# Linked Data for researchers, YCBA Pilot Project



Lec Maj
Head of Information Technology & Innovation
Yale Center for British Art (YCBA)
lec.maj@yale.edu

## Who and what are we working on?

- Began with access to online collections via website [2010]
- Extended XML data provider, [2011] data used by:







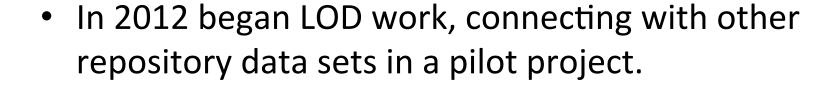












YALE CENTER FOR BRITISH ART







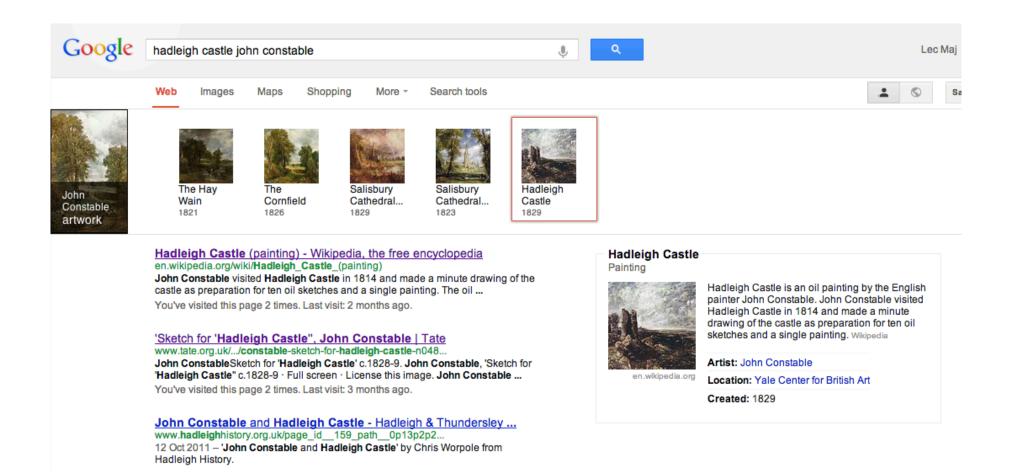




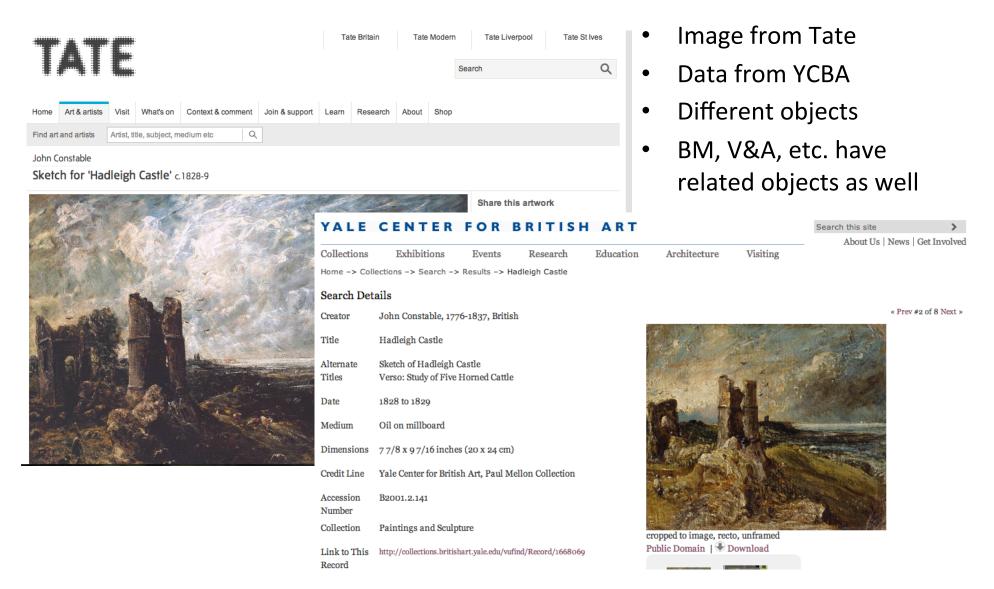




# What is going on with this data?



## Answer: it requires domain expert



## Data for Research

- Answer in-depth questions
- Refine and collect better data
- Current research
  - Spreadsheets
  - Paper print outs
  - Google search
  - Image search

#### Research Questions

- What related types of objects are in existence
- What drawings were created and owned by Paul Sandby (analysis of image markings to identify marks on them)
- History map of ownership migration for Sandby's drawings
- Compare compositions of water colors to other objects to help speculate artistic models (how was the work influenced, how it is treated by various artists)

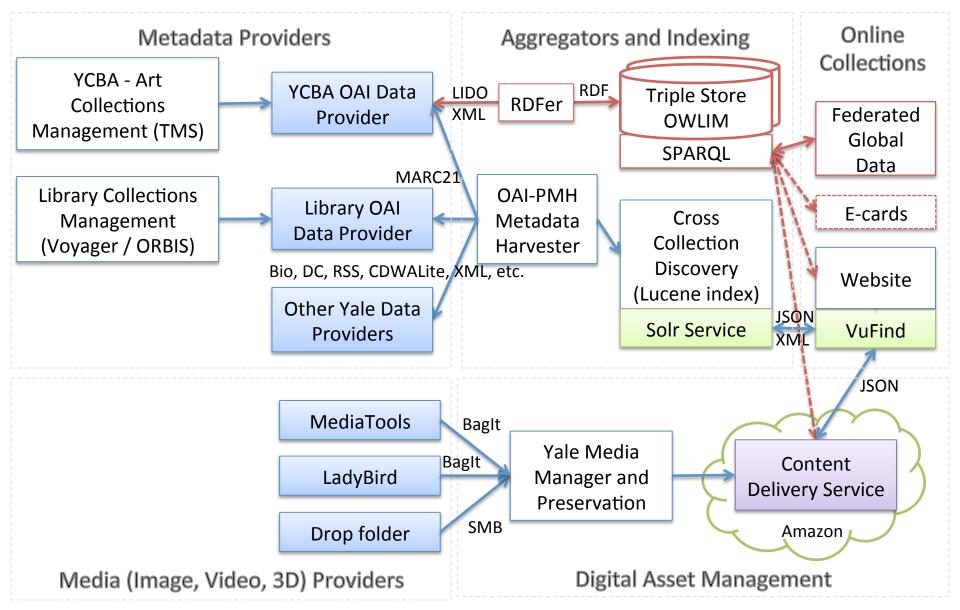
#### Tools

- Need visual tools for domain experts to analyze data
- Combination of maps, timelines, etc. without technical expertise and complicated tools



http://collection.britishart.yale.edu/id/object/178

## **Architecture Integration**



### Data

- Schema and Data Complexity:
  - XML all kinds of schemas / vocabularies (12 mapped over 150 fields)
  - In pilot project CIDOC-CRM Ontology (Conceptual Reference, no limit to describing data)



http://collection.britishart.vale.edu/id/object/57163

- Scale (at the moment metadata only):
  - Pilot Project: YCBA (100K XML objects ~= 20M RDF triples)
    - Assuming current mapping of 1 XML object ~= 200 RDF triples
  - 3 Museums (2-3M XML objects ~= 400-600M RDF triples)
    - Painting, Prints, Drawings, Books, Rare Books, Sculptures, Bones, Cake...
  - Professional Schools (1M XML objects ~= 200M RDF triples)
    - Law, SOM, Drama, Music...
  - 21 Libraries (16M XML objects ~= 3.2Billion RDF triples)
    - Book, Rare Books, Maps, Sketchbooks, Journals...
- Type of queries we expect:
  - NLP, multi-join, federated (in/out of cloud)
  - in-depth research oriented, visualization of data for domains (maps, timelines,...)

## **Key Challenges**

- Loading data without running out of time or computing resources (memory)
  - RDF triples updated (serialized) slow
  - Parallel asynchronous updates (multithreaded)
- Need to know what is happening under the hood
  - Indexing / distributed processing
  - Commits
- Queries
  - Federation across global repositories
  - Dynamic Ontology Matching
- Analyzing natural language questions for translation to SPARQL, voice Q/A
- 3<sup>rd</sup> Party / Partner real-time data integration



http://collection.britishart.yale.edu/id/object/236

## Limitations (computing vs. time)

#### Performance Expectation

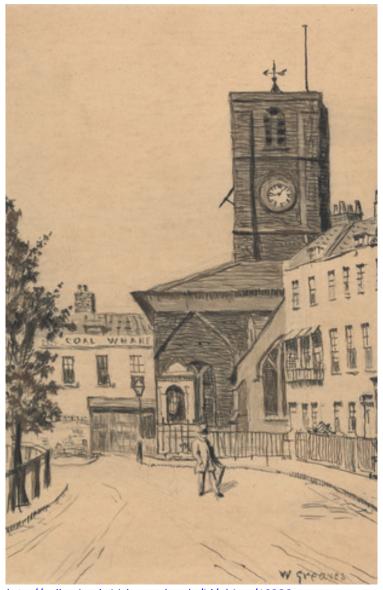
- Query: Google like performance (3 seconds at most to process queries)
- Loading data, cannot take longer then next load cycle
- Offload whatever takes to long (multi-thread, cluster, cloud)

#### Functionality

- Multi-threaded and parallel data loading from cloud (ie: 100 servers)
- Local indexing vs. in-cloud distributed indexing (ran into problems with CCD)

#### Interoperability

- Federation support across product and other products
- URI mapping / lookups
- Various ontology mapping (CRM, EDM,...)



http://collection.britishart.yale.edu/id/object/10386

## What to expect from benchmarks



http://collection.britishart.yale.edu/id/object/37735

Configuration recommendations

- Processing benchmarks
  - Load: triples per sec
  - Inference
  - Indexing
  - Poor query examples and timings (# of joins)

- Scale and hardware
  - Physical vs. VM vs. Cloud
- At what point will system start breaking down
- Performance measurement tool to diagnose problems in real time