# The <u>Computable News</u> Project Milestone 10 Hypertable, Corrections and Multi-tenancy

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Intro

- ✓✓ Replacement of Cassandra with Hypertable
  - Automatic application of corrections
- ✓ Multitenancy with NZ and Regional data
  - Documentation
  - Entity store editor
  - Wikipedia concept import





# M10: Engineering

- ✓✓ Transition from Cassandra to Hypertable
  - ✓ So far, much faster and no dropped records!
- ✓✓ Substantial increase in linking speed

MS10





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# M10: Multitenancy

- Concepts have <u>tags</u> for flexible multitenancy
- ✓ Documents have tags to produce multiple Zooms
- ✓ Linker uses tags to control available concepts
- ✓ Tag-specific correction rules





#### M10: Correction tools

- ✓ Further work on correction tools
- Thousands of corrections entered
- Assess most frequent concepts and unlinked terms
- ✓ Supports multitenancy
- ✓ Fixes apply to Zoom stories



- Create and edit Entity Store concepts
- ✓ Import individual concepts from Wikipedia



# M10: Ongoing research

- Paper accepted to EMNLP (a top international conference)
  - ✓ Paper submitted to ALTA (Australian workshop)
  - Improved linker for TAC evaluation: still among the best
  - Entered slot-filling system for TAC evaluation
  - Submitted thesis on Event Linking



# M10: Wrapping up

- Compiling documentation in Google Docs
  - ✓ on the system
  - on project
- ✓ Will update instructions during installation (this week)
- ✓ http://goo.gl/Bl5Nna



### Farewell Cassandra, hello Hypertable

- Had found Cassandra unstable and lost many writes
- Found Hypertable fast and reliable
- Moved concepts, documents and statistics to Hypertable
- In-house ORM minimised changes to application code
- Refactored schemas to clean up accumulated problems
- Linking data compiled into efficient MsgPack blobs



- We want some data shared, and others site-specific
- Different products need to work with different sets of documents
- Different terms are prominent in different publications
- Some concepts may be special to specific sites
- Language may have different meanings according to site



## Flexible multitenancy through tags

- Each concept can be labelled with a set of tags: all, wiki, regional, nz, fin
- Linking requests specify the tags to link against
- Tags on documents define routing to outputs (e.g. Zoom)
- Corrections can be tag-specific



### Multitenant tags in correction

- Annotations are scoped to a tenant using tags
- Allows different tenants to provide different annotations
- The same term can be linked differently according to tenant



## Importing and editing concepts

- Import concepts from Wikipedia into store
- Create new concepts from scratch
- Edit existing concepts, e.g. to modify tags



- List of most frequent concepts linked
  - ⇒ may need corrections due to high risk of viewing
- List of most frequent unlinked mentions
  - ⇒ may need new concepts to be created
- Can be scoped by date of publication, document category, etc.



Research

### High-performing results at TAC evaluation

- Submitted systems with:
  - new work in local description matching
  - machine learning for candidate scoring
  - better NIL clustering by local attributes and topics
- 26 teams, 111 runs
- Top-class score, 1.6% below best system





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#### TAC results

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System	All	KB	NIL
Тор	72.1	72.4	72.0
1 Supervised with basic clustering	70.5	72.1	68.5
2 Supervised with local clustering	70.3	72.1	68.2
3 Supervised with topic clustering	68.9	72.1	64.8
4 Supervised $+NIL$ , basic clustering	54.4	44.5	64.1
5 Supervised $+ NIL$ , topic clustering	53.0	44.5	60.9
Median	58.4	55.8	60.3





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System	News	Web	Fora	PER	ORG	GPE
Тор	80.1	67.3	63.3	75.8	73.7	72.0
1	77.0	63.3	63.3	73.4	67.6	70.3
Median	65.5	54.6	45.8	62.0	59.9	52.6



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### Publication on quotation extraction

Extracting and attributing direct, indirect and mixed quotations

#### Example

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Police would only apply for the restrictions when "we have a lot of evidence that late night noise... is disturbing the residents of that neighbourhood", Superintendent Tony Cooke said.

- New data and techniques for extracting
- Published at Empirical Methods in NLP 2013



### Concluded experiments in Event Linking

- Events proved to be a very challenging space
- Joel submitted thesis on a new model of event reference
- Hyperlinks in Fairfax Digital stories are often good indicators of event reference
- Improved system to predict event-centred links



# Documenting Fizzing Panda

- Collating in Google Docs
- System description

- APIs and maintenance
- Underlying technologies
- Other areas pursued in the project



#### Things we would like to see in the future

- Feedback corrections to supervised linking system
- Integrate new insights from TAC including improved NIL handling
- Mastering the scanned historical archive
- Application to personalisation / advertising
- Application to editing

