



# Linked Data breakout session

Jonathan Yu, Mark Hedley

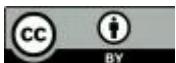
CSIRO and UK Met Office

25 May 2016 | EarthCube netCDF-CF Workshop



# Session agenda

1. Context + Purpose
2. What is Linked Data? (aka. web of data)
3. How is it relevant for netCDF and CF conventions?  
Benefits?
4. Work done to date
5. Discuss its value for this community (and broader) and draft use cases
6. Draft a plan for activities to engineer prototype(s), test and validate against use cases



# We're not data poor

“90% of the world’s data has been produced over the last two years”

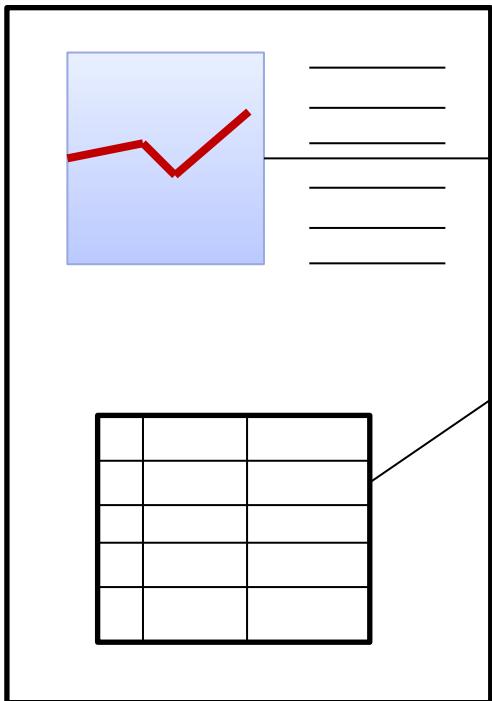


## Problem

Users - find the right data, access, use it, (cite it?)

Data providers – collect data, describe, publish, (update)

# Problem



Common formats  
not well handled  
by machines across  
formats and sources

XML

CSV

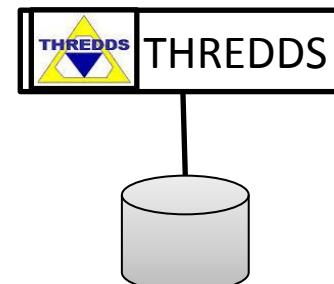
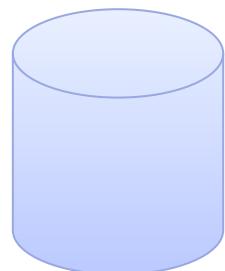
JSON

netCDF

HDF

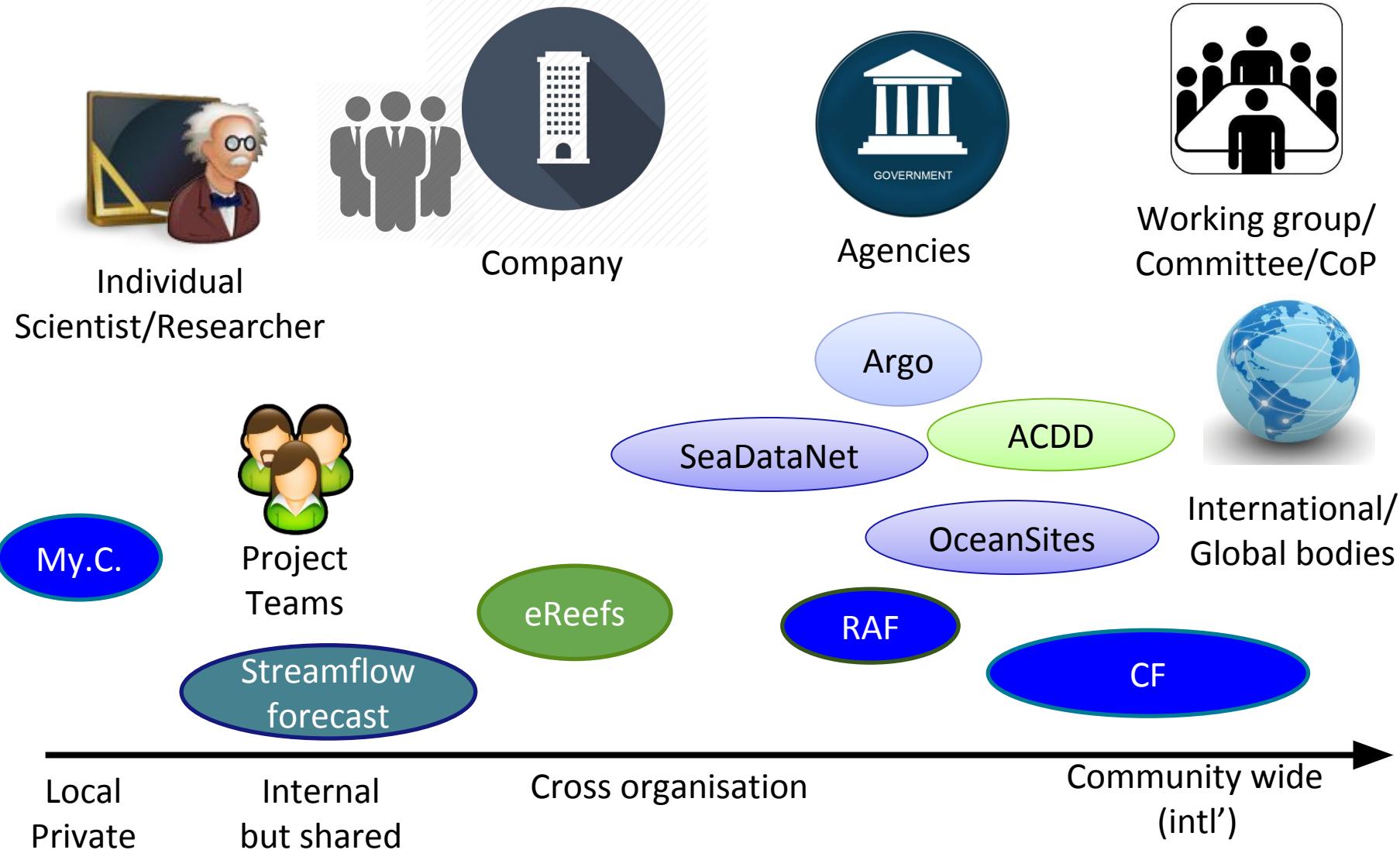


Data implicit in  
webpages



Discovering, accessing, parsing data held in databases and via APIs

# netCDF conventions – level of agreement



# Challenges with conventions

Keeping up to date/Updating them/Need something now

Suitability – which one?

Validation – have I done the right thing?

Compatibility between versions

Cost/Benefits of adopting conventions – why should I?

Tooling – help me adopt the convention? Make data useful...

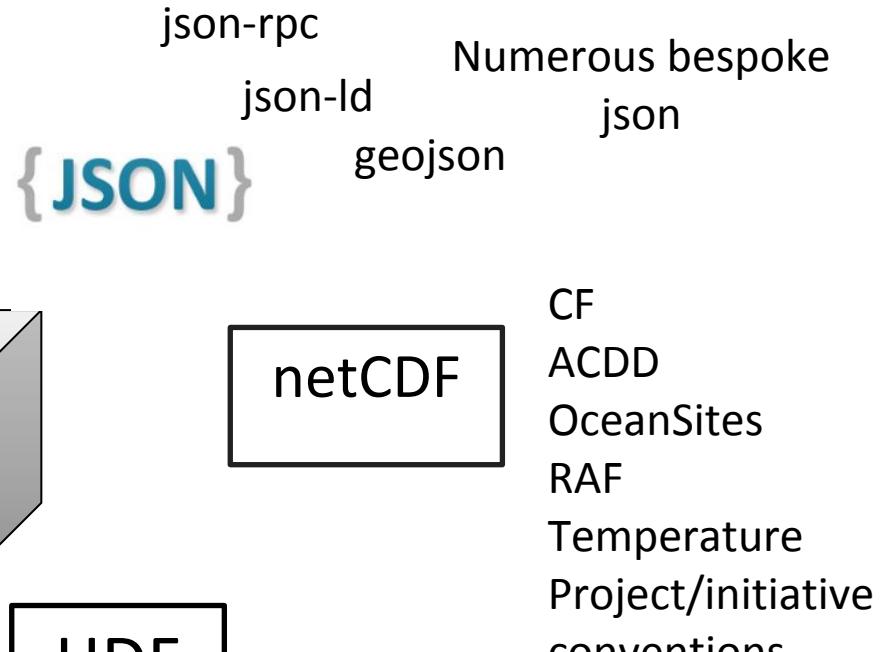
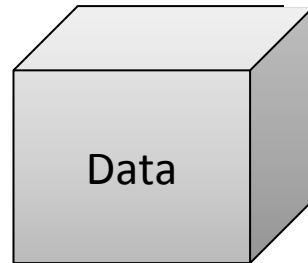


# netCDF not alone in these challenges

Too  
many



csv-au-geo  
seadas  
Numerous bespoke  
CSV...



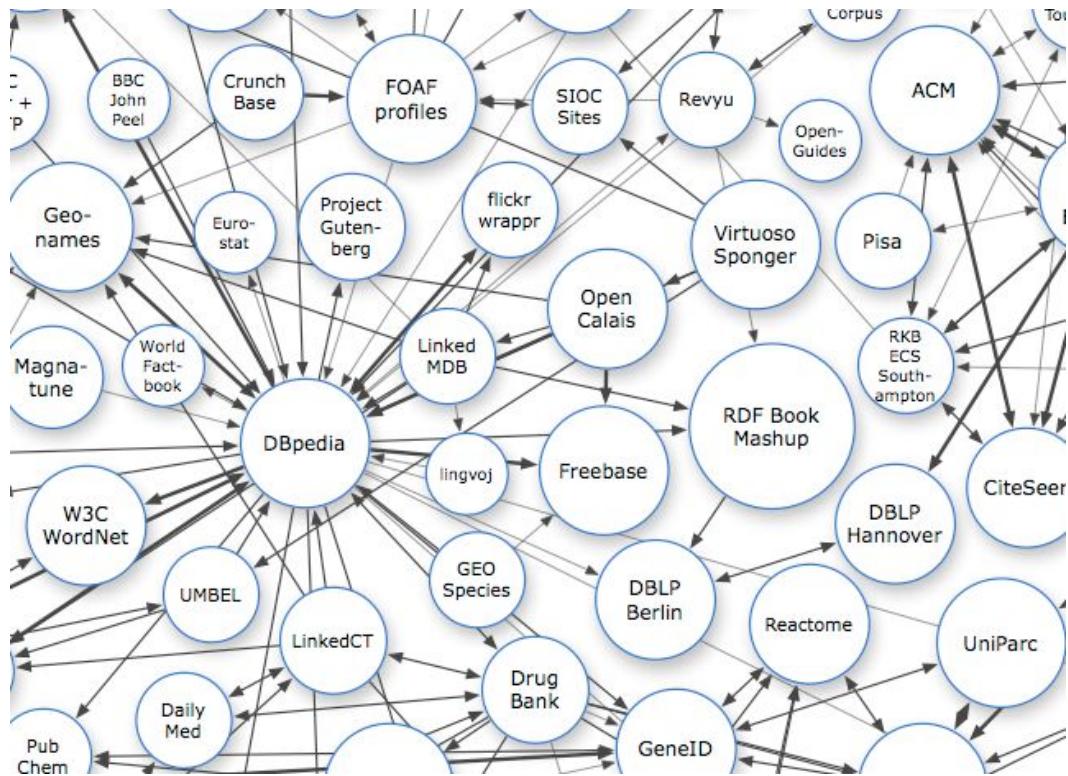
# Linked Data / Web of Data

Method to connect related data and semantics using web links (HTTP URIs)

Data is self-describing

Standardised – HTTP + RDF

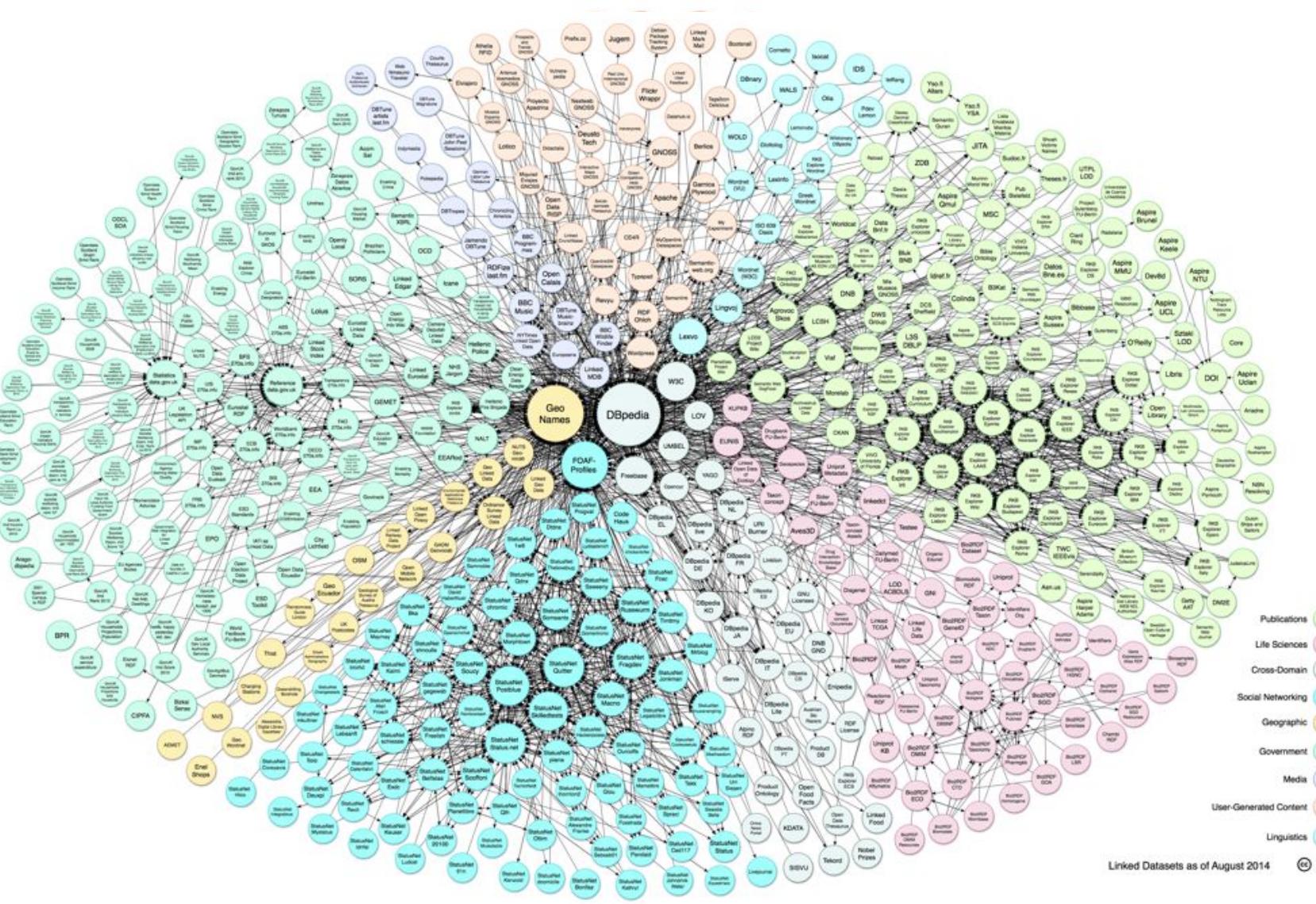
Applications can then  
lookup embedded web links  
to get more info, find more  
connections, and infer  
new insights from the data



# Linked Data principles

1. Use URIs as names for things.
2. Use HTTP URIs, so that people can look up those names.
3. When someone looks up a URI, provide useful information, using the standards (RDF, SPARQL).
4. Include links to other URIs, so that they can discover more things.

# Linked Open Data Cloud



<http://lod-cloud.net/>

95 Datasets

295 Datasets

570 Datasets

# Science/Domain vocabularies as Linked Data

This XML file does not appear to have any style information associated with it.

```
<rdf:RDF xmlns:rdf="http://www.w3.org/1999/02/22-rdf-syntax-ns#" xmlns:dc="http://purl.org/dc/elements/1.1/" xmlns:grg="http://www.isotc211.org/schemas/grg/1.0/">

▼<skos:Collection rdf:about="http://vocab.nerc.ac.uk/collection/P07/">

  <skos:prefLabel>Climate and Forecast

    <dc:title>Climate and Forecast Standard Names

    <skos:altLabel>CF Standard Names</skos:altLabel>

    <dc:alternative>CF Standard Names</dc:alternative>


```

SISSVoc Search

Climate and Forecast Standard

Service URL: http://auscope-services-test.arrc.csiro.au/elda-demo/n...

Results for Climate and Forecast Standard. Showing page 1, result 1 to 10 (0.655 secs)

**Climate and Forecast Standard Names Committee**

http://vocab.nerc.ac.uk/collection/C30/current/CF/

allLabel: CF Standard Names

definition: Formal vocabulary specialist group within the governance of the Climate and Forecast Community Metadata Standard.

notation: SDN:C30::CF

date: 2010-08-10 14:40:40.0

deprecated: false

identifier: SDN:C30::CF

note: accepted

versionInfo: 1

Type (1) ▾

**Climate and Forecast Standard Names Committee**

http://vocab.nerc.ac.uk/collection/C30/current/CF/

allLabel: CF Standard Names

definition: Formal vocabulary specialist group within the governance of the Climate and Forecast Community Metadata Standard.

# SISSVoc

NATURAL ENVIRONMENT RESEARCH COUNCIL

## Climate and Forecast Standard Names

http://vocab.nerc.ac.uk/collection/P07/current/

alt label	CF Standard Names
comment	Formal vocabulary specialist group within the governance of the Climate and Forecast Community Metadata Standard.
description	Terms used for definitive but not necessarily comprehensive descriptions of measured phenomena in the CF conventions (a content standard for data stored in NetCDF).
member	aerosol_angstrom_exponent age_of_sea_ice age_of_stratospheric_air age_of_surface_snow air_density air_potential_temperature air_pressure air_pressure_anomaly air_pressure_at_cloud_base air_pressure_at_cloud_top air_pressure_at_convective_cloud_base air_pressure_at_convective_cloud_top air_pressure_at_freezing_level air_pressure_at_sea_level air_temperature air_temperature_anomaly air_temperature_at_cloud_top air_temperature_lapse_rate air_temperature_threshold altimeter_range altimeter_range_correction_due_to_dry_troposphere

Find Concepts

Exact label

Text within label

View

» skosbasic > default  
» description > basic

★ pref label  
★ alt label  
★ comment  
★ description  
★ member  
★ type  
★ is primary topic of

Core metadata

Reg metadata

All properties

Download

Send comment

# Register: observable properties

URI: <http://registry.it.csiro.au/def/environment/property>

A collection of observable properties. This vocabulary defines terms for observed properties originally used for groundwater, surface water and marine water quality observations. Most PropertyKinds are associated with a Species object via the objectOfInterest property or a real-world Feature via the featureOfInterest property. The sub-class of PropertyKinds that can be measured are ScaledQuantityKinds, which have appropriate units of measure (qudt:unit property). This water quality ontology re-uses the Quantities, Units, Dimensions, Data Types (QUDT) ontology which is developed by TopQuadrant and NASA.

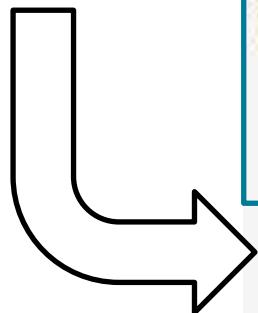
## Contents (tree view)

 chemistry observable properties A collection of observable chemistry properties	stable
 life form observable properties A collection of observable organism properties	stable
 major element observable properties A collection of observable major elements as specified by Australia...	stable
 minor or trace element observable properties A collection of observable minor trace elements as specified by Aus...	stable
 nutrient observable properties A collection of observable nutrients	stable
ammonia and ammonium as NH4 concentration ammonia and ammonium as NH4 concentration	stable
ammonia and ammonium as N concentration ammonia and ammonium as N concentration	stable
ammonia and ammonium concentration ammonia and ammonium concentration	stable
ammonia as N concentration ammonia as N concentration	stable
ammonia concentration ammonia concentration	stable
ammonium (NH4) concentration ammonium (NH4) concentration	stable
nitrate N concentration nitrate N concentration	stable
nitrate and nitrite N concentration nitrate and nitrite N concentration	stable
nitrite N concentration nitrite N concentration	stable
nitrogen concentration nitrogen concentration	stable
nutrient concentration nutrient concentration	stable

# JSON-LD

```
{  
  "name": "John Lennon",  
  "born": "1940-10-09",  
  "spouse":  
    "http://dbpedia.org/resource/Cynthia_Lennon"  
}
```

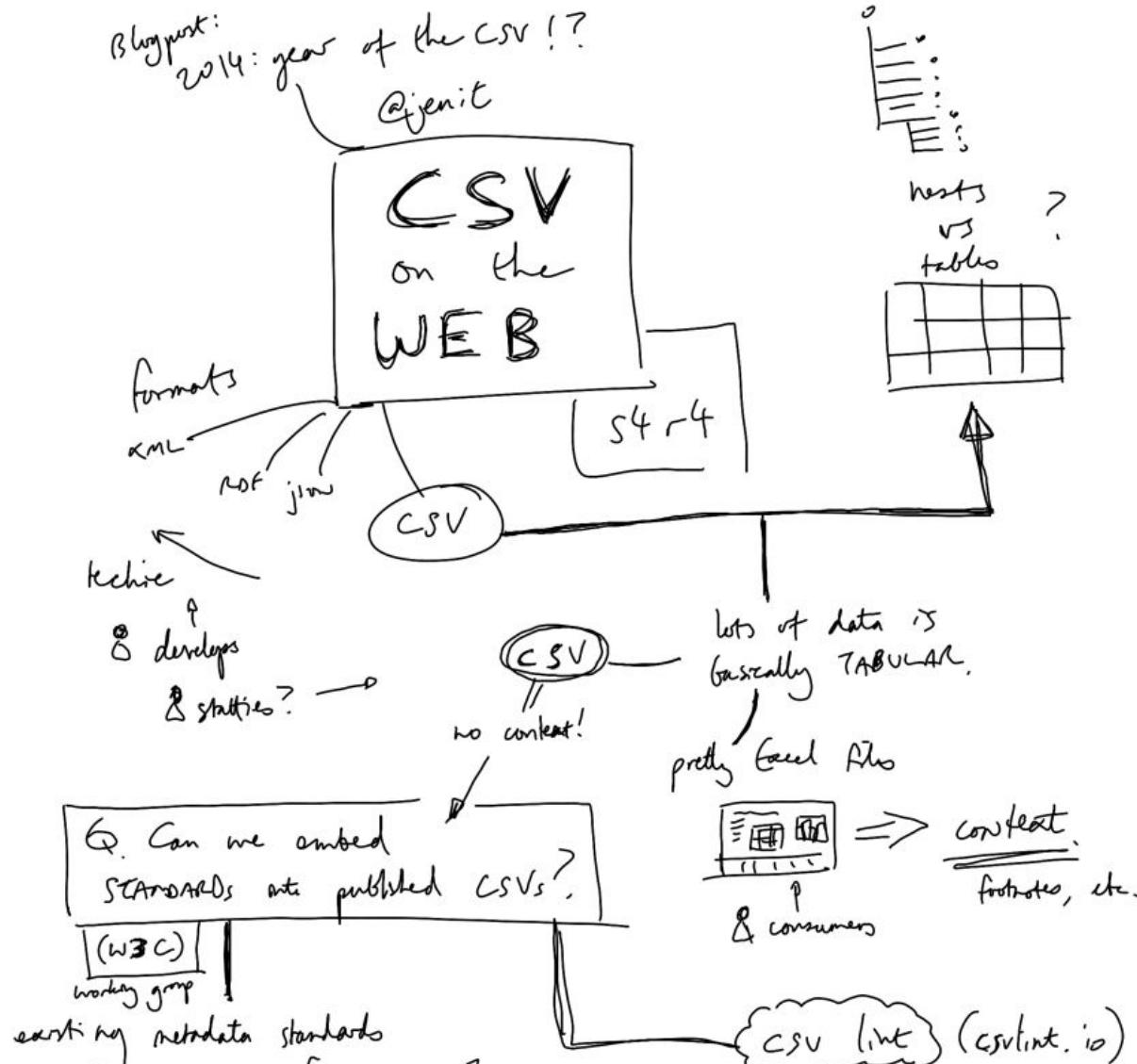
JSON-LD  
Decorators



```
{  
  "@context": "http://json-ld.org/contexts/person.jsonld",  
  "@id": "http://dbpedia.org/resource/John_Lennon",  
  "name": "John Lennon",  
  "born": "1940-10-09",  
  "spouse": "http://dbpedia.org/resource/Cynthia_Lennon"  
}
```

# CSV-on-the-web

Linked data for CSV tabular data

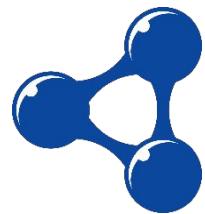
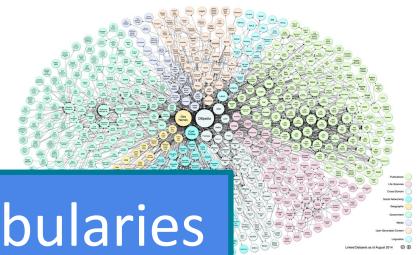


Add context to tables via metadata file

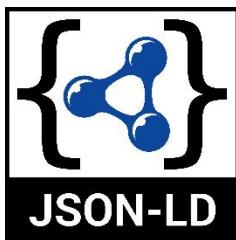
Use cases:  
documentation,  
validation,  
transformation  
(e.g. RDF, JSON,  
XML...), annotate  
semantics,  
enhanced discovery

# How is all this Linked Data stuff relevant for netCDF and CF conventions?

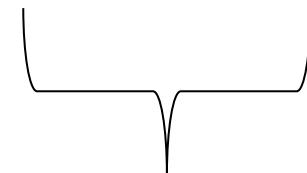
Have all the building blocks to enhance netCDF(-CF)!



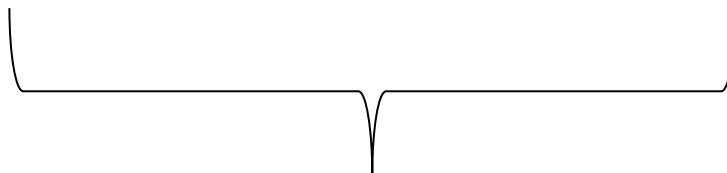
Linked Data



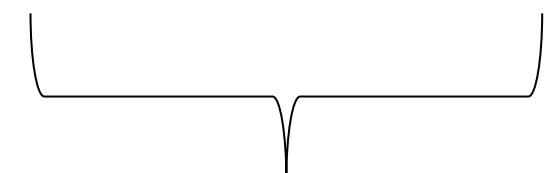
Vocabularies  
as Linked  
Data



General approach  
Principles  
Tools



Patterns for linkifying  
common formats



Content for annotating  
metadata  
Tools to create, manage,  
publish vlangs

***'linkify'* netCDF!**

# 5 stars of Linked Open Data

- ★ make your stuff available on the web (whatever format)
- ★★ make it available as structured data (e.g. excel instead of image scan of a table)
- ★★★ non-proprietary format (e.g. csv instead of excel)
- ★★★★ use URLs to identify things, so that people can point at your stuff
- ★★★★★ link your data to other people's data to  
★ provide context

netCDF(-CF) online

netCDF(-CF) online  
+ additional context - links to standardised vocab URLs e.g. NERC vocabs, QUDT, Observable Properties vocabs, CF standard name URLs online, DBpedia URLs

# Benefits of linkifying netCDF(-CF)

1. Improve discoverability and reduce ambiguity

- link to vocabularies to add context
- easier to support community profiles and validation

2. Improve data integration

3. Potential to translate netCDF to other formats

4. Potentially ease metadata generation

5. Easier to build applications

***Increased discoverability -> More usage -> Greater impact***

# Current examples / thought exercises

## 1. Injecting vocabulary URIs in netCDF headers using special attr

- eReefs/Observable property model convention
- SeaDataNet
- ‘Smuggling’ semantics into flags

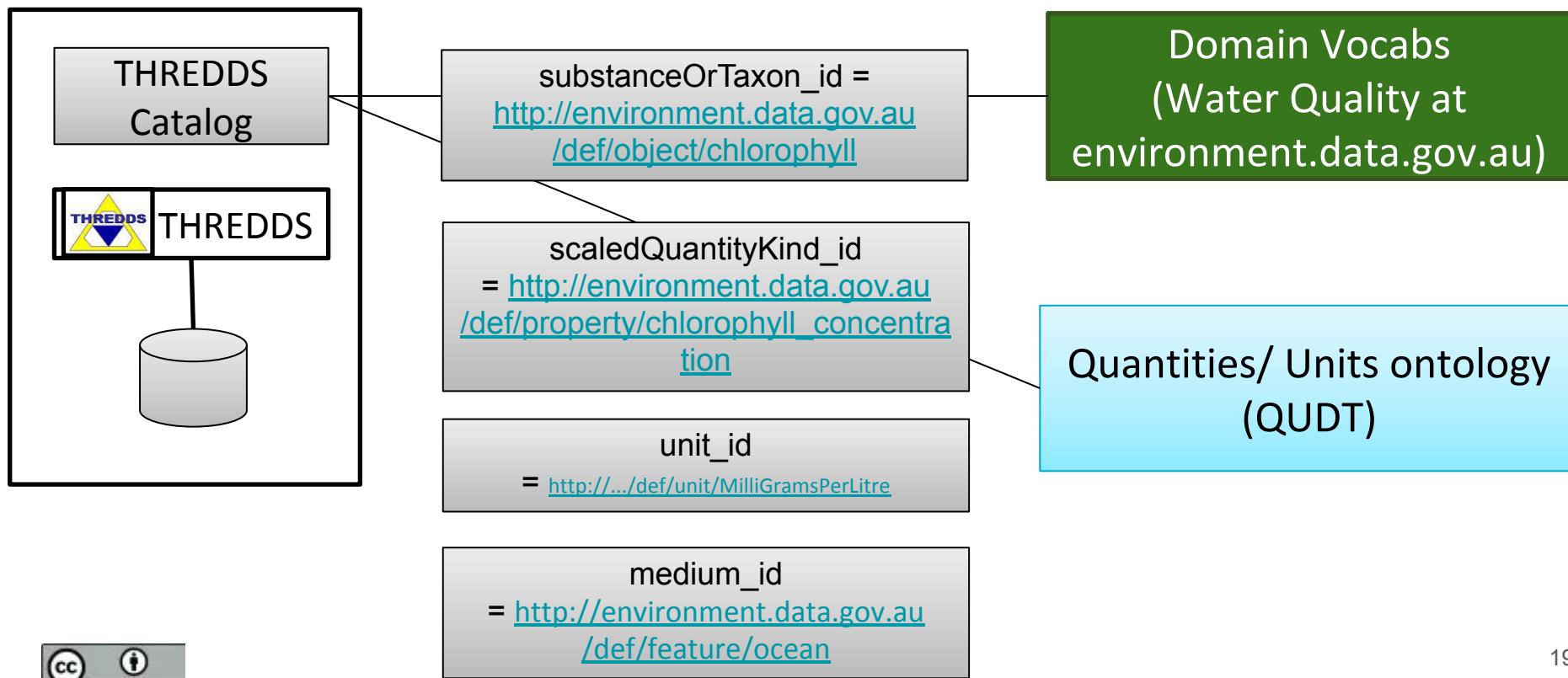
## 2. netCDF-LD

## 3. Binary-array-LD (BALD)

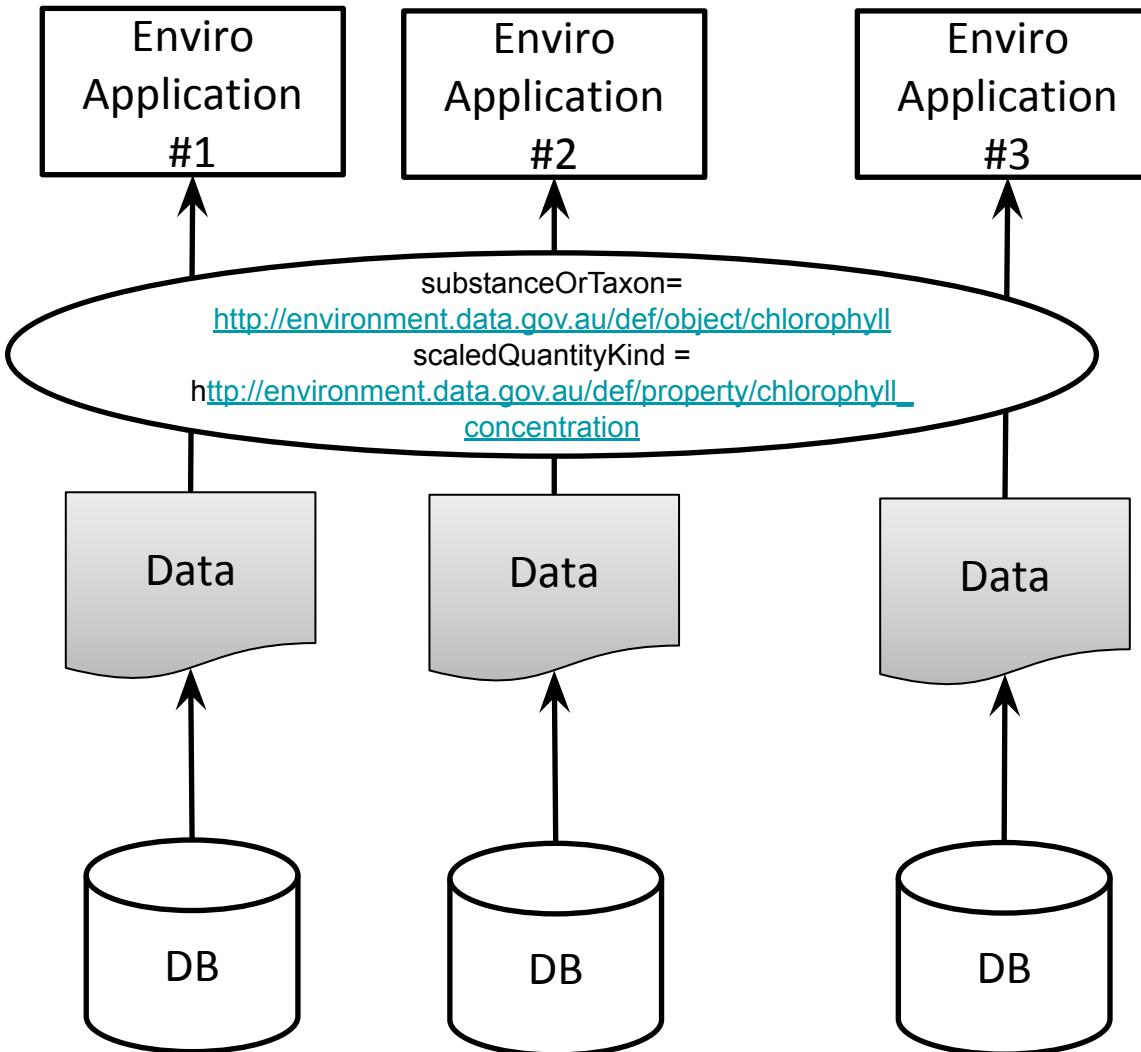


# #1: Injecting vocabulary URIs in netCDF headers using special attributes

eReefs / Observed Properties model conventions



# Allows for harmonised access to those binding to conventions



Yu, J., Simons, B. A., Car, N. J., & Cox, S. J. (2014). [Enhancing water quality data service discovery and access using standard vocabularies](#). Hydroinformatics conference. New York.

# Others examples of injecting vocab URIs

## 1. SeaDataNet CF Profile

- Specifies minimum info content as attributes: `sdn_parameter_urn` , `sdn_parameter_name`, `sdn_uom_urn`, `sdn_uom_name`
- Binding to NERC P01 (parameters), P06 (units) vocabulary collections

## 2. netCDF-U - uncertainty URIs (Bigagli & Nativi 2013)

- Use of “ref” attribute for uncertainty concept URI, further references using `ancillary_variables`

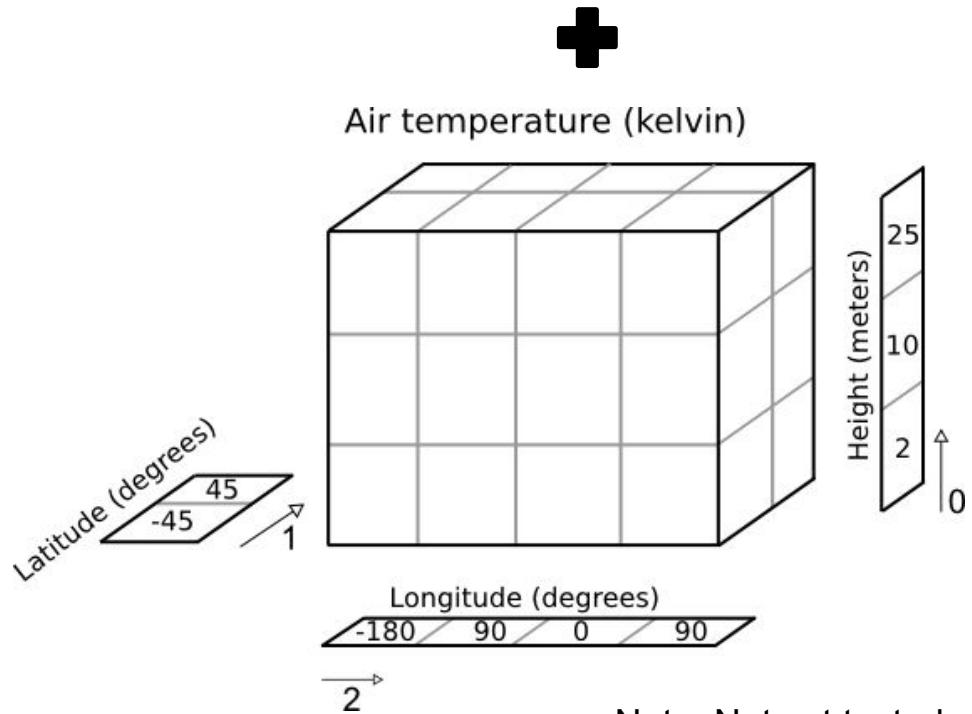
## 3. Use of flags to encode URIs for categorical data

- Use of `flag_namespace` attribute to give vocab URI prefix to values in `flag_meanings`

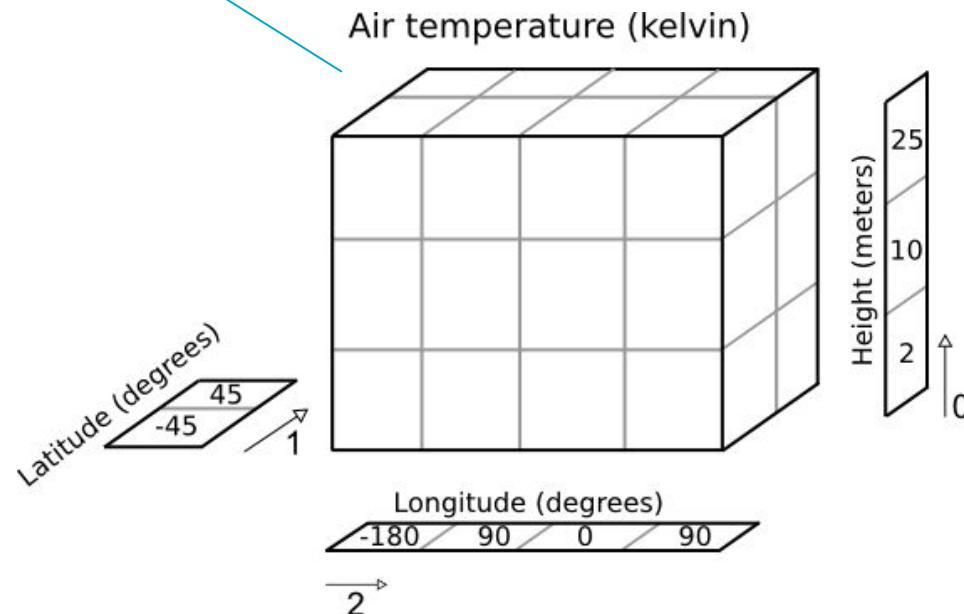
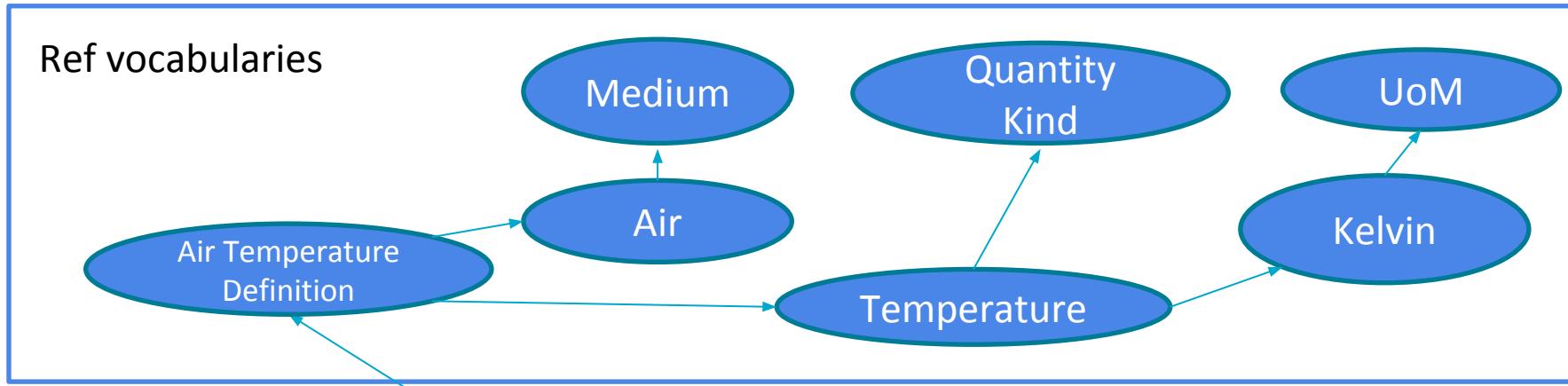
***It's already happening out in the community!  
Should we co-ordinate how we do this?***



## 'Context' boilerplates



# netCDF-LD: Linkifying netCDF



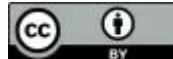
Note: Not yet tested - more a thought experiment...

# netCDF-LD: Global Attributes

```
:context-id = "http://foo.bar/baz";
:context-a = "http://www.w3.org/1999/02
              /22-rdf-syntax-ns#type";
:context-ref = "http://www.w3.org/1999/02
                 /22-rdf-syntax-ns#resource";
```

```
:context-datatype = "http://www.w3.org/1999/02
                     /22-rdf-syntax-ns#datatype";
```

```
:context-vocab = "http://def.seagrid.csiro.au
                  /isotc211/iso19156/2011/observation#";
```



# Assigning URIs to variable level attributes

```
z:units = "meters";
z:units_ref = "http://qudt.org/vocab/unit#Meter";
z:a =
"http://environment.data.gov.au/def/op#quantityKind";
z:dcPartOf = "http://foo.bar/linked_netCDF_example";
z:valid_range = 0., 5000.;
```



Note: Not yet tested - more a thought experiment...

# netCDF-LD to RDF

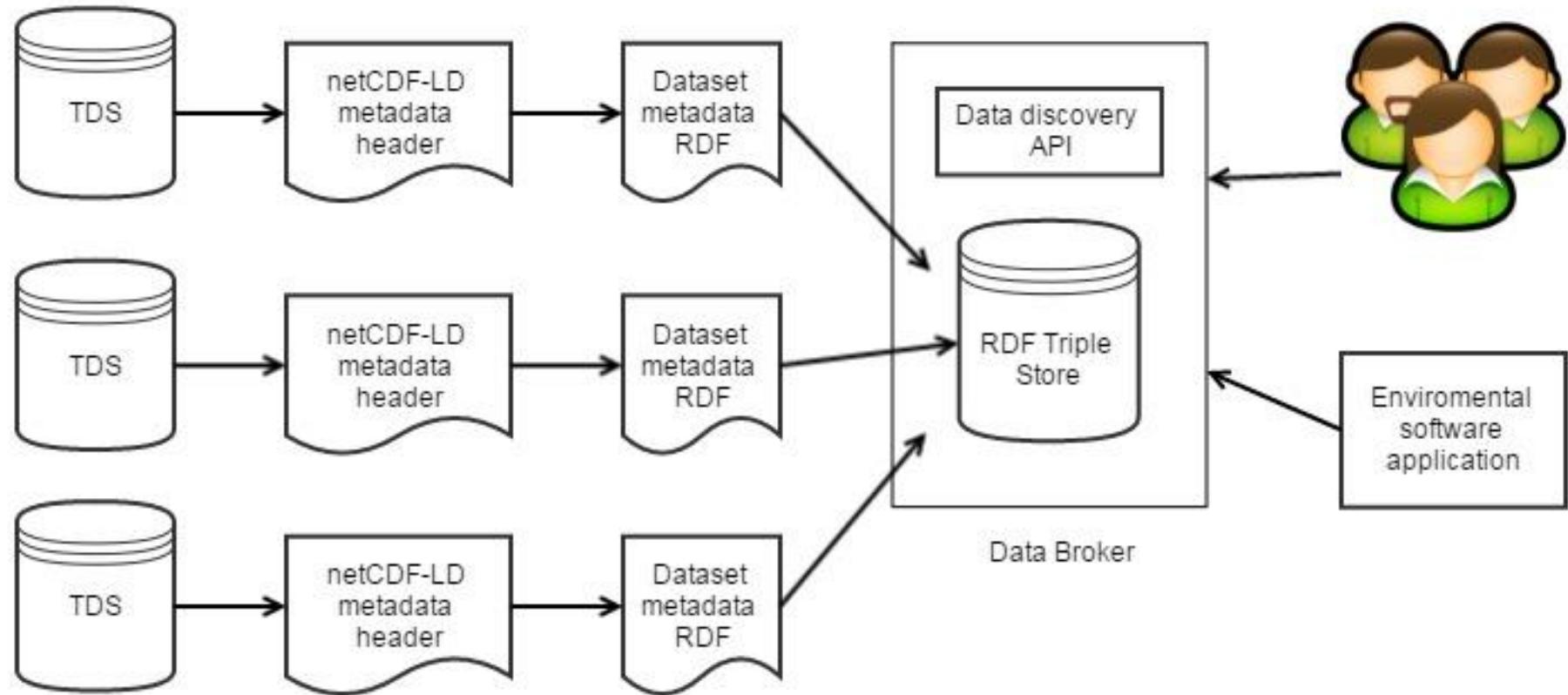
```
@prefix unit: <http://qudt.org/vocab/unit#> .  
@prefix qudt: <http://qudt.org/1.1/schema/qudt#> .  
@prefix op: <http://environment.data.gov.au/def/op#> .  
@prefix rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#> .  
@prefix dcterms: <http://purl.org/dc/terms/> .  
@prefix xsd: <http://www.w3.org/2001/XMLSchema#> .
```

```
_:z qudt:unit unit:Meter;  
  a op:ScaledQuantityKind;  
  dcterms:isPartOf <http://foo.bar/linked\_netCDF\_example>.
```



Note: Not yet tested - more a thought experiment...

# Use of netCDF-LD to support Data Discovery



Yu, J., Car, N. J., Leadbetter, A., Simons, B. A., & Cox, S. J. (2015). Towards linked data conventions for delivery of environmental data using netCDF. In *Environmental Software Systems. Infrastructures, Services and Applications* (pp. 102-112). Springer International Publishing. [https://dx.doi.org/10.1007/978-3-319-15994-2\\_9](https://dx.doi.org/10.1007/978-3-319-15994-2_9)

# #3: BALD (Binary Array LD)

Linked Data Conventions for netCDF, HDF, ...

<https://github.com/binary-array-ld/bald>

<http://binary-array-ld.net/latest>

<http://binary-array-ld.net/latest?classView=true>

<https://github.com/binary-array-ld/bald/issues>



# #3: BALD (Binary Array LD)

#2 prefix identification

#3 prefix container

validation - do URIs resolve? - are array references consistent?

Aim: create an RDF graph of the metadata within a file (collection of files)

Identifying a file is an interesting question: OpenDAP presents an interesting angle on this



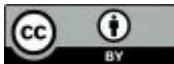
# Discussion: Value for this community (and broader) and draft use cases

Does the community see value in a Linked Data profile/convention for netCDF? Part of netCDF-CF?

- General consensus
- Acceptable to reference external resources?

What are the use cases?

Spend some time drafting use cases



# Draft use cases

Discovery

Use

- Machine readable content
- DOI for a dataset - create links for a URI

Encoding

- help data providers reference external sources
- reference features (geoms, stations, platform, instrument, sensor)

Compliance checking

- help data providers check conventions bound - e.g. practice of 1 or more conventions

cf\_standard\_name = cf\_air\_temp

ereefs\_quantity = wq\_

Options:

cf namespace default mixed with other conventions

standard\_name = "xxx"

acdd\_



## Challenges

- Wary of introducing XML-ism into netCDF
  - Perhaps have default namespaces for each convention
  - People like netCDF because there's no namespace
  - not as elegant
  - alternatives for specifying LD - using '@' to prefix incl. standard\_name?

## Governance of prefix namespace

- falls under unidata?
- governance of other namespace

## Persistence of URLs -

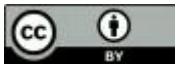
- injecting fragility
- already exists - references to convention documentation
- doi?

## Principles

- Doesn't break classic CF - Backwards compatible
- Prefer elegance of classic CF
- Forward looking approach

## Benefits

- able to pull in content from external sources e.g. labels, features/geometries?



# Draft a plan for activities to engineer prototype(s), test and validate against use cases

1. What would we need to make this work? Examples, qualified use cases from existing projects/data, endorsement?
  - principles (see prev slide)
  - project use cases
  - endorsement - CF/ACDD/CMIP (conventions level) or netCDF (at an API level)?
2. What would an activity look like?
  - github
  - test BALD software on github
3. How do we organise it? Next steps and timeframes
  - 6 months, propose monthly telecon in this period
  - github

## Participation

- contribute use cases, test cases from projects
  - e.g. features, grid specs, ship track
  - netcdf groups?
- monthly telecons
- github code and issue tracker





# Thank you

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# Linked Data principles

1. Use URIs as names for things.
2. Use HTTP URIs, so that people can look up those names.
3. When someone looks up a URI, provide useful information, using the standards (RDF, SPARQL).
4. Include links to other URIs, so that they can discover more things.

<http://linkeddata.org/>

<http://linkeddatabook.com>

# 5 stars of Linked Open Data

---

★ make your stuff available on the web (whatever format)

---

★★ make it available as structured data (e.g. excel instead of image scan of a table)

---

★★★ non-proprietary format (e.g. csv instead of excel)

netCDF(-CF) online

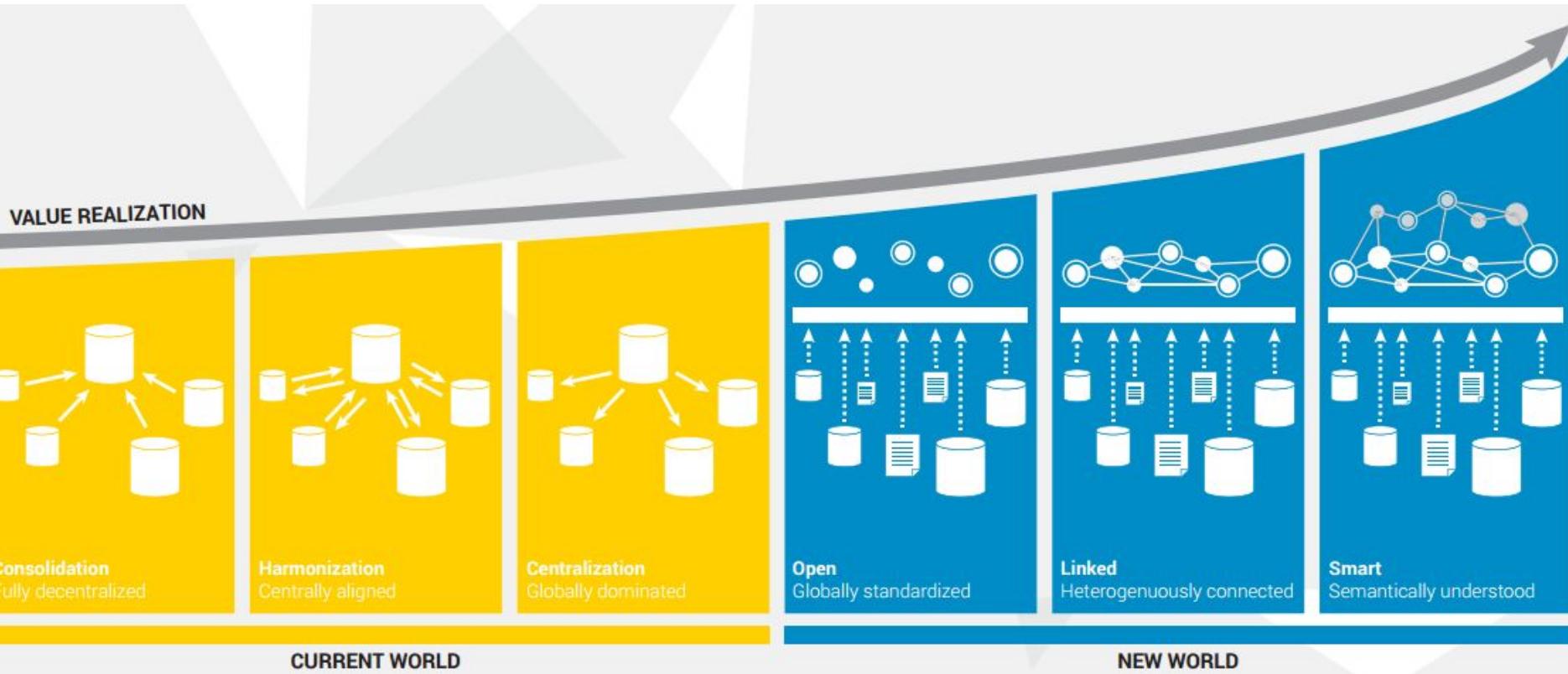
---

★★★★ use URLs to identify things, so that people can point at your stuff

netCDF(-CF) online  
+ additional context - links to standardised vocab URLs e.g. NERC vocabs, QUDT, Observable Properties vocabs, CF standard name URLs online, DBpedia URLs

---

★★★★★ link your data to other people's data to provide  
★ context



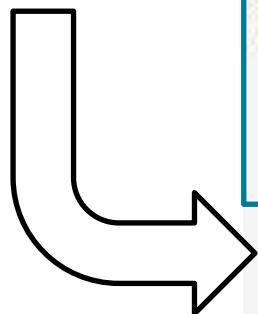
# Break up components in standard\_name into multiple attributes – ref (Yu et al. 2014)

```
float Nap_MIM(time, latitude, longitude) ;
Nap_MIM:_FillValue = -999.f ;
Nap_MIM:long_name = "TSS, MIM SVDC on Rrs" ;
Nap_MIM:units = "mg/L" ;
Nap_MIM:valid_min = 0.01209607f ;
Nap_MIM:valid_max = 226.9626f ;
Nap_MIM:scaledQuantityKind_id
=
"http://environment.data.gov.au/water/quality/def/property/solids-total\_suspended" ;
Nap_MIM:unit_id =
"http://environment.data.gov.au/water/quality/def/unit/MilliGramsPerLitre" ;
Nap_MIM:substanceOrTaxon_id =
"http://environment.data.gov.au/water/quality/def/object/solids" ;
Nap_MIM:medium_id =
"http://environment.data.gov.au/water/quality/def/object/ocean" ;
Nap_MIM:procedure_id = "http://data.ereefs.org.au/ocean-colour/MIM\_SVDC\_RRS" ;
```

# JSON-LD

```
{  
  "name": "John Lennon",  
  "born": "1940-10-09",  
  "spouse":  
    "http://dbpedia.org/resource/Cynthia_Lennon"  
}
```

JSON-LD  
Decorators



```
{  
  "@context": "http://json-ld.org-contexts/person.jsonld",  
  "@id": "http://dbpedia.org/resource/John_Lennon",  
  "name": "John Lennon",  
  "born": "1940-10-09",  
  "spouse": "http://dbpedia.org/resource/Cynthia_Lennon"  
}
```

# JSON-LD and Semantic Web

```
{  
  "@context": "http://json-ld.org-contexts/person.jsonld",  
  "@id": "http://dbpedia.org/resource/John_Lennon",  
  "name": "John Lennon",  
  "born": "1940-10-09",  
  "spouse": "http://dbpedia.org/resource/Cynthia_Lennon"  
}
```

http://dbpedia.org/resource/Cynthia\_Lennon

http://dbpedia.org/resource/John\_Lennon

“John Lennon”

1940-10-09

John Lennon

From Wikipedia, the free encyclopedia

This article is about the musician-songwriter. For other uses, see John Lennon (disambiguation).  
"Lennon" redirects here. For other uses, see Lennon (disambiguation).

John Winston Ono Lennon, MBE, born John Winston Lennon, (9 October 1940 – 8 December 1980), was an English musician, singer and songwriter who rose to worldwide fame as a founder member of the rock band the Beatles, the most commercially successful band in the history of popular music. With Paul McCartney, he formed a songwriting partnership that is one of the most celebrated of the 20th century.

Born and raised in Liverpool, as a teenager Lennon became involved in the skiffle craze; his first band, the Quarrymen, evolved into the Beatles in 1960. When the group disbanded in 1970, Lennon embarked on a solo career that produced the critically acclaimed albums *John Lennon/Plastic Ono Band* and *Imagine*, and iconic songs such as "Give Peace a Chance" and "Working Class Hero". After his marriage to Yoko Ono in 1969, he changed his name to John Ono Lennon. Lennon disengaged himself from the music business in 1975 to raise his infant son Sean, but re-emerged with Ono in 1980 with the new album *Double Fantasy*. He was murdered three weeks after its release.

Lennon revealed a rebellious nature and acerbic wit in his music, writing, drawings, on film and in interviews. Controversial through his political and peace activism, he moved to Manhattan in 1971, where his criticism of the Vietnam War resulted in a lengthy attempt by Richard Nixon's administration to deport him, while some of his songs were adopted as anthems by the anti-war movement and the larger counterculture.

As of 2012, Lennon's solo album sales in the United States exceeded 14 million and, as writer, co-writer or performer, he is responsible for 25 number-one singles on the US Hot 100 chart. In 2002, a BBC poll on the 100 Greatest Britons voted him eighth and, in 2008, *Rolling Stone* ranked him the fifth-greatest singer of all time. He was posthumously inducted into the Songwriters Hall of Fame in 1987 and into the Rock and Roll Hall of Fame twice; as a member of the Beatles in 1988 and as a solo artist in 1994.<sup>[1]</sup>

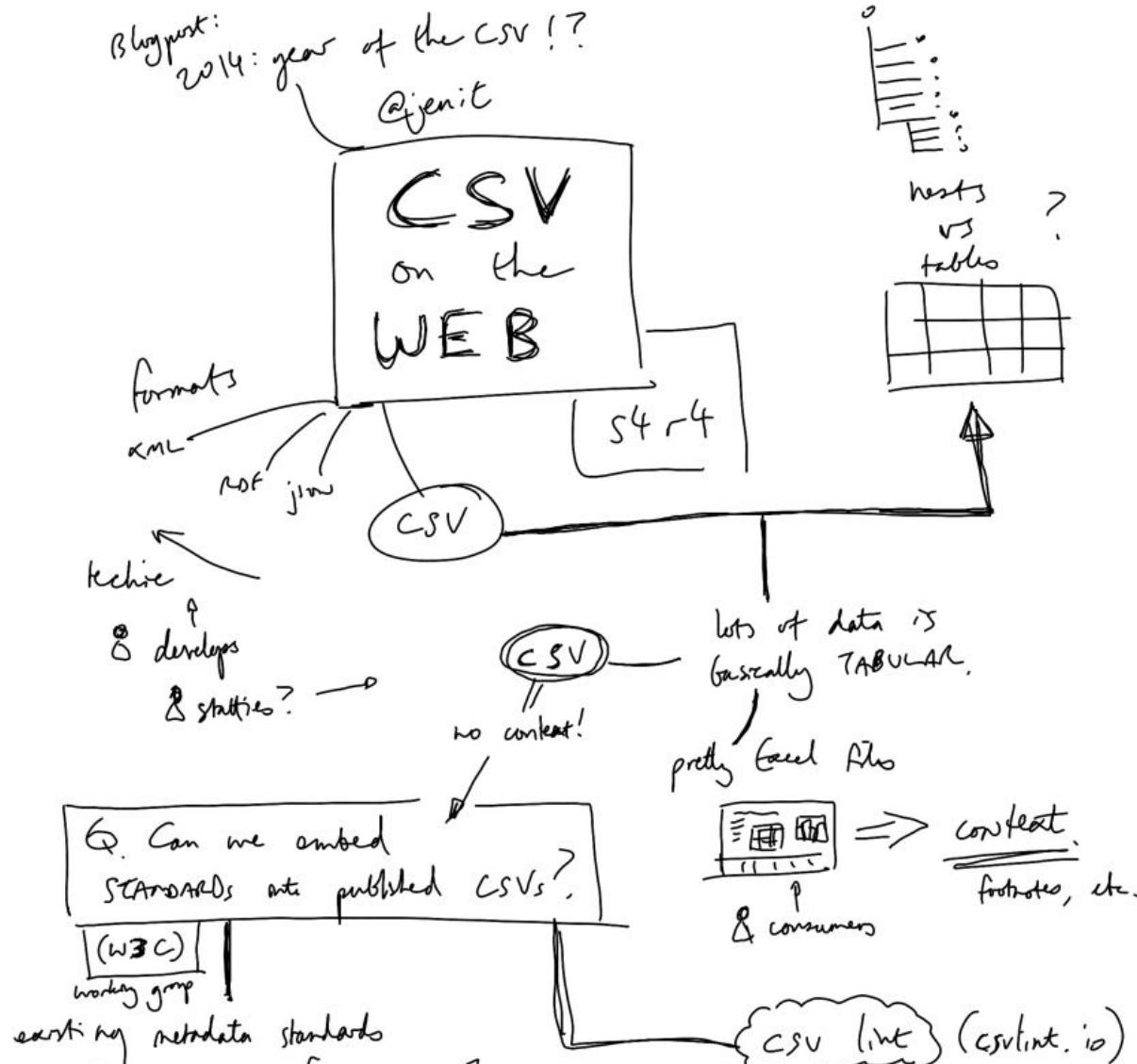
Contents [hide]

John Lennon MBE	
Born	John Winston Lennon 9 October 1940 Liverpool, England
Died	8 December 1980 (aged 40)

<http://json-ld.org/>

# CSV-on-the-web

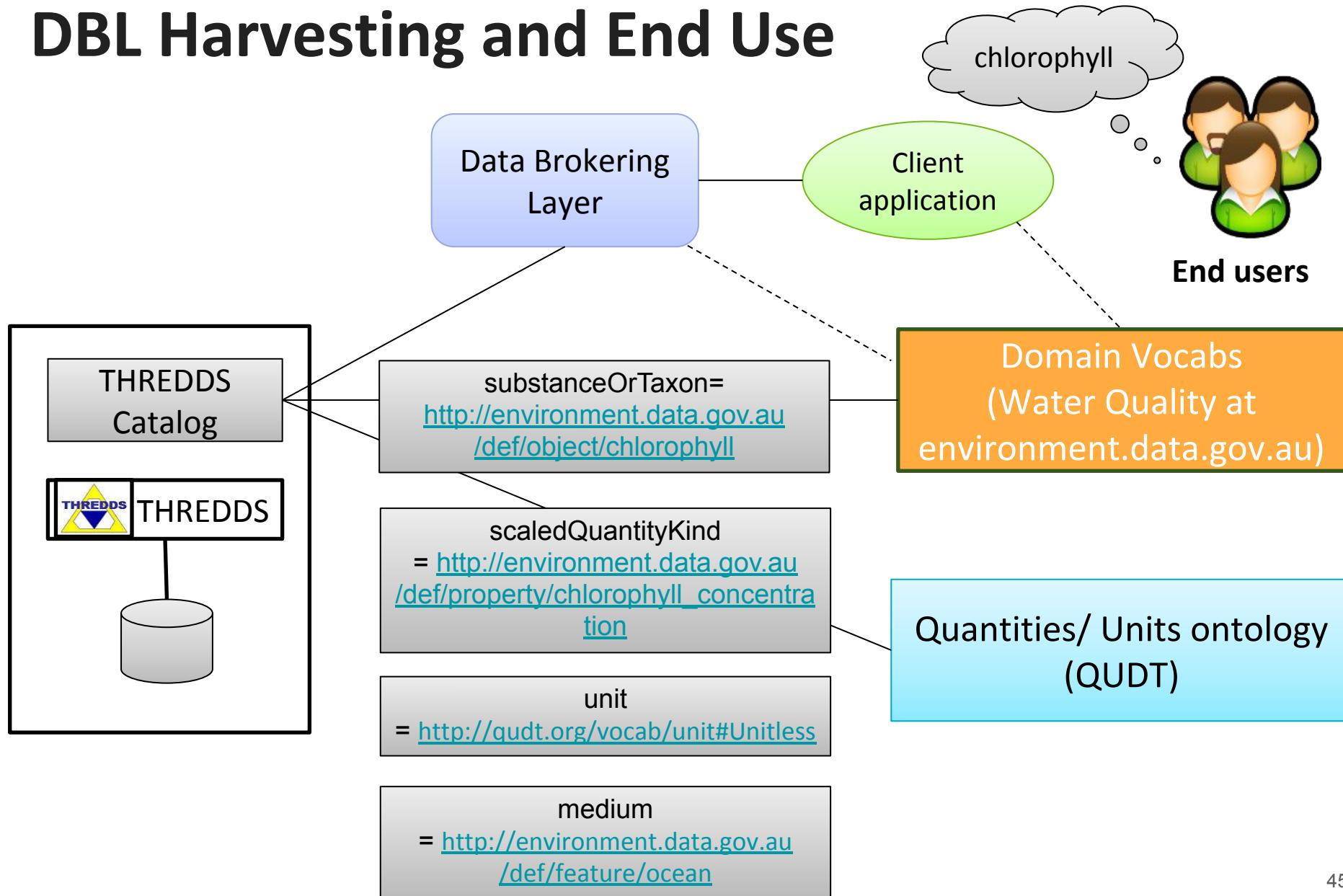
Linked data for CSV tabular data



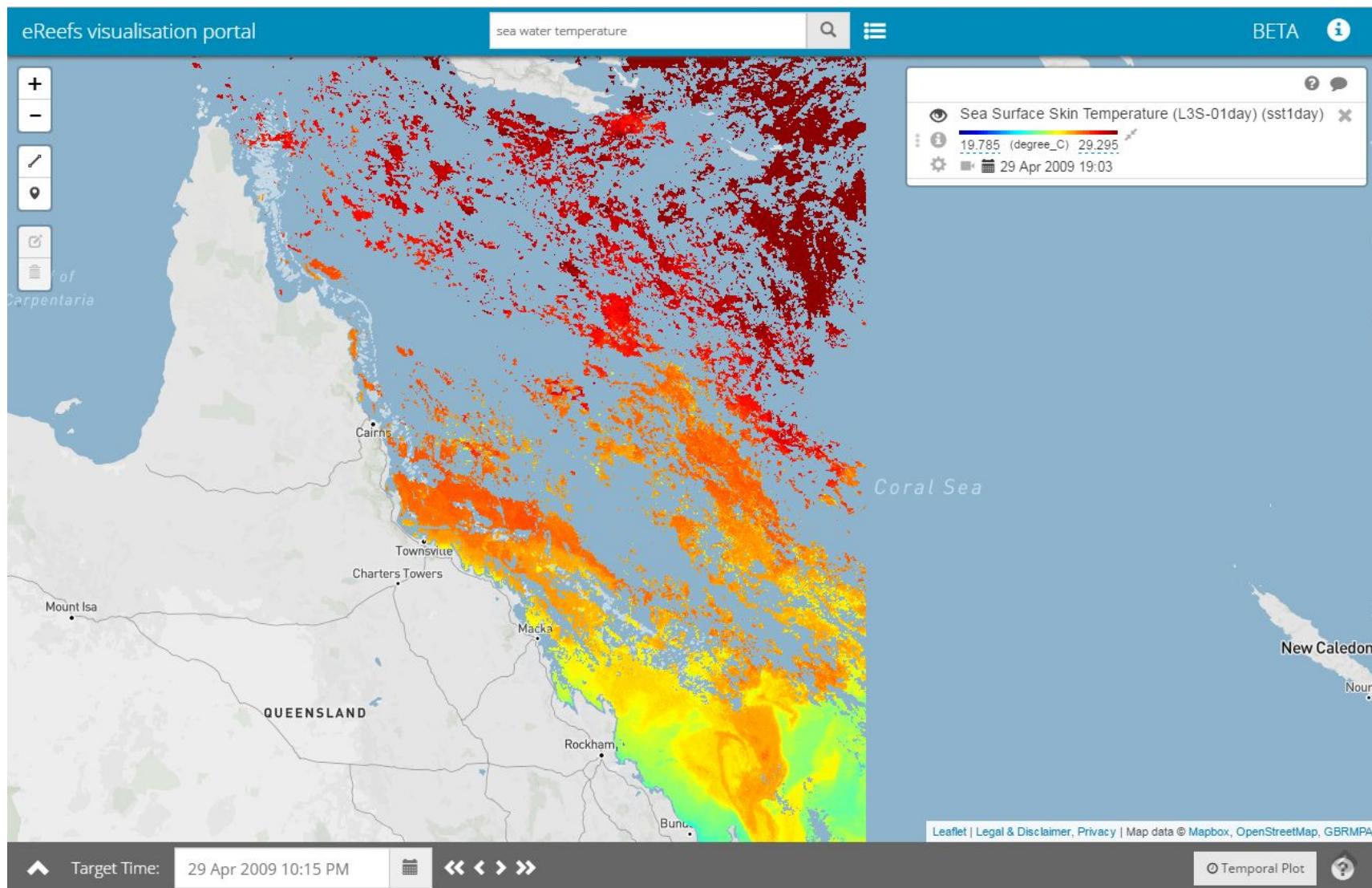
Add context to tables via metadata file

Use cases:  
documentation,  
validation,  
transformation  
(e.g. RDF, JSON,  
XML...), annotate  
semantics,  
enhanced discovery

# DBL Harvesting and End Use



# eReefs visualisation portal



<http://portal.ereefs.info/>

5 results found for

sea water temperature



[http://environment.data.gov.au/def/property/sea\\_water\\_temperature](http://environment.data.gov.au/def/property/sea_water_temperature)

## Sea Surface Skin Temperature (L3S-01day) - "sst1day"

SaltWater



BOM  
AUS



sea water temperature

BOM ReefTemp2 daily SST

"sst1day"

OceanRegion

SeaWater

**Data label:** Sea Surface Skin Temperature (L3S-01day)

**Dataset:** [BOM ReefTemp2 daily SST](#)

**Data node:** Bureau of Meteorology node for eReefs

**Quantity:** [sea water temperature](#)

**Medium:** [SeaWater](#)

**Date range:** 19 Dec 2001 to 16 Mar 2016

### Available web services:

OPENDAP

WMS

WCS

NetcdfSubset

[http://ereeftds.bom.gov.au/ereefs/tds/dodsC/ereefs/RT2\\_gridAgg\\_P1D\\_SST](http://ereeftds.bom.gov.au/ereefs/tds/dodsC/ereefs/RT2_gridAgg_P1D_SST)

[http://ereeftds.bom.gov.au/ereefs/tds/wms/ereefs/RT2\\_gridAgg\\_P1D\\_SST](http://ereeftds.bom.gov.au/ereefs/tds/wms/ereefs/RT2_gridAgg_P1D_SST)

[http://ereeftds.bom.gov.au/ereefs/tds/wcs/ereefs/RT2\\_gridAgg\\_P1D\\_SST](http://ereeftds.bom.gov.au/ereefs/tds/wcs/ereefs/RT2_gridAgg_P1D_SST)

[http://ereeftds.bom.gov.au/ereefs/tds/ncss/grid/ereefs/RT2\\_gridAgg\\_P1D\\_SS](http://ereeftds.bom.gov.au/ereefs/tds/ncss/grid/ereefs/RT2_gridAgg_P1D_SS)

T

[Full DBL result for this data product](#)

# **Summary of approach #1: injecting vocab URIs**

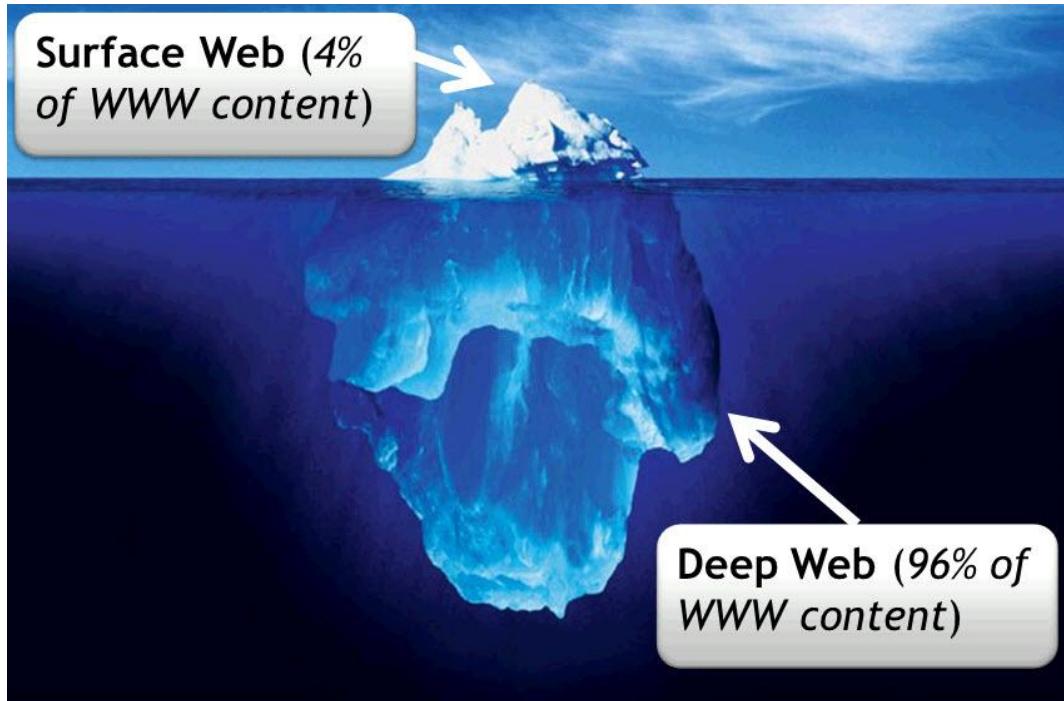
Various communities are developing approaches to add context and semantics to complement netCDF-CF.

Clearly, there are use cases for adding more semantics to current netCDF-CF metadata specifications.

Approaches are currently fragmented.

Would benefit from agreement and common approaches to profile.

# Deep (or invisible) web



400-500x more public information than the Surface Web

1000-2000x greater quality than Surface Web

95% Deep Web is publicly accessible

Deep Web tend to be narrower, with deeper content

*netCDF (scientific) data part  
of this Deep Web?*