

# SpokenMedia: Automatic Lecture Transcription and Rich Media Notebooks

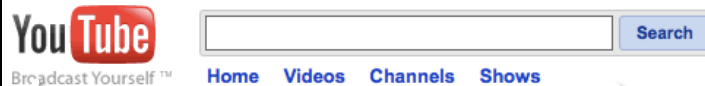
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MIT, Office of Educational Innovation and Technology

Citation: Muramatsu, B., McKinney, A., Wilkins, P. (2010). SpokenMedia: Automatic Lecture Transcription and Rich Media Notebooks.  
Presented at NERCOMP 2010: Providence, Rhode Island, March 9, 2010.

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# SpokenMedia: What to do if your videos aren't in YouTube



## Broadcasting Ourselves ;)

The Official YouTube Blog

## SpokenMedia:

### Automatic Lecture Transcription

...we now re

resentation...

## and Rich Media Notebooks

THURSDAY, MARCH 4, 2010

### The Future Will Be Captioned: Improving Accessibility on YouTube

Tens or millions of people in the U.S. experience some kind of hearing impairment and recent studies have predicted that over 700 million people worldwide will suffer from hearing impairment by 2015. To address a clear need, the broadcast industry began running captions on regular video programming in the early 1970s. Today, closed captions on video are more prevalent than ever. But even with captions today, on-broadcast accessibility is not perfect.

Making video easily accessible is something we're working hard to address at YouTube. One of the first steps we took was the development of a [caption feature](#) in 2008. In November of last year we released [auto-captioning](#) for a small, select group of partners. Auto-captioning combines some of the speech-to-text algorithms found in Google's Voice Search to automatically generate video captions when requested by a viewer. The video owner can also download the auto-generated captions, improve them, and upload the new version. Viewers can even choose an option to translate those captions into any one of 50 different languages -- all in just a couple of clicks.

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- While we plan to broaden the feature to include more languages in the months to come, currently, auto-captioning is only for videos where English is spoken.
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For content owners, the power of auto-captioning is significant. With just a few quick clicks your videos can be accessed by a whole new global audience. And captions can make it easier for users to discover content on YouTube.

YouTube. (2010, March 4). The Future Will be Captioned: Improving Accessibility on YouTube. Retrieved on March 8, 2010 from YouTube Website:

<http://youtube-global.blogspot.com/2010/03/future-will-be-captioned-improving.html>

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Citation: Muram

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ch Media Notebooks.

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# *SpokenMedia: What to do if your videos aren't in YouTube*

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# Why are we doing this?



[MIT OCW 8.01](#): Professor Lewin puts his life on the line in [Lecture 11](#) by demonstrating his faith in the Conservation of Mechanical Energy.

- More & more videos on the Web
  - Universities recording course lectures
  - Students relying upon Web video for courses



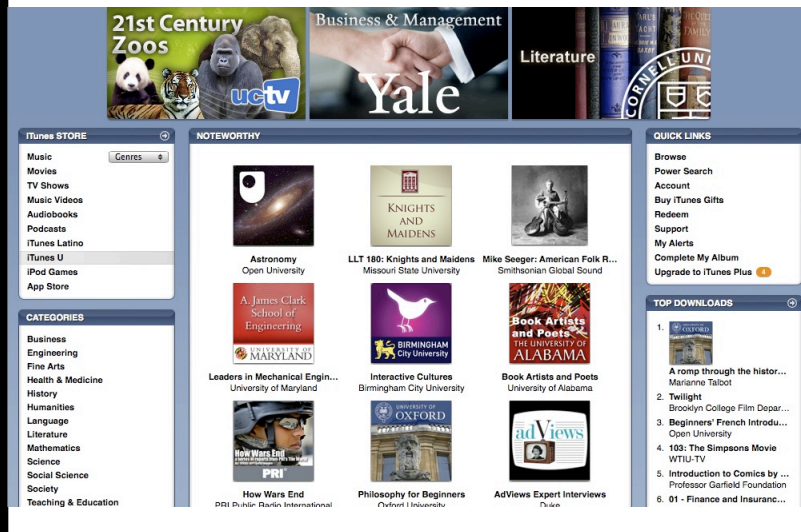
# What video? Where?



webcast  
berkeley



iTunes U



# What are the challenges?

- Search
  - Volume
  - Segmented by Web, Video
  - Text title and Description

Google Search for  
“angular momentum”  
Performed April 2009

The screenshot shows a Google Video search interface. At the top, the search bar contains 'angular momentum'. Below the search bar, there are filters for 'all videos' and 'videos playable on Google'. The search results are displayed in a list on the left, with a detailed view of the top result on the right.

**Search Results:**

- Caltech: The Mechanical Universe - 19 - Angular Momentum**  
28:51 - 1 year ago - ★★★★★ - [video.google.com](#)
- What Is The Conservation Of Angular Momentum?**  
02:06 - 6 months ago - ☆☆☆☆ - [metacafe.com](#)
- Tennis Lessons - how to use angular momentum**  
04:34 - 6 months ago - ☆☆☆☆ - [graspr.com](#)
- MIT Physics Lecture: Classical Mechanics - 21 - Torques ...**  
47:52 - 1 year ago - ★★★★★ - [video.google.com](#)
- What is the conservation of angular momentum?**  
02:05 - 2 years ago - ★★★★★ - [youtube.com](#)
- fahrradreifen drehimpuls physik angular momentum physics**  
00:23 - 1 year ago - ★★★★★ - [youtube.com](#)

**Caltech: The Mechanical Universe - 19 - Angular Momentum**  
28:51 - Feb 23, 2008 - ★★★★★ (3 Ratings) - Rate: ★★★★★  
Watch this video on [video.google.com](#)  
This series helps teachers demystify physics by showing students what it look hot-air balloon events, symphony concerts, bicycle shops, and other locales n

# What about Bing?

Bing Search for "angular momentum" Performed August 2009

Web Images Videos News Maps More MSN Hotmail

Sign in | Extras ▾

bing  
Beta

angular momentum



ALL RESULTS

Videos

VIDEOS 1-20 of 2,420 results

sort by: best match | most recent  

LENGTH

short (< 5 min)

medium (5-20 min)

long (> 20 min)

SCREEN TYPE

standard

widescreen

RESOLUTION

low

medium

high

SOURCE

msn

youtube

rajshri

rediff

ibnlive

dailymotion

mtv



Angular Momentum Time  
Pieces TENDANCE...  
Dailymotion 2:11



Angular Momentum est une  
société...  
Dailymotion 3:19



Angular Momentum 1  
TENDANCE MAGAZINE  
TV  
Dailymotion 2:19



Angular Momentum Time  
Pieces TENDANCE...  
Dailymotion 2:09



Angular Momentum 10e  
ANNIVERSAIRE - 2008...  
Dailymotion 2:29



Angular Momentum -  
Science Theater 24  
YouTube 4:59



Geomag & Physics:  
Angular Momentum...  
YouTube 1:19



Angular Momentum Demos  
YouTube 6:01



Fun with Physics - Angular  
Momentum



Conservation of Angular  
Momentum



What is the conservation of  
angular



DEMO: Conservation of  
angular momentum



# What are the Challenges?

- Description
  - Course and Lecture Title
  - Summary
  - Metadata?

YouTube, MIT OCW Physics 8.01 - Lecture 20  
Retrieved August 2009

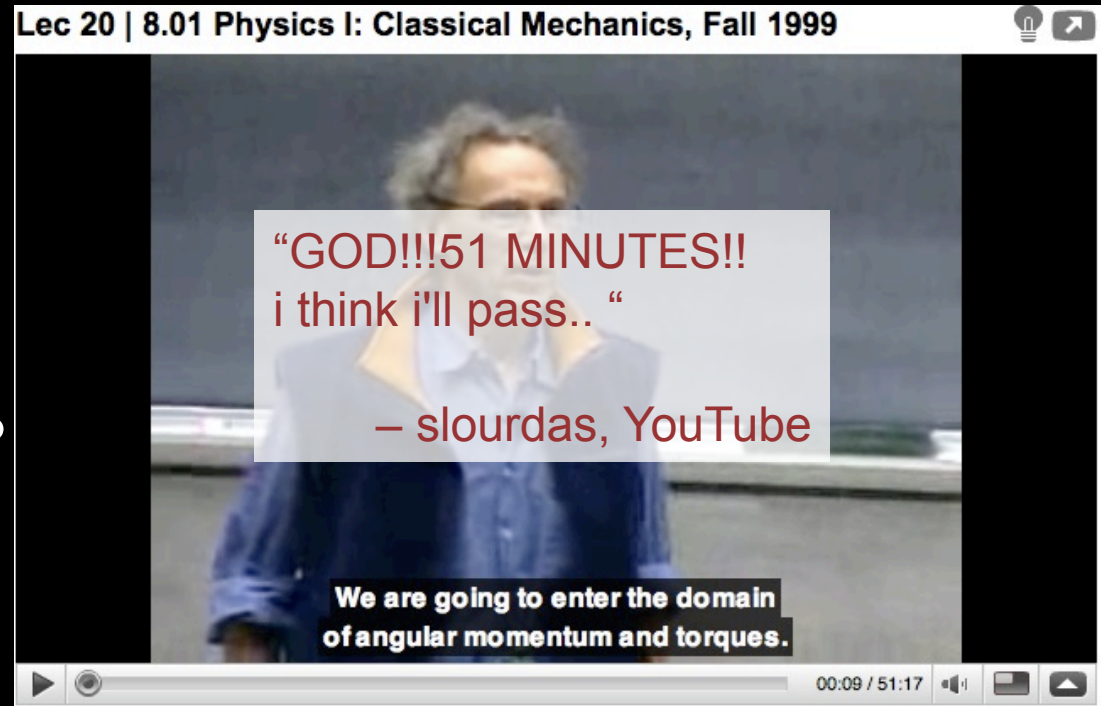
webcast.berkeley, Physics 8A, 002, Spring 2009  
Retrieved August 2009

The screenshot shows the webcast.berkeley website for Physics 8A, 002 - Introductory Physics. The page includes a header with the Berkeley logo and a 'support us' button. The course title 'Physics 8A, 002 - Introductory Physics' is circled in red. Below the title, the instructor is listed as Joel FAJANS. A Creative Commons license is displayed. The 'Lecture Archive' section lists 10 lectures, with the entire list circled in red. The bottom of the page shows a 'Text Comments' section with a comment from 'methur83shalal91hash'.

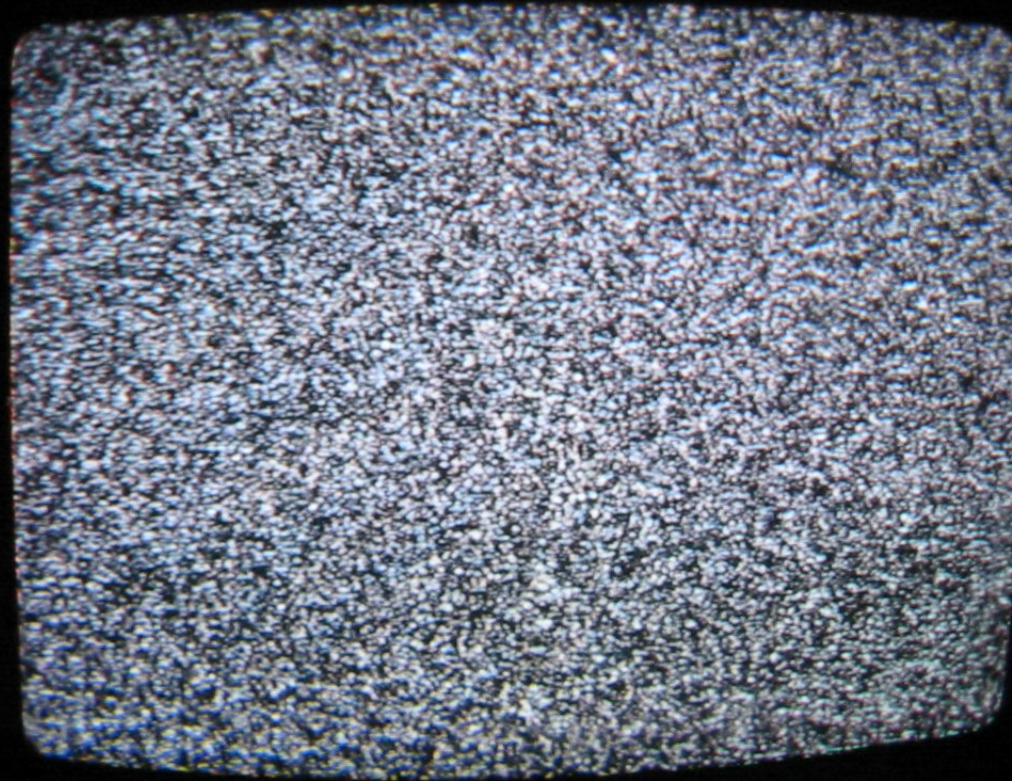
Lecture	Date
Lecture 1	Tue, Jan 20
Lecture 2	Thu, Jan 22
Lecture 3	Tue, Jan 27
Lecture 4	Thu, Jan 29
Lecture 5	Tue, Feb 03
Lecture 6	Thu, Feb 05
Lecture 7	Tue, Feb 10
Lecture 8	Thu, Feb 12
Lecture 9	Tue, Feb 17
Lecture 10	Thu, Feb 19

# *What are the challenges? Use*

- Interaction & Use
  - Transcripts / captions
    - Do they exist?
    - Cost?
  - Full video vs. segments



Lewin, W. (1999). Lec 20 | 8.01 Physics I: Classical Mechanics, Fall 1999.  
Retrieved August 1, 2009 from YouTube Website:  
<http://www.youtube.com/watch?v=ibePFvo22x4>



flickr [@futureatlas.com](#)

# *Why do we need these tools?*

- Improve search and retrieval
- Improve user experience
- Captioning for accessibility?
- Facilitate translation?
- Other uses?



## Broadcasting Ourselves ;)

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<http://youtube-global.blogspot.com/2010/03/future-will-be-captioned-improving.html>

# *Comparing SpokenMedia and YouTube Auto-Caption?*

## **YouTube**

- Scale ✓
- Research-basis ✓
- For all videos ✓ (soon)
- No transcript/caption export (?)
- YouTube hosted
- Accuracy based on general patterns (?)
- No transcript editing (?)

## **SpokenMedia**

- Limited
- Research-basis ✓
- Service by request
- Transcript/caption export available ✓
- Hosted anywhere ✓
- Accuracy based on custom models ✓ (soon)
- Transcript editing ✓ (soon)

# *Developing SpokenMedia...*

- What do we have at MIT?
  - Existing videos & audio, new video
  - Lecture notes, slides, etc. (descriptive text)
  - Multiple videos/audio by same lecturer
  - Diverse topics/disciplines
- Research from Spoken Language Systems Group !!!

# Enabling Research

James Glass  
glass@mit.edu



- Spoken Lecture: research project
- Speech recognition & automated transcription of lectures
- Why lectures?
  - Conversational, spontaneous, starts/stops
  - Different from broadcast news, other types of speech recognition
  - Specialized vocabularies

# *Spoken Lecture Project*

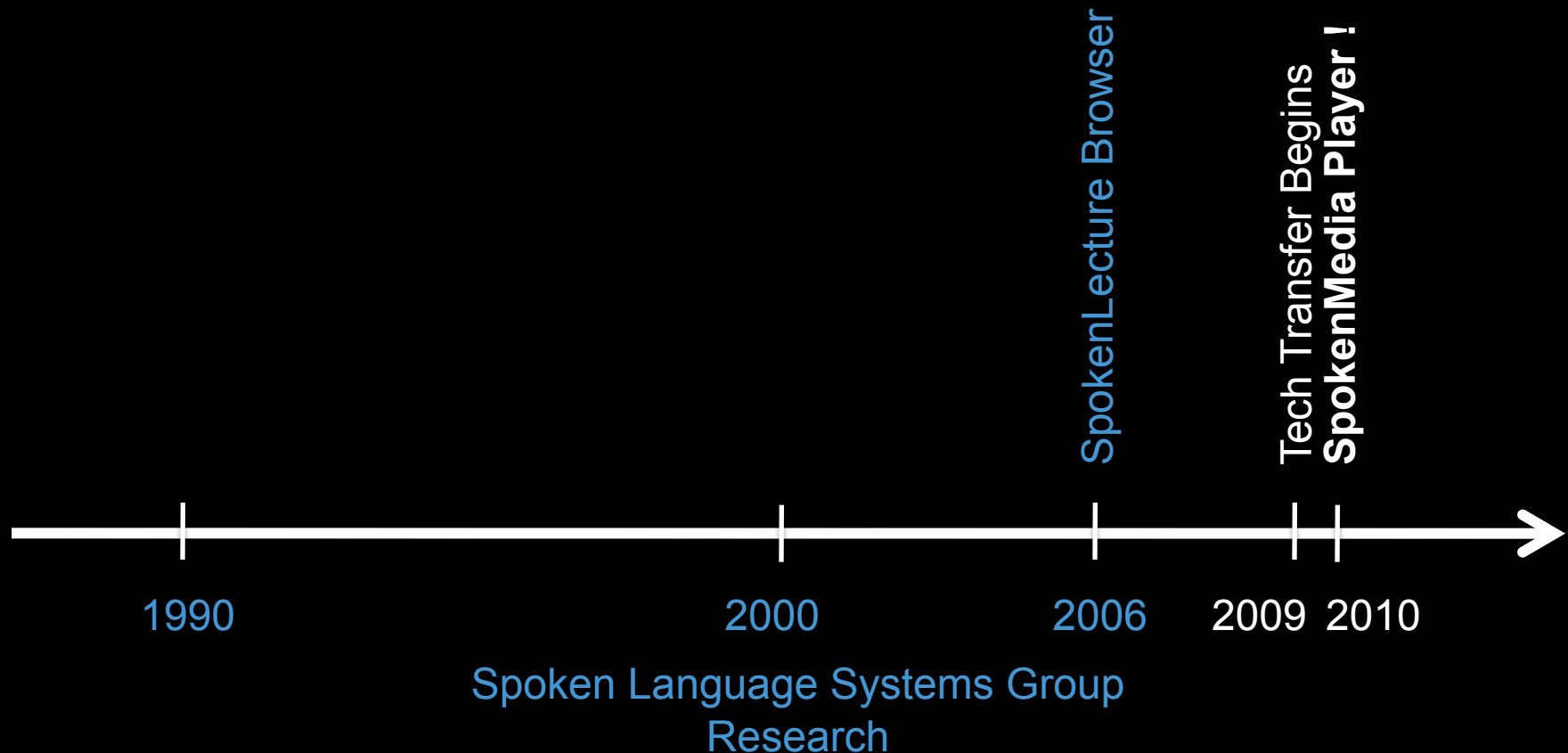
James Glass  
glass@mit.edu



- Processor, browser, workflow
- Prototyped with lecture & seminar video
  - MIT OCW (~300 hours, lectures)
  - MIT World (~80 hours, seminar speakers)

Supported with iCampus MIT/Microsoft Alliance funding

# Tech Transfer Timeline: Research -> Service




*Let's see a demo!*



# Demo

Challenges of Planning, Critical Challenges facing Cities of Global South, IIHS, and Challenges within the IIHS Curriculum Framework

Search transcript



Prof. Bish Sanyal

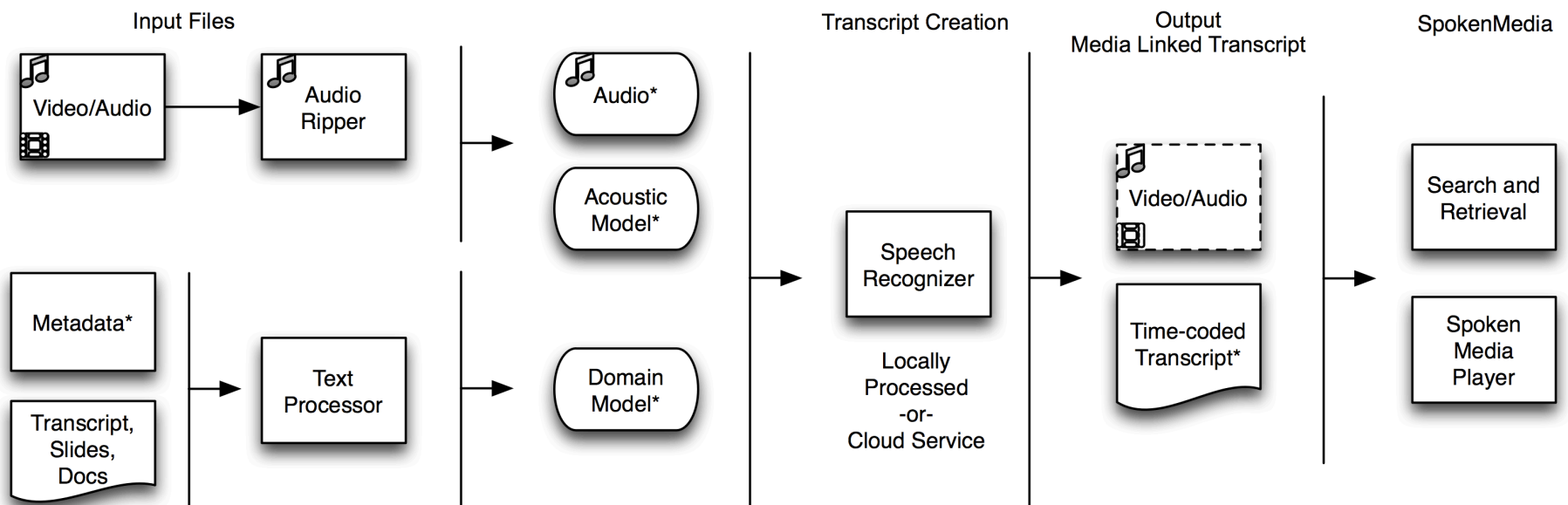
I think one central challenge of planning is legitimacy of government as a key institution that should be involved in bringing the change. The legitimacy of the government is under attack in many different parts of the world so that it has to be reestablished as a major planning institution. I think the second challenge for planning at least in the US or the west is that the

Audio English (US) Transcript English (US)

oeiT

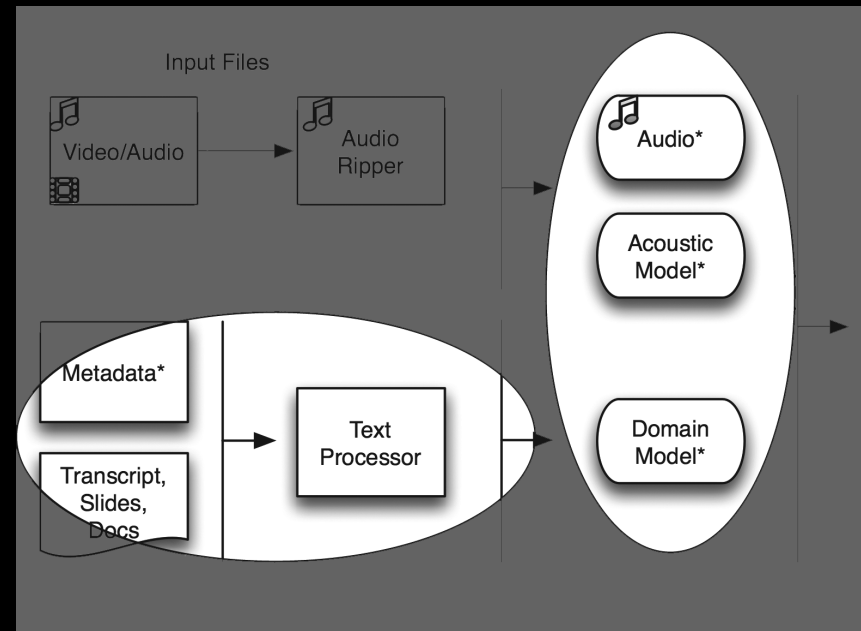
# How Does it Work?

## Lecture Transcription Workflow



# Recognizer Accuracy? ~85%

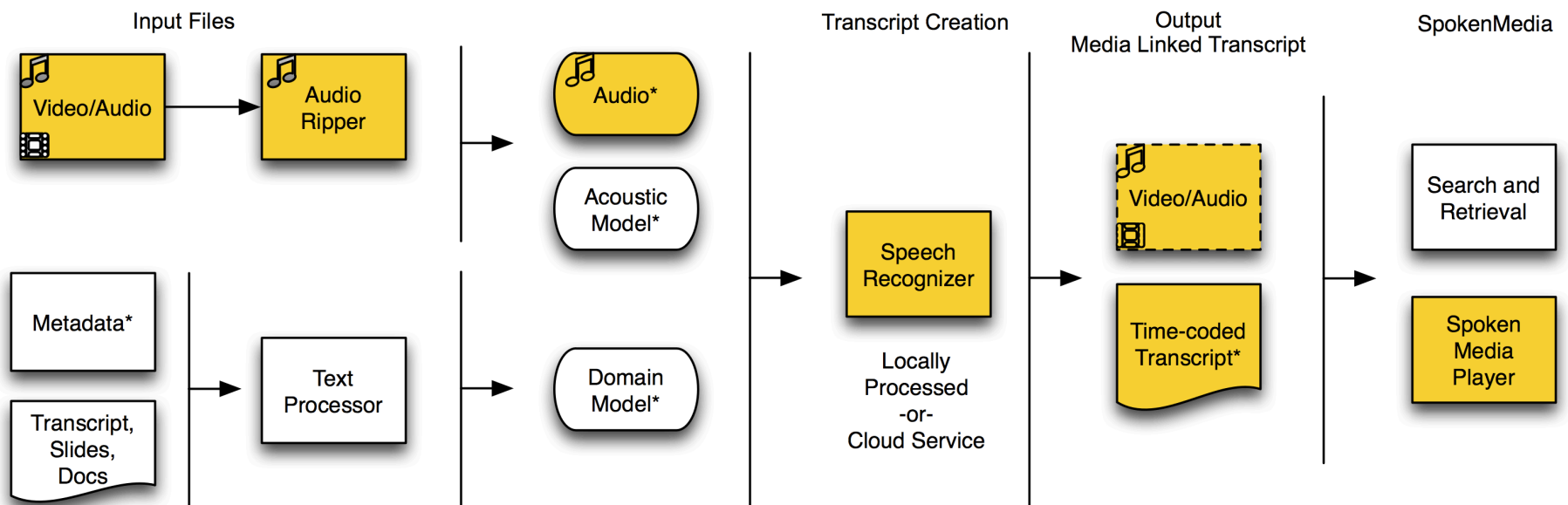
- Accuracy
  - Domain Model and Acoustic Model
  - Internal validity measure
  - Single 100% accurate transcript for a full course



Ongoing research by Jim Glass and his team

# What works today?

## Lecture Transcription Workflow



# Transcript "Errors"

- “angular momentum and forks it’s extremely non intuitive”
  - “folks”?
  - “torques”?
- “introduce both fork an angular momentum”
  - “torque”!

.....

we're now answering the part of eight oh one which is the most difficult for students and faculty alike ... we are going to enter the domain of angular momentum and forks it's extremely non intuitive ... the good news however is that b will stay with this concept for at least four five lectures today i will introduce both fork an angular momentum ... what is angular momentum if an object has a mass  $m$  ... and it has a velocity  $v$  ... then clearly it has a momentum ...  $v$  that's very well defined your reference frame the product of  $m$  and  $v$  ... thank the momentum ... i can take relative to any point i choose i choose this point  $q$  arbitrary ... this now ... is the position vector which i call our of  $q$  ... but this angle buffet to ... an angular

*That's what we have today...*

- Features
  - Video linked transcripts
  - “Bouncing Ball” follow along
  - Search within a video
  - Multiple transcript language support
- Challenges
  - Accuracy (partial toolset)

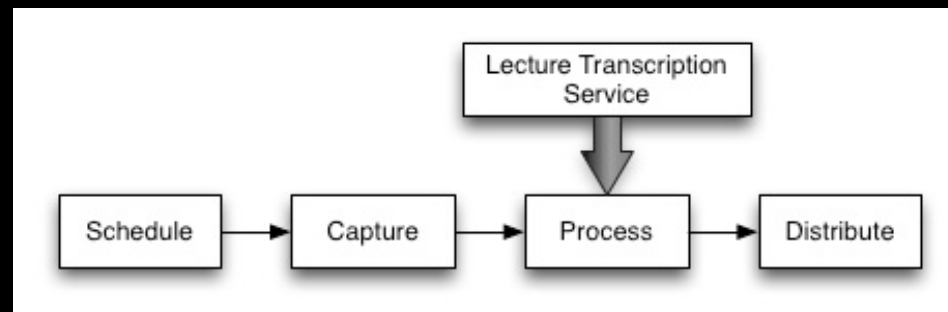
# *Where are we heading?*

- Improved accuracy
- Automate and improve processing
- Search across multiple video transcripts
- Starting a lecture transcription service



# Lecture Transcription Service

- Integrate with media production workflows
  - At MIT, University of Queensland



- Stand-alone service
  - Test with external content (video) producers

# *A Lecture Transcription Service? Caveats*

- Lecture-style content (technology optimized)
- Up to 85% accuracy
  - (good for search, not sure about accessibility)
- English-language audio
  - (need much more research for other languages)
- Processing hosted at MIT (current thinking)
  - Submit jobs via MIT-run service
  - Contribute audio, models, transcript for further research

*Test it for yourself!*

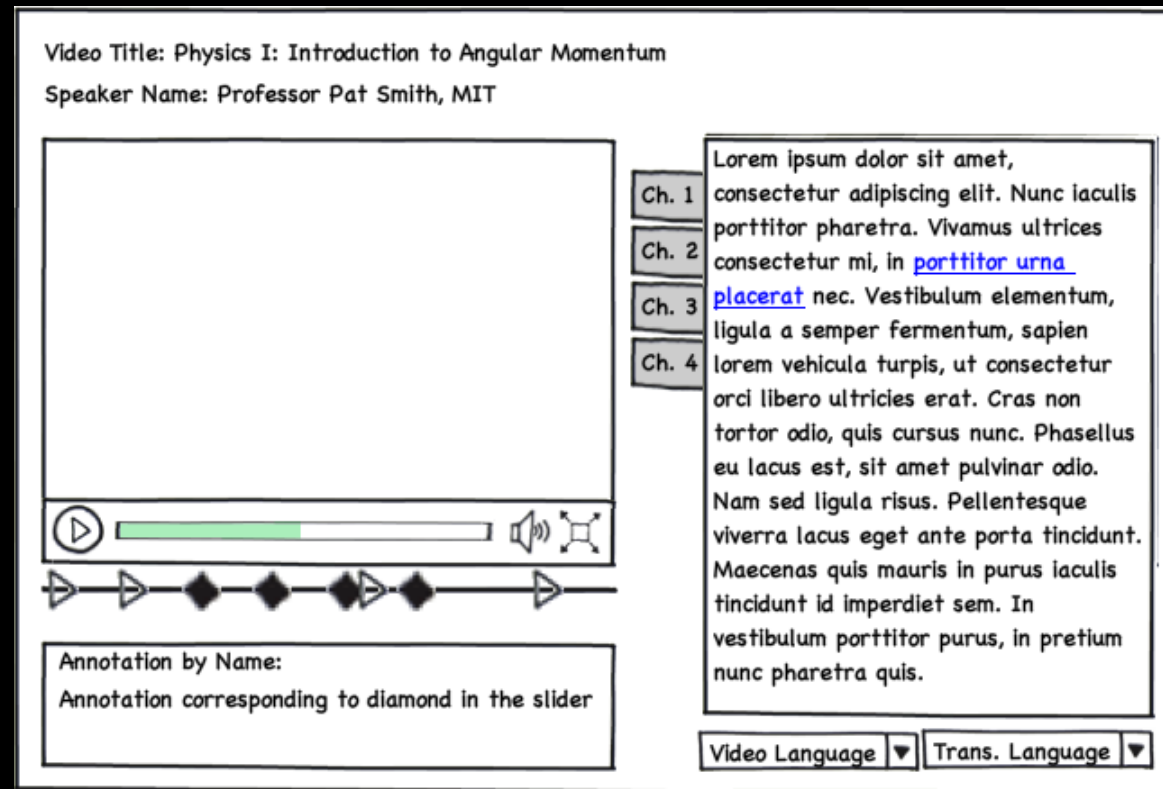
<http://spokenmedia.mit.edu/>

<http://sm.mit.edu/upload>

# *Toward Rich Media Notebooks Improving the User Experience*

- Innovative player interfaces (soon)
  - Bookmarking and annotation
  - Clip creation and authoring
- Transcript editing (soon)
- Searching across collections of videos

# Player with Annotation Mockup



# *Editing Interfaces*

*Soon*

*(we're designing the editing interfaces right now)*

*Thanks!*

**spokenmedia.mit.edu**

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