

**HoMed project** (*Homo Medicinalis*) <https://homed.ruhosting.nl>

# An Innovative Methodology Utilizing AI-based Automatic Speech Recognition for Transcribing Dutch Patient-Provider Consultation Recordings

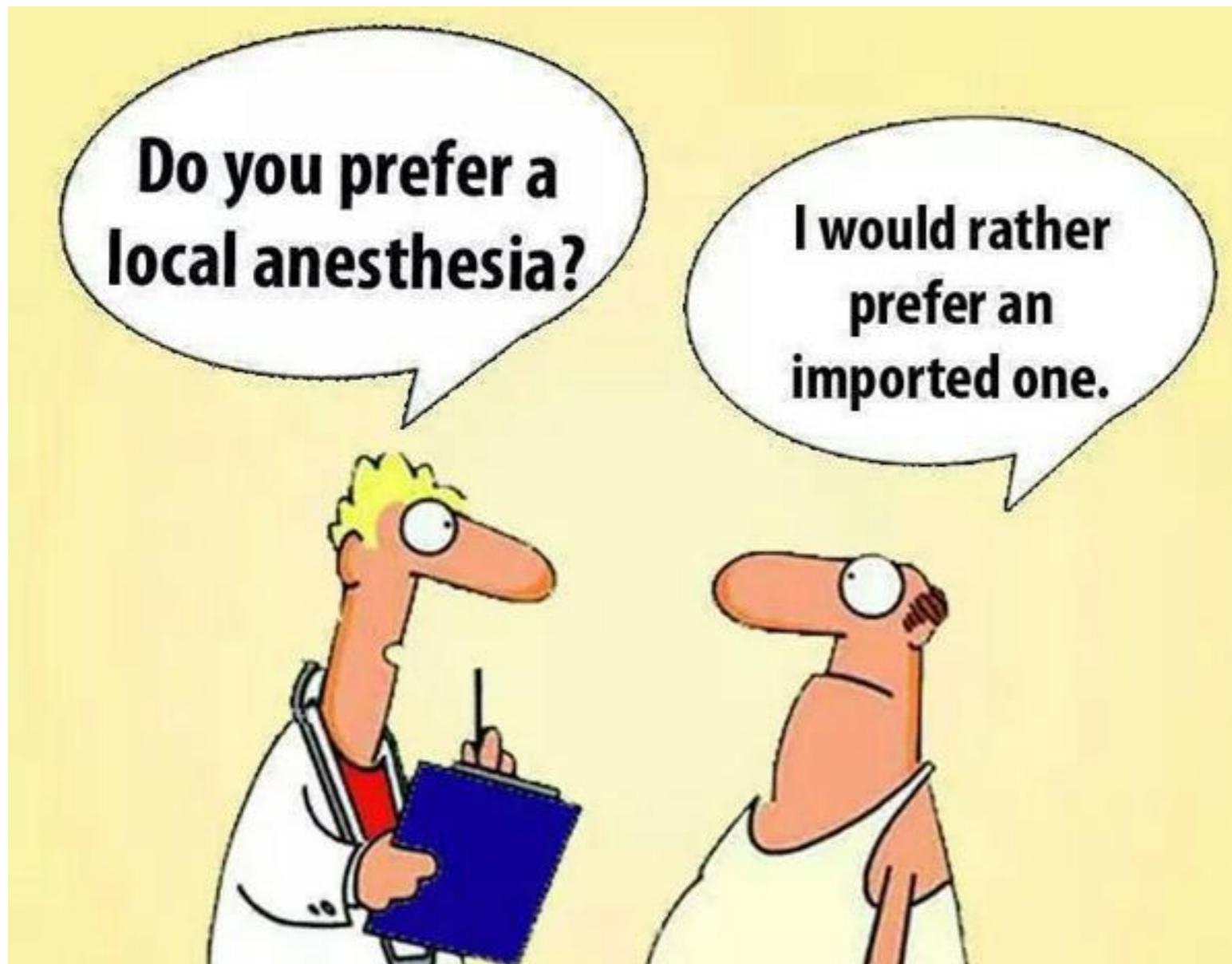
*DH Benelux Conference 2024 – 11th Edition – June 5-7, 2024 | Leuven (Belgium)*

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<https://www.ru.nl/en/people/tejedor-garcia-c>

## Motivation



15k cases / year – [Report, 2017](#)

Vervolgonderzoek medicatieveiligheid: eindrapport. Rotterdam/Utrecht/Nijmegen: Erasmus MC, NIVEL, Radboud UMC, PHARMO, 2017. 129 p.

# Index of contents

1. Speech Recognition in Healthcare
2. Speech Recognition & Dutch Language
3. Methodology
4. Results
5. Conclusions
6. Publications

# 1. Speech Recognition in Healthcare



## 2. Speech Recognition & Dutch language (I)

- Kaldi\_NL: Classical ASR system
  - ~900 speech hours



- **New Hugging-face era: Transformer-based systems**
  - 500k – 15M of speech hours

A screenshot of the Hugging Face Model Hub interface. The search bar at the top contains the text "dutch". Below the search bar, there are several model cards. From left to right, they are:

- jonatasgrosman/wav2vec2-large-xlsr-53-dutch**: Automatic Speech Recognition • Updated Dec 14, 2022 • 267k downloads • 7 stars
- Clementapa/wav2vec2-base-960h-phoneme-reco-dutch**: Automatic Speech Recognition • Updated Oct 11, 2022 • 332k downloads • 2 stars
- facebook/wav2vec2-large-xlsr-53-dutch**: Automatic Speech Recognition • Updated Jul 6, 2021 • 61k downloads • 2 stars
- GroNLP/wav2vec2-dutch-large-ft-cgn**: Automatic Speech Recognition • Updated Sep 11, 2023 • 53k downloads • 1 star
- jonatasgrosman/wav2vec2-xls-r-1b-dutch**: Automatic Speech Recognition • Updated Dec 14, 2022 • 42k downloads • 1 star
- hannatoenbreker/whisper-dutch**: Automatic Speech Recognition • Updated Jun 12, 2023 • 40k downloads • 4 stars
- goleshed/whisper-non-native-adult-0-dutch**: Automatic Speech Recognition • Updated Feb 5 • 31k downloads
- Oysiyl/w2v-bert-2.0-dutch-colab-CV16.0**: Automatic Speech Recognition • Updated 21 days ago • 28k downloads

The interface includes navigation buttons for "new", "Full-text search", and "Sort: Most downloads".

## 2. Speech Recognition & Dutch language (II)

The screenshot shows a news article from the SURF website. The top navigation bar includes links for Diensten, Thema's, and Nieuws. A green 'NIEUWS' button is visible. The main headline reads: 'Nederland start bouw GPT-NL, als eigen AI-taalmodel'. The text below the headline discusses the development of an open-source AI language model called GPT-NL by TNO, NFI, and SURF.

02 november 2023

**Nederland start bouw GPT-NL, als eigen AI-taalmodel**

Nederland gaat een eigen open taalmodel ontwikkelen: GPT-NL. Dit model is nodig voor het ontwikkelen, versterken en bestendigen van de digitale soevereiniteit. Non-profitpartijen TNO, NFI en SURF gaan samen het model ontwikkelen om zo een belangrijke stap te zetten richting transparant, eerlijk en toetsbaar gebruik van AI naar Nederlandse en Europese waarden en richtlijnen en met respect voor het eigenaarschap van data. Financiering van het model is afkomstig van het ministerie van EZK.

### Nederland trekt 13,5 miljoen euro uit voor ontwikkeling van eigen AI-taalmodel

Onderzoeksinstituut TNO gaat samen met SURF en het Nederlands Forensisch Instituut een eigen AI-taalmodel ontwikkelen, GPT-NL. Hiermee willen de partijen naar eigen zeggen een 'veilig alternatief' ontwikkelen voor buitenlandse taalmodellen als ChatGPT.

## 2. Speech Recognition & Dutch language (III)

- ASR\_NL\_Benchmark:

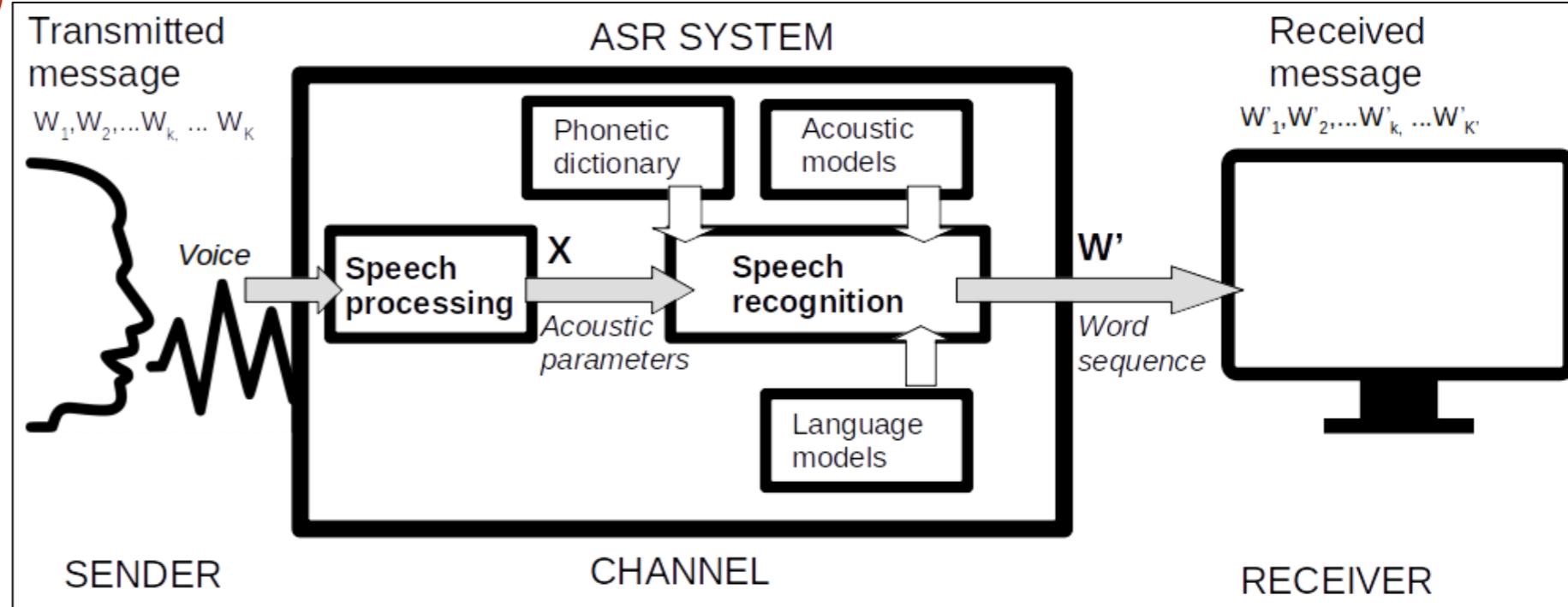
- [https://opensource-spraakherkenning-nl.github.io/ASR\\_NL\\_results/](https://opensource-spraakherkenning-nl.github.io/ASR_NL_results/)
  - University of Twente
  - Radboud University

**2nd Dutch Speech Day**

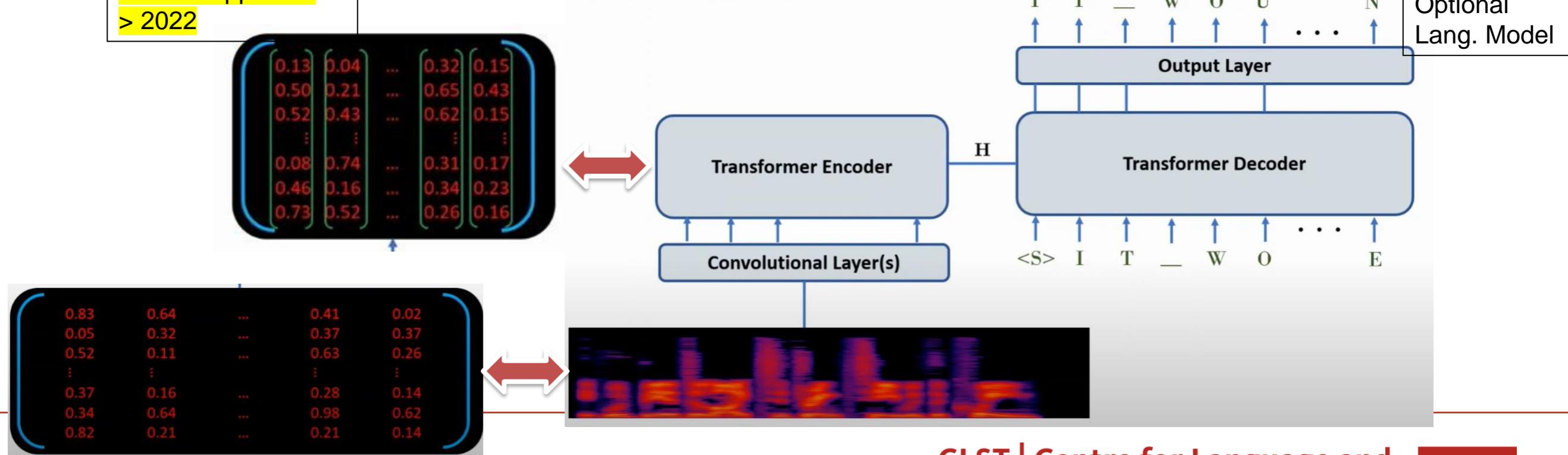
Model\Dataset	Jasmin_q_1	Jasmin_q_2	Jasmin_q_3	Jasmin_q_4	Jasmin_q_5
Kaldi_NL	28.1%	16.2%	43.6%	45.3%	20.9%
Whisper v2	22.6%	18.0%	36.5%	37.3%	22.2%
Whisper v3	34.2%	29.4%	50.4%	58.5%	34.4%
Whisper v2 w/ VAD	20.1%	12.4%	30.2%	33.4%	14.9%
Whisper v3 w/ VAD	34.7%	27.5%	46.7%	53.0%	30.2%
faster-whisper v2	20.3%	11.3%	29.9%	30.6%	13.7%
faster-whisper v3	28.1%	25.2%	50.9%	62.6%	27.6%
faster-whisper v2 w/ VAD	19.1%	11.1%	29.5%	30.0%	12.8%
faster-whisper v3 w/ VAD	27.5%	22.4%	42.6%	49.4%	25.2%

### 3. Methodology (I)

Classical approach

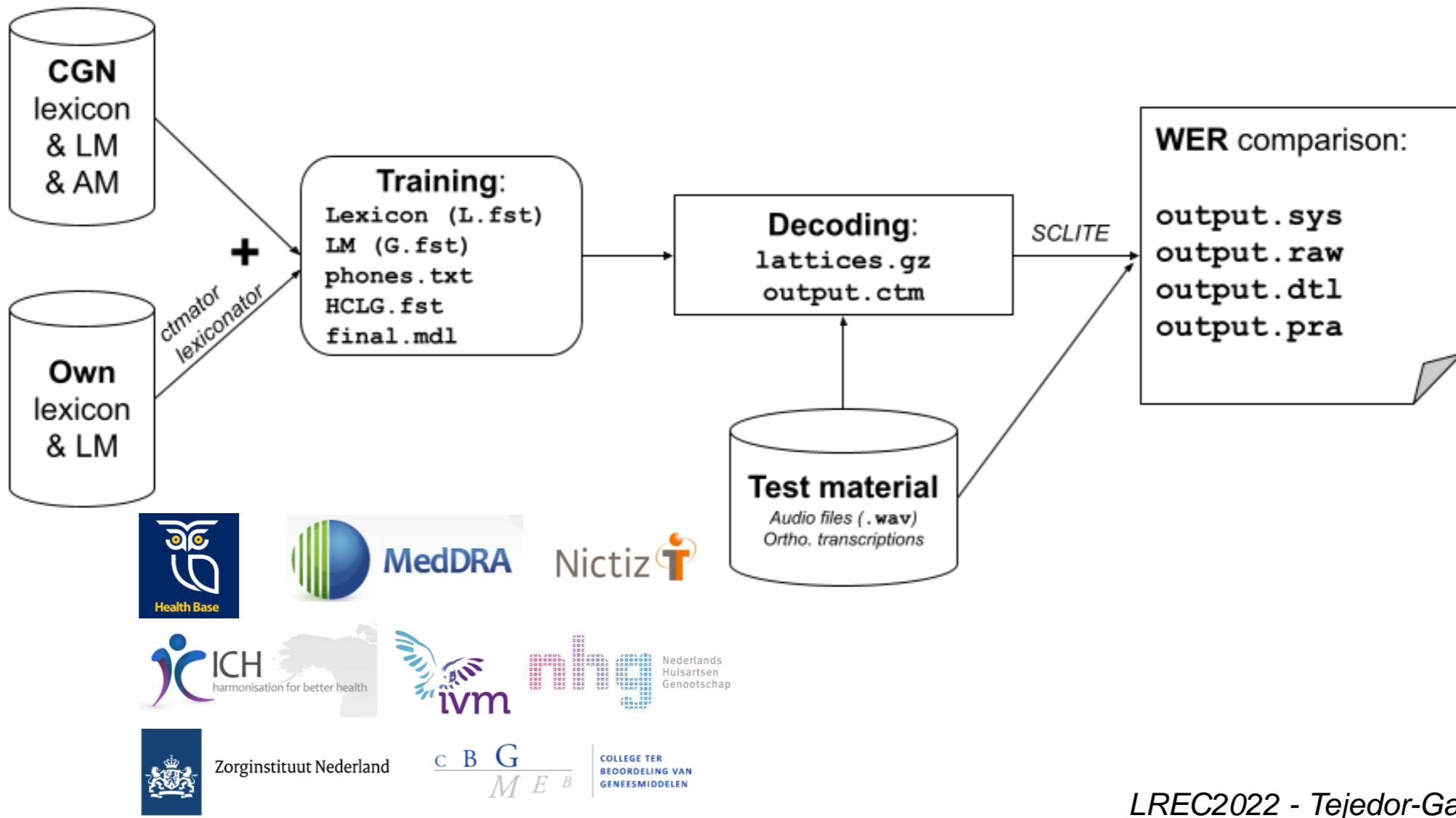


Current approach  
> 2022



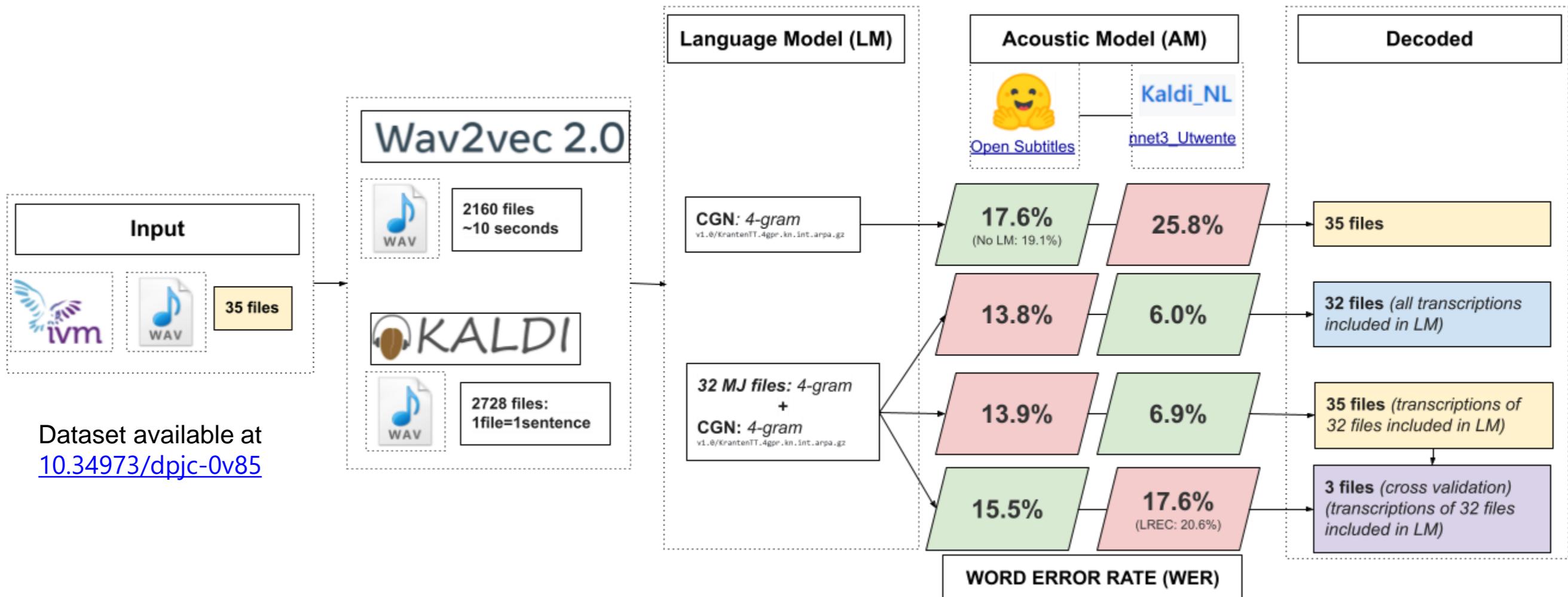
### 3. Methodology (II)

- HoMed: Language model fine-tuning (2021-2022) – Kaldi-NL



### 3. Methodology (III)

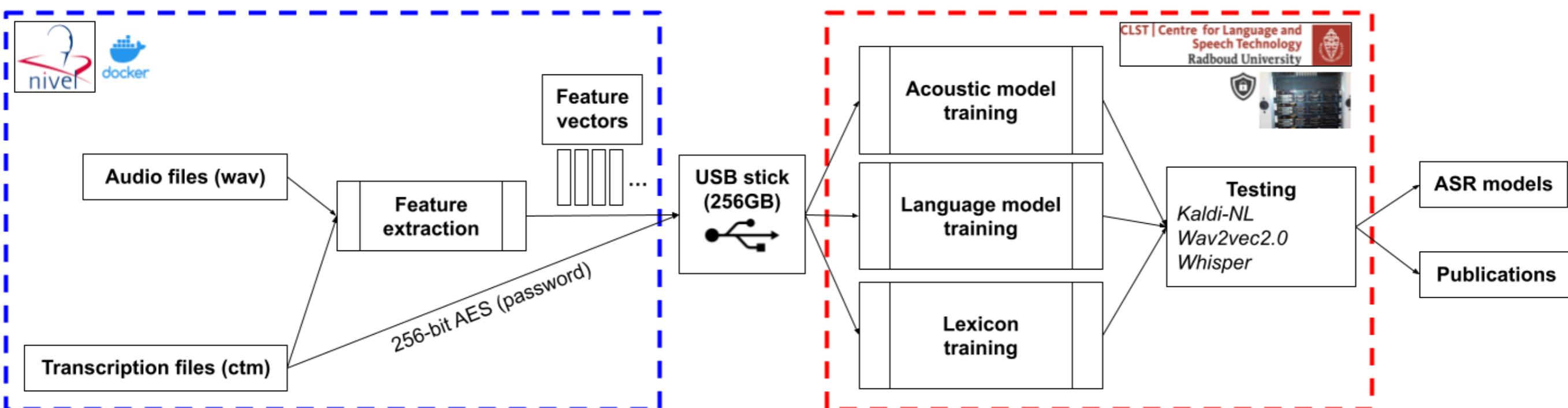
HoMed: 2022 Wav2vec2.0 exploration



LREC2022 - Tejedor-Garcia et al. 2022a

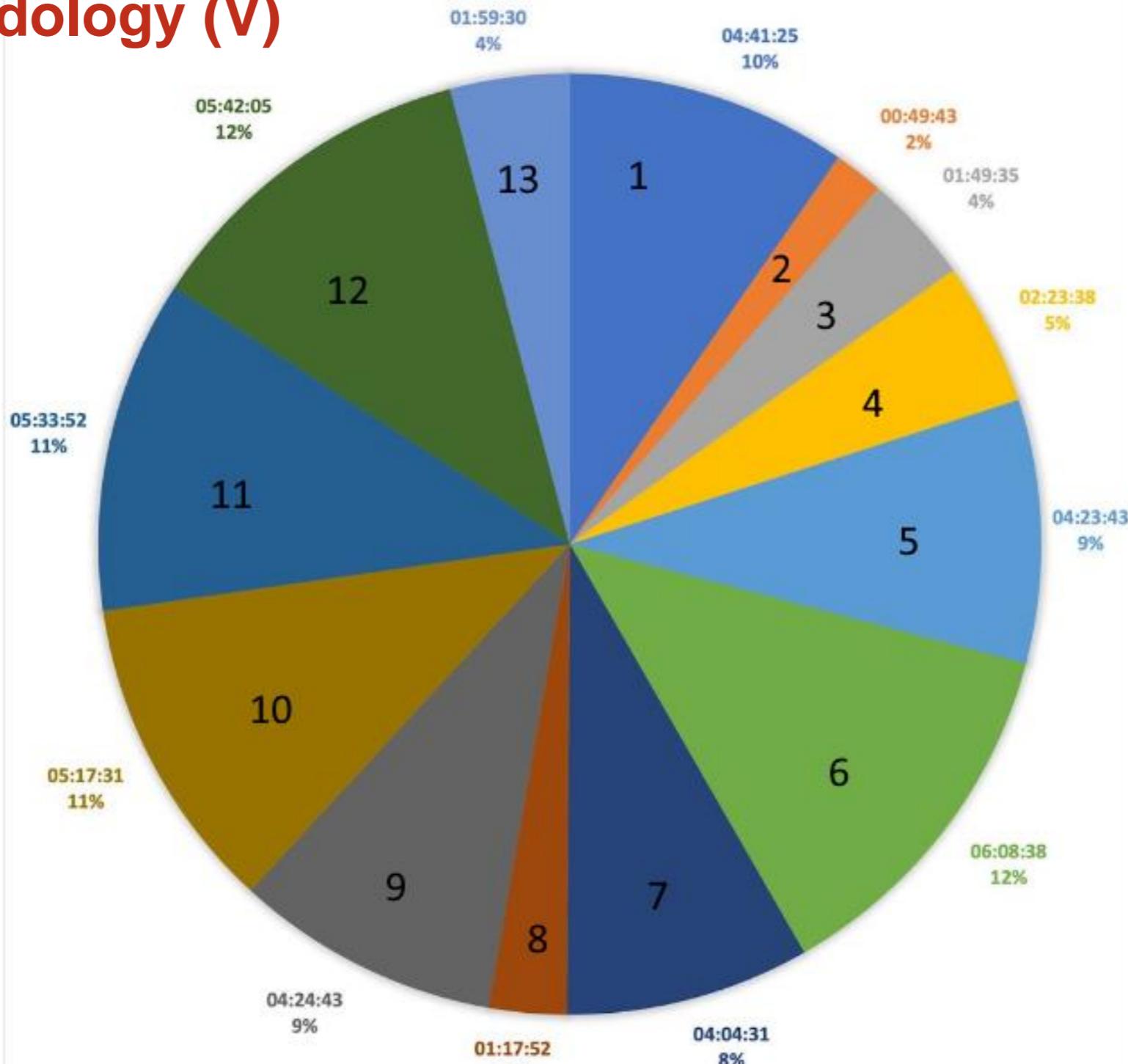
### 3. Methodology (IV)

HoMed: 2022-2023: An innovative method for building special purpose speech recognisers for sensitive data domains built on evidence-based pilot projects.



### 3. Methodology (V)

Total: 50 hours  
-- Audio quality



- 1 Pulmonology
- 2 Oncology
- 3 Palliative care
- 4 Radiology
- 5 Pharmacy
- 6 Nephrology
- 7 Obstetrics
- 8 Home care
- 9 Oncology
- 10 Paediatrics
- 11 Internal medicine
- 12 Gynecology
- 13 Geriatry

## 4. Results (I)

	# Fil	# Wrd	Corr	Sub	Del	Ins	Err
TEST-40H	110	421847	71.3	10.9	17.8	5.4	34.1
Whisper-large-v2	110	421847	33.9	22.8	43.3	2.4	68.5
Kaldi_NL							

### Subs:

- 1: 942 -> daar ==> er
- 2: 454 -> da's ==> is
- 3: 397 -> dat ==> het

### Ins:

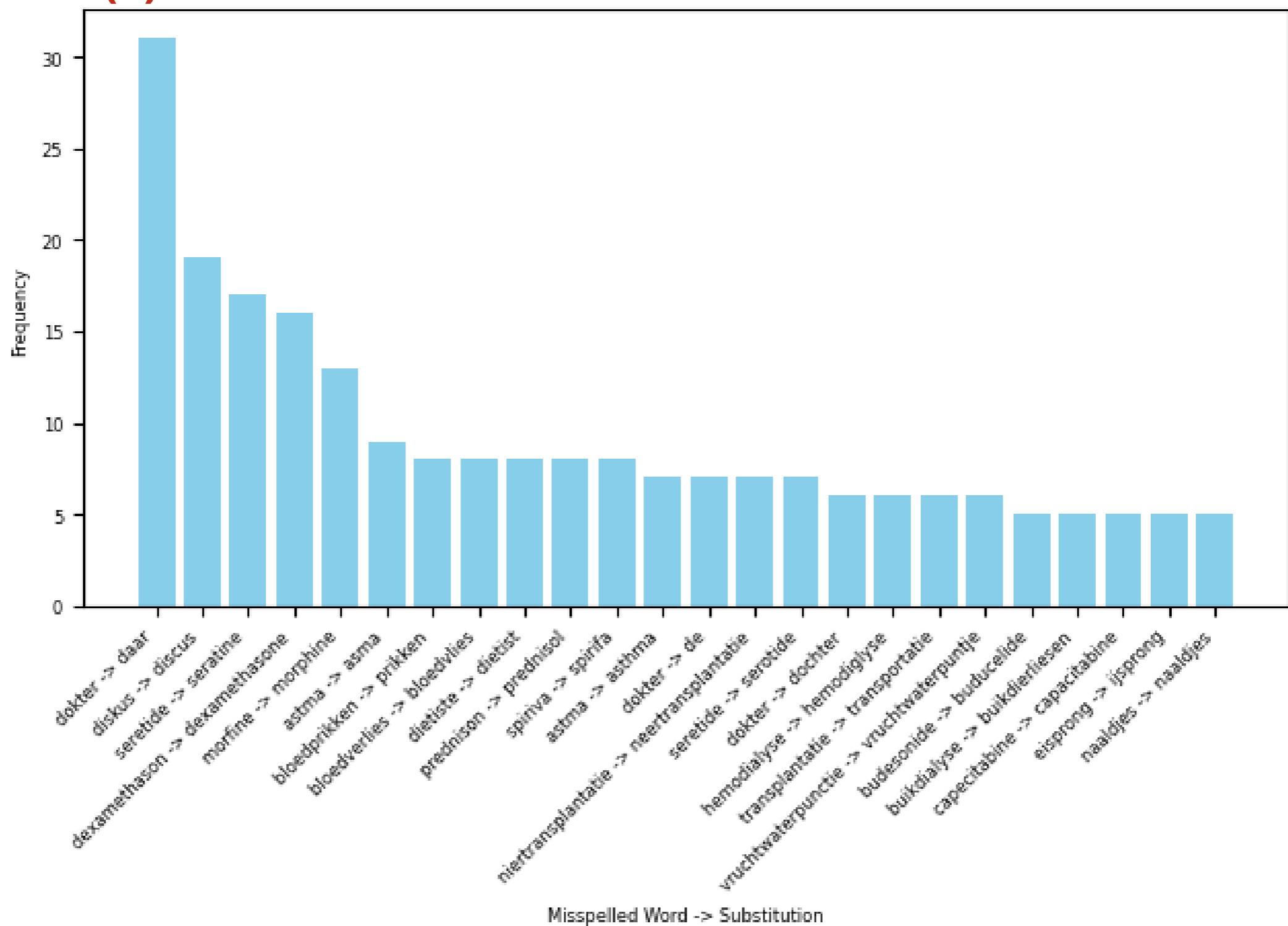
- 1: 1251 -> dat
- 2: 1208 -> het
- 3: 1152 -> ja

### Del:

- 1: 8568 -> ja
- 2: 2776 -> dat
- 3: 2429 -> ik

## 4. Results (II)

Frequency of Misspelled Words and Substitutions



## 5. Conclusions

1. AI has drastically changed the speech recognition field > 2022
  - Companies now have a predominant role
  - Huge open-source models are available: Quality, on-domain adaptation
2. A tailor-made methodology is key:
  - Standardized input and output is necessary following a well-established protocol
  - Words out of vocabulary (jargon) not a problem for most new models
  - A post-processing step (LLM) improves the performance results
3. In the upcoming years the speech recognition results will significantly improve:
  - New AI techniques, + data + open-source collaboration + multilingual approach
  - In-domain adaptation (fine-tuning) will still be the key
    - Low quality audio signal will still be the challenge
  - Richer information will be provided by ASR: emotions, personal information
    - Responsible AI & GDPR

## 6. Publications

1. Dutch ASR benchmark (**HoMed, 2024**): [https://opensource-spraakherkenning-nl.github.io/ASR\\_NL\\_results/RU/wer.html](https://opensource-spraakherkenning-nl.github.io/ASR_NL_results/RU/wer.html)
2. Tejedor-García, et al. (2024a). *An Innovative Methodology Utilizing AI-based Automatic Speech Recognition for Transcribing Dutch Patient-Provider Consultation Recordings.* **DH Benelux 2024** (June 5-7, Leuven) Conference. In press.
3. Tejedor-García, et al. (2024b). *Comparative analysis of state-of-the-art automatic speech recognition systems for transcribing medical consultation audio recordings .* **Health by Tech** Conference 2024 (May 30-31, Groningen). In press.
4. Van der Molen et al. (2022, May 4). *Challenges on the Promising Road to Automatic Speech Recognition of Privacy-Sensitive Dutch Doctor-Patient Consultation Recordings.* **DH Benelux 2022** - ReMIX: Creation and alteration in DH (hybrid), Belval Campus, Esch-sur-Alzette, Luxembourg and online. <https://doi.org/10.5281/zenodo.6517157>
5. Tejedor-García, et al. (2022a). *Towards an Open-Source Dutch Speech Recognition System for the Healthcare Domain.* *Proceedings of the 13th International Conference on Language Resources and Evaluation (LREC2022)*, pp. 1032-1039. <http://www.lrec-conf.org/proceedings/lrec2022/pdf/2022.lrec-1.110.pdf>
6. Tejedor García, C., Molen, B. & Heuvel, H. van den (2022b). *Homed Transcriptions Medicijnjournaal. Radboud Data Repository [Dataset].* doi: [10.34973/dpjc-0v85](https://doi.org/10.34973/dpjc-0v85).
7. Davelaar et al. [\*Spraakherkenning mogelijk zinvol bij medicatiegesprek.\*](#) *Pharmaceutisch Weekblad*, 12-09-2022

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