

Automatic Identification of Spoken Names and Addresses

***– and why we should abolish
account numbers!***

Melvyn Hunt

Novauris UK



No doubt you know your own phone numbers and car registration number, **BUT** what about your:

- ❑ Credit card nos.
- ❑ Bank account nos.
- ❑ Mortgage no.
- ❑ Social Security no.
- ❑ Car insurance policy no.
- ❑ House ins. policy no.
- ❑ Medical ins. policy no.
- ❑ Passport no.
- ❑ Electricity account no.
- ❑ Gas account no.
- ❑ Water account no.
- ❑ Telephone account no.
- ❑ Warranty nos. on countless items

I don't know any of these!

What I never forget is:

- My own name
 - Where I live
-
- These items are unique identifiers for me – and for everyone else
 - They are all we should ever need to identify ourselves

But there are a few of problems with names and addresses:

- Humans are bad at taking down names and addresses quickly and accurately on the phone
 - and in English, increasing use of offshore operators is making the problem worse
- Machine systems work more easily with index numbers
 - and the designers of such systems consequently impose index numbers on us humans
- Until recently machines were even worse than humans at taking down names and addresses

The good news is:

- Machines can now identify names and addresses spoken in a single utterance
 - Provided that these names and addresses are available in a database
- And they can do it:
 - much faster than a human
 - much more reliably than a human
 - and without needing to spell anything

This means that:

- ❑ We could abolish user-unfriendly account numbers
 - even if computers still represent individuals internally with numbers
- ❑ Call centres currently needing human operators to take down names and addresses can now be automated

The rest of this talk covers...

- Feasibility of name & address recognition
 - To justify the claims I just made
- Advantages of single-utterance input
- Some immediate applications
- Technology for spoken database access
- Relationship to other ASR tasks
- Recognition of shorter inputs
- Importance of confidence measures
- Invitation to try the demos on our stand

Our Feasibility Tests

- To develop and test our capabilities, we needed:
 - A (US) name-and-address database
 - We made a semi-artificial but realistic database
 - A large set of test and training recordings
 - We first made direct-microphone office recordings
 - We later used telephone recordings from the publicly available *Macrophone* corpus
 - Now, we and our customers have begun conducting on-line performance tests

Some statistics on our task

- 244,947,552 addresses in the database
- 245,000 distinct words in the vocabulary
- 3,220 cities, with 2,809 distinct names
- ~1 million distinct street names
- 88,800 distinct last names
- 4,275 female & 1,219 male first names
- ~50 million distinct person names
- 49,384 “*James Smith*”s – 39,638 “*Mary Smith*”s

Generating artificial but realistic person names

- Frequencies of first and last names taken from the US 1990 census
- Equal numbers of male and female names generated by random combination of first and second names, reflecting the published frequencies

Name & Address Speech Corpus

- Corpus collected in the US
 - speakers from all major US regions
- Each of the 181 speakers recorded between 100 and 200 names and addresses presented as if on an envelope
- 59 speakers held back for testing
 - Only used once

Recognition Test Results against 245 million items

- **99.8%** of the 7800 names and addresses were completely correct (with no rejection)
- Mean response time was **0.66 sec**
- Tests carried out on a standard PC:
 - 2.4GHz *P4* with 256MB of 266MHz RAM
(only **40 MB** of RAM actually used)
- **So large-scale name and address recognition is more than feasible**

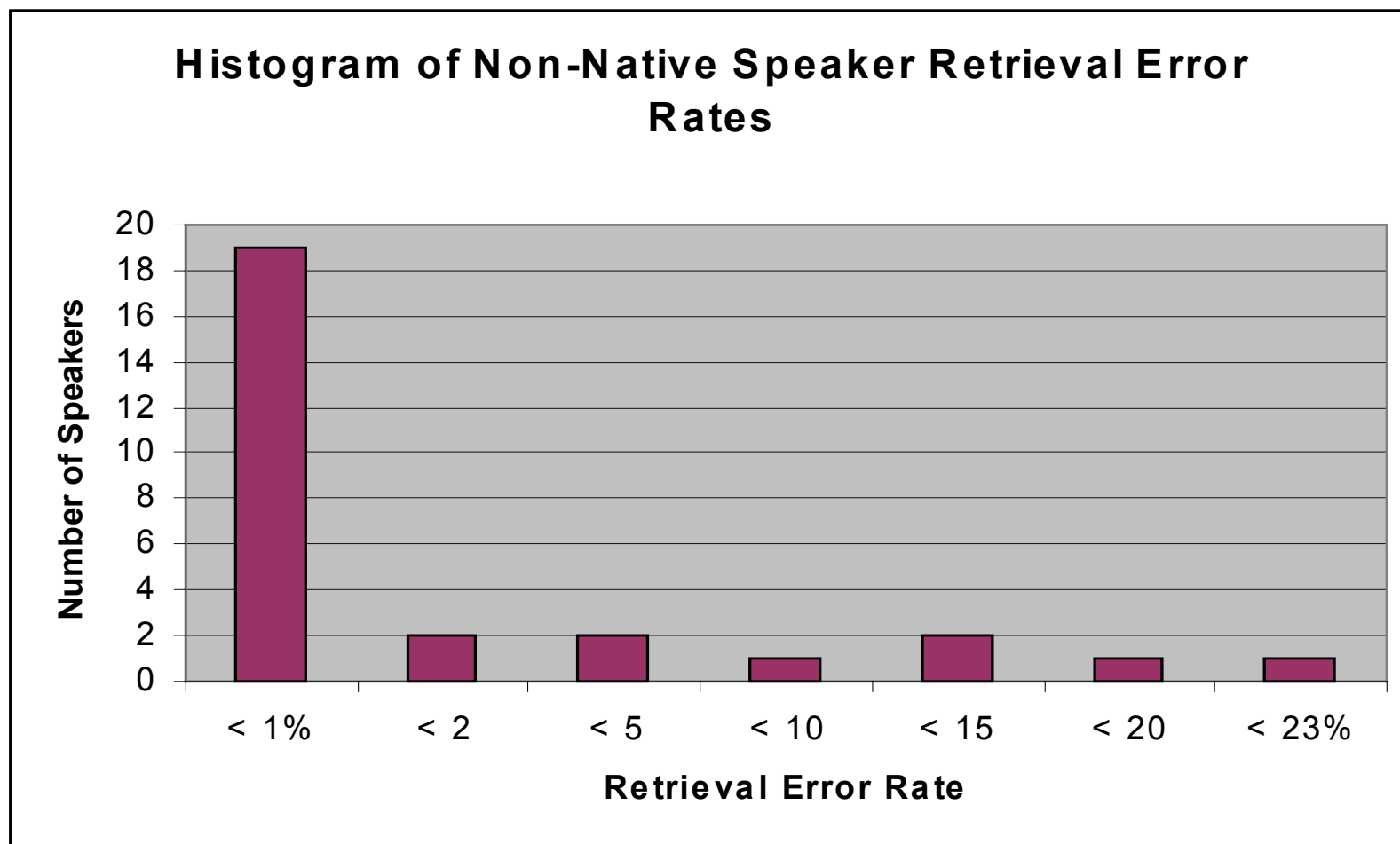
Non-native speaker tests

- Performance with most non-native speakers was as good as with native American English speakers
 - Our particular technical approach makes us more tolerant to variation in pronunciation

First Languages of the Non-Native U.S. English speakers

| | |
|--------------------------|----------|
| English (not USA) | 6 |
| Mandarin | 3 |
| Spanish (N. Am) | 3 |
| Arabic | 2 |
| German | 2 |
| Hindi | 2 |
| Korean | 2 |
| Bulgarian | 1 |
| Burmese | 1 |
| Czech | 1 |
| Hebrew | 1 |
| Japanese | 1 |
| Polish | 1 |
| Spanish (Spain) | 1 |
| Yoruba | 1 |

Results with the 28 Non-Native Speakers



So most non-natives got good recognition accuracy; 67% had <1% errors; 82% had <5% errors; those with high percentage error rates are barely comprehensible to human listeners.

Address recognition:
without names or house numbers
~ 2.5 million addresses
needed for *e.g.* route planning applications

| | Errors | Rejections |
|--------------------------------------|---------------|-------------------|
| Top-choice error rate | 2.34% | 0% |
| Top-choice error rate with rejection | 0.70% | 6.9% |
| Top-3 error rate | 1.09% | 0% |
| Response time: 1.33 sec. | | |

Tests with Telephone Speech

- Indicate that accuracy remains high
 - With office recordings restricted to telephone bandwidth, accuracy = 99.66%
 - With telephone recordings from the public *Macrophone* corpus, with name and address concatenated from separate utterances plus a telephone number in place of ZIP code, accuracy = 99.34%
 - In live tests errors are rare

Single-utterance vs. Multi-utterance (dialogue-based) approaches

➤ Usual interaction with dialogue:

- Which state do you live in?
 - Connecticut
- Which city?
 - Greenwich
- Speak the street & house no.
 - 143 Main Street
- What is your last name?
 - Bawson
- Please spell that name
 - B – A – W – S – O – N
- Did you say “Dawson”?
- *And so on...*

➤ Interaction without dialogue:

- What is your name and address?
 - James Bawson
143 Main Street
Greenwich
Connecticut
06830
- Thank you

□ ***Much quicker!***

Single-Utterance Name & Address Input is User-Friendly

- Many automatic speech recognition systems are more convenient for the service provider
- Taking down a name and address automatically is also more convenient for the user because:
 - It's faster
 - More accurate
 - No need to spell names

Former Head of BT's Speech Processing Research Department, Denis Johnston, said:

“This level of performance may permanently change how application designers approach dialogue design.

“Quite simply, it makes speech recognition systems far more attractive to users.”

Example of an Immediate Application

- ❑ A traveller has had her credit card stolen
- ❑ She needs to get it stopped immediately, but has no record of its number
- ❑ She identifies herself by her name and address
- ❑ Currently this has to be taken down (slowly) by a human operator
- ❑ Finance companies say there would be large savings if only a fraction of such calls could be handled automatically

Immediate Applications in General

- Obvious applications:
 - In call centres
 - In road-vehicle navigation systems
 - In parcel sorting
 - In financial info. and transaction processing
- But also some slightly less obvious ones not involving addresses...
 - In consumer entertainment for selecting music or video selections, artists, satellite TV channels and programmes, *etc.*

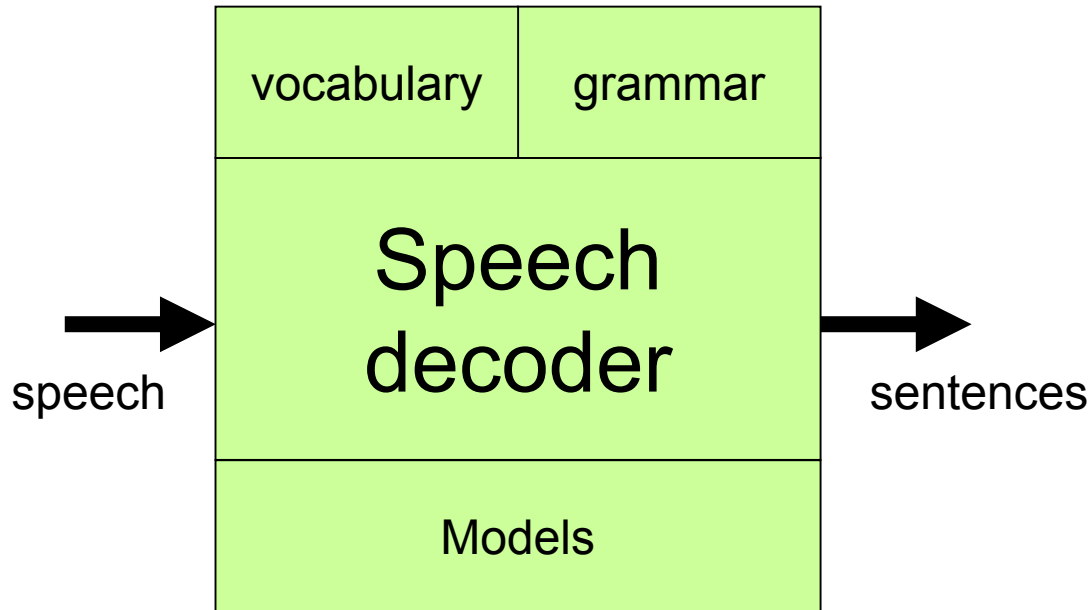
How have we achieved these capabilities?

- By exploiting redundancy in the grammar, but also:
 - With special, novel database search techniques
 - With special, novel speech recognition techniques, employing more speech knowledge than conventional systems

- Patent applications submitted on both sets of techniques

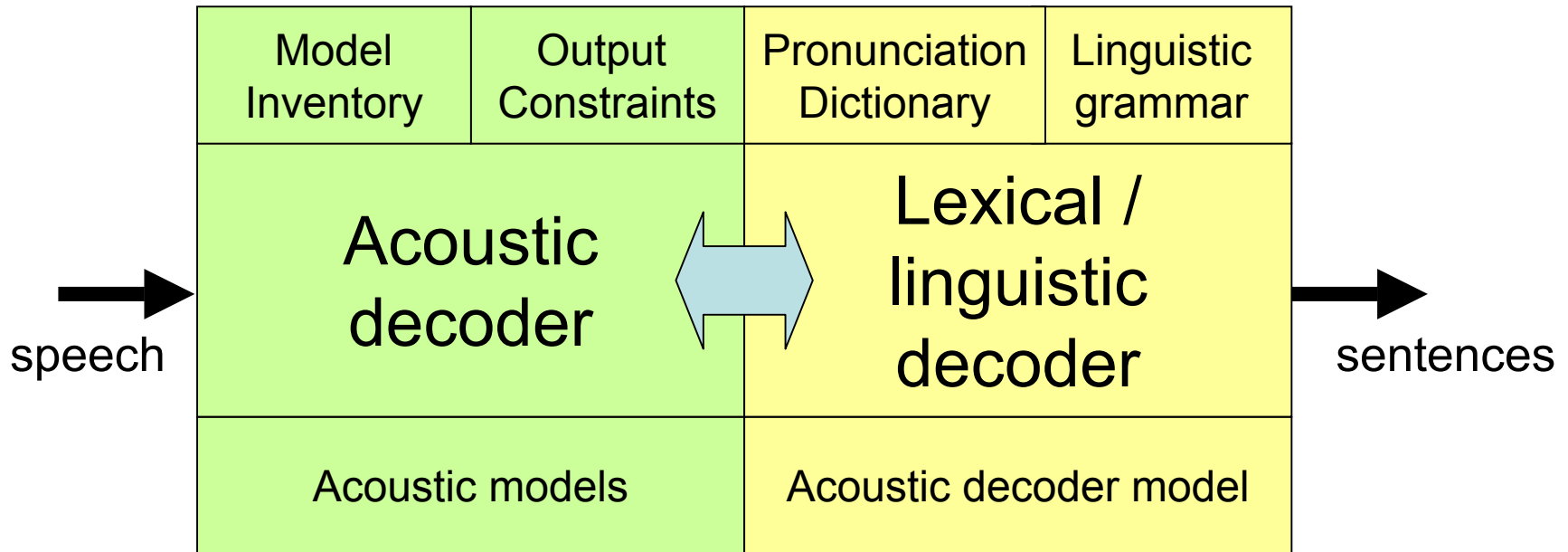
Our basic architecture is also
unconventional...

Conventional Speech Recognition



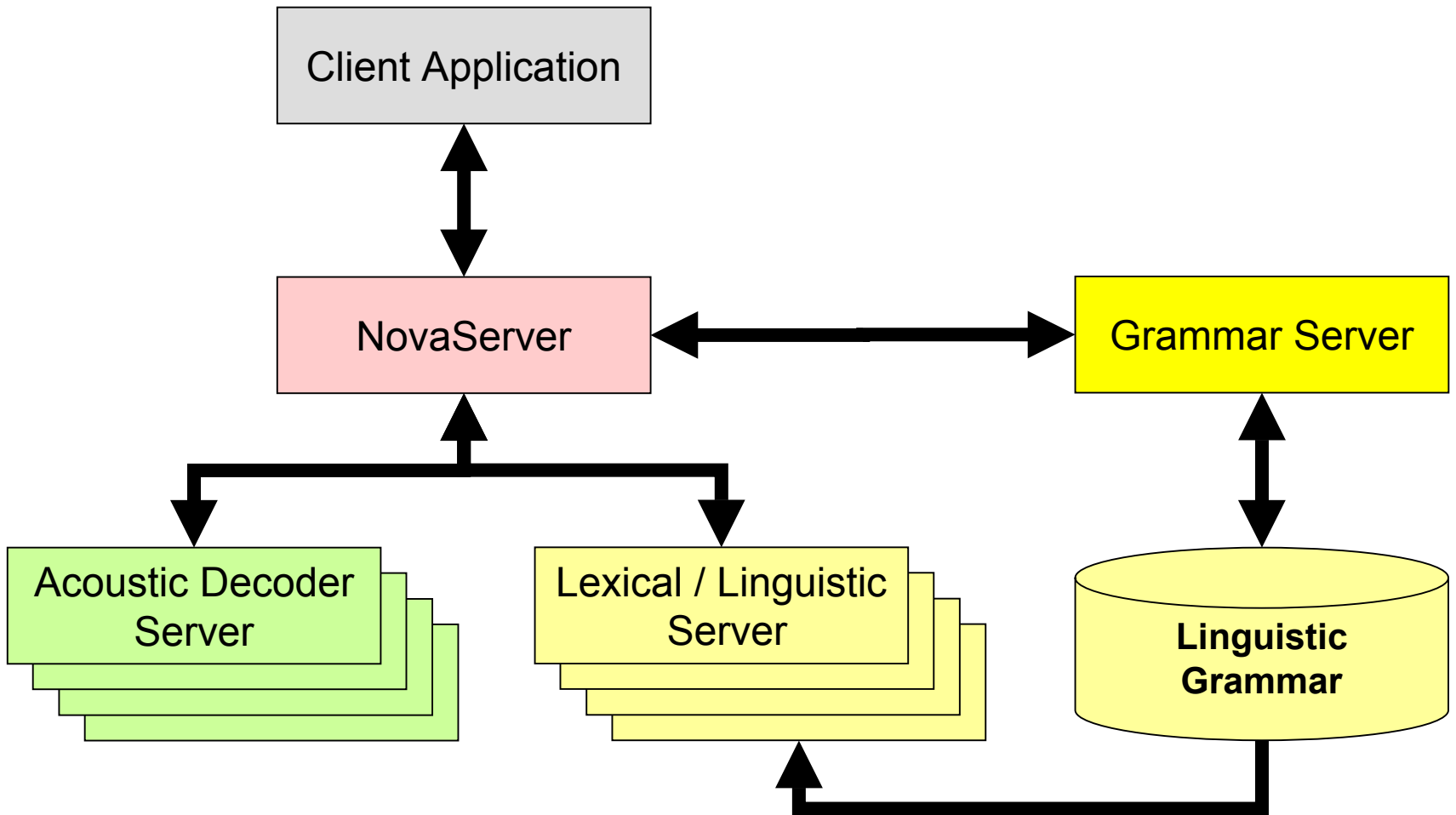
- The acoustic, lexical and linguistic modelling is done entirely within the decoder

Novauris' System

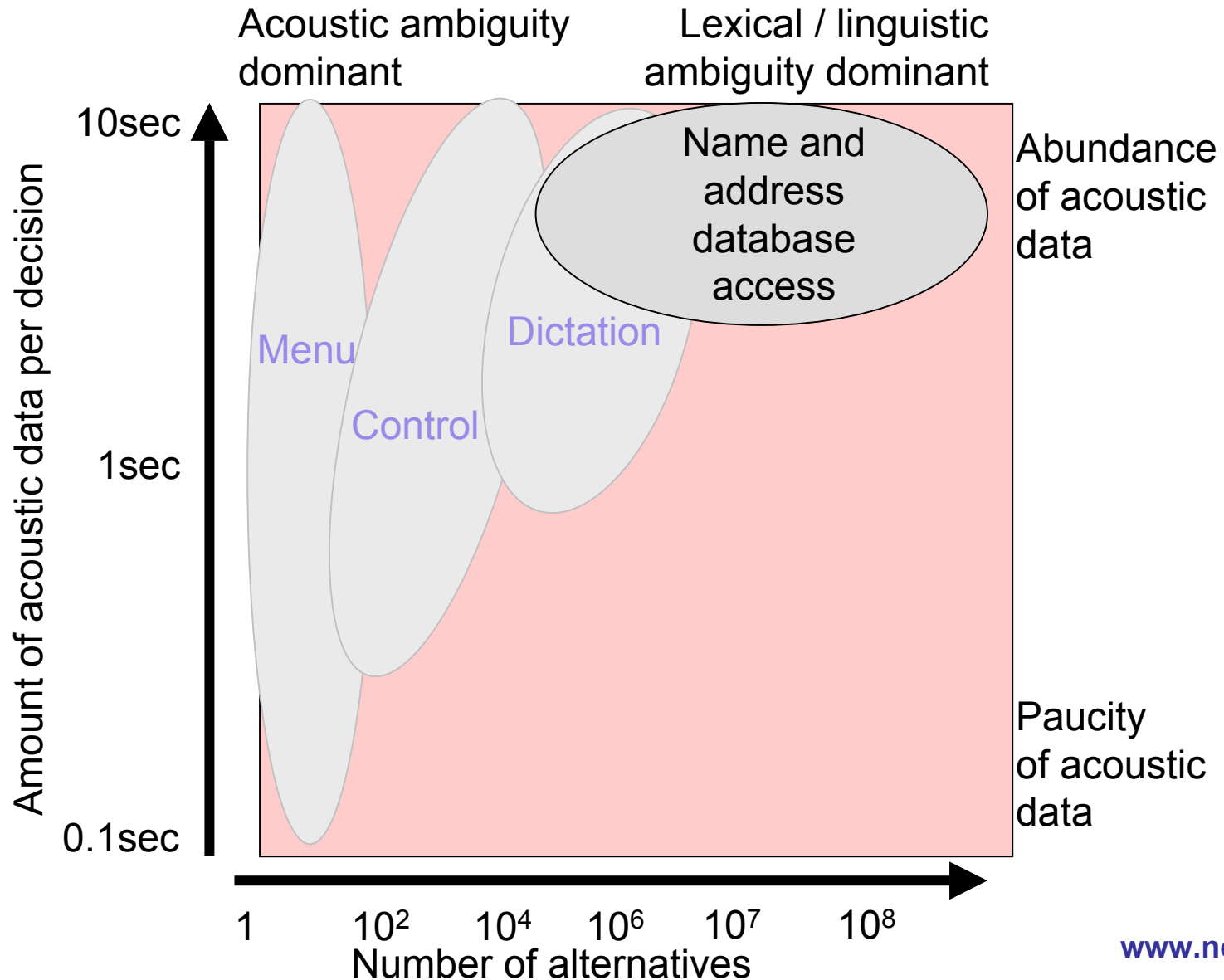


- Different modules are used for the acoustic modelling and the lexical / linguistic modelling
 - A more memory efficient lexical vocabulary is possible
 - A long-range linguistic grammar is possible

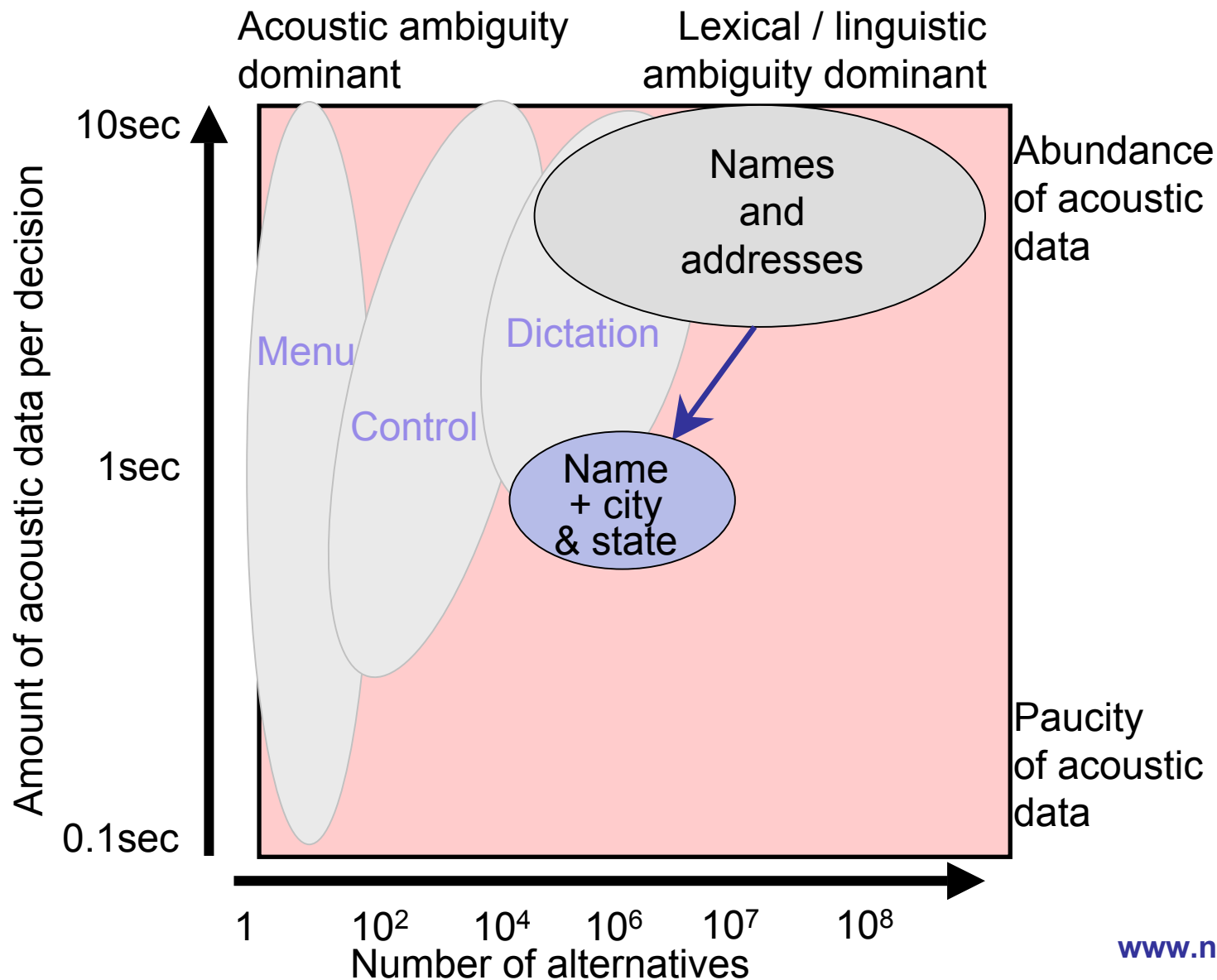
The Scalable Architecture



Speech Task Problem Space



Moving to shorter utterances

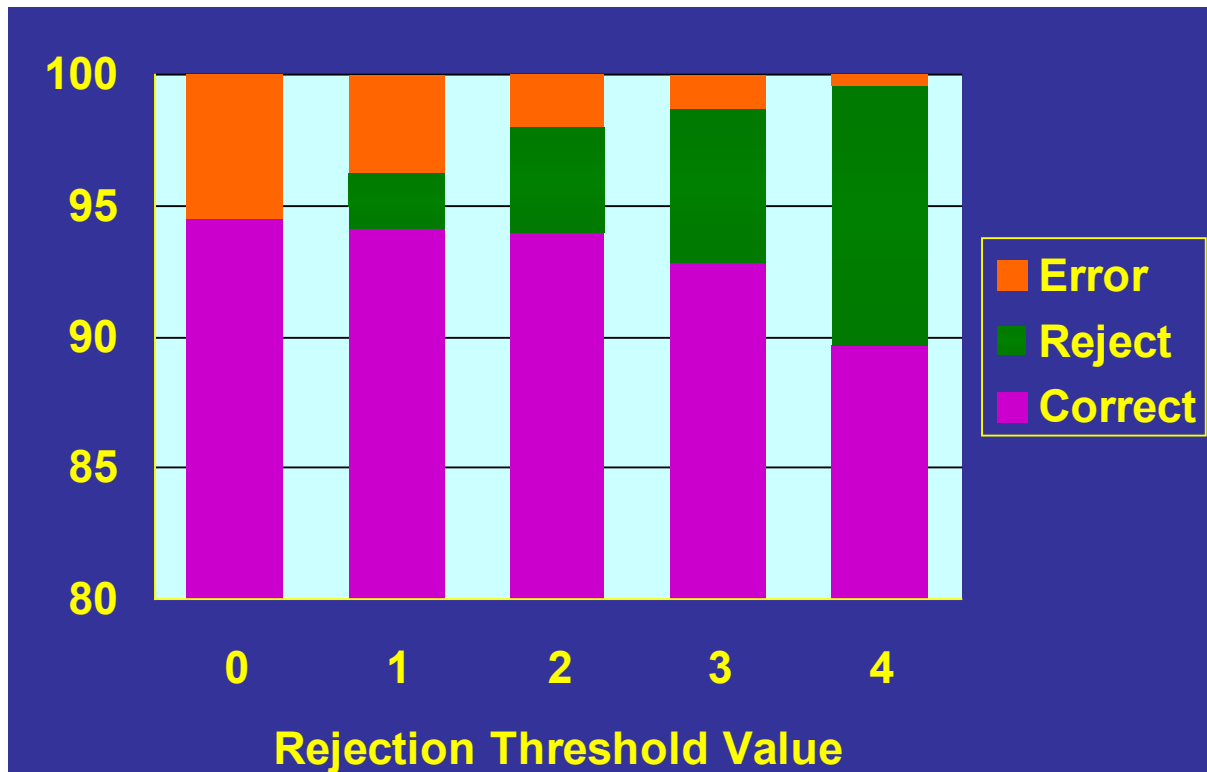


Telephone Tests on name + city & state

100,000 items

Confidence measures for rejection are needed to:

- Detect inputs that are not in the database
- Detect possible errors in database matches
 - Up to threshold value 2 or 3, almost all rejected items would otherwise have been errors



In Summary

- The technology needed to abolish user-unfriendly index numbers is already available
 - Though it won't happen right away
- In the meantime, there are many uses for automatic identification of (names and) addresses
- The technology providing this capability has potential in other applications

Please try the demonstrations on the Novauris stand (16)

- ❑ 245 million names & addresses
 - US English, direct input
- ❑ 24,000 names + city & state
 - US English, direct input
- ❑ Also, possibility of telephone demo
 - US English demos as 1 & 2
 - Plus name & address demo for British English



Appendix: Brief Background on Novauris UK

www.novauris.com

+44 1242 678581

Where Novauris is located



Background

Novauris UK offices



How Novauris Began

- Novauris (= “new ear”) founded in March 2002
 - to create a new generation of ASR capabilities and applications
 - initially specialised on spoken access to large databases
 - first public demonstration, April 2003
- □ Initial funding provided by Jim Baker, who:
 - With Janet Baker founded *Dragon Systems, which:*
 - Pioneered & led the market in general-purpose dictation products
 - Grew to ~380 people, revenue ~\$70M
 - Profitable throughout Jim’s 15-yr reign
 - 2 years later, brought down by L&H crash
- Novauris is currently an independent, privately held UK company

The UK Team

- Small, cohesive team of experienced speech technologists
 - + 1 administrator/book-keeper
 - Headed by John Bridle & Melvyn Hunt
 - Most have PhDs
- Largely comprise the former Dragon Systems UK R&D team

Dragon Systems UK R&D

- Worked on speech recognition over the telephone and in cars
- Independently profitable unit
 - Headed by John Bridle & Melvyn Hunt
- Developed *C-REC* speech recognizer
 - Suitable for noise-robust embedded and multi-channel telephone applications
 - Applications in: US & UK English, German, French, Japanese...
 - Sold to *Visteon*
 - including command & control and navigation
 - Now fitted in *Jaguar* cars — and others
 - Subsequently licensed by *SpeechWorks* (now *Scansoft*)

Dr James Baker

- ❑ Chairman of Novauris
- ❑ Initial investor
- ❑ Mathematician by training (Princeton)
- ❑ Introduced *HMMs* to speech recognition
- ❑ Co-Founder & Chairman of Dragon Systems
- ❑ Now lives in Florida

Dr Melvyn Hunt

- ❑ Joint MD — Functions as CEO
- ❑ Physicist by training (Oxford)
- ❑ Honorary Fellow, Dept of Phonetics and Linguistics, University College London
- ❑ Introduced LDA for acoustic representations and MLLR for speaker adaptation.
- ❑ His team in Canada developed the world's first helicopter piloted by voice
- ❑ Introduced what may be the world's first commercial telephone ASR system with barge-in (*Flightline* — 1991)
 - While Chief Scientist, Marconi Speech & Information Systems
- ❑ Served on the IEEE Speech Technical Committee

John Bridle, FIA

- ❑ Joint MD — Functions as CTO
- ❑ Pioneer in using dynamic programming time warping in the West (early 70s).
- ❑ Provided the algorithmic design for the world's first commercial truly continuous speech recognizer – *Logos* (early 80s).
- ❑ Pioneer in using neural networks for speech recognition (mid 80s).
- ❑ Formerly head of the UK government's Joint Speech Research Unit
- ❑ Jointly headed Dragon Systems UK
- ❑ Fellow of the Institute of Acoustics
- ❑ Served on IEEE Speech Technical committee