

Spoken Content Retrieval: Challenges, Techniques and Applications

(Part 1: Introduction and Overview)

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Overview

Introduction to Spoken Content Retrieval (SCR)

A Brief Overview of SCR Research

Architecture of an SCR System

Information Retrieval for SCR

Challenges for SCR

Introduction to Spoken Content Retrieval (SCR)

- ▶ Spoken Content Retrieval (SCR) provides users with access to digitized audio-visual content with a spoken language component.

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- ▶ Spoken Content Retrieval (SCR) provides users with access to digitized audio-visual content with a spoken language component.

This course is based on:

- ▶ Martha Larson and Gareth J. F. Jones (2012)
Spoken content retrieval: A survey of techniques and technologies
Foundations and Trends in Information Retrieval, 5 (4-5).
pp. 235-422.
Available from: <http://doras.dcu.ie/17158/>.

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- Growth in content which is spontaneous or conversational and/or recorded outside a studio setting.

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Growth in content which is spontaneous or conversational and/or recorded outside a studio setting.
 - ▶ Great variety of needs to search spoken content: factual information, e.g. TV documentaries, lectures; historical records, e.g. meetings, interviews; entertainment, e.g. movies, user-generated internet video.

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 - ▶ Great variety of needs to search spoken content: factual information, e.g. TV documentaries, lectures; historical records, e.g. meetings, interviews; entertainment, e.g. movies, user-generated internet video.
 - ▶ Increasing recording of spoken interactions, e.g. call centres. Access to speech media should be intuitive, reliable and comfortable.

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- ▶ Search engines and retrieval systems that make of SCR are better able to connect users with audio-visual content which match their needs for information and content.

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- ▶ ASR systems generate text transcripts from spoken audio.
- ▶ A naive SCR system would simply use ASR text transcripts to replace text files in a text IR system.
- ▶ The nature of spoken content, human interaction with spoken content and limitations of ASR systems mean that deeper consideration is needed to realise effective SCR systems.

Definition of Spoken Content Retrieval (SCR)

- ▶ **Spoken Content Retrieval (SCR)** is the task of returning speech media results that are relevant to an information need expressed as a user query.

Includes both audio-only speech content and speech media in other forms, including as part of video.

- ▶ **Speech Retrieval (SR)** - first name used for this technology
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- ▶ **Spoken Document Retrieval (SDR)** - later name, but limited in scope - based on defined document units
- ▶ **Voice Search** or **Voice Retrieval** focuses on returning textual or speech media based on **spoken** queries.
 - ▶ Raises different challenges to SCR, and is outside the scope of this course.

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- ▶ Spoken content rarely has the defined structure of text, e.g. paragraphs, sentences.
- ▶ Spoken content is often informal and not segmented into clearly defined documents, e.g. consider news stories vs a recorded meeting.
- ▶ Speech is a temporal medium, meaning that accessing raw spoken content is time consuming and inefficient. SCR systems must provide visualizations of content to enable easy relevance assessment and to access suitable playback start points.

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 - ▶ ASR system can generate **rich transcripts** containing additional information, e.g. speaker change points, male/female speaker, identifying named speaker or audio events, such as applause and laughter.

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SCR typically based on speech transcription, but STD and related techniques can be useful.

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- ▶ STD technologies are designed to find instances of individual words which can be defined easily for search.
- ▶ Combinations of ASR transcriptions and STD can provide solutions for SCR.

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 - ▶ Proto-SCR
 - ▶ Dawn of SCR
 - ▶ Rise of the SCR benchmark
 - ▶ Spontaneous, conversational speech

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- ▶ The technologies explored in this research have been applied in a range of application areas of generally increasing complexity, and investigated for a large number of languages.

History of SCR Research

Proto-SCR

- ▶ Mainly in the early 1990s.
- ▶ ASR transcription systems not yet available; speech recognition using fixed-vocabulary wordspotting. Recognised small fixed set of words, typically 20-50 carefully chosen words relating to a specific domain.

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- ▶ Used for filtering and classifying spoken items, e.g. voice messages.
- ▶ Referred to in the literature as “information retrieval”, but not IR as generally understood, topics are pre-defined, more akin to what is known as “information filtering”.

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- ▶ Small scale evaluations at individual research sites.

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 - ▶ Task relatively straightforward - problem declared generally solved in 2000.
 - ▶ Generally based on ASR transcriptions.
 - ▶ Extensive use of query expansion.
 - ▶ Exploration of document expansion.
 - ▶ Investigation of contemporaneous text collections.

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- ▶ MediaEval speech research tasks 2010 - present
 - ▶ Search of semi-professional internet video.
 - ▶ Collection developed using crowdsourcing.
 - ▶ Focus on identifying jump-in points to begin playback of content.

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 - ▶ Search of meetings: informal, challenging speech conditions, may be possible to tune speech technology, complex content structure, what is the appropriate retrieval unit.
 - ▶ Other examples: call centre recordings, collections of interviews, historical archives, lectures, podcasts, political speeches.

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- ▶ *Retrieval System*: matches the query with the items in the collection.

Architecture of an SCR System

- ▶ *Ranked Results*: A set of results ordered by their likelihood of potential relevance to the query.

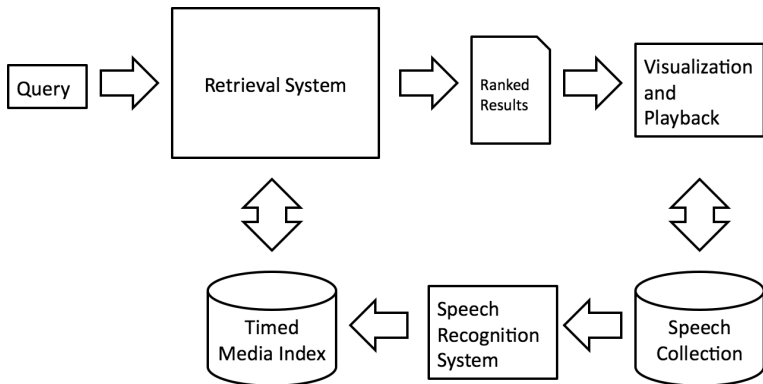
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- ▶ *Visualization and Playback*: enable user to judge relevance without extensive listening, access information efficiently in selected item.

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- ▶ Objective of any model is to differentiate relevant from non-relevant content (documents).
- ▶ Typically uses features which are *representative* and *discriminative*.

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 - ▶ problems with query words not well modeled by the ASR system;
 - ▶ words outside the vocabulary of the ASR system.
- ▶ Query expansion has proven particularly effective and robust for SCR.

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- ▶ Other ranking features developed for text IR can be applied for SCR: non-content features such as: PageRank. Google quality metrics such as “Panda”, freshness, query ambiguity, etc.

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The challenge of handling uncertainty

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- ▶ Challenge is how to determine appropriate ways to determine how to use this information in SCR.
- ▶ Challenge of how to use alternative unit (word) hypotheses to improve SCR.

Challenges for SCR

The challenge of covering all possible words

- ▶ ASR transcription systems are limited to a predefined fixed vocabulary.
- ▶ Words outside this vocabulary are referred to as “out-of-vocabulary” (OOV).

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- ▶ Words outside this vocabulary are referred to as “out-of-vocabulary” (OOV).
- ▶ Using a larger vocabulary is not the answer:
 - ▶ Language is in constant growth and new words enter the vocabulary steadily.
 - ▶ Under certain circumstances, increasing the vocabulary can compromise ASR recognition accuracy.

Challenges for SCR

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 - ▶ Under certain circumstances, increasing the vocabulary can compromise ASR recognition accuracy.
- ▶ Vocabulary can be adapted and new ASR system constructed, but
 - ▶ Can be difficult to obtain sufficient training data.
 - ▶ It is often not feasible to re-recognise spoken content - computational cost, collection size.

Challenges for SCR

The challenge of context

- ▶ Speech media is not fully represented by its transcript.
- ▶ User may require: certain speaker, speaking style, length of result, speech media of certain quality (no background noise).
- ▶ How should results be depicted in the user interface?
How should speech segments be placed in context - be understandable in context, without requiring extensive audition.

Challenges for SCR

The challenge of structuring spoken content

- ▶ How should speech media be structured to support effective SCR?
- ▶ Much speech media does not have well-defined inherent structure.
- ▶ SCR systems must often carry out topical segmentation:
 - ▶ Select appropriate units for ranked IR.
 - ▶ How should content be represented to the user in the interactive interface?

Challenges for SCR

The challenge of visualization and playback

- ▶ Users are seldom willing to listen to long stretches of audio in order to access the information that they are looking for.
- ▶ A key feature of effective SCR is representing the content so that its relevance can be determined rapidly and accurately, and individual items can be interrogated efficiently.

Challenges for SCR

The challenge of visualization and playback

- ▶ Users are seldom willing to listen to long stretches of audio in order to access the information that they are looking for.
- ▶ A key feature of effective SCR is representing the content so that its relevance can be determined rapidly and accurately, and individual items can be interrogated efficiently.
- ▶ May include features of: graphical representation, recognized words, system confidence in words, topical or speaker involvement structure, suggested playback jump-in point(s).