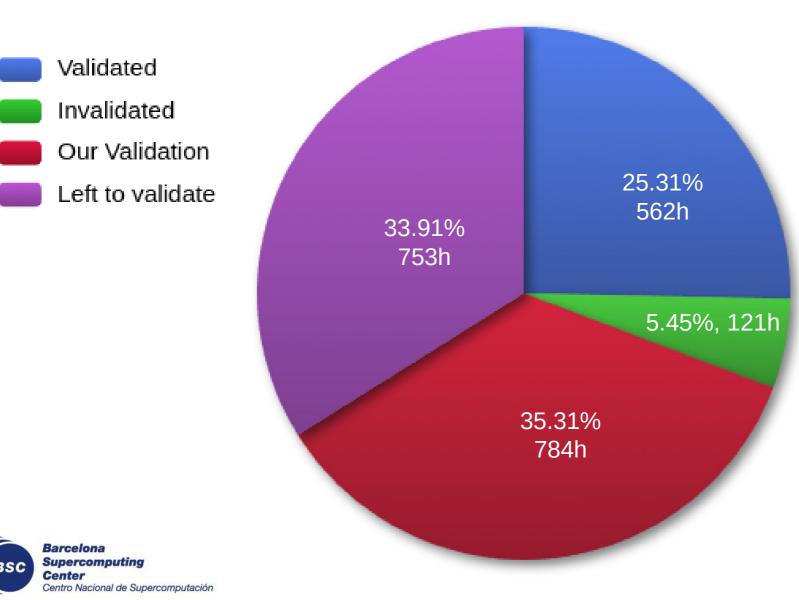
**Invalidated**: At least two more negative votes than positive ones.

Reported: inappropriate content or other issues.

Other: Not sufficient votes to make a decision

Barcelona Supercomputing Center Centro Nacional de Supercomputación In this work we focus in the category "other".

## **Portions of Common Voice 17.0**



In original CV17 around 1500 hours (~70%) of audio are in the split called "**other**".

The portion validated by us is the largest !!!

# Validation Methodology



## **Whisper Out-of-the-Box**

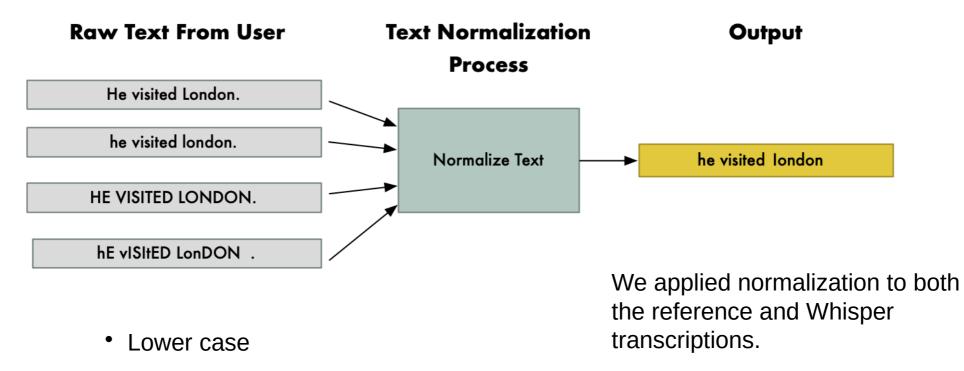
**Direct validation = Perfect Matches** 





We seek for "Perfect Matches" between the Reference and Whisper's Transcriptions!

## **Normalization of the Transcripts**

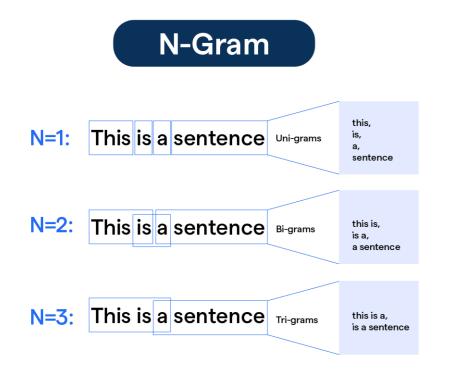


- Remove punctuation
- Removing characters not belonging to Spanish alphabet (ä, ë, ô, ö, etc.)



Classic ASR systems do not accept punctuation!

## We didn't use a Language Model (n-gram)



In large vocabulary ASR systems, there are many possible word choices. Ngrams help to narrow down the search space, making the process more efficient. Instead of searching through every possible word, the system can focus on the most probable sequences.

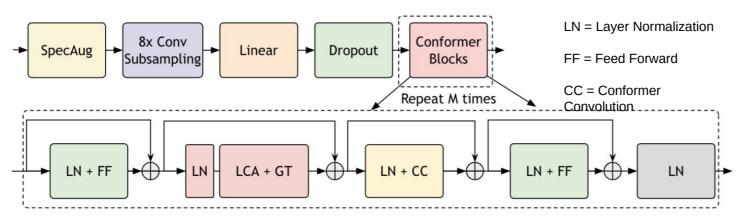
- <header information ignored by applications>
- \data\
- ngram 1=9
- ngram 2=11
- ngram 3=3
- \1-grams:
- -0.8953 <unk> -0.7373
- -0.7404 </s> -0.6515
- -0.7861 <s> -0.1764
- -1.0414 When -0.4754
- -1.0414 will -0.1315
- -0.9622 the 0.0080
- -1.4393 Stock -0.3100
- -1.0414 Go -0.3852
- -0.9622 Up
   -0.1286
- \2-grams:
- -0.3626 <s> When -0.1736
- -1.2765 <s> the 0.0000
- -1.2765 <s> Up
   0.0000
- -0.2359 When will 0.1011
- -1.0212 will </s> 0.0000
- -0.4191 will the 0.0000
- -1.1004 the </s> 0.0000
- -1.1004 the Go
   0.0000
- -0.6232 Stock Go 0.0000
- -0.2359 Go Up 0.0587
- -0.4983 Up </s>
- \3-grams:
- -0.4260 <s> When will
- -0.6601 When will the
- -0.6601 Go Up </s>
- \end\



## The ASR system will only choose words present in the n-gram model. We don't want that!

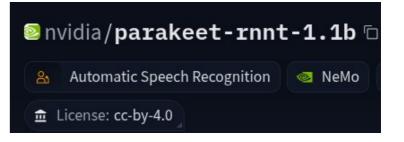
## **NVIDIA's Parakeet Architecture**

### Indirect validation = Training an ASR model with our validated data



RNNT = Recurrent Neural Network Transducer

Architecture of the NVIDIA Parakeet encoder with blocks of downsampling and subsampling, conformer encoder blocks with limited context attention (LCA), and global token (GT).



Bad data can't produce Good models!

As far as we know, there is no official model of Parakeet in Spanish trained by NVIDIA!



https://developer.nvidia.com/blog/pushing-the-boundaries-of-speech-recognition-with-nemo-parakeet-asr-models/

## **Hugging Face Leaderboard**



model	Average WER 🚺 🔺	RTFx 🚹 🔺	AMI 🔺	Earnings22 🔺	Gigaspeech 🔺	LS Clean 🔺	LS Other 🔺	SPGISpeech 🔺	Tedlium 🖌
nvidia/canary-1b	6.5	235.34	13.9	12.19	10.12	1.48	2.93	2.06	3.56
nyrahealth/CrisperWhisper	6.67	84.05	8.71	12.89	10.24	1.82	4	2.7	3.2
nvidia/parakeet-tdt-1.1b	7.01	2390.61	15.87	14.49	9.52	1.4	2.6	3.16	3.59
nvidia/parakeet-rnnt-1.1b	7.12	2053.15	17.01	13.94	9.89	1.45	2.5	2.93	3.83
nvidia/parakeet-ctc-1.1b	7.4	2728.52	15.67	13.75	10.28	1.83	3.51	4.02	3.57
openai/whisper-large-v3	7.44	145.51	15.95	11.29	10.02	2.01	3.91	2.94	3.86
nvidia/parakeet-tdt_ctc-110m	7.49	5345.14	15.89	12.37	10.52	2.4	5.22	2.54	4.07
nvidia/parakeet-rnnt-0.6b	7.5	2815.72	17.4	14.66	10.01	1.62	3.02	3.32	3.85
distil-whisper/distil-large-v3	7.52	214.42	15.16	11.79	10.08	2.54	5.19	3.27	3.86
nvidia/parakeet-ctc-0.6b	7.69	4281.53	16.46	14.26	10.39	1.88	3.8	3.89	3.77
openai/whisper-large-v3-turbo	7.83	200.19	16.13	11.63	10.14	2.1	4.24	2.97	3.57
openai/whisper-large-v?	7.83	111 15	16 74	12 05	10 67	2 83	5 1/	3 87	30



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https://huggingface.co/spaces/hf-audio/open\_asr\_leaderboard

## Results



## **Validation in Numbers**

Category "Other" of Common Voice 17.0

1513 hours (1,138,631 audio files) Our Validation Left to validate 48.91% 51.08% 753h 784h 556,951 audios 581,680 audios



We did not find a "perfect match" in the "left to validate" ones.

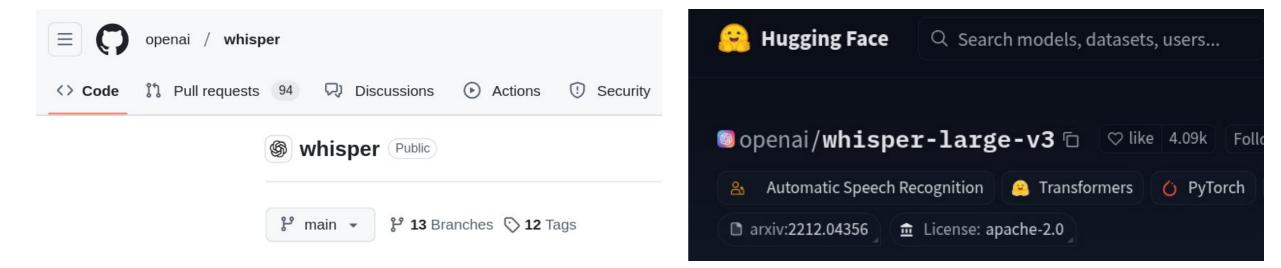
## **WER and CER Results**

Model	Split	WER	CER
		(%)	(%)
CV17 Validated	Test	5.13	1.69
	Dev	4.66	1.41
CV17 Other	Test	5.23	1.80
CV1/Ouler	Dev	4.85	1.53
CV17 Combined	Test	3.93	1.29
CV1/Combined	Dev	3.55	1.05
Open AI Whisper large	Test	4.97	1.81
OpenAI Whisper large	Dev	4.21	1.45
Within an lance w?	Test	5.15	1.84
Whisper-large-v3	Dev	4.34	1.48

Table 1: Performance of the models trained with distinct subsets of Common Voice compared to the performance of two different versions of Whisper.



### **OpenAl Whisper vs Hugging Face Whisper**



We have observed that they don't provide the same results.



# Deliverables



## **Deliverables in Hugging Face**

#### projecte-aina/parakeet-rnnt-1.1b\_cv17\_es\_ep18\_1270h

💿 NeMo 🗌 🏛 License: apache-2.0

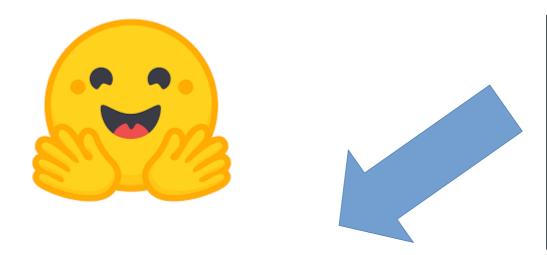
Split	WER	CER		
CV17	(%)	(%)		
Test	3.93	1.29		
Dev	3.55	1.05		



784 hours and 50 minutes!



## **Our HF Repo Doesn't Contain Audios**



P main ~ common_voice_17_0 / audio / es / other ロ						
<pre>   reach-vb HF STAFF Upload es_other_9.tar 7503bd6 VERIFIED </pre>						
🗅 es_other_0.tar	1.38 GB 🧔 LFS 👱					
🗅 es_other_1.tar	1.31 GB 🥥 LFS 👱					
🗅 es_other_10.tar	1.28 GB 🥥 LFS 👱					
🗅 es_other_11.tar	1.22 GB 🧔 LFS 👱					
🗅 es_other_12.tar	1.18 GB 🧼 LFS 👱					

	carlosdanielhernandezmena	Upload	other.tsv	caf5677	VERIFIED
Ľ	other.tsv 🕑 Safe				
ľ	tars_repo.paths 🕝 Safe				

Our Repo takes the audio files from the Original Common Voice HF Repo!



You will have to agree to the terms and conditions shown on the dataset card of Mozilla's HF Repo!

# Discussion



## **Possible Criticisms**

The use of just one ASR system.



The use of one ASR system does not invalidate the results of other ASR systems.

The use of normalized transcriptions

he visited Iondon

Normalized transcriptions enable compatibility with a broader spectrum of ASR systems.

It is very likely that Whisper was trained with Common Voice



Even with that, our Parakeet model outperformed Whisper!



# **Conclusions and Further Work**



## Conclusions

### Our contributions to the community are:

A Parakeet model that beats Whisper in the Dev and Test of Common Voice 17.0

https://huggingface.co/datasets/projecte-aina/cv17\_es\_other\_automatically\_verified

An automatically validated corpus of 784 hours and 50 minutes. <u>https://huggingface.co/projecte-aina/parakeet-rnnt-1.1b\_cv17\_es\_ep18\_1270h</u>





This contributions are publicly available in Hugging Face!



## **Further Work**



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뎍 Discussion by 🔶 Thomas Ferraz

### A large number of incorrect audio samples on FLEURS

google/fleurs

😔 huggingface.co

We can apply this method to validated other datasets in the future!



## **Acknowledgements**

# **ILENA**

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SECRETARÍA DE ESTADO DE DIGITALIZACIÓN E INTELIGENCIA ARTIFICIAL MINISTERIO PARA LA TRANSFORMACIÓN DIGITAI Y DE LA FUNCIÓN PÚBLICA



PERTE Nueva Economía De la Lengua



# **Questions?**





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