Semantic Technology for Online, Broadcast and Print Media

Jem Rayfield: Head of Solution Architecture

Financial Times: www.ft.com





Outline

BBC: Dynamic Semantic Publishing and the World Cup 2010

BBC: Sport 2012 + Olympics

Financial Times: Semantic Re-platform

Financial Times: Semantic Prototype

Financial Times: Behavioral Recommendations



World Cup 2010

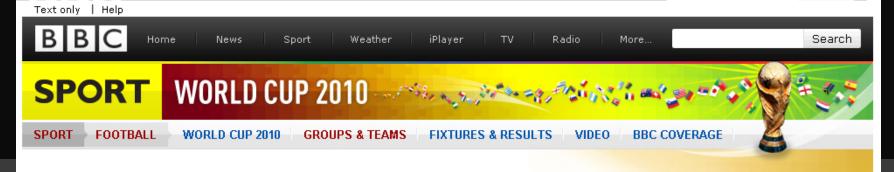
- 1. 32 teams, 8 groups, 736 players → 776 pages
- 2. Fixtures & Results, Groups & Teams pages
- 3. To many web pages for too few journalists
- 4. Improve the publishing system to help achieve all of this

Page Per Player

http://news.bbc.co.uk/sport/football/world_cup_2010/groups_and_teams/team/england/wayne_rooney



Page Per Team



Latest matches









III Italy



A B C D E <mark>F</mark> G H					
Group F Teams	w	D	L	GD	PTS
🔢 Italy	0	1	0	0	1
Paraguay	0	1	0	0	1
🔤 New Zealand	0	0	0	0	0
slovakia	0	0	0	0	0

Latest stories



Buffon confident after back pain



Paraguay boss delighted with draw

Italy's Pirlo to miss two matches

▶ Rossi left out of Italy Cup squad

Prandelli to be next Italy boss

- Gattuso to retire after World Cup.
- Sunday's World Cup 2010 round-up
- Tuesday's World Cup 2010. round-up
- Lippi in post-World Cup exit hint

Features



World Cup 2010 performance analysis All the facts and figures from the World Cup 2010

tournament

- My World Cup Noel Gallagher
- Guide to the teams at South Africa 2010.

Latest audio and video









De Rossi equalises

Around the web

- Italian FA site.
- Italy Fifa Profile
- ▶ BBC Search+ country page
- Italy Wikipedia profile

Page Per Group



Matches

BBC COVERAGE

More..

🚺 Italy 1-1 Paraguay Match report Monday, 14 June 🚺 New Zealand - Slovakia LIVE Today 12:30 Slovakia v Paraguay Preview Sunday, 20 June, 12:30 Italy v New Zealand Preview Sunday, 20 June, 15:00 Paraguay v New Zealand Preview Thursday, 24 June, 15:00 Slovakia v Italy Preview Thursday, 24 June, 15:00

Search

Features



World Cup 2010 performance analysis All the facts and figures from

the World Cup 2010

tournament

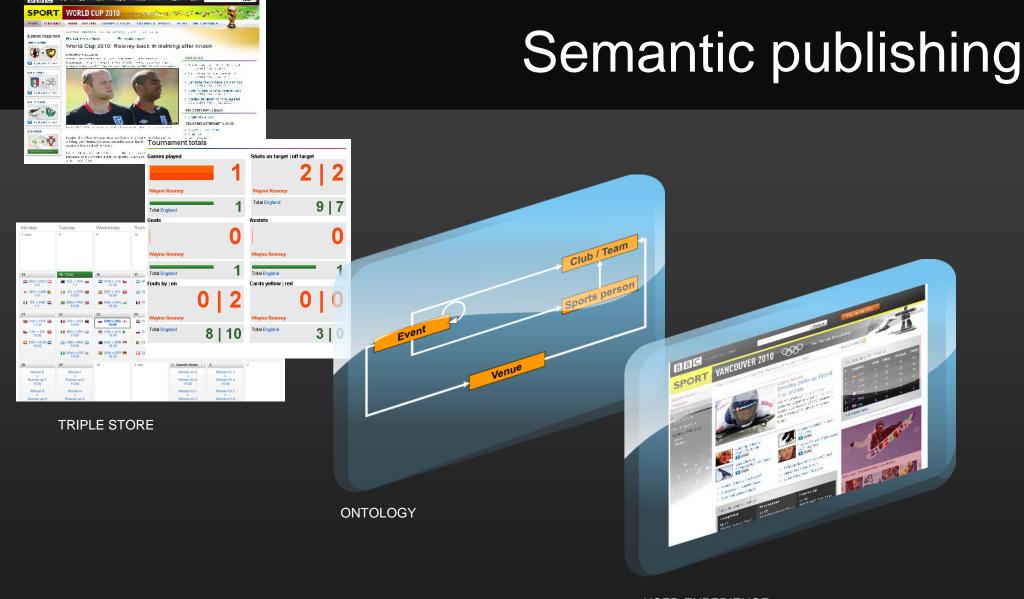
- Slovakia performance analysis
- Paraguay performance analysis
- New Zealand performance analysis
- My World Cup Noel Gallagher
- Guide to the teams at South Africa 2010







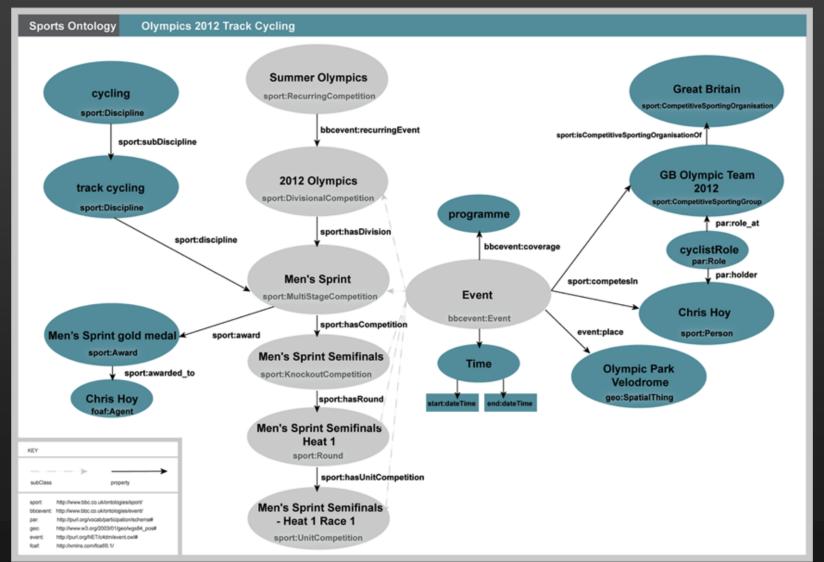




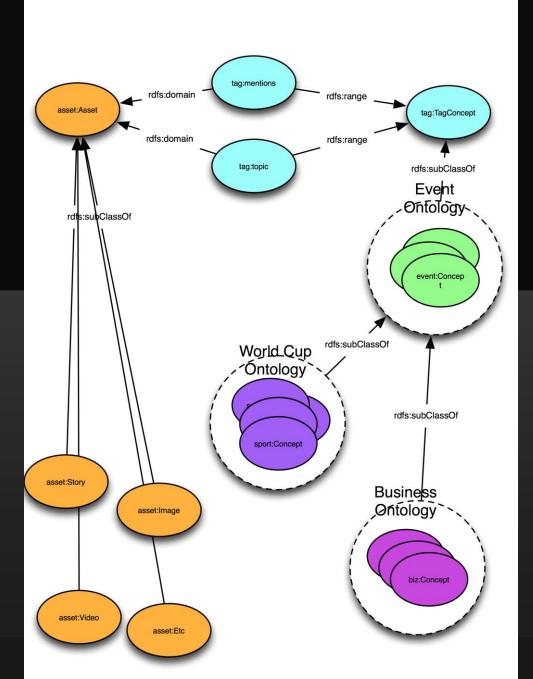
USER EXPERIENCE

Open Sport Ontology

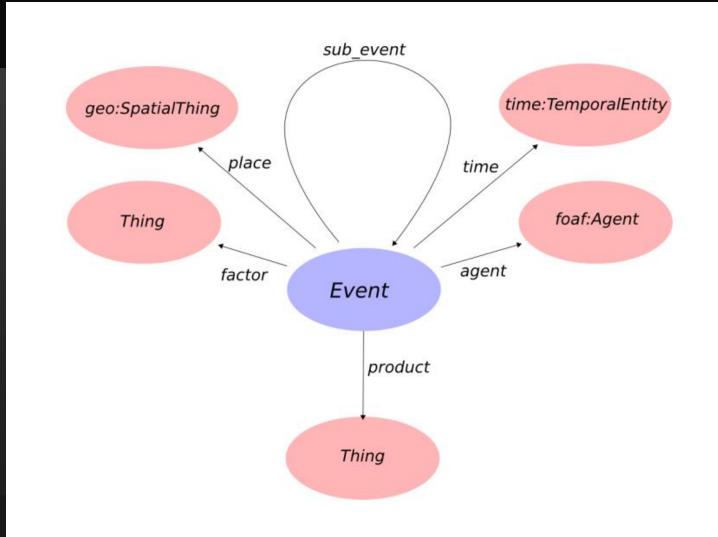
BBC Sport: http://www.bbc.co.uk/ontologies/sport



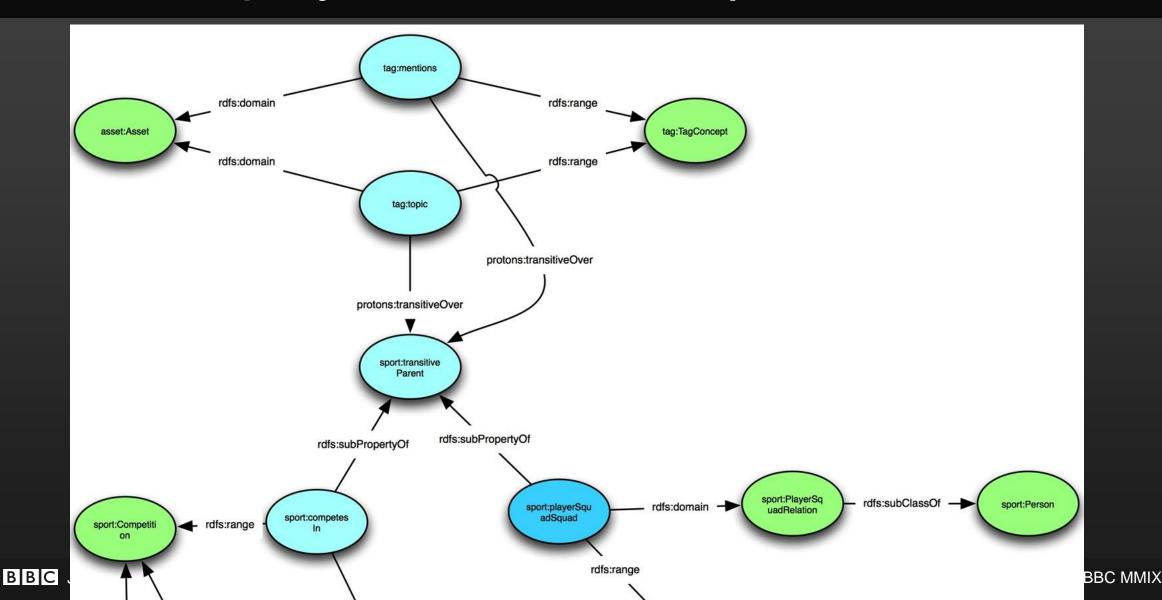
Extendable Domain Driven Asset Tagging



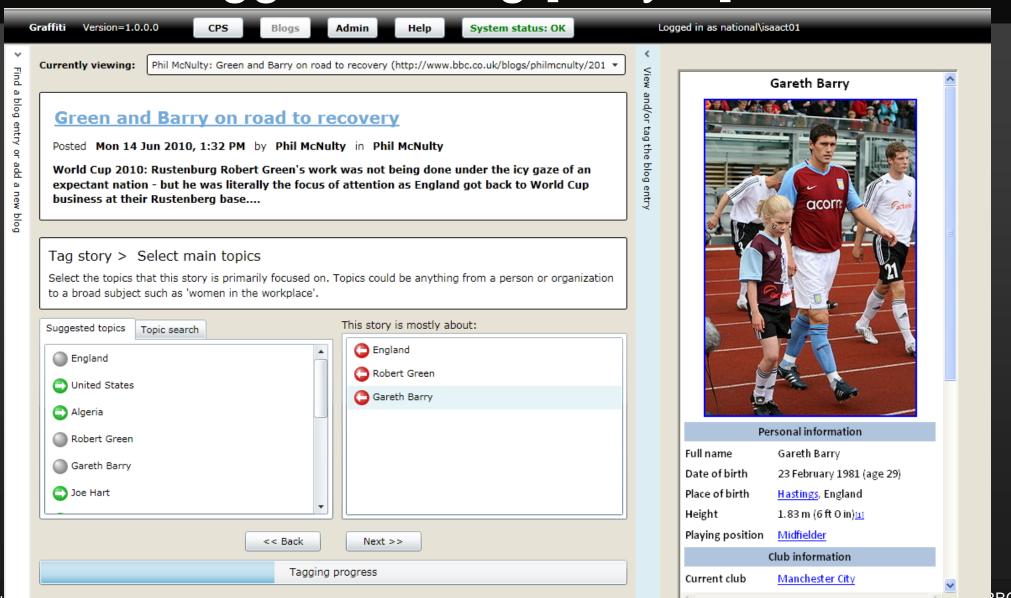
Open Ontology/Dataset reuse Event | Geonames | Foaf | Etc.



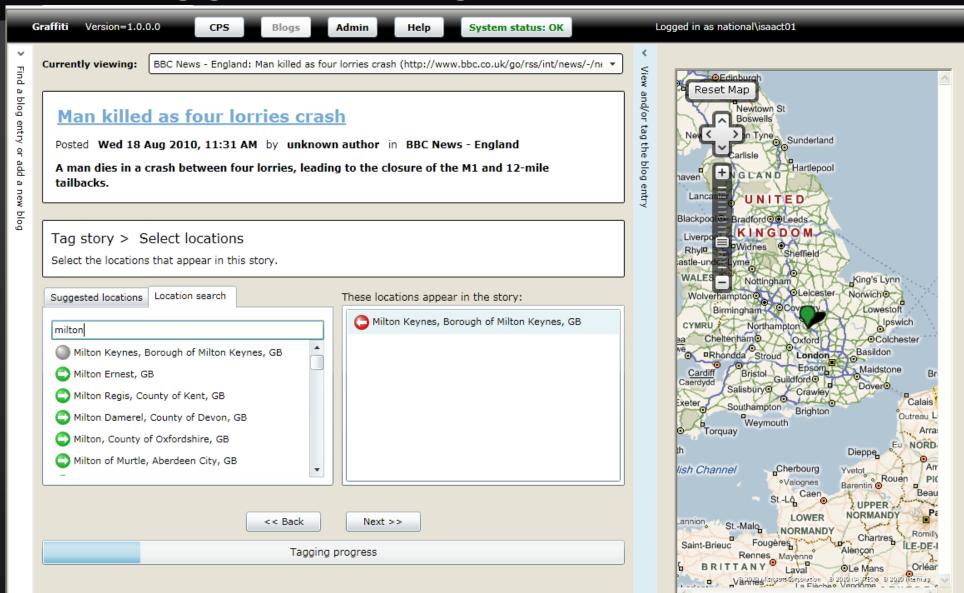
Infer... player->team->competition



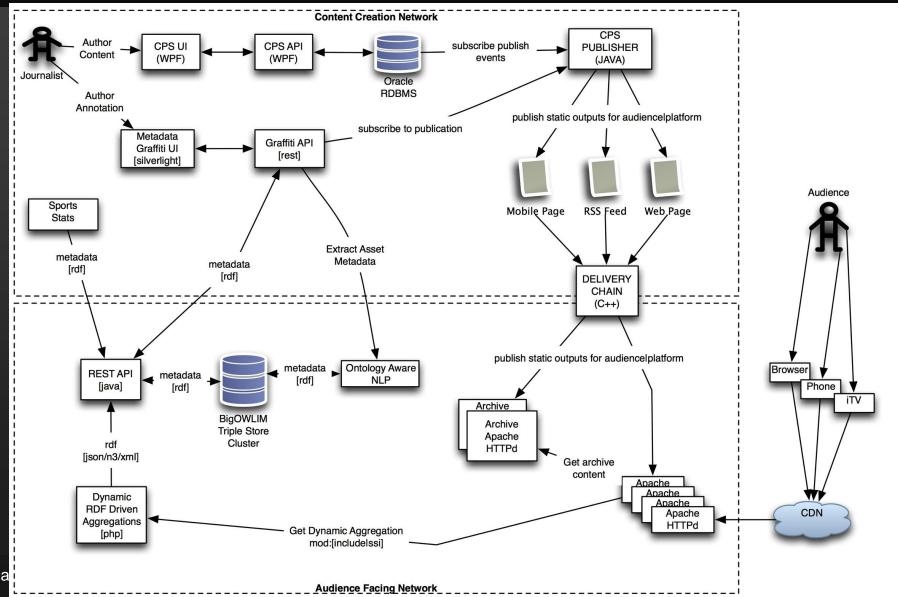
Graffiti: Suggest -> Tag [Player]



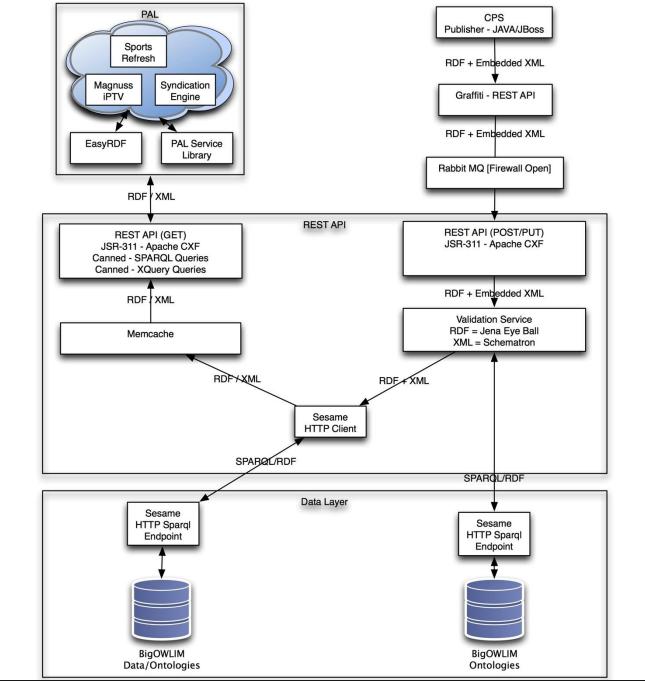
Graffiti: Suggest -> Tag [Location] (Geonames)



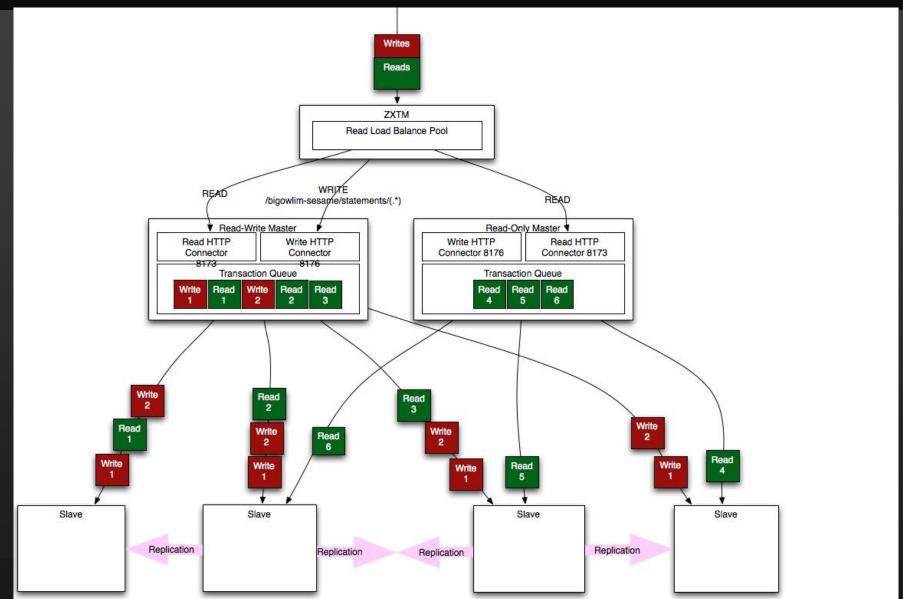
World Cup DSP Architecture



API Stack



Highly Scalable Clustered BigOWLIM



GET Accept text/rdf+n3 https://api.live.bbc.co.uk/dsp/sport/football/teams/chelsea

```
<a href="http://www.chelseafc.com/">http://www.chelseafc.com/>
     domain:documentType <a href="http://www.bbc.co.uk/things/document-types/homepage">http://www.bbc.co.uk/things/document-types/external</a>.
<a href="http://www.bbc.co.uk/sport/football/teams/chelsea">http://www.bbc.co.uk/sport/football/teams/chelsea</a>
     domain:documentType <a href="http://www.bbc.co.uk/things/document-types/bbc-document">document type <a href="http://www.bbc.co.uk/things/document-types/homepage">http://www.bbc.co.uk/things/document-types/homepage</a>.
<a href="http://www.bbc.co.uk/things/2acacd19-6609-1840-9c2b-b0820c50d281#id">http://www.bbc.co.uk/things/2acacd19-6609-1840-9c2b-b0820c50d281#id</a>
             sport:CompetitiveSportingOrganisation;
     domain:canonicalName
             "Chelsea"^^<xsd:string>:
     domain:document <a href="http://www.chelseafc.com/">domain:document <a href="http://www.bbc.co.uk/sport/football/teams/chelsea">http://www.bbc.co.uk/sport/football/teams/chelsea</a>;
     domain:externalld <a href="http://dbpedia.org/resource/Chelsea_F.C.">http://dbpedia.org/resource/Chelsea_F.C.</a>, <urn:sports-stats:137316635>;
     domain:name "Chelsea";
     domain:shortName "Chelsea"^^<xsd:string>;
     sport:competesIn <a href="http://www.bbc.co.uk/things/5cd4682a-7643-f445-8b1f-bcbaf450bc89#id">http://www.bbc.co.uk/things/5cd4682a-7643-f445-8b1f-bcbaf450bc89#id</a>.
<a href="http://dbpedia.org/resource/Chelsea_F.C.">http://dbpedia.org/resource/Chelsea_F.C.</a>
     domain:externalIdType
            <a href="http://www.bbc.co.uk/things/external-id-types/dbpedia">http://www.bbc.co.uk/things/external-id-types/dbpedia</a>.
<urn:sports-stats:137316635>
     domain:externalIdType
            <a href="http://www.bbc.co.uk/things/external-id-types/bbc-sport-stats">http://www.bbc.co.uk/things/external-id-types/bbc-sport-stats</a>.
<a href="http://www.bbc.co.uk/things/5cd4682a-7643-f445-8b1f-bcbaf450bc89#id">http://www.bbc.co.uk/things/5cd4682a-7643-f445-8b1f-bcbaf450bc89#id</a>
     domain:canonicalName
             "Premier League" ^^ < xsd:string> :
     domain:externalld <urn:sports-stats:118996114>;
     sport:competitionType
            <a href="http://www.bbc.co.uk/things/competition-types/domestic-league">http://www.bbc.co.uk/things/competition-types/domestic-league>.</a>
```

Rationale

- Automated content publishing
- Huge increase in content breadth (number of manageable pages)
- Content re-use and re-purposing, increasing reach
- Simplified content management
- Journalist headcount reduction
- Multi-dimensional entry points and semantic navigation
- Improved user experience with high levels of user engagement
- Dynamic, state (time|event) and semantic driven page layout
- Personalized content aggregations
- Open data and API's

World Cup statistics the GOOD

- 750+ Dynamic aggregations/pages (Player, Squad, Group, etc..)
- Average unique page requests a day : 2 million +
- Average OWLIM SPARQL queries a day: 1 million
- 100s RDF statement updates/inserts per minute with full OWL reasoning and associated inference.
- Multi data center fully resilient, clustered 6 node triple store
- RDF graph model ideally suited to model domain representations such as sport

World Cup statistics the BAD

- Sports stories and indices static
- Sport content not responsive or personalized
- RDF Store unable to handle thousands of statistic updates a second
- RDF Store forward-chained closures expensive increase write latency
- RDF graph model and SPARQL not ideally suited to the BBC's News and Sport document publication model

BBC Sport 2012; Online Refresh





http://bbc.co.uk/sport

Sport Refresh 2012

- Page per Athlete [10,000+], Page per country [200+], Page per Discipline [400-500], Page per venue, Page per team
 A lot of output...
- Almost real time statistics and live event pages
- Time coded, metadata annotated, on demand video, 58,000 hours of content
- Far too many web pages for far too few journalists
- DSP annotation architecture to automate content aggregation

10000+ Dynamic Aggregations

A necessary sacrifice

Athletes from Team GB

- Dempsey

Show me: All sports

Barcelona to reach.

Chelsea can prey on Barcelona's weaknesses

Chelsea midfielder Ramires was rightly lauded for his display in

ALISTAIR MAGOWAN - BBC SPORT

BBC SPORT BLOG EDITOR

league photos

Around the web

Anton Ferdinand

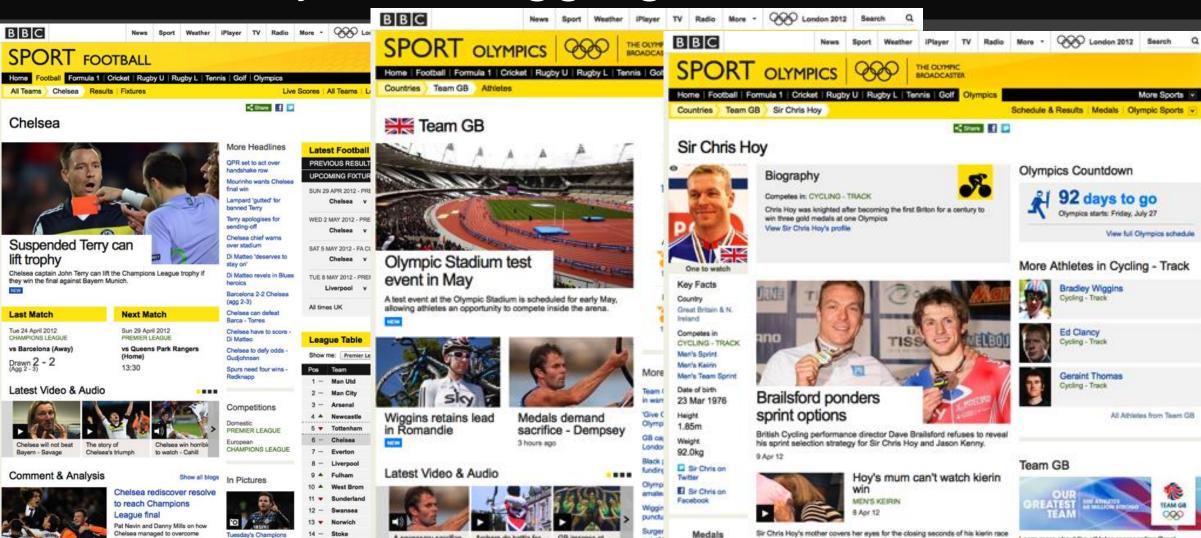
ESPN Soccemet

advised to snub Terry

15 - Aston Villa

16 A OPR

17 Wigan



GB impress at

synchro test event.

out of I

Five si

Team (

Sarker

top-eig

Beijing 2008

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at the World Track Cycling in Melbourne. (UK users only)

Bauge

A Apr 12

MEN'S SPRINT

Year ban hurt me - champion

Learn more about the athletes representing Great

Games, and catch up on the latest news and gossip

Britain and Northern Ireland in the 2012 Olympic

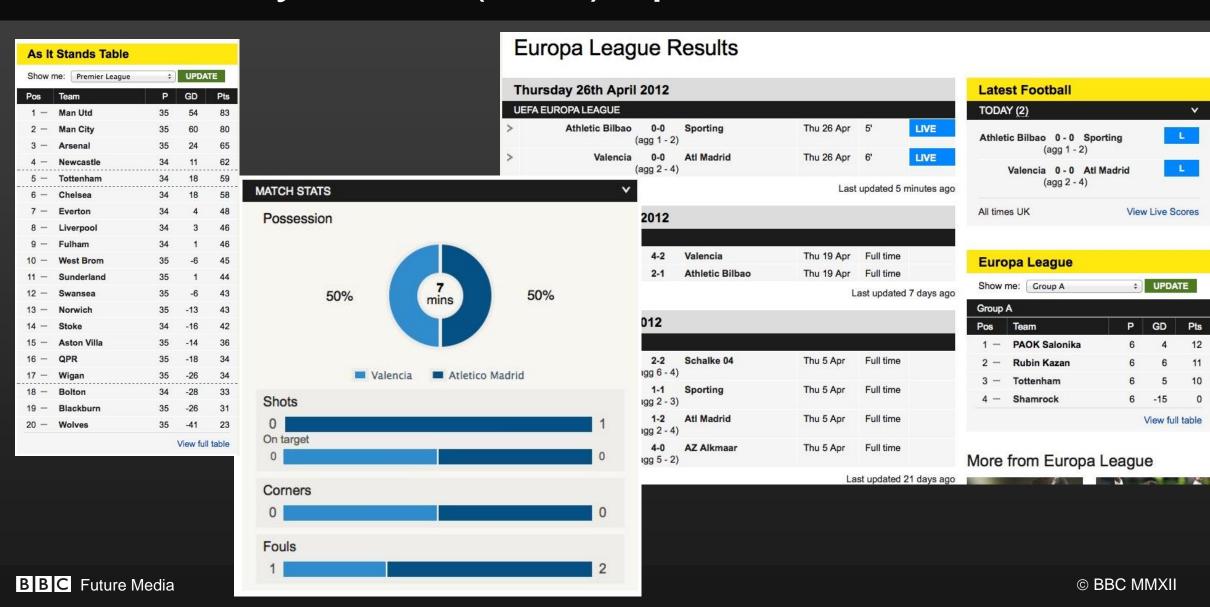
surrounding Team GB

Meet Team GB

Archers do battle for

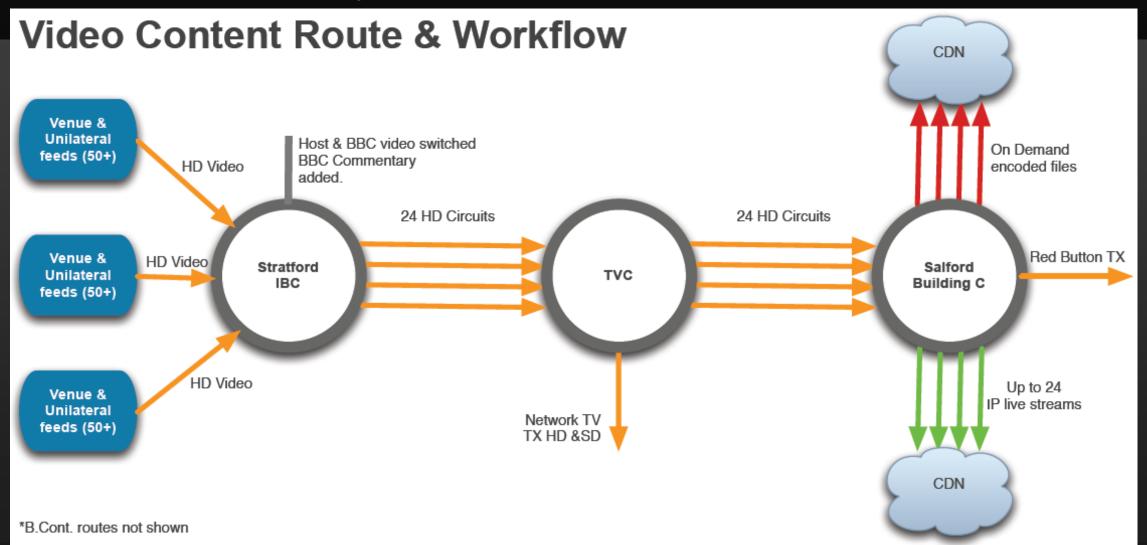
Olympic places

Lots of Dynamic (Live) sports stats





Video delivery



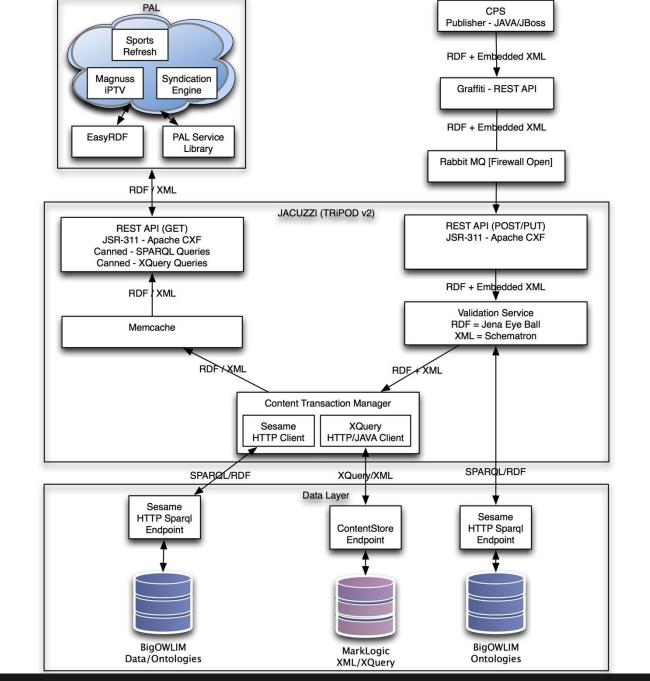
Augment architecture with a Content Store

- 1. Atomic content assets stored in MarkLogic XML store
- 2. XML content queryable via Xquery
- 3. Content Assets searchable
- 4. Sports statistics searchable/queryable via XQuery
- 5. Ontological SPARQL via BigOWLIM, assets Xquery via MarkLogic

API Stack

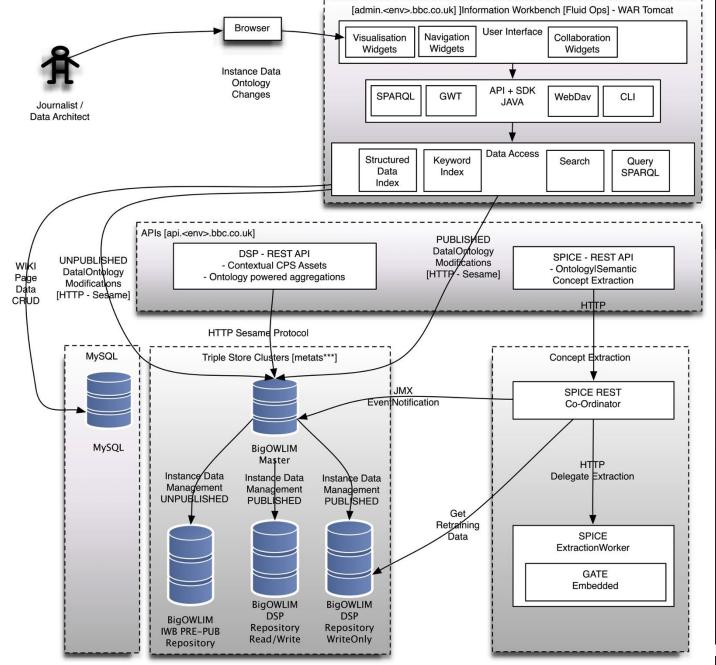
MarkLogic

OWLIM Enterprise

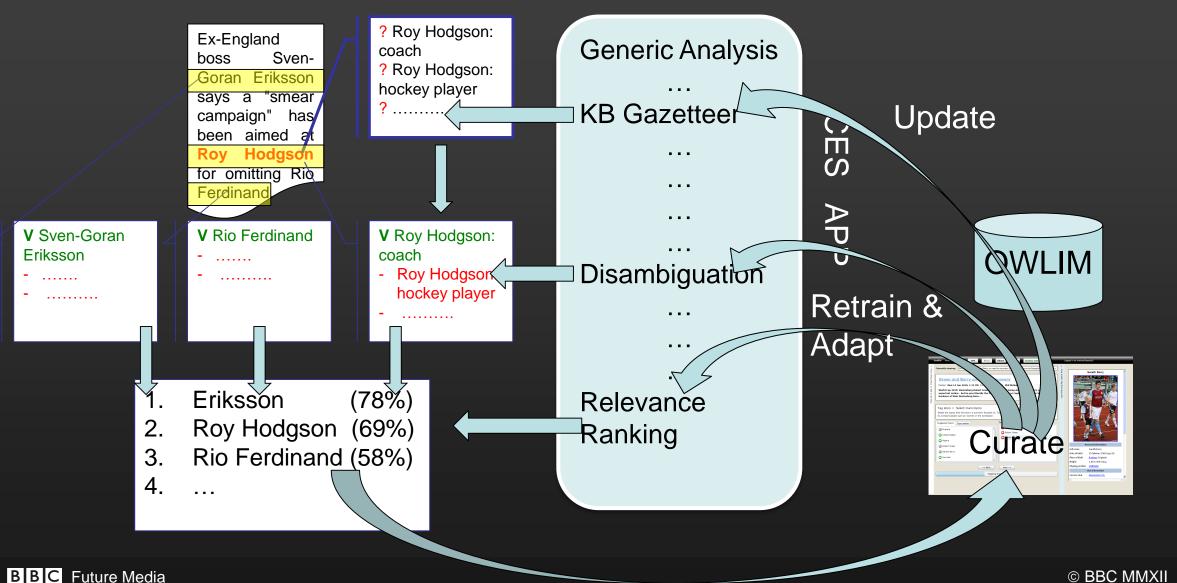


Ontology Aware NLP

- Information Workbench
- OWLIM
- (Spice) GATE+Ontotext



Ontology Aware NLP and Semantic Disambiguation



Entity Relevance: Objective

- Rank entities by their relatedness to the article
- Accuracy 75%
- We consider various frequencies of entity mentions in the article and in the entire set of articles
- Positions in the article fields or in the first paragraphs of the body boost the relevance

Confidence and Relevance

The relevance of an entity in arbitrary document may depend on:

Text context and the vicinity of an entity/concept within the text. (Confidence)

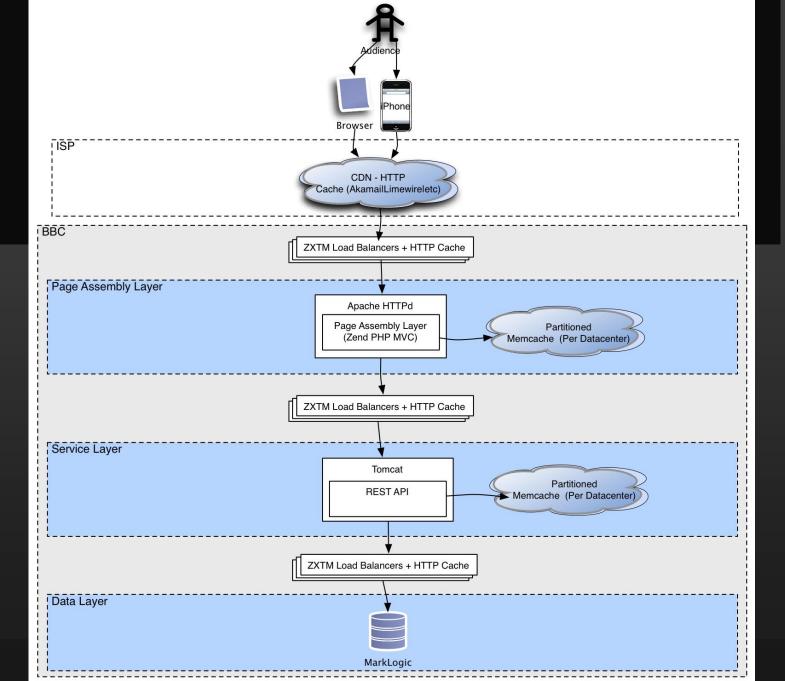
Ontological graph context and the vicinity of an entity/concept within the graphs knowledge model

The frequencies of entities in the corpus and document. (Relevance)

Disambiguation of Locations

- Geospatial distance a feature of OWLIM (geosparql)
- Super region GeoNames hierarchy and containment relations, e.g. parentFeature
- RDF Rank Similar to Page Rank but RDF links
- Human approval score (on the basis of curated documents)

Plenty of Caching



Sport Stats REST API

REST Endpoint for all Sports Stats on BBC

- /football/teamstats/team/{team}
 - /clubstats
- /football/table
 - /ais/competition/{comp}
 - /competition/{comp}
 - /positions/competition/{comp}/team/{team}
 - /snapshot/competition/{comp}
 - /structure/{structureid}/group/{groupid}
- /football/matches
 - /structure/{structureid}/group/{groupid}
- /football/match
 - /{matchid}
- /football/recentresults
 - /match/{matchid}
- /football/videprinter
- /football/config
 - /competition/structure/{structureId}
 - /competition/structure/{structureId}/groups
 - /competition/{competitionId}/structure/{structureId}/groups
- /football/stats
 - /competition/{comp}
 - /competition/{comp}/team/{team}
- /cricket/scorecard
 - /{matchid}
- /cricket/matches
- /cricket/table
 - /competition/{comp}
 - /positions/competition/{comp}/team/{team}
- /cricket/stats

Olympics API (RDF)

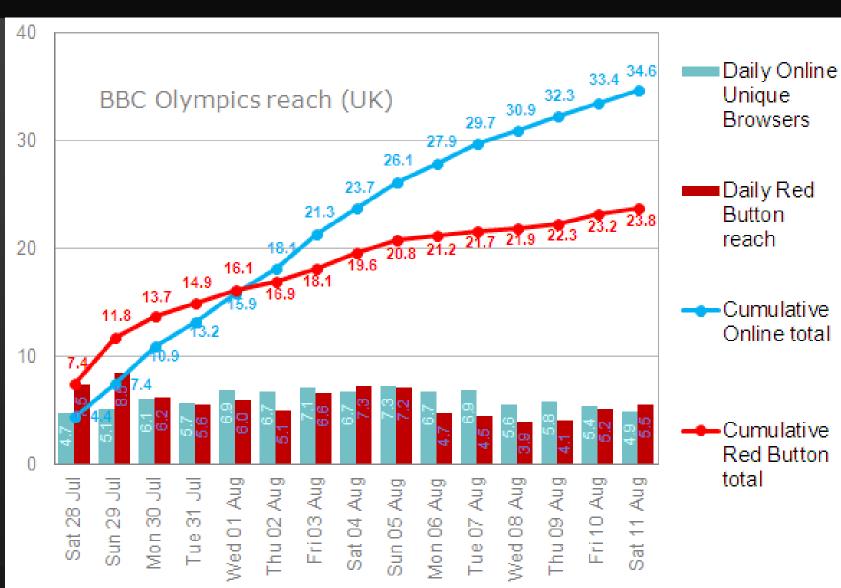
@prefix oly: http://www.bbc.co.uk/ontologies/2012olympics/.

```
@prefix par: <http://purl.org/vocab/participation/schema#>.
@prefix dc: <http://purl.org/dc/elements/1.1/> .
<a href="http://www.bbc.co.uk/things/82f5db84-0591-49ee-b6f4-a1d26e9381fb#id">http://www.bbc.co.uk/things/82f5db84-0591-49ee-b6f4-a1d26e9381fb#id</a> a sport:Person ;
                  rdfs:label "Usain Bolt"^^xsd:string, "Bolt Usain-athletics-jam-1986-08-21"^^xsd:string;
                  foaf:name "Usain Bolt"^^xsd:string, "Bolt Usain-athletics-jam-1986-08-21"^^xsd:string;
                  domain:canonicalName "Bolt Usain-athletics-jam-1986-08-21"^^xsd:string;
                  foaf:givenName "Usain"^^xsd:string;
                  foaf:familyName "Bolt"^^xsd:string;
                  domain:name "Usain Bolt"^^xsd:string;
                  olv:dateOfBirth "1986-08-21"^^xsd:date :
                  oly:gender "M"^^xsd:string;
                  oly:height "195.0"^^xsd:float;
                  oly:weight "94.0"^^xsd:float;
                  oly:worldOlympicDream "true"^^xsd:boolean;
                  sport:discipline <a href="http://www.bbc.co.uk/things/b3a086df-ab42-2b44-be8b-76b600bfcdce#id">http://www.bbc.co.uk/things/b3a086df-ab42-2b44-be8b-76b600bfcdce#id</a>;
                  sport:competesIn <a href="http://www.bbc.co.uk/things/1b499a08-4f02-4196-aa6c-c43ea353138b#id">sport:competesIn <a href="http://www.bbc.co.uk/things/1b499a08-4f02-4196-aa6c-c43ea353138b#id">http://www.bbc.co.uk/things/1b499a08-4f02-4196-aa6c-c43ea353138b#id</a>.
<a href="http://www.bbc.co.uk/things/b3a086df-ab42-2b44-be8b-76b600bfcdce#id">http://www.bbc.co.uk/things/b3a086df-ab42-2b44-be8b-76b600bfcdce#id</a> a sport:SportsDiscipline;
                  domain:name "Athletics"^^xsd:string;
                  domain:document <a href="http://www.bbc.co.uk/sport/olympics/2012/sports/athletics">http://www.bbc.co.uk/sport/olympics/2012/sports/athletics</a>.
<a href="http://www.bbc.co.uk/things/1b499a08-4f02-4196-aa6c-c43ea353138b#id">http://www.bbc.co.uk/things/1b499a08-4f02-4196-aa6c-c43ea353138b#id</a> a sport:MedalCompetition;
                  domain:name "Men's 100m"^^xsd:string;
                  domain:shortName "Men's 100m"^^xsd:string;
                  domain:document <a href="http://www.bbc.co.uk/sport/olympics/2012/sports/athletics/events/mens-100m">http://www.bbc.co.uk/sport/olympics/2012/sports/athletics/events/mens-100m</a>;
                  oly:measurementType <a href="http://www.bbc.co.uk/things/measurement-types/time">http://www.bbc.co.uk/things/measurement-types/time</a>;
                  domain:externalld <urn:ioc2012:ATM001000>.
```

Olympic numbers

Unique Browser Requests per day Peaked at just over 8 million UK and 11 million Globally.

Cumulative Unique browsers online total 34.6 million

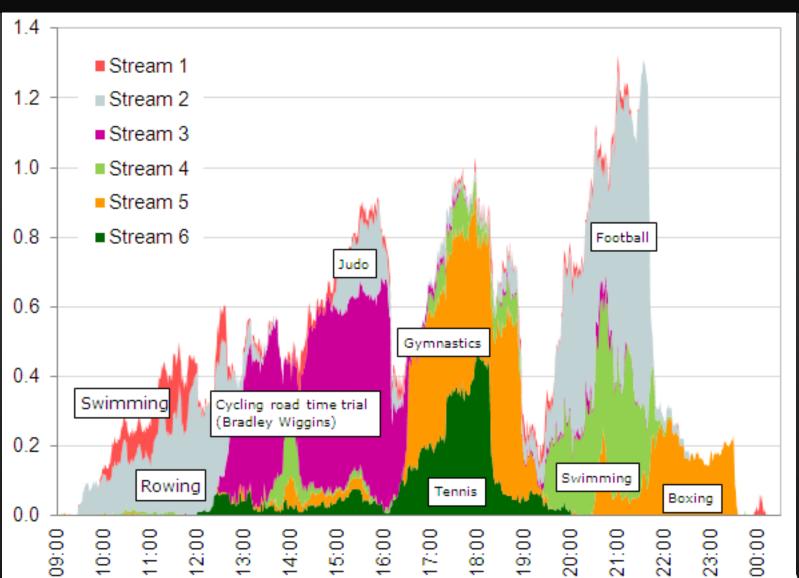


Olympic numbers

On the busiest day, the BBC delivered 2.8 petabytes, with the peak traffic moment occurring when Bradley Wiggins won Gold and we shifted 700 Gb/s.

106 million requests for BBC Olympic video content across all online platforms

Number of people watching individual Streams →

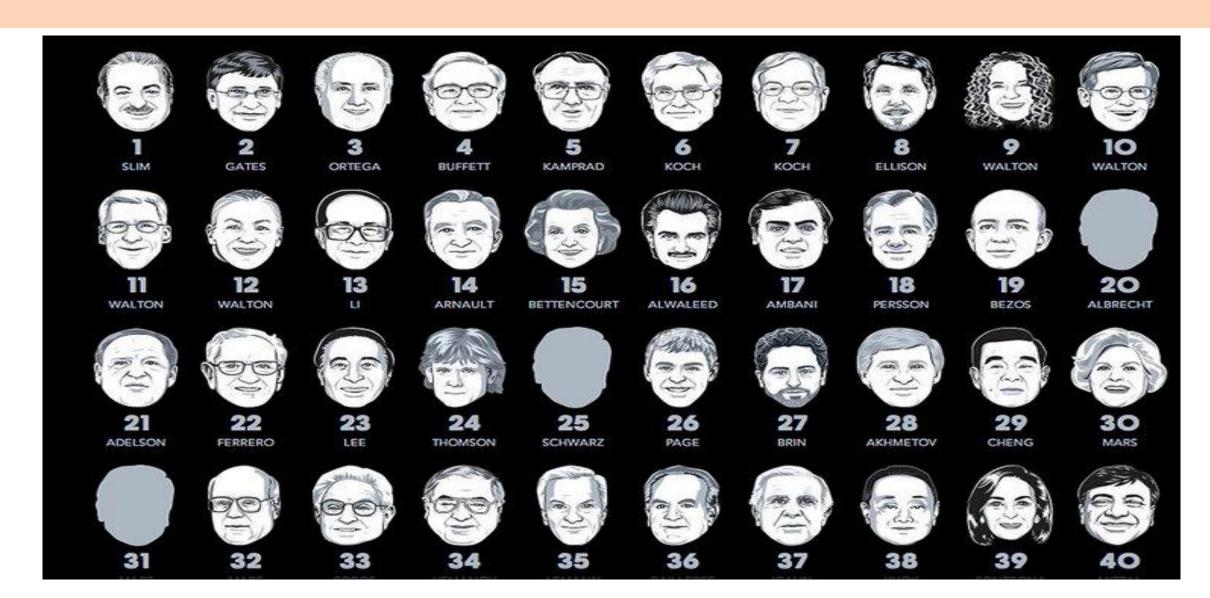


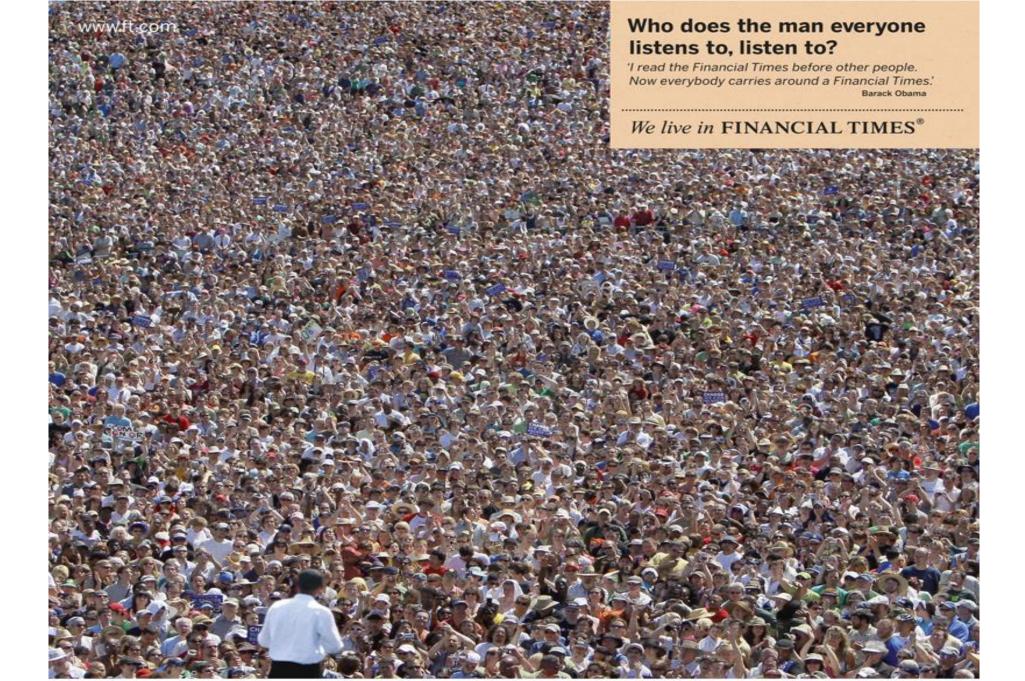
FT?

...some background about the Financial Times



The FT Audience: The world's most wealthy and powerful people





Global network of over 500 journalists



The FT product portfolio



FT has been successfully charging for online content since 2002

FT.com subscriptions first introduced

2007
FT.com metered model is launched

2012
Digital subs
overtake print
circulation

2013FT has 343k paying digital

subscribers

- Subscriptions were launched in 2002
- The model was flexible and business rules were determined by various departments
- Customer experience wasn't great!
 (Customer data wasn't been captured or used intelligently)

Digital subscriptions continue to grow

2002

FT.com subscriptions first introduced 2007

FT.com metered model is launched

2012

Digital subs overtake print circulation 2013

FT has 443k paying digital subscribers

2 million

people worldwide read the FT in print or online

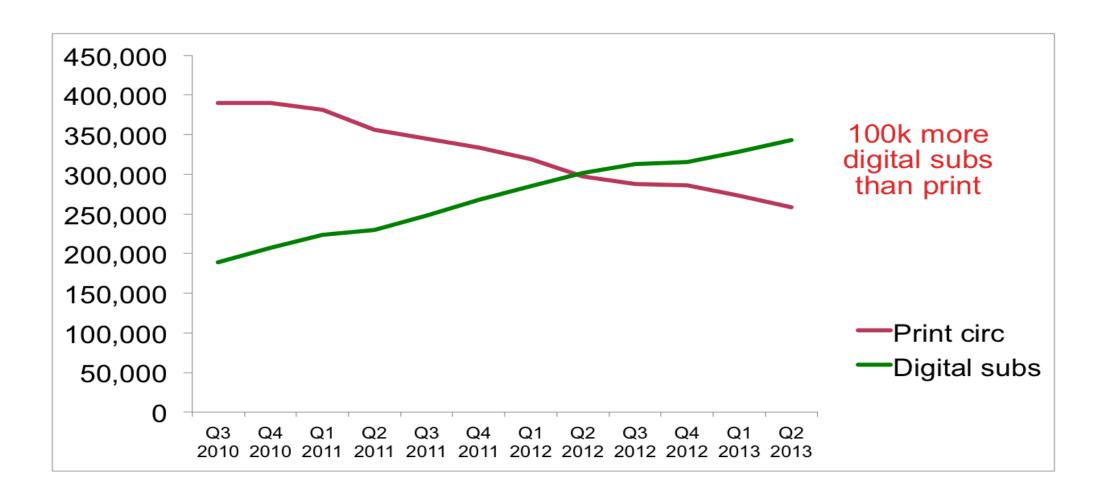
600,000+

Combined Print & Digital Circulation



Revenue expected to be generated through content sales/subscriptions by end of 2013

Digital is our future



The FT is where our readers wish to consume it













Meteoric rise of mobile

- Over 50% of subscriber consumption
- Third of FT.com traffic
- Driving 24% of new digital subs
- Mobile advertising up 26% yoy





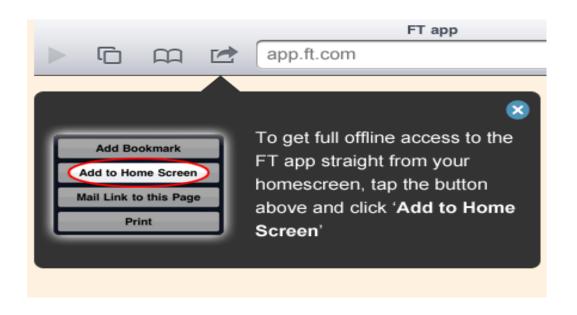








First major publisher to launch an HTML5 web app

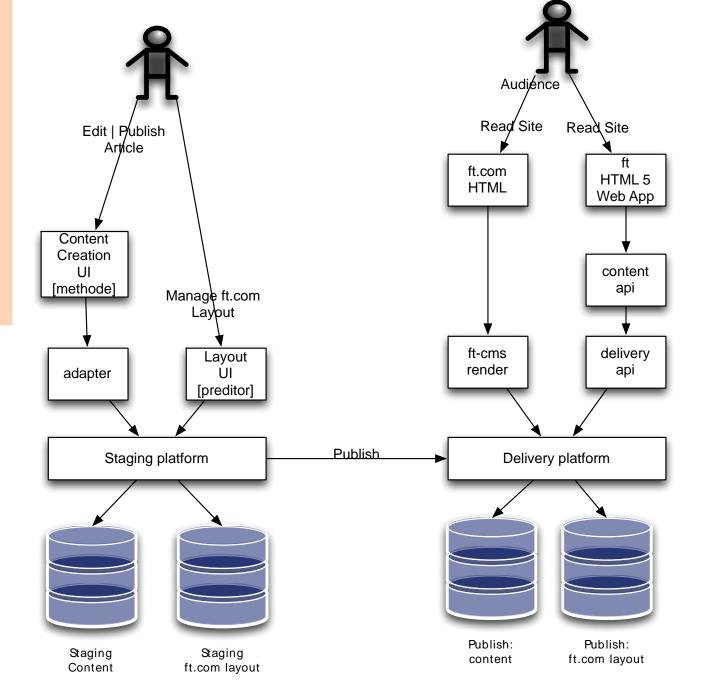


 Supporting offline content consumption



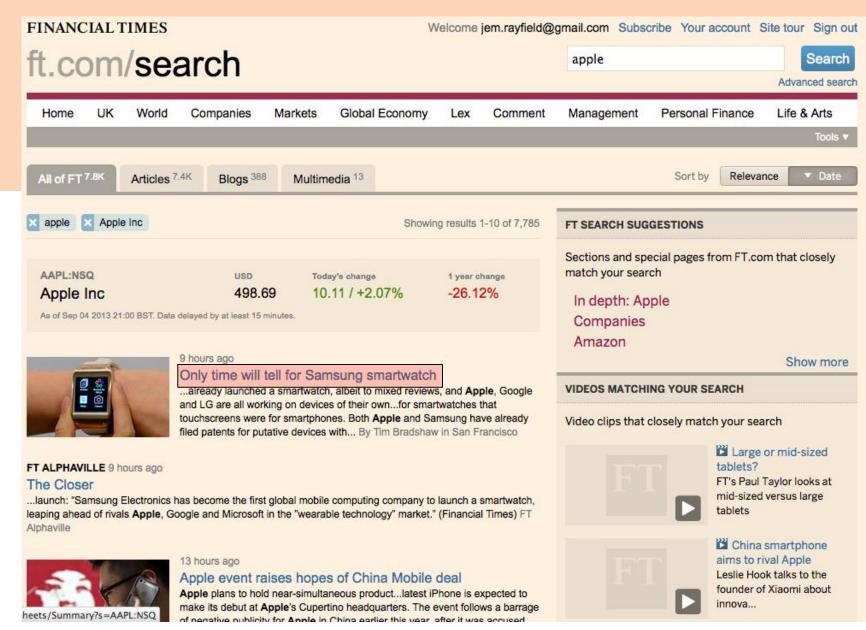
Existing Very complex Publishing Architecture.

Just to publish a content object.
No search no metadata?

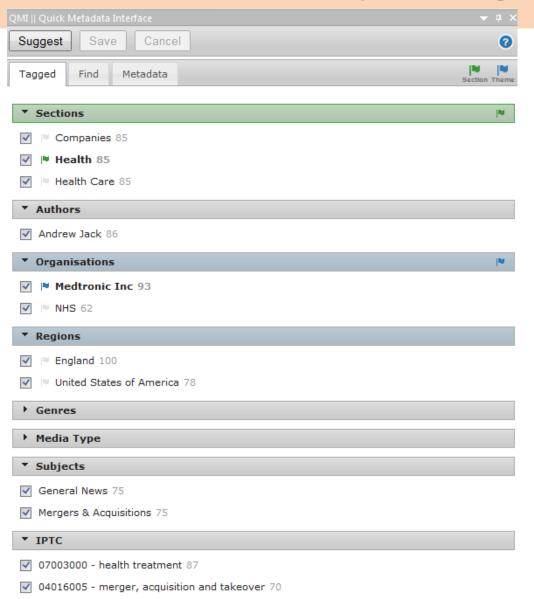


Taxonomy based Search and Topic pages (Poor Quality)

Top story is about Samsung?



Taxonomy Based Tagging & Event Based Story editing



COMPANIES DAILY NEWS LIST for 02/09/2013

FINANCIAL SERVICES

± ^

⊞ 🐉

BHP Billiton shares crash as China results recede

💂 BHP Billiton shares crash as China results recede



BHP Billiton shares crash as

BHP Billiton shares crash as

Interactive graphic

Picture of BHP make it good

☐ Great tax race: Ireland's policies aid business more than public

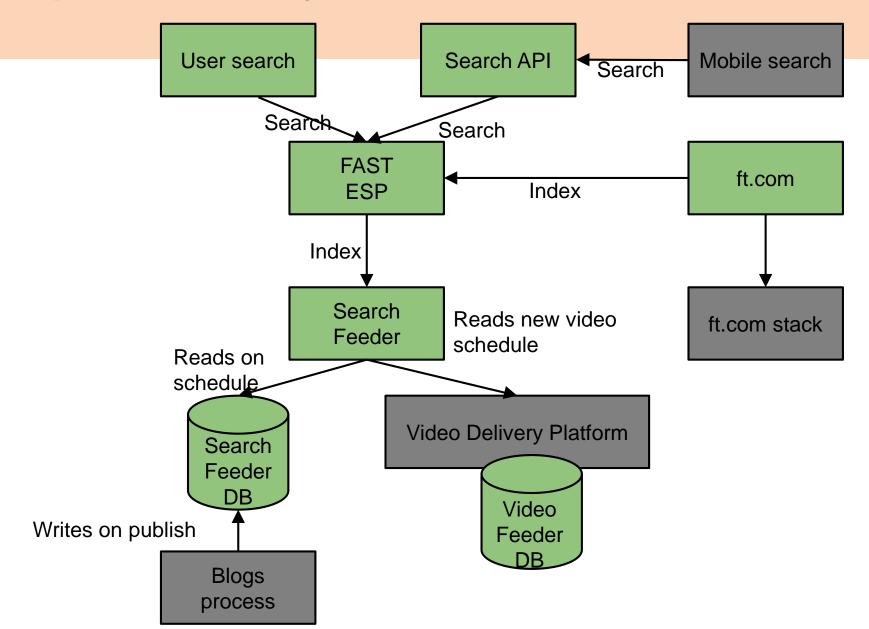
A few weeks before Ireland unveiled its 2012 budget, which heaped €3.5bn in tax rises and spending cuts on an austerity weary public, I the industry's wish list. It was the morning of 24 November 2011, just a year after Dublin was forced into an international bail-out due to

▼ under the auspices of the "Clearing House"- a secretive group of finan...



- Apple is bitten by results
- A new story for Jill to write about Apple
- Correlations (Show Thumbnails)
 - UKDubai.dwc Story Package Created: symonf 01/05/2013 10:12 Modified: servlet-Archive 30/08/2013 17:10
- Sprint CO 24.xml Promo Box Created: bonds 24/04/2013 13:06 Modified: watkinsa new 01/05/2013 12:50
- Thorntons CO 24.xml RELATED OBJECT Created: watkinsa 24/04/2013 16:36 Modified: watkinsa_new 01/05/2013 12:50
- Further reading.html FT Blog Created: watkinsa_new 01/05/2013 12:19 Modified: watkinsa_new 03/05/2013 15:14
 - How the Miliband reforms may give even more power to the unions-013.html FT Blog Created: burnsr 19/07/2013 10:03 Modifi
 - The mobile operating system battle.html FT Video Created: watkinsa_new 01/05/2013 12:19 Modified: watkinsa_new 03/05/.
- Companies_2608997786001_Talking-to-the-animals_Companies.xml Promo Box Created: servlet-Import 15/08/2013 20:37 Mo

Complex Taxonomy Based Search



Moving towards: Semantic Publishing Platform

Provide a Universal Publishing "UP" platform where all FT content is universally accessible across all of its channels:

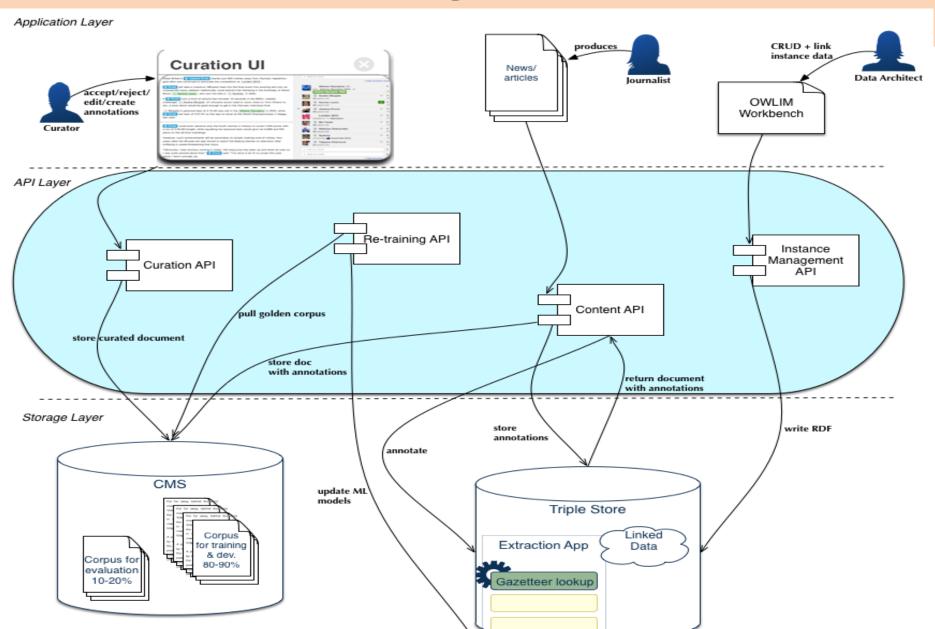
RDF Store; semantically understand, interlink and store all FT content within a single pan FT Content Store

APIs; content, metadata and the links between will be exposed and made publicly available via APIs

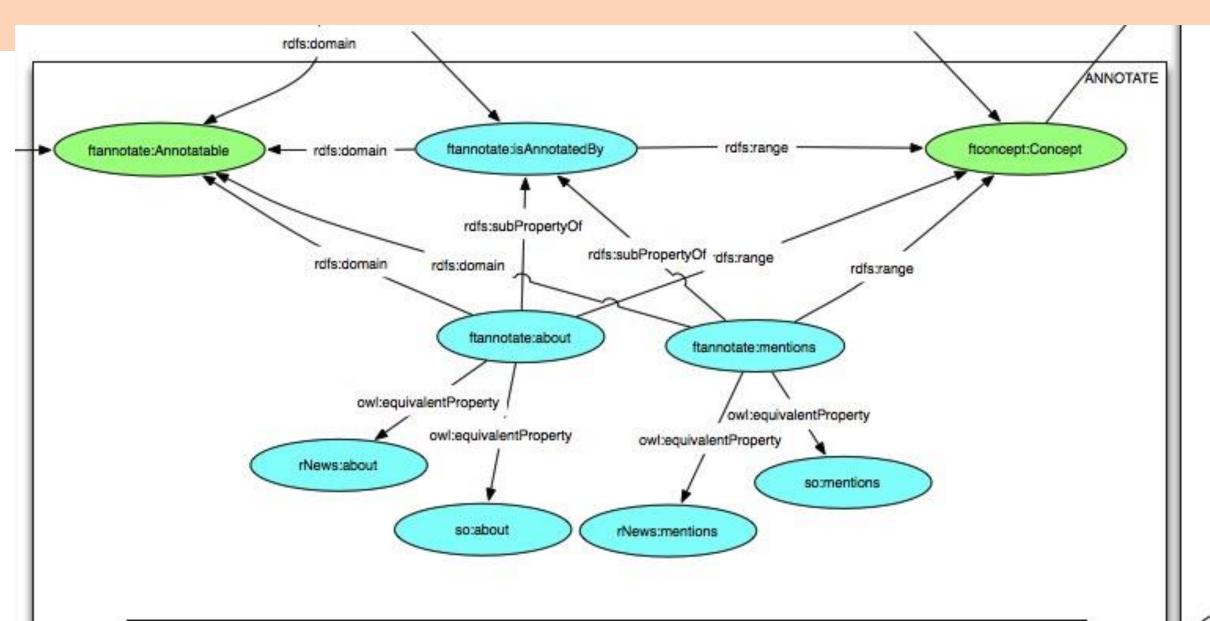
Publishing tools; provide tooling which allows journalists, users, readers and contributors to publish to the Content Store via APIs.

Metadata and Semantics; author content directly in addition publish data about the content - semantic metadata. Provide intelligent query and search capabilities empowering the next generation of FT products

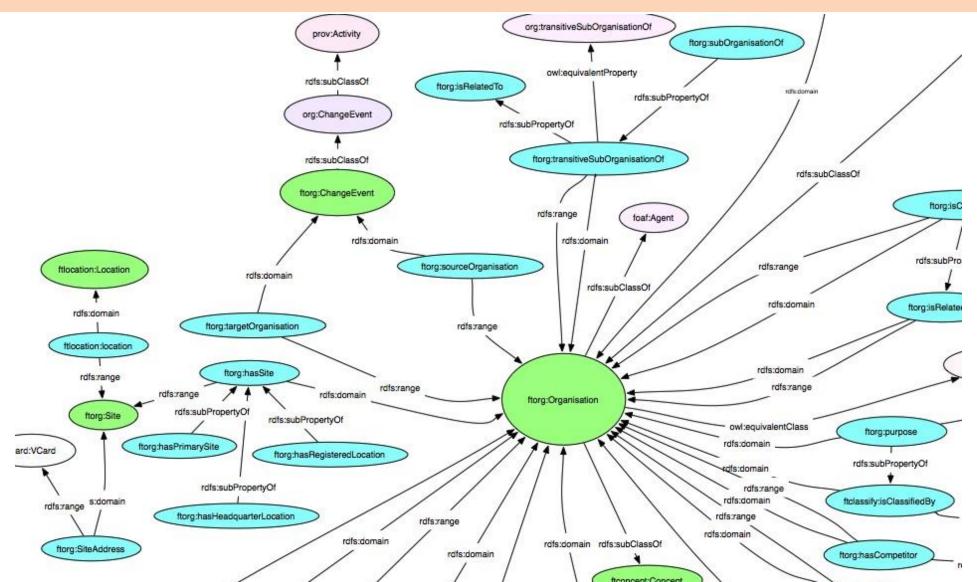
Dynamic Semantic Publishing Architecture



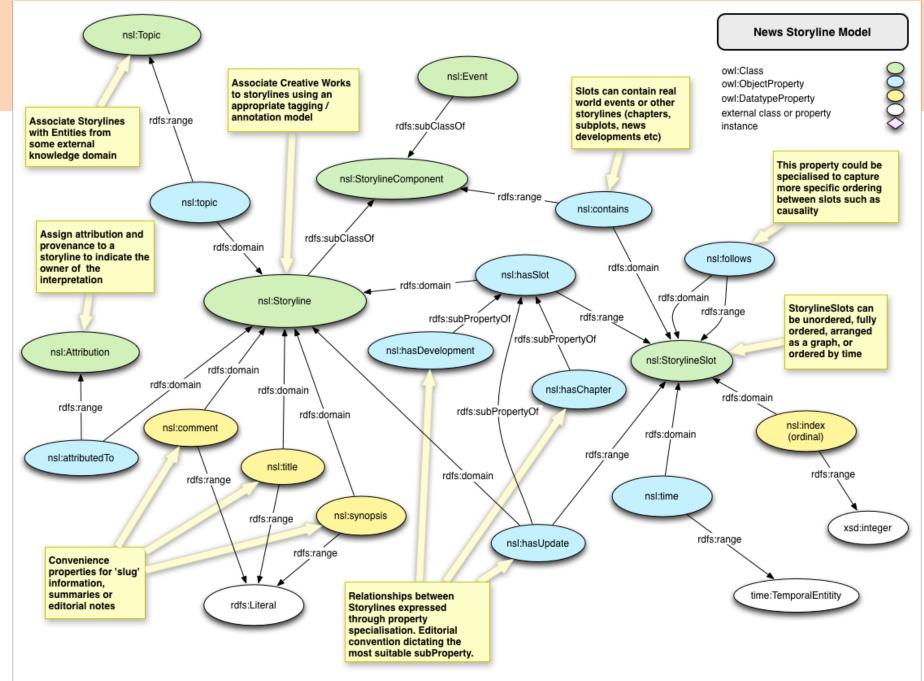
Annotation ontology - Semantic fingerprint



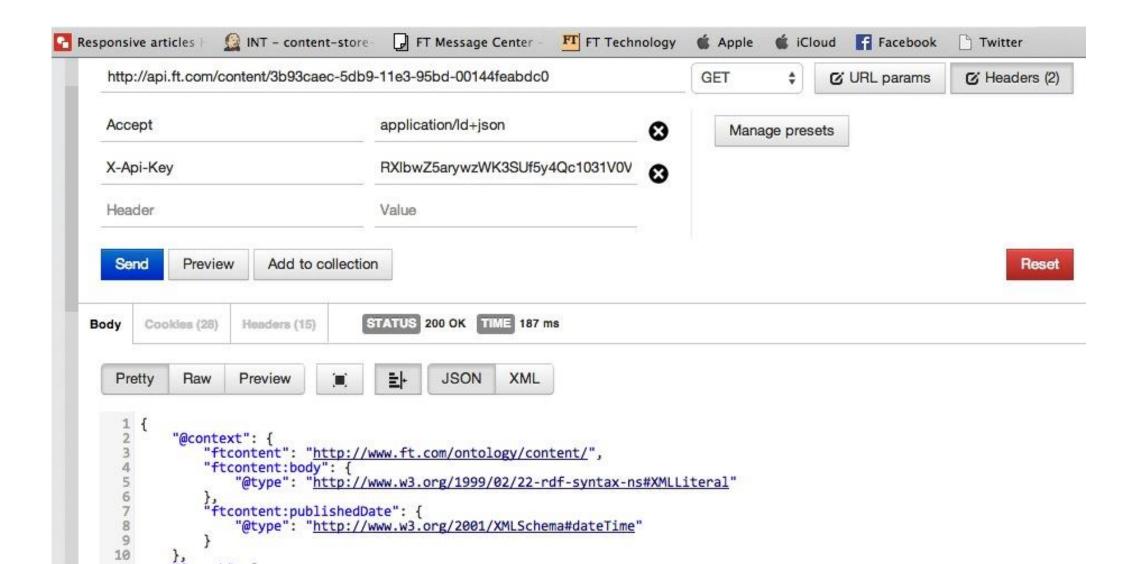
News Business ontology Collaboration: (FT, BBC, Reuters, Bloomberg, EuroMoney)



Future: Story line ontology



JSON+LD For all pubic (secure) endpoints (Demo)



FT.com Semantic Prototype (Demo)...



FINANCIAL TIMES

Facets

Trending

HOME

May 31, 2014

Peter Mutharika wins Malawi presidential elections



President Banda triedto nullifying election citing 'rampant irregularities' but was overruled by the high court and the counting and recounting of votes went on for days

May 29, 2014

Radoslaw Sikorski in the hot seat.

Poland's foreign minister is helping drive a hardline stance on the Ukraine crisis, propelling himself and his country into the first rank of European diplomacy

WORLD

Jun 1, 2014

It is time for the ECB to act, but more talk is needed too



A further bout of disinflationary pressures could force more troubled member states into a prolonged bout of Japanese-style deflation

Jun 1, 2014

World diary: June 2 - June 8

Nato defence ministers meet; war-torn Syria elects a new president; a G7 summit is held without Russia; Lithuania's progress on eurozone membership is outlined; Ukip's showing at Newark's byelection will be closely watched

COMPANIES

Jun 1, 2014

Companies diary: June 2 – June 8

Diary commentary from FT reporters; data and company announcements, unless otherwise stated, from Thomson Reuters. Company announcements are of information publicly available before last week.

Jun 1, 2014

Manchester airport's 21m passengers a year is busiest since 2008



Numbers are rising by 5.5 per cent year on year, compared with 3 per cent for the UK

MARKETS

Jun 1, 2014

China accuses US an of 'provocative action



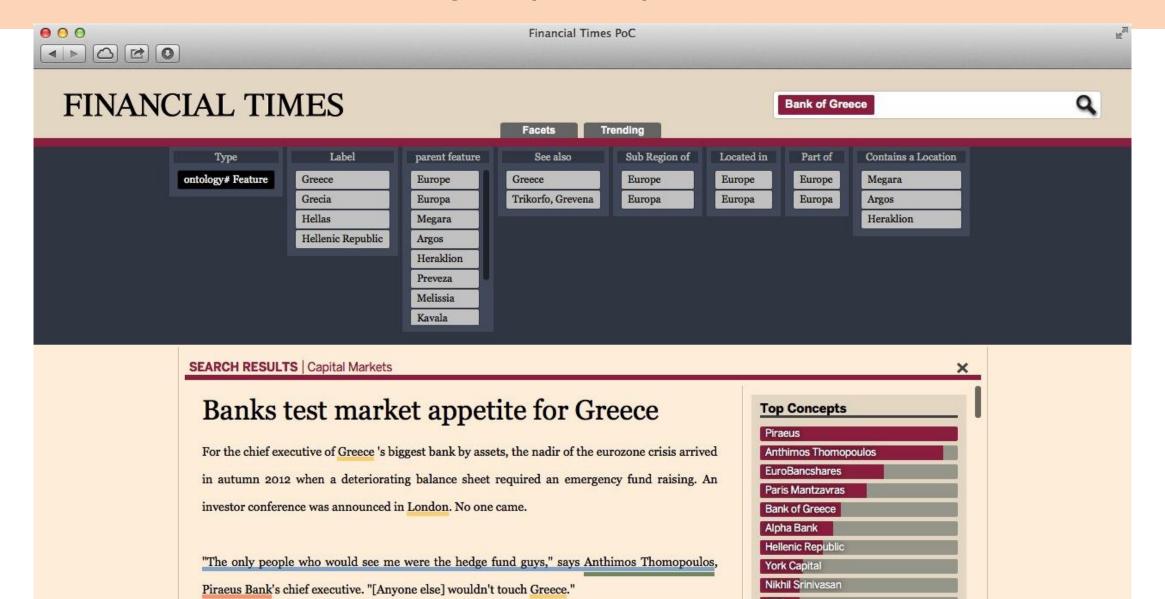
Top Chinese general accused yan of staging 'provocative a inst China, as maritime to into an Asian regional defence

May 31, 2014

China hits back after criticises maritime cl strategy



FT.com Semantic Prototype (Demo)...



FT.com Semantic Prototype (Demo)...



Related/Similar Content

Facebook buys WhatsApp in \$19bn deal

Facebook is buying WhatsApp in a cash-and-stock deal worth up to \$19bn, as the world's leading social network enters the fast-growing chat app market that is popular among younger generations and emerging markets.

The Menlo Park-based social network is acquiring an app which boasts more than 450m users who use it to message without paying high fees. Users of the app send almost as many messages as the number of text messages sent over the entire global telecoms network.

The purchase – far larger than Facebook's next largest deal of \$1bn – is designed to achieve Facebook's two main aims: to maintain its dominance in social networking as users move to mobile devices, and to grow its already massive userbase in less penetrated areas of the world.

WhatsApp is a leading player in the chat app world which has grown rapidly in the last couple of years. It is more dominant in countries outside the US, particularly in emerging markets.

The deal - which is 25 per cent in cash and the rest in stock - will see the app maintained as a

Facebook Messenger Apple Inc. Jan Koum chat app market Benedict Evans Sequoia Capital one venture capital firm Zuckerberg Menlo Park Mr Acton

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Feb 20, 2014
Facebook gets the message: the strategy for WhatsApp

Acquisition part of emerging tactic by social network to develop portfolio of apps to hang onto users adapting to mobile

Feb 21, 2014
Technology: Small company, big app

Facebook's \$19bn buyout of WhatsApp marks a moment for the mobile internet

Recommendations

Primary Objective

Serve relevant articles to increase user engagement and improve usability

Recommendations

Subject, Object and Action

Subject: User

Object: Article, Media Asset, Data, ...

Action: Read, Preview, Comment, ...

Contextual Recommendations

May 23, 2014 Barclays hit with £26m fine over gold fix



UK financial regulator has fined Barclays over poor controls that allowed trader to move the price of gold to avoid paying out on a client's order Contextual Similarity

Similar Articles

Feb 16, 2014 Forex in the spotlight

Banks are braced for a potential barrage of multibillion-dollar fines and litigation from the probe into alleged collusion in the foreign exchange market

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FCA is probing the use of private accounts by foreign exchange traders amid allegations they traded their own money

Behavioural Recommendations



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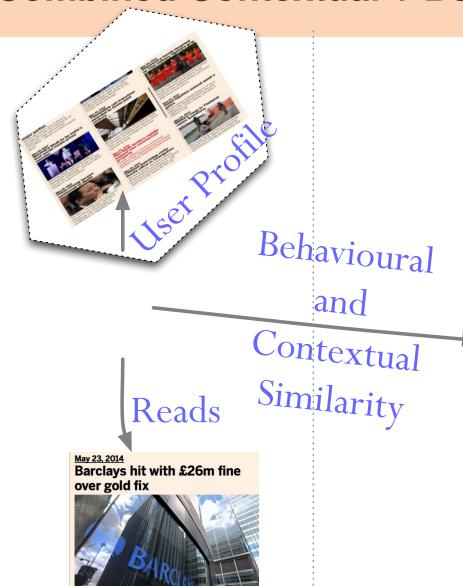
Barclays becomes latest bank to launch probe into its foreign exchange trading, adding to a growing worries over an industry-wide investigation

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UK probes private accounts of foreign exchange traders

FCA is probing the use of private accounts by foreign exchange traders amid

Combined Contextual + Behavioural Recommendations



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Banks are braced for a potential barrage of multibillion-dollar fines and litigation from the probe into alleged collusion in the foreign exchange market

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Nov 18, 2013

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FCA is probing the use of private accounts by foreign exchange traders amid allegations they traded their own money ahead of clients orders

User Actions: Limited to User Reads Article

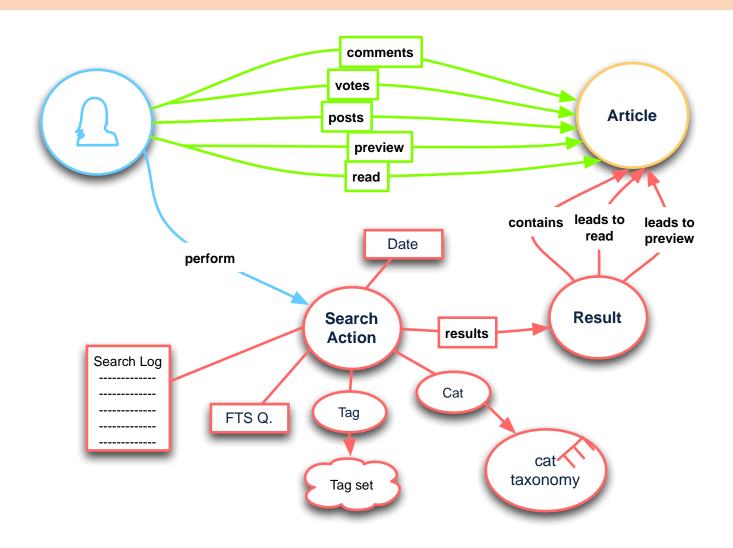


May 23, 2014 Barclays hit with £26m fine over gold fix



UK financial regulator has fined Barclays over poor controls that allowed trader to move the price of gold to avoid paying out on a client's order

User Actions: A wider behavioural perspective



"Content" Based Recommendations

Results will be based on the <u>similarity of content</u> <u>items</u>. Similarity will be defined by the terms/entities within the content (content fingerprint)

Results will be based on the past choices of an individual user (a user's *profile*). (Users content fingerprint)

Content based ranking

Two-fold scoring approach

- Similarity to recently viewed articles (context)
- Relevance to a long-term user profile,
 - Weights reflecting the <u>relative importance of the</u> <u>individual terms</u> (static component)
 - Transition likelihoods among any pair of terms (dynamic component)

Collaborative Ranking

Results based on statistics that reflect the past choices of <u>all users</u>

Results based on <u>user ratings</u>, and the similarity of users or items

Content-agnostic

Aware of the quality of content

Collaborative Ranking Mechanisms



May 23, 2014
Barclays hit with £26m fine over gold fix



UK financial regulator has fined Barclays over poor controls that allowed trader to move the price of gold to avoid paying out on a client's order

User to User Sim.
Score

Content to Content Sim. Score



UK financial regulator has fined Barclays over poor controls that allowed trader to

May 22, 2014
Credit Suisse sells \$5bn in bonds



Swiss bank's first significant senior debt

API: Recommend for:

http://www.ft.com/cms/s/0/398e6d5e-e858-11e3-9cb3-00144feabdc0.html

```
GET http://ft-recommendations.ft.com/api/behavioural/getsmartcontent?
        userid=6753665&contentid=398e6d5e-e858-11e3-9cb3-00144feabdc0
  "SmartAPI": "Recommendations API v1.8",
  "type": "behavioural",
  "status": "ok",
  "method": "getsmartcontent",
  "response": {
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         "feedid": 21.
         "feed": "FT Mobile Content API",
         "rel": 1.331479549407959,
         "date": "Thu May 29 18:33:04 UTC 2014",
          "cid": "3c6e330a-e74b-11e3-8b4e-00144feabdc0",
         "url": "http://www.ft.com/cms/s/0/3c6e330a-e74b-11e3-8b4e-00144feabdc0.html",
          "popularity": 2452
```

FINANCIAL TIMES **Architecture** Eleo RR Read Article 1. get related click stream **FT API AWS Elastic LB** 2. ask **Varnish Cache** update 1. pull content popularity update user SOLR 2 3. on cache SOLR 3 miss store user Fetch & 4. query profiles **Annotation** SOLR 1 Recommendation Node 1 API **OWLIM** Replication **₹2. annotate** CS Worker Group I Node 2 3. index annotate content CS **AWS INSTANCE** Node 3 **AWS INSTANCE** AWS INSTANCE

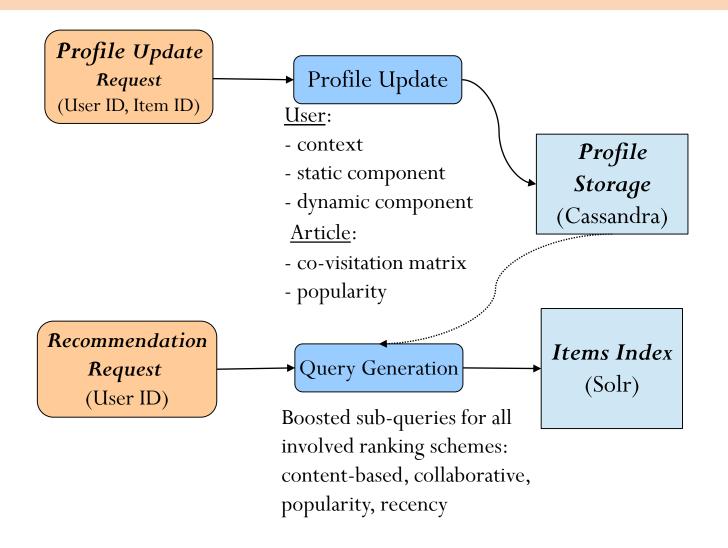
Main Actions

Pull content – annotate/enrich – index

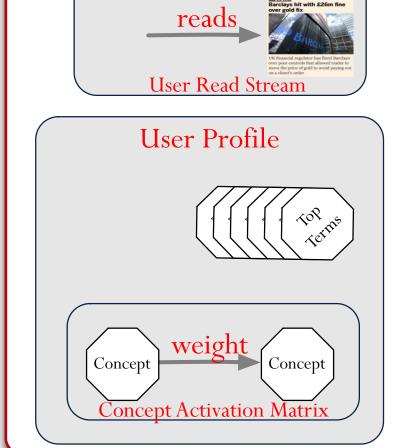
2. Accumulate/update user profile

3. Recommend

Main Actions

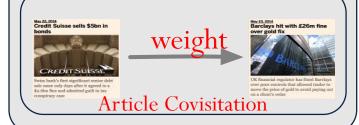


Cassandra



Article Profile





Solr

Article Profile

Title

Summary

body

concepts

keyphrases

May 22, 2014
Credit Suisse sells \$5bn in bonds



Swiss bank's first significant senior debt sale came only days after it agreed to a \$2.6bn fine and admitted guilt in tax conspiracy case





Thank you. Questions?

Jem.rayfield@ft.com @jemrayfield