## Videolectures ingredients that can make analytics effective

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#### Some numbers

MIT MOOC (MITx - 6.002x: Circuits and Electronics.),

- 154,763 registrants.
- 69,221 people (45%) looked at the first problem set,
- 26,349 earned at least one point (17%)

Midterm assignment

- 13,569 people looked at it while it was still open
- 9,318 people got a passing score on the midterm (6%)
- 7,157 people earned the first certificate (4,6% of the enrolled, i.e. 27% of those who really manifested interest).

#### Some numbers

- Coursera's Social Network Analysis class
- 61,285 students registered,
- 1303 (2%) earned a certificate,
- **107** earned "the programming (i.e. *with distinction*) version of the certificate" (0.17%).

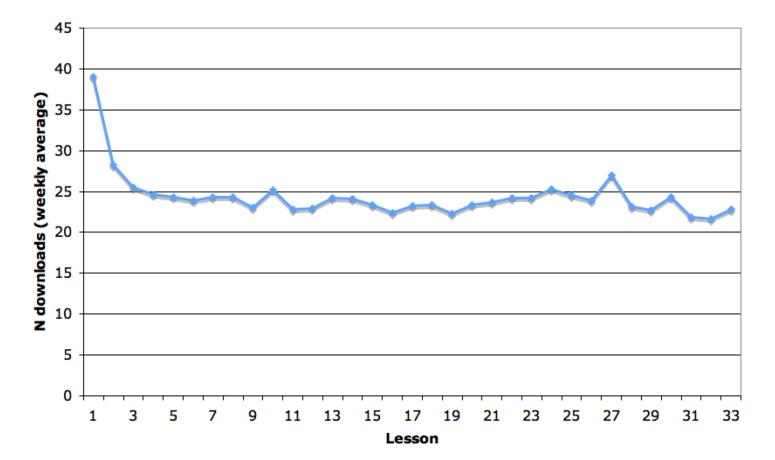
#### Questions

- Where do the students come from?
- Which videos are most popular, and which ones attract little interest?
- Are students actually watching the videos on the assigned dates?
- Are viewers watching all the way through?
- At what point in the lecture, if any, do viewers stop watching?
- Are there any portions of the videos that are being watched repeatedly?
- Are the students watching the videos by the assigned deadlines?
- Do the videos generating active user engagement? Do students edit, share, download the material?

# Do "students" take the entire course?

Stats over 15 weeks

Lesson Download distribution



#### What do row data tell us?

- N students watched lecture K
- M students repeatedly watched the fragment between time T1 and T2 in lecture K

What o we need to make these data more meaningful?

### Semantics !

# But how do we get semantic information?

### Granularity

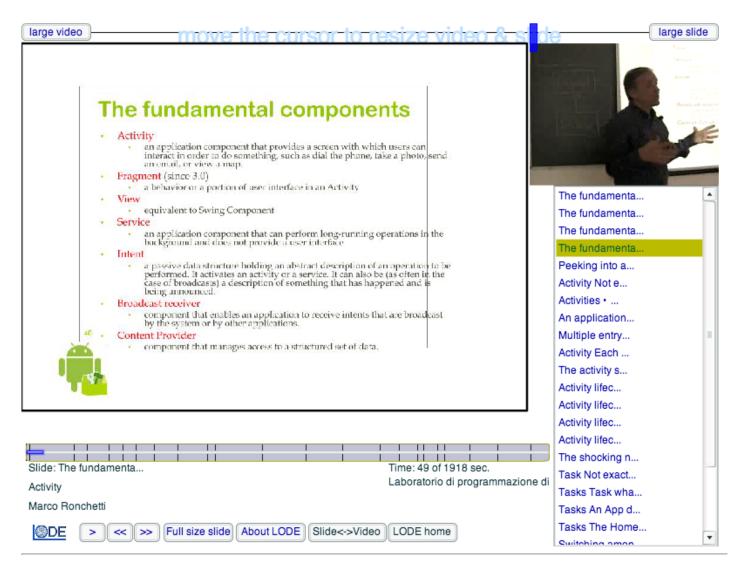
How is the (video)lecture structured?

- According to logistic constraints
- Divided in small chunks (10 min at most)

#### How to generate semantic marking?

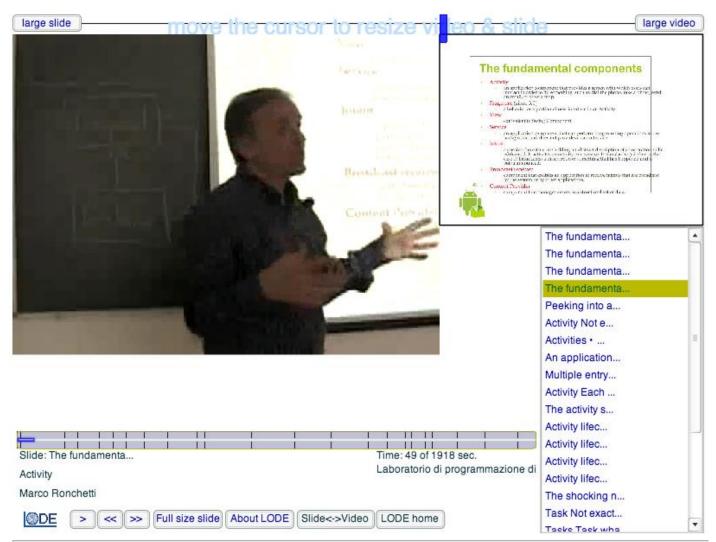
1. For ppt-based lectures, we can automatically extract markers from the slides

### LODE



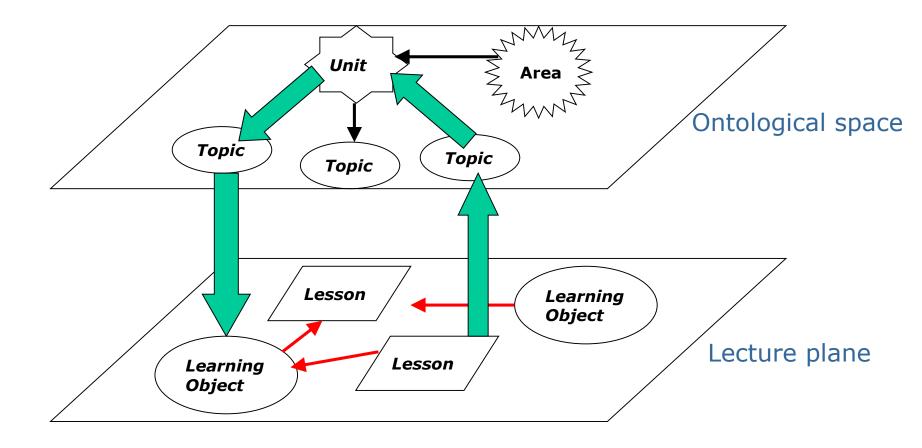
This video was produced with Lode4Mac

#### Multiple cognitive channels

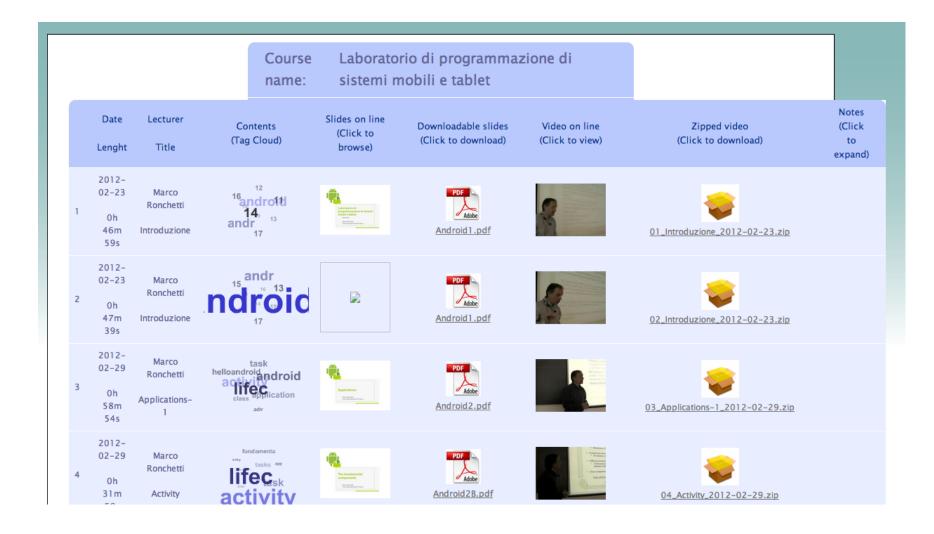


This video was produced with Lode4Mac

#### **Ontological navigation**



#### A first step



#### Using ASR to extract some meaning

1. Automatic speech recognition

#### WORD RECOGNITION PERFORMANCE

Percent Total Error	=	43.3%	( 862)
Percent Correct	=	60.0%	(1195)
Percent Substitution	=	29.7%	( 592)
Percent Deletions	=	10.3%	(205)
Percent Insertions	=	3.3%	( 65)
Percent Word Accuracy	=	56.7%	
Ref. words	=		(1992)
Hyp. words	=		(1852)
Aligned words	=		(2057)

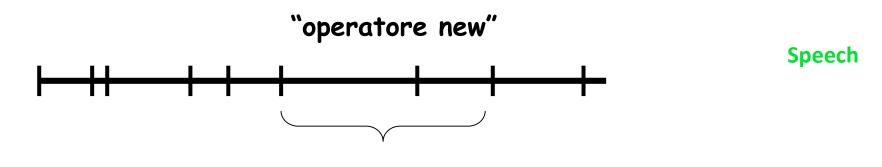
(speech driven)

Speech

Video

**Slides** 

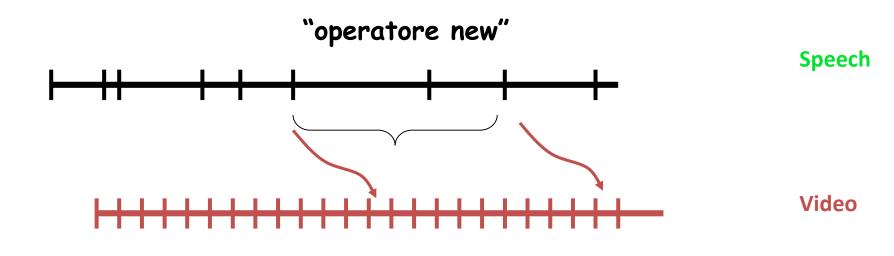
(speech driven)



Video

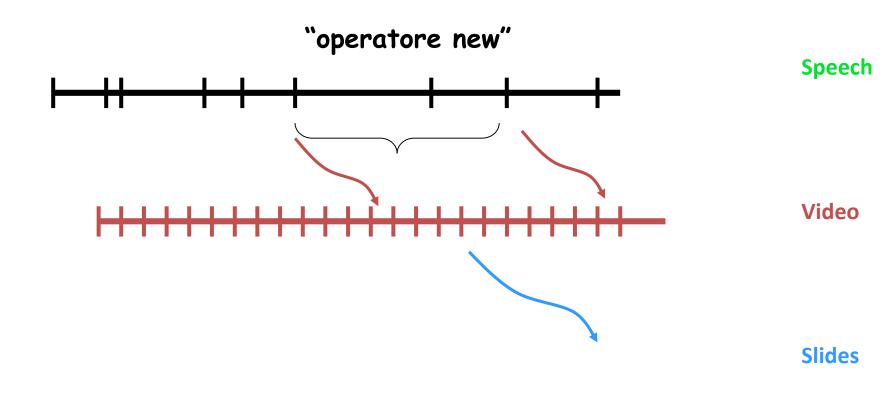
**Slides** 

(speech driven)

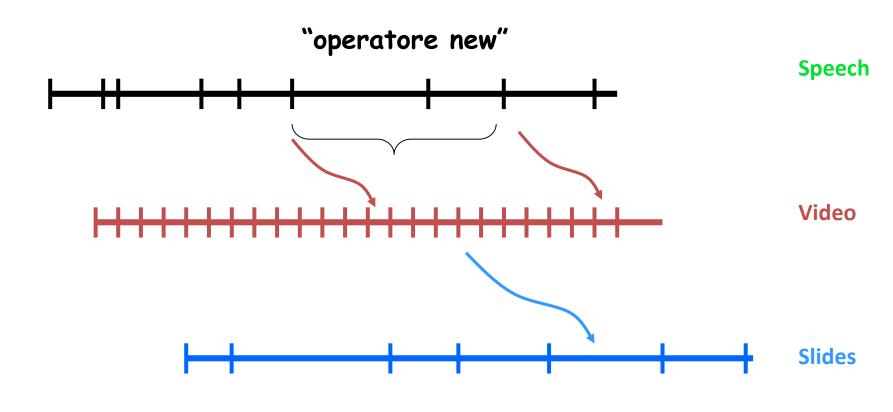


**Slides** 

(speech driven)

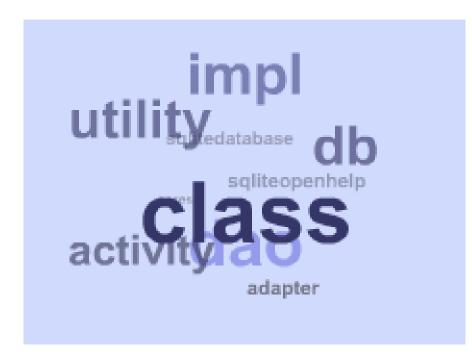


(speech driven)



(speech driven)

 Natural Language Processing to extract meaning from a fragment



#### Video annotation

- 3. User contribution
- Social (video) bookmarking tagging annotation
- Human computing (*a la* Van Ahn)

#### Conclusion

- We MUST enrich our media!
  - Better user experience
  - Better analytics