



# ***Challenges in Automatic Speech Recognition***

***2010-2020: Speech Technology for the Next Decade - Visions from  
Academia and Industry***

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Google

# Case Study: Google Search by Voice

Carries 25% of USA Google mobile search queries!  
What contributed to success:

- ⑥ clearly set user expectation by existing text app
- ⑥ excellent language model built from query stream
- ⑥ clean speech:
  - △ users are motivated to articulate clearly
  - △ phones do high quality speech capture
  - △ speech transferred error free to server over IP

Challenges:

- ⑥ Making and measuring progress: manually transcribing data is at about same word error rate as system (15%)

# Case Study: Google Labs GAudi

## Demo

This was the study for the YouTube feature that is now launched for all and integrated with translation.

Main challenge:

- ⑥ lack of coverage due to ASR limitations:
  - △ noise-robustness
  - △ speaker/accent/channel variability
  - △ language model mismatches
  - △ web is multi-lingual

# *ASR for Retrieval and Ranking*

On large document collections search is truly about Precision@N.

There is seldom a good reason to replace a result in the top-N with one that has hits in the (noisy) ASR transcript.

Future directions:

- ⑥ improve retrieval for "hard queries" which return very few documents based strictly on keyword hits in the text metadata
- ⑥ speech-rich sub-domains such as lectures/talks in English recorded in a controlled setup where current ASR capabilities are adequate after manual tuning to the sub-domain.

# Core Technology

## Current state:

- ⑥ automatic speech recognition is incredibly complex
- ⑥ problem is fundamentally unsolved
- ⑥ data availability and computing have changed significantly since the mid-nineties

## Challenges and Directions:

- ⑥ re-visit (**simplify!**) modeling choices made on corpora of modest size; 2-3 orders of magnitude more data is available
- ⑥ multi-linguality built-in from start
- ⑥ noise-robustness and speaker/channel variability