Multimedia Information Retrieval

Alan F. Smeaton

Centre for Digital Video Processing & Adaptive Information Cluster

> Dublin City University Alan.Smeaton@DCU.ie



Contents

1. IR vs. Information Seeking, and why it is hard

2. MMIR

- a) Key approaches and issues
- b) IR on Audio spoken and musical
- c) IR on Images
- d) The nature of video
- e) Commercial video IR systems
- f) Experimental approaches (5)
 - a) Using video metadata
 - b) Using text
 - c) Keyframe image matching
 - d) Using semantic concepts and features
 - e) Using video objects
- 3. MMIR Evaluation
 - a) TREC
 - b) Copycat evaluations
 - c) TRECVid
- 4. Challenges and issues



- Information retrieval looks easy
 - and everyone thinks they are good at it



- But accurate, high-quality IR is difficult
- Yet we've grown tolerant of poor quality IR

Ian Ruthven



Centre for Digital Video Processing

Sheep Attacks Rocket





What makes text IR hard is word polysemy





Centre for Digital Video Processing





Centre for Digital Video Processing

Nut screws washer and bolts





There's more to IS than IR

- Word polysemy is possibly the major issue in (text) IR
 - scale, interfaces, index freshness, etc. are all conquerable;
- Most (text) IR research, and IR evaluation, tries to find ways to work around this;
- Yet there is much more to evaluating IR ...
 - what information do I want, what will I do with it, what information will be useful, how will I get it, what words should I use, what documents to save for later, how is this document different from the other 15 million that Google has retrieved, is there better information, do I trust this information, have I missed anything,...



Centre for Digital Video Processing

ASPECTS OF Evaluation

System EVALUATION

- tests quality of IR system
- high volume of queries
- no user involvement
 - Simulate user
- cheap and popular
- highly controlled!

User EVALUATION

- tests quality of IR system + interface
- (usually) low volume of queries
- direct user involvement
- artificial test

Operational EVALUATION

- similar to user but in real situations
- expensive and difficult to run but very good test

experienced needed

Ian Ruthven



IR and IS - The Emerging View

- Approaches to improving (text & MM) information access in general
 - computer science (system evaluation)
 - propose new (well-founded) solutions
 - evaluate them in evaluation campaigns to uncover
 - what benefits searchers and in what way
 - new questions for investigation information science
 - investigate searching behaviour from a human perspective (user evaluation)
 - identify generalities amongst searchers or search behaviour
 - identify meaningful differences between searchers or search behaviour
 - make recommendations to system designers

Ian Ruthven



User-oriented evaluations

- IN PRACTICE, USER EVALUATIONS EVALUATE THE Whole system
 - algorithms plus interfaces
 - mostly comparative
 - e.g. two interfaces to same system
 - objective measures
 - e.g. number of relevant documents found, time to search
 - subjective measures
 - easy to search, easy to learn, popular
 - qualitative and quantitative analysis
 - also proposed are things like cost, quality of information, search satisfaction
 - less controlled than test collection evaluation
- ... but this is too expensive to do, so we do system evaluations instead.



Relevance in IR

- Relevance is important in the IS view, and is simplified in the CS view, of information retrieval;
- It can mean many things (Saracevic)
 - **system** relevance
 - relation between query and document representation
 - **topical** relevance (aboutness)
 - relation between topic of query and topic of document
 - cognitive relevance (pertinence)
 - relation between user's state of knowledge and texts
 - *situational* relevance (utility)
 - relation between situation (problem) and texts
 - *motivational* relevance
 - relation between intention of user and texts
- In the CS view of IR, it is simplified, binary, non-complex whereas in the IS view of IR it is not;

Ian Ruthven



Don't believe me ? IFs and IR/IS

- These things DO matter, but they are hard to address, so we don't address them. Don't believe it ... look at SEARCH interfaces - features of common interfaces
 - what information seeking actions they support
 - what type of searches they support
 - what they do not support
- Interfaces are important, always are, and search interfaces determine actions the user can do, the system can support
- Interfaces make certain types of action more likely
 - generally known as the *affordance* of interfaces
- There is a difference between intended affordance and unintentional affordance
- For example, Google vs. Other system affordances?



Affordance of a door handle !





Centre for Digital Video Processing











... Critically examine the research frameworks and **models** of **information seeking** ... **Information** Scent model by Chi et al., Web **Information Seeking** model by ... www.si.umich.edu/rieh/syllabi/isb04.html - 15k - <u>Cached</u> - <u>Similar pages</u>

Nonlinear Information Seeking Behaviour

... research by Foster following a study using Naturalistic Inquiry suggested the existence of a

Multimedia IR (Smeaton)

DCU



- standard interface allows for
 - query
 - examination of documents
 - all documents with at least one query term
 - top *n*
 - assessment of relevance
 - relevance feedback
 - binary relevant/not relevant
 - partial how relevant
 - range relevant/partially relevant/partially nonrelevant/not relevant

Ian Ruthven

Multimedia IR (Smeaton)



Centre for Digital Video Processing

Key features ...

- supports cycle of activity
 - query -> document examination -> query/rf -> document examination
- documents and queries only entities
- good for rapid searching
 - quick analysis
- little support for
 - categorisation (types of documents, date of documents, etc.)
 - multiple querying in multitasking
 - storing search results
 - decision making
 - overview of collection

Ian Ruthven



ile Edit View Favorites Tools Help Back • • • • • • • • • • • • • • • • • • •	About Google
Back • • • • • • • • • • • • • • • • • • •	▼ ⊘Go About Google
Inter://www.google.com/advanced_search?hl=en	About Google
Google Advanced Search Tips Advanced Search Find results with all of the words with the exact phrase with at least one of the words with out the words without the words any language	About Google
Google* Advanced Search Find results with all of the words 10 results • Google Search with the exact phrase	<u>About Google</u>
GOOGLE Advanced Search Find results with all of the words IO results Google Search with the exact phrase with at least one of the words Google Search with at least one of the words IO Google Search with at least one of the words IO IO IO With at least one of the words IO IO IO IO Language Return pages written in In In In IO	
Find results with all of the words 10 results Google Search with the exact phrase	
Find results with all of the words 10 results Google Search with the exact phrase with at least one of the words 10 with at least one of the words without the words 10 without the words 10 10 Language Return pages written in any language Image	
Find results with the exact phrase with at least one of the words without the words Language Return pages written in	
with at least one of the words without the words Language Return pages written in any language	
without the words any language	
Language Return pages written in any language	
Language Tetan pageo witten in any language	
File Format	
Date Return web pages updated in the any intervence any	
Occurrences Return results where my terms occur anywhere in the page	
e.g. google.com, .org More info	
SafeSearch © No filtering © Filter using SafeSearch	
	-
Similar Find pages similar to the page	
e.g. www.googie.commeip.nam	
Links Find pages that link to the page Search	

С

Centre for Digital Video Processing

Main features ...

- emphasis on query
 - more support for complex queries
 - more support for precise queries
- support for meta-data
 - date, location, type
- but essentially narrowing options
- often cumbersome and tedious to use
 - especially for multimedia
- again little support for more complex actions
 - or for the difficult parts of searching





Category-based



🛃 Yahoo! - Microsoft Internet Explorer	
File Edit View Fa	vorites Tools Help
⇔ Back 🔹 🔿 👻 🙆	😰 🚮 🔞 Search 📷 Favorites 🖓 Media 🎯 🔂 - 🎒 🗹 - 📃 📿
Address 🙆 http://www.yahoo.com/	
Google -	💌 🛛 📸 Search Web 🕞 🚿 🛛 🖶 97 blocked 🛛 🔚 AutoFill 🕒 📗
	Web Hosting Sell Online Games on Demand Personals Get a Domain Business Email Fantasy Football Mail Plus
	Web Site Directory - Sites organized by subject Suggest your site
	Business & Economy Regional B2B. Finance, Shopping, Jobs Countries, Regions, US States
	Computers & Internet Society & Culture Internet, WWW, Software, Games People, Environment, Religion
	News & Media Education Newspapers, TV, Radio College and University, K-12
	Entertainment Arts & Humanities Movies, Humor, Music Photography, History, Literature
	Recreation & Sports Science Sports, Travel, Autos, Outdoors Animals, Astronomy, Engineering
	Health Social Science Diseases, Drugs, Fitness Languages, Archaeology, Psychology
	Government Reference Elections, Military, Law, Taxes Phone Numbers, Dictionaries, Quotations



DCU

Main features ...

- possibly no search browse only
- overview of collection
- but difficulties of categorisation
 - usually clustering
 - perhaps manual
- location issues
 - "where am I?"
 - "where is X?"
- some support for
 - completeness of search
 - organisation of analysis

Ian Ruthven

Centre for Digital Video Processing

Graphics-based – kartoo.com





DCL

Main features ...

- specify relationships between concepts
 - terms, concepts, documents, websites, etc.
- overview of collection
 - main categories and concepts
- often, more direct access to information
 - less emphasis on documents
- still occasionally problem of defining queries
 - and little support....



Wrapping it up ...

- IR, and now MMIR, is dominantly system-evaluation, ignoring context;
- Context is hard to capture, to use, and to evaluate;
- In this lecture we'll look at MMIR techniques and in tandem, how well/badly they work, using system evaluation (like everyone else);
- But really we should do more, if only we knew how.

Contents

- 1. IR vs. Information Seeking, and why it is hard
- 2. MMIR
 - a) Key approaches and issues
 - b) IR on Audio spoken and musical
 - c) IR on Images
 - d) The nature of video
 - e) Commercial video IR systems
 - f) Experimental approaches (5)
 - a) Using video metadata
 - b) Using text
 - c) Keyframe image matching
 - d) Using semantic concepts and features
 - e) Using video objects
- 3. MMIR Evaluation
 - a) TREC
 - b) Copycat evaluations
 - c) TRECVid
- 4. Challenges and issues



Why MMIR?

- Search Engines allow (mostly) searching over textual data...
- Text IR is easy ... match text query vs. text docs, but MMIR is harder 'cos we don't have queries !
- We could use text description of Q and D via user annotations but this has + and - (see later);
- What is MMIR?:
 - Find me the section of the movie where...
 - Forward to the goals in this match...
 - Just show me a summary of the F1 race, but I am only interested in Ferrari.
 - Find the person in this picture in this movie?
 - Much of it is visual, which is hard to express



Text vs. MM IR





Centre for Digital Video Processing

MMIR - key ideas

The trend in content-based retrieval systems for non-text is based on three key ideas:

- 1. Successful content-based retrieval systems (in image and video) are **domain-specific** and work best in those domains.
- 2. Automatic understanding tools are **difficult to develop**, so either:
 - Use simple techniques based on automatically extractable media primitives or;
 - Replace automatic techniques by interactive ones which involve users... i.e. manual mark-up.
- 3. Human involvement should be limited to **primitive tasks** that can be performed consistently.



MMIR – some issues

- Many underlying technologies are based on TEXT IR and exploit simple, proven methods.
 – Often text can be extracted from MM data
- Often a text IR based media retrieval system is augmented with media specific retrieval facilities operating over features of the underlying media.
- MM data has many possible interpretations, much more than text data.
- Hence we must develop a suite of retrieval techniques that can be used for these features.



Contents

- 1. IR vs. Information Seeking, and why it is hard
- 2. MMIR
 - a) Key approaches and issues
 - **b)** IR on Audio spoken and musical
 - c) IR on Images
 - d) The nature of video
 - e) Commercial video IR systems
 - f) Experimental approaches (5)
 - a) Using video metadata
 - b) Using text
 - c) Keyframe image matching
 - d) Using semantic concepts and features
 - e) Using video objects
- 3. MMIR Evaluation
 - a) TREC
 - b) Copycat evaluations
 - c) TRECVid
- 4. Challenges and issues



Retrieval of Spoken Documents

- From an IR perspective the retrieval of spoken documents is the most straightforward extension from text retrieval.
- Here we use text requests to search document content.
- However, the contents of spoken documents are not immediately available for indexing.
- An ideal solution would be to generate a perfect transcription of the spoken data then treat the document as text data and apply standard text information retrieval.
- But, perfect transcriptions are not available:
 - perfect automated transcription is not possible
 - full manual transcription is usually uneconomic.
- Speech recognition systems can be used to generate imperfect index information for the documents.
- Index errors arising from errors in speech recognition will reduce the performance, but overall retrieval can still be good enough to be useful.



Speech Recognition: An Introduction

- Human processing of spoken language is highly sophisticated, and unfortunately, currently poorly understood.
- Speech recognition can be thought of as a decoding task, specifically decoding air pressure wave signals into a written word signal.
- The speech signal is captured using a microphone and an audio amplifier. This signal is then sampled using an analogue-to-digital converter.
- A typical sample rate for telephone speech is 16,000 sample/second with 16 bits per sample, resulting in a data rate of 320,000 bits per second.
 - Data rates for hi-fi signals are much higher, e.g. CD uses 16-bits at 44.1kHz.
- A combination of efficient recognition algorithms and high-power computers are needed to achieve real-time speech processing.



Speaker Variability

- The speech patterns of different people show significant variations.
- Even for a given speaker every individual utterance of a word is unique.
- There may be changes in:
 - speed of delivery
 - the pitch of the voice
 - the pattern of stressing
 - the volume
 - background noise conditions
- Really it's remarkable that human listeners have the perception that the same word is spoken on each occasion!



Acoustic Ambiguity

Some words are acoustically ambiguous. For example,
 to, too and *two*

are homophones which sound the same.

- Also, some words only have a very small acoustic distinction. For example,
 - bee and pea,

while not true homophones, can be highly confusable, especially when the initial consonant is not well articulated.

 Early speech recognition was single, discrete words but current systems allow continuous speech recognition, i.e. recognition of flowing speech without silent gaps between words.



Context-Dependency

- All words can be broken down into a small set of constituent sounds, referred to as the phones of the language.
- English has about 45 distinct phones.
- For example, speech is composed of the phones s p iy ch
- Each phone can be produced a number of ways depending on its context, leading to slight variations in its sound.



Word vs Subword Recognition

- Current speech transcription systems typically have a vocabulary of around 80,000 words.
- Attempting to recognise 80,000 word models in parallel is not computationally possible.
- Also there are significant issues in availability of training data.
- The required recognition task can be dramatically reduced by performing recognition at the subword phone level. All words are recognised from their constituent phones.
 - This is not simply a phone level recogniser. A phonetic dictionary is used to constrain the allowed phone sequences to allow only those of real words.



Phonetic Modelling

- A basic approach to phone level recognition would be to simply have 45 HMM acoustic phone models and a phonetic dictionary showing the phonetic composition of each word.
 - e.g. the phrase ``Beat It!" is represented by the phone sequence

sil b iy t ih t sil

- However, since phones are context-dependent a more sophisticated approach is required.
- The most common subword model in speech recognition is the triphone. In a triphone model a unique acoustic phone model is trained for each left and right phone combination.
- The previous example becomes

```
sil sil-b+iy b-iy+t iy-t+ih t-ih+t ih-t+sil sil
```


Centre for Digital Video Processing

Phone Lattice Spotting





Document Indexing - Phone Lattice Spotting

- The phone lattice is effectively a very constrained search-space of possible document contents.
- Advantages:
 - open vocabulary any word can be indexed at retrieval time.
 - very rapid indexing of any search word.



Example: Taiscealaí

- Our own Taiscealaí RTÉ news archive search did the same thing and was a real operational system which ran for 18 months.
- In the implementation, Taiscealaí, queries (text) were turned into phones via a dictionary lookup and the matching was a bag of tri-phones against bags of triphones.
- This project for RTÉ radio news broadcasts, recognised phones, chopped the stream of news into overlapping windows, and generated a document for each window as a retrievable unit of information (see online link to Taiscealaí paper).

Taiscealaí





Centre for Digital Video Processing

Content based retrieval of music

- Waveform matching?
 - It is difficult for a human to produce a perfect query which would support perfect note-note matching of audio documents, so some alternative is needed.
- MIDI is easy because...
 - Notes are available
 - Indexing terms are n-grams of notes...
- However if PCM or MP3 there are issues...
 - We must extract the notes...
 - Monophonic is not too difficult.
 - Polyphonic is difficult.
 - Once the notes are extracted we can then do conventional (text) retrieval.



Ceolaire

- CEOLAIRE supported IR on digital music by matching user's music queries directly against the melody content of recorded songs.
 - monophonic as opposed to polyphonic music.
 - CEOLAIRE processed music files stored in PCM or MP3.
- Songs were represented in CEOLAIRE in UDS format.
 - The sequence of note changes are used to represent both music and user's queries and matching occurs between these.



Ceolaire

Centre for Digital Video Processing



Multimedia IR (Smeaton)

- UDS Up, Down, Same
 - a perceived change in pitch is enough to match tunes from human memory.
 - Hence indexing music by UDS could work.
- The melody of a music file is defined by comparing the change from one note to the next.
 - irrespective of any timing information.
- UDS string n-grammed (size 6 worked best in Ceolaire)
 - Each n-gram is a term in the music document
 - Retrieval was using BM25... (text IR)



Contents

- 1. IR vs. Information Seeking, and why it is hard
- 2. MMIR
 - a) Key approaches and issues
 - b) IR on Audio spoken and musical
 - c) IR on Images
 - d) The nature of video
 - e) Commercial video IR systems
 - f) Experimental approaches (5)
 - a) Using video metadata
 - b) Using text
 - c) Keyframe image matching
 - d) Using semantic concepts and features
 - e) Using video objects
- 3. MMIR Evaluation
 - a) TREC
 - b) Copycat evaluations
 - c) TRECVid
- 4. Challenges and issues



IMAGE Retrieval

- Retrieval from image archives of:
 - Photos, technical drawings, legal documents, www images...
- Two types (for this lecture):
 - Text-based Image Search
 - Manual Annotation
 - Automatic Annotation, e.g. Google Image Search
 - Content-based Image Search
 - Low-level features
 - Colour, texture, etc...
 - Higher Level Attributes
 - Extracting semantic objects or meaning from images



Centre for Digital Video Processing

Text Based Image Search



Images

Web Images Groups News more »

SafeSearch is off

schloss Neuschwanstein

Search Advanced Image Search Preferences

Results 1 - 20 of about 2,270 for schloss Neuschwanstein . (0.40 seconds) Show: All sizes - Large - Medium - Small



schloss-neuschwanstein.jpg 400 x 300 pixels - 16k www.familienfreizeittipps.de/ schlossneuschwa...



umgebg2min.jpg 194 x 206 pixels - 9k www.posthotel-ettal.de/html/ ettal___bavaria.html



schloss-neuschwanstein.jpg 296 x 522 pixels - 32k guide.supereva.it/.../ 2001/03/36683.shtml



neuschwanstein.jpg 350 x 458 pixels - 39k www.bayerntours.com/.../ neuschwanstein.htm



schloss_neuschwanstein.jpg 600 x 423 pixels - 51k www.tourist-world.net/xxlnews/ schloss_neuschw



neuschwan.jpg 280 x 350 pixels - 16k www.ferienlandhaus.de/ fern.htm



neuschwa.jpg 240 x 207 pixels - 13k www.mvdaily.com/articles/ 2002/11/munich01 htm



neuschwanstein.jpg 170 x 180 pixels - 14k www.meteme.de/projekte/ neuschwanstein.shtml





Automatic Text-based Indexing

- Using latent data from web page text to annotate images with textual description.
- Many possible sources:
 - Alternate text
 - Image URL
 - E.g. http://www.seriouswheels.com/ferrari/ Ferrari-360-Modena-Coupe.jpg.
 - Neighbouring Text
 - Same Paragraph Text
 - Title
 - Heading
 - most recent heading prior to each image.
 - Anchor text
 - Windowing if necessary
 - Other terms
 - Any term on the web page





Content-based Image Search

- Why?
 - Security, intellectual property, scientific imaging, large archives...
- How?
 - By examining the content of each image and extracting indexable data.



- Do this for each image in a collection.
- Do similar for any query image(s) and calculate distance between query and indexed images, thereby producing a ranked list.



How to query?

- How to query a content-based image retrieval system:
 - User query specification
 - required colours, textures, etc...
 - ... or required features
 - ... or keywords
 - User drawing as input
 - Basic image requirements
 - Spatial arrangement
 - Query by example
 - Images with similar composition
 - Relevance Feedback









based on automatic extraction. Signal Processing - Colour and Texture primarily. I ow level features Using Higher Level Attributes - Semantic Concepts Often based on low-level features. Requires feature detectors.

Using low-level features

Two levels of Content-Based Retrieval



Computer Vision

Semantic Concepts

AI

Abstract Attributes



Using Low-level Features

- Low-level features are basically:
 - Colour
 - Texture
 - Shape
 - Spatial arrangement of the above
- Combining multiple sources together produces better results than one alone.
 - Weighted Fusion .. Usually based on training examples or query image categorisation.
- Using low-level features allows us to:
 - rank images w.r.t. a query image(s) based on visual similarity.
 - Rank images based on relevance feedback.



Example using Colour Histogram



- Take a sample image, convert to histogram and use to query the image index.
- Small variations in colour can lead to non-matches...
 - so we group perceptually similar colours together into colour bins.
 - A limited number of colour shades (10 to 15) are sufficient for visual discrimination.



Centre for Digital Video Processing

Centre for Digital Video Processing

Example Retrieval using Colour (QBIC)

http://www.hermitagemuseum.org/



use in your search.

Example Retrieval using Colour (QBIC)



1) <u>View of the</u> <u>Valhalla near</u> <u>Regensburg</u>

Klenze, Leo von

3) An Angler

1836



2) <u>Bouquet (Vase</u> with Two <u>Handles)</u>

Centre for Digital Video Processing

Matisse, Henri 1907





Amaral, Tarsila do Mid-1920s

5) Black Square

Malevich, Kazimir

Severinovich Circa 1930



4) <u>Coast View</u> with Apollo and the Cumaean <u>Siby</u>

Gellee, Claude (Le Lorrain) Between 1645 and 1649

6) <u>Portrait of</u> <u>Suzanne Dufy,</u> <u>the Artist's Sister</u>

Dufy, Raoul 1904

7) <u>Pfaueninseln</u>

Lutke, Peter Ludwig 1821



8) <u>Piazza Santa</u> <u>Trinita, Firenze</u>

Garibbo, Luigi (Louis) 1829





l n g

Example Feature Fusion

 Colour, texture and perceptual grouping (structure)

http://amazon.ece.utexas.edu/~qasim/cires.htm

Query Image



Weights: Perceptual Grouping = 0.2, Color = 0.4, Texture = 0.4, L, A, B channels

Query Image



Weights: Perceptual Grouping = 0.4, Color = 0.2, Texture = 0.4, L channel only.



Perceptual Grouping=0.2, Colour=0.4, Texture=0.4



Perceptual Grouping=0.4, Colour=0.2, Texture=0.4

weighted fusion

Multimedia IR (Smeaton)



Higher Level Attributes : Semantic Concepts

- Using low-level features is ... UGH !
- Semantic Gap
 - A human interpretation of an image is not as colour, texture or any other low-level feature. Rather the human interpretation is naturally occurring semantic concepts.
- In images we have semantic concepts:
 - **objects** such as chairs, cars, crowds...
 - named specific individuals.
 - specific features of the image:
 - indoor/outdoor or landscape/cityscape.
- Retrieval is based on identifying and indexing images by concepts.



Try to find this using colour, texture & shape !





Centre for Digital Video Processing

Semantic Concept Detectors

- Semantic concept detectors have been difficult to develop.
- Even in closed domains such as images from TV NEWS video, the detection rate for such features is not high.
- Annotation effort to help this process.

TV2004 Feature Extraction Results

	Boat	Albright	Clinton	Train	Beach	Basket	Airplane	Walking	Violence	Road
Avg	0.0506	0.0465	0.0921	0.0180	0.0174	0.2380	0.0426	0.0754	0.0264	0.0705
Mdn	0.0420	0.0495	0.0525	0.0020	0.0640	0.2630	0.0325	0.0610	0.0085	0.0680
High	0.1370	0.3040	0.2220	0.1090	0.0640	0.5610	0.1280	0.1700	0.0860	0.1470
Low	0.0010	0.0000	0.0010	0.0000	0.0010	0.0000	0.0020	0.0080	0.0000	0.0030



Higher Level Attributes : Inferred Concepts

- Detecting the meaning of an image...
 - A more natural representation of an image.
 - The semantic gap again!
- Inferred abstract attributes of an image:
 - do not correspond to any direct content in the image.
 - e.g. if we have football players and a goalpost and a football, then we have a football match.
- High-level to low-level image retrieval:
 - find images of a football match as opposed to;
 - find images of 2 footballers and a football as opposed to;
 - images of green with a grass texture, and two splashes of black&white in a striped arrangement with a black/white circular pattern in the middle of the two splashes



Overall Concept Detectors



"Picture of a storm over a city"

"Picture of an F1 motor race"



Managing Digital Photos

- Of course complex content analysis is not always necessary.
 - E.g. digital photos.
 - Current software uses time/date and manual annotation.
 - BUT: Cameras capture context metadata
 - Time, flash, brightness, etc...
 - Adding location allows us to infer:
 - Daylight status and weather.
- Addition of feature detectors will help:
 - Feature detectors such as:
 - Known people, building and other object, scene, baby, and may more detectors.
- This gives us a very useful personal photo content management system



Example context-based photo tool



SEARCH SUMMARY

Browse the events below and view more photos in each event. Click on a photo to see full-size. [INDIVIDUAL PHOTOS]

Centre for Digital Video Processing



Multimedia IR (Smeaton)



Tools for organising, browsing and retrieving from a personal electronic picture collection

TOTAL #PHOTOS: 1722

LOCATION

0

Select the placed where the photos were taken. SRESET

COUNTRY	STAT	E/COUNTY	CITY/TOW	N
UNITED ST	FATE: 🔽 🛛 Maryl	and 💌	Any	~
TIME	PANGE			
Set start a	nd end time fo	r your search	n. 🕨 o	ALENDAR
2001	2002	2003	2004	2005
			-	
LECTION:	5 EVENTS	26 PHOT	ios 🤇	бноw »

PHOTO DETAIL

This is a full-size photo. Amend annotation, or find similar photos. [BACK]

Date:	16-11-2004	
Time:	11:14pm	😑 Faces Detected: 3
Location:	District 9 (Gaithersburg) Election District, Maryland, UNITED STATES	Hide Faces



10

Contents

- 1. IR vs. Information Seeking, and why it is hard
- 2. MMIR
 - a) Key approaches and issues
 - b) IR on Audio spoken and musical
 - c) IR on Images

d) The nature of video

- e) Commercial video IR systems
- f) Experimental approaches (5)
 - a) Using video metadata
 - b) Using text
 - c) Keyframe image matching
 - d) Using semantic concepts and features
 - e) Using video objects
- 3. MMIR Evaluation
 - a) TREC
 - b) Copycat evaluations
 - c) TRECVid
- 4. Challenges and issues



What is Digital Video?

- Sequence of images (25-30 fps) often with audio.
- Mostly compressed:
 - Many encoding formats
- Video is structured:
 - So what is the unit of retrieval?
 - Dependent on task



Centre for Digital Video Processing

DCU

The Nature of Video

- Video is a collation of images presented so fast they give the illusion of motion;
- A "programme" is divided into logical scenes, and a scene is composed of 1 or more camera shots;
- A shot is a single motion of a camera in time and can involve camera motion like panning, zooming, tracking or booming;
- Objects in a camera shot can also move;
- Shots can transition using fade in/out, fade to black, wipes, or the more usual hard cut;
- There's an awful lot of video 10,000 TB = 1M hours of original TV and radio content in 2002;



Problems with Video ?

- Many of the issues associated with video in digital form are solved !
 - Capture, formatting, compression, storage, transmission, rendering on fixed and mobile
- Digital video is widespread and outstanding challenge(s) are managing video content;
- Key catalyst in this has been compression format standards;
- There are several (!) AVI, QuickTime, WMV, etc. but the ones that matter are MPEG;

MPEG Family

- MPEG-1

- VCD (352x288 @ 25fps), for CD-ROMs and higher
- MPEG-2
 - DVD (720x576 @ 30fps), and higher
 - Better compression
- MPEG-4
 - Very low bit rates, better compression
 - Object based encoding
- MPEG-7
 - XML based video, audio and content description language... for describing content.



Centre for Digital Video Processing

Managing Video

- Managing means many things
 - Analysis, indexing, summarising, aggregating, browsing and searching;
 - Some of these are very domain dependent eg sports vs. TV sitcom summarisation;
- Video analysis & search has much overlap with image
 - + easily scalable to larger volumes;
 - doesn't take advantage of object/camera motion
- Good example of this is automatic structuring of video, necessary in order to make any progress in managing it - a.k.a. shot bound detection;



DCU

Shot Boundary Detection

- A shot in video information is a sequence of continuous images (frames) from a single camera.
 - Shots are the retrieval units used by TREC for video IR
 - A shot boundary is crossed when a new camera is used, or a recording instance ends and a new one begins.
- The task of SBD or automatic video segmentation is to segment video into its constituent shots...
 - Why? To allow content-based operations over video at granularity of shot units.
 - Browsing
 - Searching
 - How? By examining exery X frames / adjacent frames to look for shot cuts.
 - Simple shot cuts are easy to process



Centre for Digital Video Processing




Centre for Digital Video Processing

Shot Boundary Detection



- But it can be quite difficult because of camera tricks:
 - Dropped Shot Boundaries
 - fade-in and fade-out
 - dissolving
 - morphing
 - Wipes
 - Many other chromatic effects
 - False Shot Boundaries
 - zooming and panning
 - tilting,
 - booming and tracking
 - events in the content itself







DCL

MPEG-7 Features

- Just as MPEG-1, -2 and -4 have catalysed video technology, MPEG-7 content description is enabling content applications;
- MPEG-7 describes basic characteristics of AV content e.g. shape, colour, texture, and user-defined;

MPEG-7 Colour

- Dominant colour(s) for object, region or image/frame;
- Colour layout;
- Colour structure;
- Scalable colour (colour histogram)





MPEG-7 Texture

- Texture is a measure of property such as smoothness, coarseness and regularity;
- Homogeneous texture and non-homogeneous texture (edge histograms) for regions, objects and frames/images;



Multimedia IR (Smeaton)



DCU

MPEG-7 Shape & Motion

- Contour-based shapes for image/frame or regions;
- Camera motion, motion intensity, motion trajectory;



Contents

- 1. IR vs. Information Seeking, and why it is hard
- 2. MMIR
 - a) Key approaches and issues
 - b) IR on Audio spoken and musical
 - c) IR on Images
 - d) The nature of video

e) Commercial video IR systems

- f) Experimental approaches (5)
 - a) Using video metadata
 - b) Using text
 - c) Keyframe image matching
 - d) Using semantic concepts and features
 - e) Using video objects
- 3. MMIR Evaluation
 - a) TREC
 - b) Copycat evaluations
 - c) TRECVid
- 4. Challenges and issues



VIDEO Retrieval

- A 'hot' topic for IR.
 - Annual TRECVid workshop driving research.
 - Vast quantities of digital video.
 - E.g. the BBC archive has +500k queries/year plus many millions of items.
- Why Video IR?
 - Large Archives
 - Broadcasters, Archivists, Personal Collections...
 - Manual Annotation is too tedious and time consuming.
 - Automatic Indexing is key.
- What video?
 - Television, NEWS, stock footage, movies, home videos, CCTV surveillance, music videos...
 - ... and then there is recent public video like YouTube



- Virage provide a suite of multimedia data management tools, e.g. VideoLogger:
 - Generates storyboards of video content
 - Extracts closed caption text
 - Can be expanded to:
 - Identify faces, voices, sounds.
 - Extract OCR (text on screen) and ASR (spoken) text.
 - Generates searchable archives of video content.





Example Web-based Systems



car race

Search Preferences

Video

Results 1 - 10 of about 1185 for car race (0.14 seconds)



Triplets and Quints

The birth and care of triplets; quintuplets celebrate their third birthday.

Search: 💿 plavable video 🦳 all video

... DAY? 170 Diapers a week? 5 Car seats? 60 Fingers and 60 toes to clean. Super! Narrator: the Marvel of modern science has more families than ever before on a multiple-birth Marathon. This is the story of two families who are winning the race against the endless ups and... Discovery Health - Sat Jun 18 2005 at 1:00 PM PDT - 1 hour



Cops

An officer responds to a robbery-in-progress call at a nearby fast food restaurant. ... you? >> Stankevitz: uh, no. No. It would have been lights out YOU ARE THE DESIGNER. You are the driver. Forza motorsport. You are what you race. Rated e for everyone. It's how ifeel I lookin it. So, of course, I'm very careful... About how I wash my blacks. I always... KTVU - Fox Network - Sat May 21 2005 at 8:00 PM PDT - 30 minutes



George Michael Sports Machine

Highlights, features, live interviews, rumors and sports gossip.

... at 155 nudge. It does big damage. Stewart hits Gordon and Gordon goes into the Wall. He puts that car into the Wall and that would be the end of his race day. Behind him, cars are going everywhere. Ricky Rudd got hit. I don't know how in the world... KNTV - NBC Network - Mon Jun 6 2005 at 12:00 AM PDT - 30 minutes



NBC Nightly News

The latest world and national news.

... Federal agent took two men into custody in connection with the disappearance of 18-year-old Natalee Holloway. They seized bags of items and a **car**. >> They are concerned over the various sorts of crimes. >> Both men are former security Guards at a Beach front hotel that is closed for... KNTV - NBC Network - Sun Jun 5 2005 at 5:30 PM PDT - 30 minutes

Decorating Cents



Centre for Digital Video Processing

Example Web-based Systems

 Web | Images | Video | Directory | Local | News | Shopping

 Car race

Video Results

SafeSearch is OFF Advanced Search Preferences Video Search Help Results 1 - 20 of about 2,542 for car race. Search took 0.15 seconds.



Jerry_Was_A_Race_Car_Driver.mov 130×97 - 163 sec - 7.7MB www.sawbladesoftware.com/portfolio/ videos



Unknown Race Car 2.mpg 145×116 - 33 sec - 4.4MB aserverjustfor.us/videos/CoxCable4



Search

Best_Motoring-SuperCar_Race.mpa 145×98 - 554 sec - 34.5MB dieamond.kicks-ass.net/videos



start_of_formula_car_race.avi 140×105 - 30 sec - 7.9MB www.michaelp.org/photos/cars/ limerock_2003/racing



Unknown Race Car 1.mpg 145×116 - 12 sec - 1.7MB aserverjustfor.us/videos/CoxCable4



Race_Car_Flips_and_Crashes.mpeg 145×107 - 11 sec - 1.9MB www2.fhsu.edu/~caweber/Video



RACE CAR SIMULATOR.AVI 140×105 - 30 sec - 8.4MB www.racecarsimulator.com/



2003 IP Control car.mpg 145×98 - 308 sec - 55.2MB www.kr.apan.net/hyeonhae/ 11th-meeting/index.shtml



Nasty Race Car Crash.mpeg 145×107 - 3 sec - 580.0kB



Race_Car_Flips_and_Crashes_2.mpeg 145×98 - 18 sec - 1.7MB



Unknown Race Car 3.mpeg 145×108 - 7 sec - 1.3MB



Car Race_Suewadu.wmv 140×105 - 37 sec - 1.0MB



Centre for Digital Video Processing

DCU

Example Web-based Systems



Contents

- 1. IR vs. Information Seeking, and why it is hard
- 2. MMIR
 - a) Key approaches and issues
 - b) IR on Audio spoken and musical
 - c) IR on Images
 - d) The nature of video
 - e) Commercial video IR systems

f) Experimental approaches (5)

- a) Using video metadata
- b) Using text
- c) Keyframe image matching
- d) Using semantic concepts and features
- e) Using video objects
- 3. MMIR Evaluation
 - a) TREC
 - b) Copycat evaluations
 - c) TRECVid
- 4. Challenges and issues



Video Navigation Approaches

1. Use metadata and browse keyframes

- 2. Use text from speech ASR/CC/in-video OCR
- 3. Match keyframes vs. query images
- 4. Use semantic video features
- 5. Use video/image objects as queries

1. Using Video Metadata

- Video metadata searching is a classic DBMS application;
- Metadata includes title, date, actor(s), producer(s), genre, running time, video format, reviews, ratings, ©, etc.
- Most coupled with keyframe / storyboard previews

Centre for Digital Video Processing Internet Movie Archive 000 Internet Archive: Moving Image Archive 局合 In http://www.archive.org/details/movies • 0 G. **MOVIE ARCHIVE** Web | Moving Images | Texts | Audio | Software | Education | Patron Info | About | A Prelinger Archives | Open Source Movies | Feature Films | Computer Chronicles | Net Café | Democracy Now | Cinemocracy | Election 2004 | Independent News | Home Youth Media | SIGGRAPH | Open Mind | Shaping San Francisco | Brick Films | Game Videos | Film Chest Vintage Cartoons | Mosaic Middle East News | AV Geeks | SabuCat Movie Trailers | World at War | Universal Newsreels | Media Burn | BBS Documentary Video Collection | German Cinema | Globians Film Festival | Deep Dish TV | The Beat Within I UCSF Tobacco Control Archives - GOD Advanced Search Anonymous User (login or join us) Search: Moving Images (what's this?) Spotlight Item Welcome to Moving Image Archive 32,047 items Top Batting Averages See recent additions - RSS 1. Devil May Cry (PS) -100% Dante Must Die! 1:55:05 -Sub-Collections Michael McEnroe Batting average: 66.28% Prelinger Archives 1.975 items Booked for Safekeeping Prelinger Archives was founded in 1983 by Rick Prelinger in New York City. Over the next twenty 2. Eve of Destruction (Part I) vears, it grew into a collection of over 48,000 "ephemeral" (advertising, educational, industrial, and... Fascinating documentary Batting average: 66.26% made to train police officers **Open Source Movies** 18.830 items in the assistance and This collection is open to the community for the contribution of any type of video, many licensed 3. 9 Questions with management of mentally ill using Creative Commons licenses. Please feel free to contribute your movies! (Uploaders, please try... Mark Achbar and confused persons, Batting average: produced in New Orleans by 65.21% **Feature Films** 643 items eminent filmmaker George This collection houses a number of classic public domain feature films and shorts, now available for C. Stoney using real New 4. Design Of Signage viewing and downloading at the Internet Archive. Orleans police officers as VJ Clips actors. A little-known Batting average: ethnographic classic that is **Computer Chronicles** 571 items 63.78% strongly rooted in... Hosted by Stewart Cheifet, Computer Chronicles was the world's most popular television program 5. Red vs. Blue on personal technology during the height of the personal computer revolution. It was broadcast for ... Episode 23 - The Joy About the Internet Archive of Toggling 129 items Net Café Batting average: Background Net Café was the world's most widely distributed television series covering the Internet revolution 59.88% during the height of the dot com boom. The series was broadcast throughout the United States... **Frequently Asked Questions** Democracy Now 283 items Rights Democracy Now! is a national, daily, independent, award-winning news program airing on over 375 Most Downloaded Items stations in North America. Pioneering the largest public media collaboration in the U.S., Democracy... This collection is free and 1. Tsunami - Phuket open for everyone to use. 13 items Cinemocracy 595.676 downloads In the early 1940s, the United States government commissioned some of the best filmmakers of all 2. Tsunami - Koh Lanta. Our goal in digitizing these time to create propaganda in support of the war effort. The works of the most famous of those movies and putting them Thailand 556,236 downloads online is to provide easy -------------





Terms of Use (10 Mar 2001)



	Centre for Digital Video Processing			
Inter	net Movie A	rchive		
000	Thumbnails for Night of the Living Dead			
🔶 📄 🔯 💿 ট 🏠 🚔 🔽 http://ww	w.archive.org/movies/thumbnails.php?identifier=nig	ght_of_the_living_dead 🔹 🔘 🕞) *	
Web Moving Images Texts Audio Softwar	e Education Patron Info About IA		MOVIE ARCHIVE	
Home Prelinger Archives Open Source Movies Feat Youth Media SIGGRAPH Open Mind Shapin SabuCat Movie Trailers World at War Univers The Beat Within UCSF Tobacco Control Archiv	ure Films Computer Chronicles Net Café Democ g San Francisco Brick Films Game Videos Film al Newsreels Media Burn BBS Documentary Vide res	racy Now Cinemocracy Election 2004 Indep Chest Vintage Cartoons Mosaic Middle East I o Collection German Cinema Globians Film F	endent News News AV Geeks ⁻ estival <u>Deep Dish TV</u>	
Search: Feature Films	Advanced Search	Ano	nymous User (login or join us)	
Thumbnails for Night of the Living Dead	Below are images for each minute in the program	<u>Return :</u> n.	to Program Details	
en e				
			E.	
		- Alth		

0	The Open Video Project	
🔶 🧭 🔕 🖏 🟠 🚔 🤒 🖍	://www.open-video.org/	• O (G-
THE OPEN VIDEO PROJECT a shared digital video collection		• Home • Contribu • About
arch		Project News
ex. "water" or "space shuttle"	Detailed Search	Teachers using video? CHI videos added Redesigned Project Web Site Understanding Video Symposium more.
owse		Featured Video
ienre	Duration	• New
Documentary [494] Educational [1072] Ephemeral [1139] Historical [187] Lecture [33] Other [5] Public Service [17]	 Less than 1 minute [259] 1 to 2 minutes [330] 2 to 5 minutes [669] 5 to 10 minutes [577] More than 10 minutes [1092] 	Three-dimensional Input, Modification and Evaluation Other new videos • ACM CHI 1984 Issue 12 - Selection-positioning Task Study
Color	Sound	ACM CHI 1985 Issue 18 - Designing a 'No Surprise Editor'
In color [1908] In black & white [1039]	 With sound [2550] Silent [397] 	prototype • Tribute To World War II NISEI Veterans - Inouye more
ollections		Benular
University of Maryland HCIL Open House Video Report: The Informedia Project at Carnegie Mellon University Internet Moving Images Archive 2001 TREC Video Retrieval Test Collection CHI Video Retrospective Digital Himalaya Project NASA K-16 Science Education Programs	s	Atom Bomb - Joe Bonica's Movie of th Month Other popular videos • Classic Television Commercials (Part II) • NASA 25th Anniversary Show,
ecial Collection Spotlight		Segment 01 • Bunjee
NASA K-16 Science Education Programs NASA's Center for Distance Learning, at NA at K-16 students, teachers, and parents. This collection contains 580 videos.	SA Langley Research Center in Hampton, Virginia broadcasts five programs aimed	more.

Home • Search • Collections • Contribute • About • Project News

¥





Metadata based video navigation is limited, but it is easy to do !



2. Using Text Dialogue

- Spoken dialogue can be of assistance in video navigation, and it may not be;
- Spoken dialogue can come from automatic speech recognition (ASR), or closed captions, or video OCR
- For certain genres of video, this can be sufficient

• Físchlar-News is a good example

Centre for Digital Video Processing IV news Cen MPEG-1 encoding News story linkage analysis Web application An MPEG-1 encoded daily 9 o'clock news program (30 min) Shot Boundary User Detection profile News story database Shot segmented program Advertisement SVM (Support Vector Detection Machine) with: Spoken diaogue indexing · Speech vs. music discrimination Anchorperson detection Shot segmented, Story segmented program advert detected Speaker segmentation & matching program

Multimedia IR (Smeaton)





http://www.fischlar.dcu.ie/news/browse/videoStory?content=17306&storyID=story17306_3





Fischlär News: Browse - Microsoft Internet Explorer File Edit View Favorites Tools Help	_ 8 ×
Image: State of the original state of the origina	Soogle
Físchlár-News Online Video Archive of Daily RTE1 9 o'clock News	
Check the recommended news for you RECOMMENDER	-
SEARCH: Bremer GO I think those yearning for the return of Ba'athism will be disappointed. But Lebanese television showed a tape of militant group,	fanew
September 2003 S M T W T F S	
7 8 9 10 11 12 13	
14 15 16 17 18 19 20 Rews Story (duration: 00:04:06) 77 (19 Aug 2003)	
21 22 23 24 25 26 27 A top United Nations envoy to Iraq, Sergio Vieira de Melio, has been killed in a powertu	i truck st and
28 29 30 scores more have been injured (PLAY THIS STORY)	
News Story (duration: 00:01:55)	
August 2003 S M W F S The United States has indicated that it may accept a UN-mandated international	
1 1 2 peacekeeping force, provided it is led by an American (PLAY THIS STORY) 3 4 5 6 7 9	10
17 18 19 20 21 22 23	/iaira
24 25 26 27 28 29 30 24 40 Mello as his special representative for Iraq (PLAY THIS STORY)	nena
31	
News Story (duration: 00:01:53) 771	
July 2003 S M T W T F S The chief US administrator in Iraq, Paul Bremer, has condemned an attack in the west	ofthe
1 2 3 4 5	
	ACCOUNT
Fischlär	
WITH COMMENTS	



3. Keyframe Matching

- ASR based video retrieval is not visual;
- Keyframes extracted as shot representatives can be used for retrieval;
- Requires user to locate images/other keyframes, from browsing, or other search;
- Físchlár-TRECVid2004 is a good example
- The unit of retrieval is a shot



Search found 169 matching shots. Following is the ranked list SEARCH RESULT of the search result. Click an image to play the segment, click button to add to your answers, or click (QUERY) button to improve subsequent query. RESULT PAGE: 1 2 3 4 5 1: CNN News (26 Oct 1998) > MORE MATCHES IN THIS BROADCAST QUERY A QUERY QUERY QUERY QUERY powerful rockets that in nineteen sixty one launched during the government the first person in space this all u. s. launch rockets had failed repeatedly and publicly and there're tests pressure was building devoted american investments 2: ABC News (30 Oct 1998) > MORE MATCHES IN THIS BROADCAST QUERY SAVE > QUERY SAVE > QUERY QUERY SAVE QUERY SAVE > WE > that manages about we've got big he'd be in on board discovery yesterday to launch would have looked like this when is in the middle of this picture are shuttle launch can be built in wrestling but it was far gentler than lives at least one we've that the astronauts back in space again that was quite different than a ride i got before of course back a long time ago > MORE MATCHES IN THIS BROADCAST 3: ABC News (26 Oct 1998) QUERY QUERY QUERY VED QUERY QUERY on wasn't whether one shot mission will been a permanent presence on mars because a mars vehicle would be too heavy to launch from earth it'd be assembled piece by piece in earth orbit

half a dozen astronauts would then take six months to **rocket** the thirty four million miles to mars they'd spend the next year and a half exploring and conducting experiments that had all mission time two and a half years mas is really going to be the place where humans will TASK 1

 \rightarrow FINISH THIS TASK

SAVED SHOTS

Your answer to the task will be listed below. Add more, delete, or use them to help your subsequent query.

-



SEARCH RESULT

Search found 250 matching shots. Following is the ranked list of the search result. Click an image to play the segment, click button to add to your answers, or click button to improve subsequent query.

RESULT PAGE: 1 2 3 4 5



that manages about we've got big he'd be in on board discovery yesterday to **launch** would have looked like this when is in the middle of this picture are shuttle **launch** can be built in wrestling but it was far gentler than lives at least one we've that the astronauts back in space again that was quite different than a ride i got before of course back a long time ago



those were the coldest years of the cold war the soviet military arsenal included powerful rockets that in nineteen sixty one launched during the government the first person in space this all u. s. ${\rm launch}$ rockets





the government the first person in space this all u. s. **launch** rockets had failed repeatedly and publicly and there're tests pressure was building devoted american investments these are the past there have been

4: CNN News (26 Oct 1998)



 \rightarrow FINISH THIS TASK

SAVED SHOTS

Your answer to the task will be listed below. Add more, delete, or use them to help your subsequent query.



SEARCH RESULT

Search found 250 matching shots. Following is the ranked list of the search result. Click an image to play the segment, click button to add to your answers, or click (QUERY) button to improve subsequent query.

RESULT PAGE: 1 2 3 4 5



that manages about we've got big he'd be in on board discovery yesterday to launch would have looked like this when is in the middle of this picture are shuttle launch can be built in wrestling but it was far gentler than lives at least one we've that the astronauts back in space again that was quite different than a ride i got before of course back a long time ago

2: ABC News (27 Oct 1998) > MORE MATCHES IN THIS BROADCAST





everyone is a one shot one each problem bruno with its than once was before with the equivalent of a jetliner four so private companies are racing to design of reusable rocket book a very deep conrad commanded the apollo twelve mission to the moon he says the private sector can do it much cheaper



o'neal nypd blue a. b. c. tonight your discretion advised finally from us this evening the price tag one of the reasons nasa is so focus on public relations this week is plain and simple money there just isn't the nuf money government money to do everything the space agency would like solicit possible that the answer may be less government and more private enterprise is a. b. c.'s jane clayson maybe it can start space travel is expensive that the except for the space shuttle everyone is a one shot one each problem bruno with its than once was before with the equivalent









4. Semantic features for retrieval

- Based upon pre-processing video or keyframes to detect features;
- Features normally from an ontology and thus related;

Indexing by Semantic Features



Multimedia IR (Smeaton)

Centre for Digital Video Processing
Feature-based retrieval

- To date, features in retrieval are independent;
- We must develop feature-based retrieval that uses features in combination;



- 0.2 Indoor
- 0.8 Outdoor
- 0.7 CityScape
- 0.3 Landscape
- 0.1 People
- 0.0 Face
- 0.8 Sky
- 0.2 Vegetation
- 0.7 Building



Feature-based retrieval

 Utilise the dependencies among and between features, from the ontology, into an **overall retrieval** combining individual evidences for each feature;



Building :	0.4
Outdoor :	0.8
Snow :	0.9
Sky :	0.6







Centre for Digital Video Processing

TRECVid: Oulu



Query tool : text + concept search



Centre for Digital Video Processing

Centre for Digital Video Processing

TRECVid Columbia U

Query Input [Reset] Search abbas arafat palestinian january mahme Start Pseudo Rel. WordNet Google Exclude Anchor Exclude Neagtive Sound Similarity Exclude Positive Image	Suggestions Google: edit election gaza fatah yasser united states see abbas' september said people palestinians holocaust groups west term security president power WordNet: yasser instance arab arabian jan gregorian state yisrael authorization authorisation quantity number palestine liberation curate religion NLP Keywords: abbas arafat january mahmoud israel authority prime plo minister Original Query: abbas arafat palestinian january mahmoud israel authority prime plo minister	Execution Time: 0.591857s Started: 09/19 12:21:15 pm [XML][Browse] [Logout eric]
--	--	---



Centre for Digital Video Processing CMU: Interface to Support Rich Visual Sets.

All data Best building shots



5. Object-based video retrieval

- For certain types of user query, with patience, and time, object-based retrieval can help;
- Another Físchlár system shows how it can be done



- Take a simple object, a car
 - 4 wheels, fairly recognisable shape
 - Should not pose problems?



- Well, it is not quite that easy...



Centre for Digital Video Processing

Automatic Understanding of Objects







Centre for Digital Video Processing





Automatic Understanding of Objects









Centre for Digital Video Processing























Multimedia IR (Smeaton)

QUERY PANEL

The images and objects below will be used for searching. Refresh the query panel or add/remove items below and click SEARCH button. [ADD EXTERNAL IMG/OBJ]



SEARCH RESULT

Following is the ranked list of the search result. An image with *i* icon indicates it contains an object within it. Click on **QUERY** button to use an image/object as query, click on **SAVE** button to save this point in bookmark.



SAVED POINT

The saved points in the rush footage are displayed below.

REMOVE

QUERY PANEL

The images and objects below will be used for searching. Refresh the query panel or add/remove items below and click SEARCH button. [ADD EXTERNAL IMG/OBJ]



SEARCH RESULT

Following is the ranked list of the search result. An image with <a>o icon indicates it contains an object within it. Click on QUERY button to use an image/object as query, click on SAVE button to save this point in bookmark.



SAVED POINT

The saved points in the rush footage are displayed below.







QUERY PANEL

The images and objects below will be used for searching. Refresh the query panel or add/remove items below and click SEARCH button. [ADD EXTERNAL IMG/OBJ]



SEARCH RESULT

Following is the ranked list of the search result. An image with <a>o icon indicates it contains an object within it. Click on QUERY button to use an image/object as query, click on SAVE button to save this point in bookmark.

RESULT PAGE 2 3 4 5





SAVED POINT

are displayed below.

The saved points in the rush footage





REMOVE

Video IR ?

- A variety of very different approaches ...
 5 of them in my categorisation;
- Each works well for certain type of query;
- Best search tool is a combination of them all
 - Let user choose the relative weighting;
 - Learn relative weightings based on query types;



Contents

- 1. IR vs. Information Seeking, and why it is hard
- 2. MMIR
 - a) Key approaches and issues
 - b) IR on Audio spoken and musical
 - c) IR on Images
 - d) The nature of video
 - e) Commercial video IR systems
 - f) Experimental approaches (5)
 - a) Using video metadata
 - b) Using text
 - c) Keyframe image matching
 - d) Using semantic concepts and features
 - e) Using video objects

3. MMIR Evaluation

- a) TREC
- b) Copycat evaluations
- c) TRECVid
- 4. Challenges and issues



TREC - the original of the species !

- IR has always been empirically-based in terms of self-evaluation;
- TREC began in 1991 as a reaction to small collection sizes & need for coordinated evaluation;
- Run by NIST and funded by DoD/ARDA;
- Set out initially to benchmark the search & retrieval operation on text;
- Approach is always metrics-based focus on evaluation of search performance
- Measurement is Precision & Recall;



TREC Operation

- Operation of TREC was established from the start:
 - Acquire data & distribute to participants;
 - Formulate search topics and release to participants en bloc;
 - After about 4 weeks accept submissions of top-1000 ranked documents per search topic;
 - Pool submissions top100 and use intelligence analysts to make binary relevance judgments;
 - Calculate P&R and other derived measures and distribute results;
 - Host workshop in NIST in November;
 - Make plans, and repeat annually ... for the next 16 years !



TREC Tracks

- After initial search task there was strong interest in diversification;
- This led to the development of "tracks";
 - See next slides
- Bonus is that TREC test collections are large enough so that they realistically model operational settings.
- Most of today's commercial search engines include technology first developed in TREC.



2006 TREC Tracks

• Blog Track

A new track in 2006 to explore information seeking behavior in the blogosphere.

• Enterprise Track

A new track in 2005 to study enterprise search: satisfying a user who is searching the data of an organization to complete some task.

Genomics Track

To study retrieval tasks in the domain of genomics data (broadly construed to include not just gene sequences but also supporting documentation such as research papers, lab reports, etc.) The genomics track first ran in 2003

• Legal Track

A new track in 2006 to develop search technology that meets the needs of lawyers to engage in effective discovery in digital document collections

• Question Answering Track

To take a step closer to information retrieval rather than document retrieval

• SPAM Track

New in 2005 to provide a standard evaluation of current and proposed spam filtering approaches, thereby laying the foundation for the evaluation of more general email filtering and retrieval tasks.

• Terabyte Track

First run in 2004 to investigate whether/how the IR community can scale traditional IR test-collection-based evaluation to significantly larger document collections



Past TREC Tracks

• Cross-Language Track

Investigates the ability of retrieval systems to find documents that pertain to a topic regardless of the language in which the document is written.

• Cross-Language Track

CL was run in 2002, now studied in both CLEF and the NTCIR workshops.

• Filtering Track

User's information need is stable (and some relevant documents are known) but there is a stream of new documents and the system must make a binary decision as to whether the document should be retrieved

• HARD

To achieve High Accuracy Retrieval from Documents by leveraging additional information about the searcher and/or the search context, through techniques such as passage retrieval and using very targeted interaction with the searcher.

• Interactive Track

Studies user interaction with text retrieval systems, carry out studies with real users using a common collection and set of user queries.

• Novelty Track

Investigate systems' abilities to locate new (i.e., non-redundant) information.

• Robust Retrieval Track

Traditional ad hoc retrieval but with the focus on individual topic effectiveness rather than average effectiveness

• Video Track

Video track devoted to research in retrieval of digital video.

• Web Track

Featuring search on a document set that is a snapshot of the World Wide Web.



Number of participants per track and total number of distinct participants in each TREC

Track	TREC											
	92	93	94	95	96	97	98	99	00	01	02	03
Ad hoc	18	24	26	23	28	31	42	41				
Routing	16	25	25	15	16	21						
Interactive			3	11	2	9	8	7	6	6	6	_
Spanish			4	10	7	_		_				_
Confusion				4	5	_		_				_
Database merging	_	_	_	3	3	_	_	_		_		_
filtering	_			4	7	10	12	14	15	19	21	—
Chinese					9	12						
NLP					4	2						
Speech				_		13	10	10	3			
Cross-language				_		13	9	13	16	10	9	_
High precision						5	4					
Very large corpus							7	6				
Query							2	5	6			
Question answering								20	28	36	34	33
Web	_			_		_		17	23	30	23	27
Video	_	_	_		_		_			12	19	
Novelty	_	_	_	_	_	_	_	_		_	13	14
Genome	_			_		_		_				29
HARD												14
Robust	_	_	_	_	_	_	_	_	_	_	_	16
Total participants	25	31	33	36	38	51	56	66	69	87	93	93



TREC Contribution

- TREC was the original, it defined the modality, focused attention on evaluation campaigns and their usefulness, had real impact on the quality of (text) IR, reared a generation of IR researchers and spawned nearly 000's of papers;
- TREC also spun off a large number of copycat evaluation campaigns;
- TREC continues now, 15 years later, as strong as ever (c.100 participants)
- TREC Overview at http://mitpress.mit.edu/catalog/item/default.a sp?ttype=2&tid=10667&mode=toc



Contents

- 1. IR vs. Information Seeking, and why it is hard
- 2. MMIR
 - a) Key approaches and issues
 - b) IR on Audio spoken and musical
 - c) IR on Images
 - d) The nature of video
 - e) Commercial video IR systems
 - f) Experimental approaches (5)
 - a) Using video metadata
 - b) Using text
 - c) Keyframe image matching
 - d) Using semantic concepts and features
 - e) Using video objects
- 3. MMIR Evaluation
 - a) TREC
 - **b)** Copycat evaluations
 - c) TRECVid
- 4. Challenges and issues



"Copycat" Evaluation Campaigns

- Following the Success of TREC, many evaluation campaigns have been launched;
- Not competitions, not just workshops, really "benchmarking evaluation campaigns";
- Most follow the TREC model, which in turn follows the Cranfield model;
- Related to video IR, in no particular order ...

"Copycat" Evaluation Campaigns

- CLEF
- NTCIR
- INEX
- VACE
- ETISEO, PETS
- AMI
- ImagEval, Benchathlon
- CLEAR = VACE \cap CHIL
- All are metrics-based, all use XML for data submission and exchange;



Cross-Language Evaluation Forum

- Tests aspects of mono- and cross-lingual IR;
- 2006 is the 7th in the annual series, DELOS funded, 74 groups;
- Proceedings online; 8 tracks in 2005
 - Mono-, bi- and ML doc retrieval on news;
 - Mono- and cross-lingual retrieval on structured scientific data;
 - Interactive CL information retrieval;
 - ML question-answering;
 - CL retrieval in image collections;
 - CL spoken document retrieval;
 - CL geographic retrieval;



Cross-Language Evaluation Forum

- 7 different document collections including 2M news documents, in 12 languages;
- Bulgarian, Dutch, English, Finnish, French, German, Hungarian, Italian, Portuguese, Russian, Spanish & Swedish;
- Herculean effort in securing permission for data provision;
- Task-specific details very much driven by the participants with loose control from the funders;
- Big team effort;



NTCIR

- Like CLEF, except Asian, and not as big !
- 2005 was 6th running;
- Like CLEF, NTCIR follows TREC quite faithfully;
- 4 tasks
 - ML, Bilingual and single language IR on Chinese, Korean and Japanese
 - Cross-lingual question-answering seeking named entities in Chinese, English, Japanese pairs
 - Patent retrieval and classification using Japanese and US patents
 - Question-answering beyond factoids and asking "why" - on Japanese



Initiative for the Evaluation of XML Retrieval (INEX)

- Started in 2002, 2006 is the 5th running, 80 participants;
- Aim is to establish infrastructure, collection & scoring for IR which exploits available structural information (XML elements) to yield more focused retrieval;
- XML IR may retrieve mixture of paragraphs, sections, etc.
- Collection is 659,300 Wikipedia articles from 113,483 categories with average 161 XML nodes from 5000 tagset - previously it was IEEE articles;
- Participants create candidate topics as content only or content-and-structure, gain access to document collection only then;
- Main task is ad hoc retrieval plus tasks in NL query, heterogeneous documents, interactive, document mining and Multimedia



Video Analysis and Content Extraction (VACE)

- VACE is a US DTO funding program for US groups, 14 funded participants;
- Address lack of tools to assist human analysts monitor and annotate video for indexing;
- Data is broadcast TV news, surveillance, UAV, meetings, ground reconnaissance;
- Tasks are detection a/o tracking of people, faces, vehicles and text in that data;
- VACE includes open evaluations with international participation
 - Increases competition, thus increases progress
 - Encourages peer review and information exchange, minimises wheel reinvention, focuses on common problems
 - Open evaluations include VACE, CLEAR, and TRECVid;



ETISEO

- Started Jan 2005, funded by French government, 23 participants;
- Aim to evaluate vision techniques for video surveillance applications;
- Video data used is single and multi-view surveillance (airport, car park, corridor, subway);
- Ground truth is annotations and classifications of persons, vehicles, groups;
- Tasks are detection, localisation, classification and tracking of physical objects, and event recognition



Performance Evaluation of Tracking & Surveillance

- 2006 is the 7th PETS cycle, funded by an EU FP6 project ISCAPS;
- Evaluates object detection and tracking for video surveillance, metrics based;
- Data is multi-view surveillance video (4 cameras);
- Task is event detection left luggage in public place



Augmented Multi-Party Interaction (AMI)

- EU FP6 project covering meeting analysis from instrumented meeting rooms;
- Run by IDIAP, CH;
 - 2D multi-person tracking, head bounding box for each frame;
 - Head pose estimation;
 - Estimation of focus-of-attention (FoA) in meetings as table, documents, screen, or people using gaze

ImagEval

- French national evaluation campaign now open to other Europeans, 14? participants;
- 5 tasks related to content based image retrieval:
 - Recognition of (geometric) image transformations like rotation, projection, etc.;
 - Retrieval based on combining text and image;
 - Detect and extract text regions from images;
 - Detect objects in images cars, planes, flowers, cats, churches, Eiffel tower, table, PC or TV, US flag;
 - (Semantic) feature detection indoor, outdoor, people, night, day, etc.;
- Various data (image) sources, O(000's);



Benchathlon and CLEAR

- Benchathlon is a clearinghouse for data, annotations, evaluation measures, tools and architecture for CBIR;
- CLEAR is a cross-campaign collaboration concerned with getting consensus and crossover on evaluation of event classification evaluation;
- CLEAR = VACE \cap CHIL



Consensus ?

- Multiple domains, not all IR;
- All very metrics-based with agreed evaluation procedures and data formats;
- All have manual self-annotation of ground truth vs. assessment of pooled results;
- All coordinate large volunteer efforts with little sponsorship funding;
- All have growing participation;
- All make their results public and data available to participants, for free;
- All have contributed to raising the profile of evaluation campaigns;
- These evaluation campaigns now exist in many other domains;


Contents

- 1. IR vs. Information Seeking, and why it is hard
- 2. MMIR
 - a) Key approaches and issues
 - b) IR on Audio spoken and musical
 - c) IR on Images
 - d) The nature of video
 - e) Commercial video IR systems
 - f) Experimental approaches (5)
 - a) Using video metadata
 - b) Using text
 - c) Keyframe image matching
 - d) Using semantic concepts and features
 - e) Using video objects
- 3. MMIR Evaluation
 - a) TREC
 - b) Copycat evaluations
 - c) TRECVid
- 4. Challenges and issues



TRECVid: Video IR Evaluation

- In 2001, "video retrieval" started as a TREC track;
- Usual TREC mode of operation (data-topics-search submissions-pooling-evaluation by metrics-workshop) but additional, related tasks besides search;
- In 2003 TRECVid separated from TREC because if was sufficiently different, and had enough participation, though TREC and TRECVid workshops are co-located;
- Started small, grew rapidly;



Multimedia IR (Smeaton)

TRECVid Search

- 2006 will have 70+ participants, 250 hours of video (TV news and rushes);
- 2007 will have almost 1,000 hours of video;
- TRECVid tasks feature shot bound detection, concept detection and TRECVid and 3 kinds of search - automatic, manual and interactive;
- Task is to find shots (common bounds) which satisfy a user's information need;
- Evaluation is by Precision and Recall with manual judging of pooled submissions;
- Spoken dialogue is provided (from ASR/MT and CC), earlier we saw this as a basis for an approach to video IR;

Interactive, Manual, Automatic

Centre for Digital Video Processing

DCU



TRECVid Topics

- 149. Find shots of Condoleeza Rice [3, 6, 116]
- 150. Find shots of Iyad Allawi, the former prime minister of Iraq [3, 6, 13]
- 151. Find Find shots of Omar Karami, the former prime minister of Lebannon [2, 5, 301]
- 152. Find shots of Hu Jintao, president of the People's Republic of China [2, 9, 498]
- 153. Find shots of Tony Blair. [2, 4, 42]
- 154. Find shots of Mahmoud Abbas, also known as Abu Mazen, prime minister of the Palestinian Authority. [2, 9, 93]
- 155. Find shots of a graphic map of Iraq, location of Bagdhad marked not a weather map [4, 10, 54]
- 156. Find shots of tennis players on the court both players visible at the same time [2, 4, 55]
- 157. Find shots of people shaking hands [4, 10, 470]
- 158. Find shots of a helicopter in flight [2, 8, 63]
- 159. Find shots of George Bush entering or leaving a vehicle (e.g., car, van, airplane, helicopter, etc), he and vehicle both visible at the same time [2, 7, 29]
- 160. Find shots of something (e.g., vehicle, aircraft, building, etc.) on fire with flames and smoke visible [2, 9, 169]



2005: Mean avg. precision



TRECVid Features

- For (semantic) feature/concept identification this is useful in retrieval and used within TRECVid for search task, and as a challenge itself;
- Initially this was done solo by groups
 - Annotate a small corpus;
 - Train a SVM as a feature detector;
- Problem was that this was not scalable to 000's of features;



TRECVid Features

- People walking/running: segment contains video of more than one person walking or running
- Explosion or fire: segment contains video of an explosion or fire
- Map: segment contains video of a map
- US flag: segment contains video of a US flag
- Building exterior: segment contains video of the exterior of a building
- Waterscape/waterfront: segment contains video of a waterscape or waterfront
- Mountain: segment contains video of a mountain or mountain range with slope(s) visible
- Prisoner: segment contains video of a captive person, e.g., imprisoned, behind bars, in jail, in handcuffs, etc.
- Sports: segment contains video of any sport in action



TRECVID-2005 Annotation



Multimedia IR (Smeaton)



LSCOM-2006 Annotation

Centre for Digital Video Processing

DCU

• 80 Hours Video

LSCOM Annotation



Multimedia IR (Smeaton)

- 156



IBM Feature Detection Performance

Indexing by Semantic Features



Multimedia IR (Smeaton)

DCU

Feature Ontologies

- Previous work on feature detection treated features as independent;
- Now emphasis is on collections of features;
- Effort underway to define a 1000concept ontology where concepts are related, dependent, and automatically computable;



Contents

- 1. IR vs. Information Seeking, and why it is hard
- 2. MMIR
 - a) Key approaches and issues
 - b) IR on Audio spoken and musical
 - c) IR on Images
 - d) The nature of video
 - e) Commercial video IR systems
 - f) Experimental approaches (5)
 - a) Using video metadata
 - b) Using text
 - c) Keyframe image matching
 - d) Using semantic concepts and features
 - e) Using video objects
- 3. MMIR Evaluation
 - a) TREC
 - b) Copycat evaluations
 - c) TRECVid

4. Challenges and issues



Challenges

- Creation, capture, storage, transmission, rendering, are all solved problems in fixed and wireless domains. Challenge with MM is with access, including analysis for that purpose;
- Spoken documents & music have their obvious directions;
- New forms of MM data combinations of sensed, biometric information - still wrestling with set-up and capture and then seeking user-pull in how it is to be accessed, what is it used for;
- Image and video is most problematic / challenging;
- We're still only doing keyframe/image and not video with motion of objects and cameras - need to break free of this convenience;
- We're still doing shot retrieval, not scene (+), or clip (-);
- Feature detection accuracy, scale-up to more features, relationships between features, move away from independent solo to ontologybased ... all need to be pursued;
- Combining features, keyframe match, text and objects in a natural and usable way ... those video IR systems sure aren't Google;
- Dynamically adjusting retrieval to the query/video type, but need to know more about the user's context;
- ... then we can consider scale-up in volume;
- Aggregating results synthesising "trailers" as answers;
- Summarising domain-specific video;

