

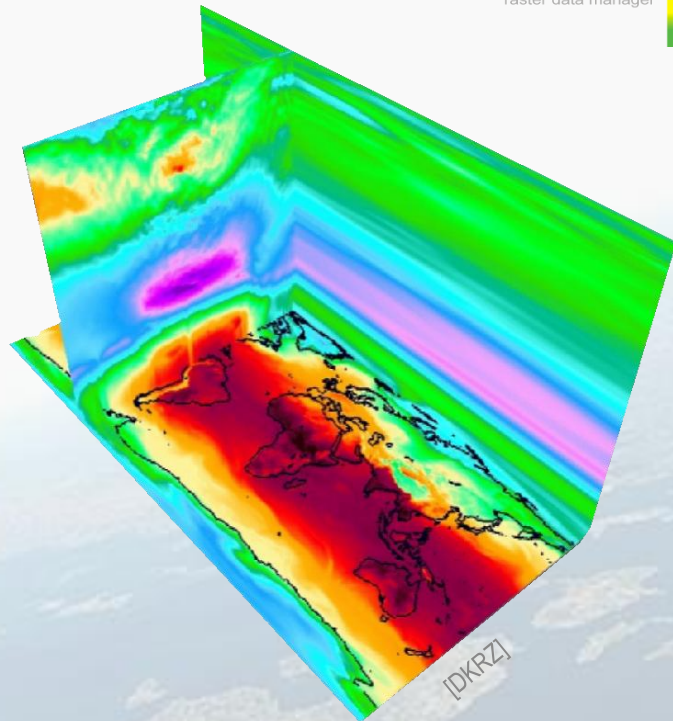
News from Datacube Land: rasdaman, Standards, and Federation

AWI Seminar, virtual, 2023-04-26

Peter Baumann

Constructor University | rasdaman GmbH

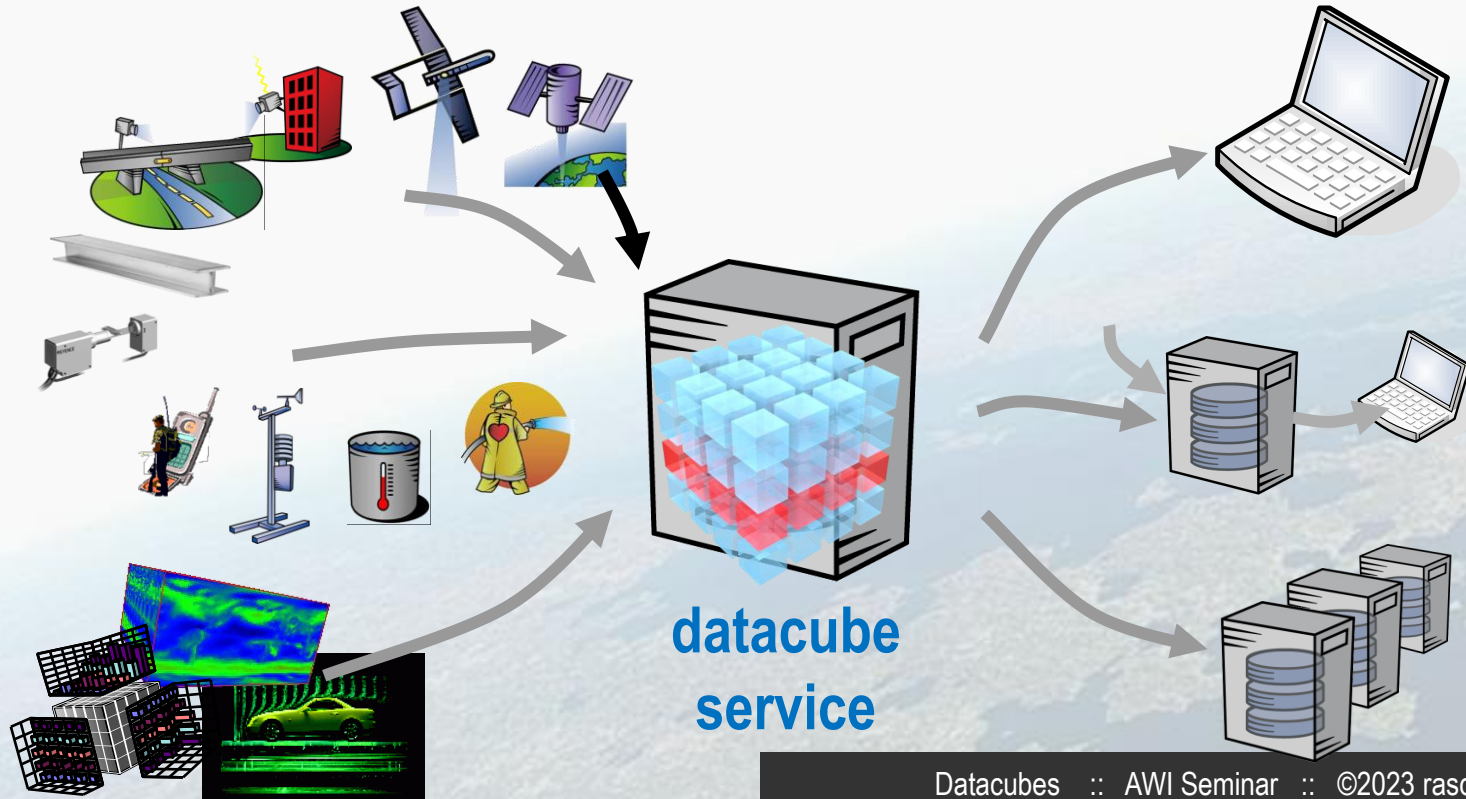
Why Datacubes?



- natural paradigm to interact with spatio-temporal, n-D data
- Accepted cornerstone for Analysis-Ready Data, Digital Twins

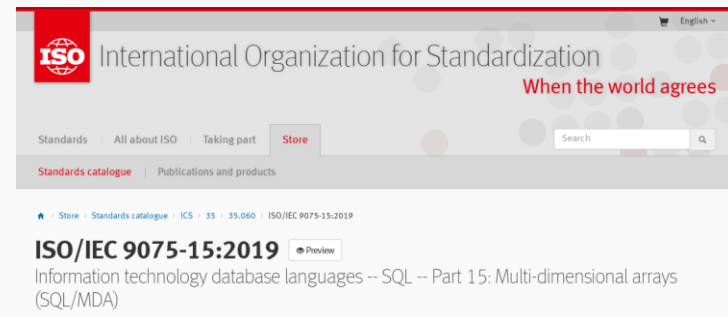
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-rwx--x---	rasdata	users	632172	Oct	13	2004	4251S0GR.tif

Homogenized, Analysis-Ready Datacubes



= „raster data manager“: actionable n-D datacubes

- pioneered, see 200+ publications & patents
- scalable **Big Datacube Management & Analytics**
 - Zero-coding, high performance & scalability, federation, security, clients
 - Mature full-stack implementation
 - Successfully from European research into international markets
- Official OGC Reference Implementation & INSPIRE Good Practice



What's new in rasdaman

- Completely overhauled query engine: JIT
 - substantially increased performance, reduced memory usage
- New powerful query operators, such as sort
- Virtual coverages: integrated datacubes from heterogeneous coverages
- Innovative Web dashboard frontend
- Role-Based Access Control, fine-grain and across federations
- Billing & quota support
- Enhanced automated datacube management

Virtual Coverages

- DIAS archives offer Sentinel granules
 - Individual UTM zones
 - Archive too big to copy

- Step 1: **homogenize within UTM zone**
 - Coverage references granules through in-situ mechanism
 - Data access → extract pixel set from relevant granules

- Step 2: **virtual coverage over UTM coverages**
 - Super-coverage = virtual single homogeneous coverage
 - Data access in arbitrary CRS → extract from relevant UTM coverages, auto-reproject
 - Query optimization: only files relevant, omit reprojection if unnecessary, ...



rasdaman Dashboard

The screenshot shows the rasdaman Dashboard interface. At the top, there is a header with the text "Welcome demo_user!" and "Visualize, Combine Spatio-Temporal Datacubes". The main area displays a 3D globe with a data overlay. A "WCPS Query Editor" window is open, showing a query. A "Layer Control" window is also visible, showing a table of layers.

Callouts identify the following UI elements:

- start box**: Points to the top navigation bar.
- toolbox**: Points to the left sidebar containing search and list icons.
- action button**: Points to a search icon in the toolbox.
- action widget**: Points to the WCPS Query Editor window.
- control widget**: Points to the Layer Control window.

The WCPS Query Editor shows the following code:

```

5 let $sub := [ansi("2018-08-18"), E(654000:690000), N(5090220:5115220)]
6
7 return encode(
8   crsTransform(
9     (unsigned char) (
10      {
11       {
12        red: $c[ $sub ];
13        green: $d[ $sub ];
14        blue: $e[ $sub ];
15      }
16    )
17  )

```

The Layer Control window shows the following table:

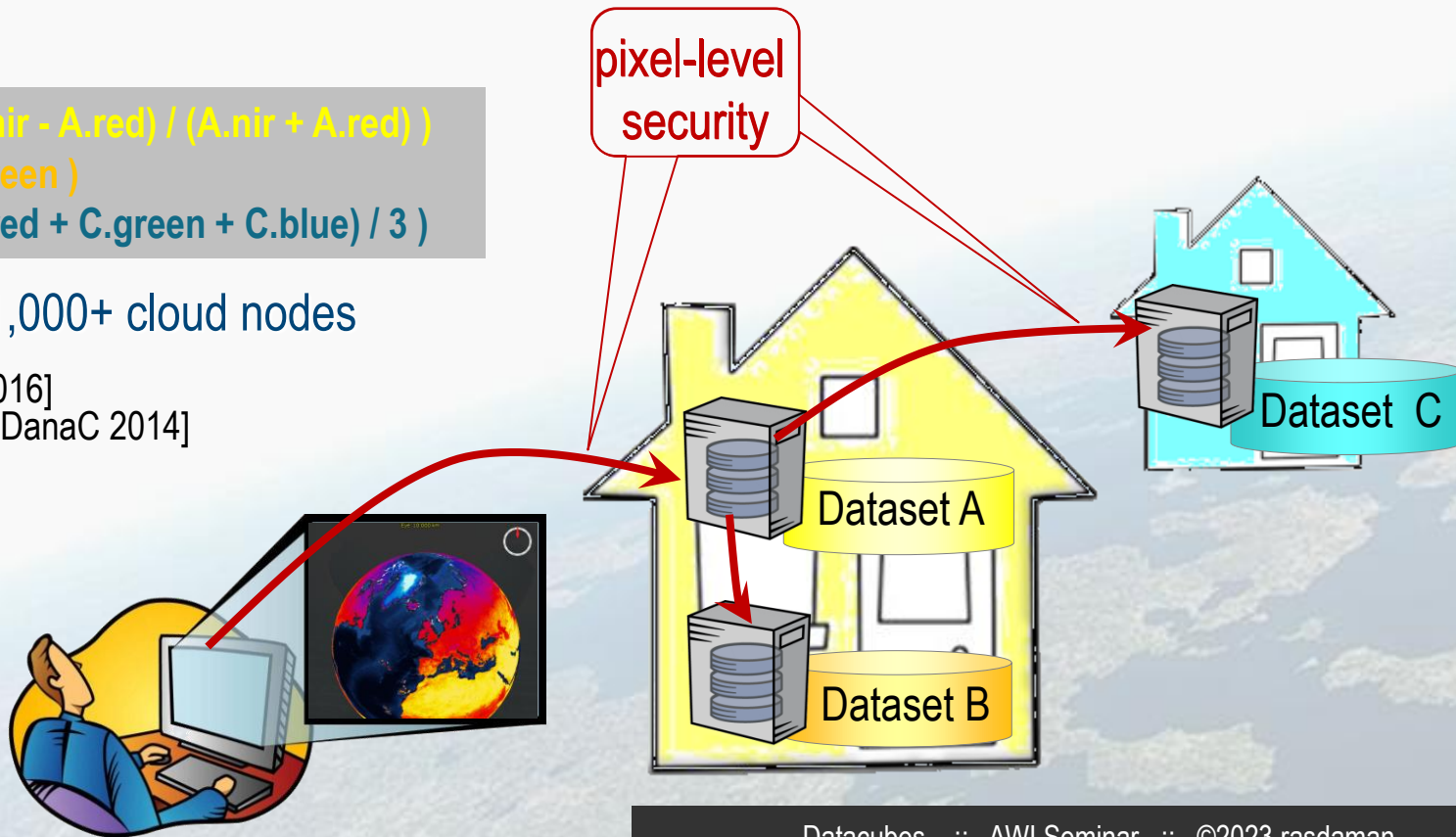
Active	Date	Layer
<input checked="" type="checkbox"/>	31/5/2021	OLCI_L2_LFR_IWV

Parallel, Distributed Processing

$$\begin{aligned} & \max((A.nir - A.red) / (A.nir + A.red)) \\ & + \text{avg}(B.green) \\ & + \max((C.red + C.green + C.blue) / 3) \end{aligned}$$

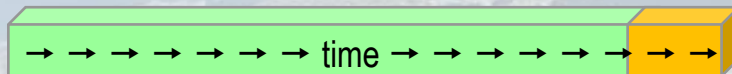
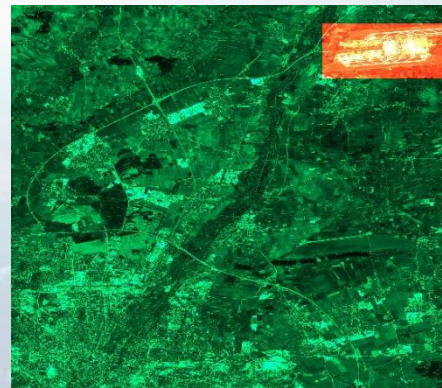
1 query → 1,000+ cloud nodes

[VLDB BOSS 2016]
[ACM SIGMOD DanaC 2014]



Security

- **Role-Based Access Control:** users ← roles ← privileges
 - Full admin control, retained also in federation
 - Configurable policies
- **Authorization** down to single pixel
 - any region
- **Quota & billing**



Comfort Zone of Well-known Clients

- **Map navigation:** OpenLayers, Leaflet, ...
- **Virtual globe:** NASA WorldWind, Cesium, ...
- **Web GIS:** QGIS, ArcGIS, ...
- **Analytics:** GDAL, R, python, ...
- **Visualization:** paraview, ...

[rasdaman-based portals]

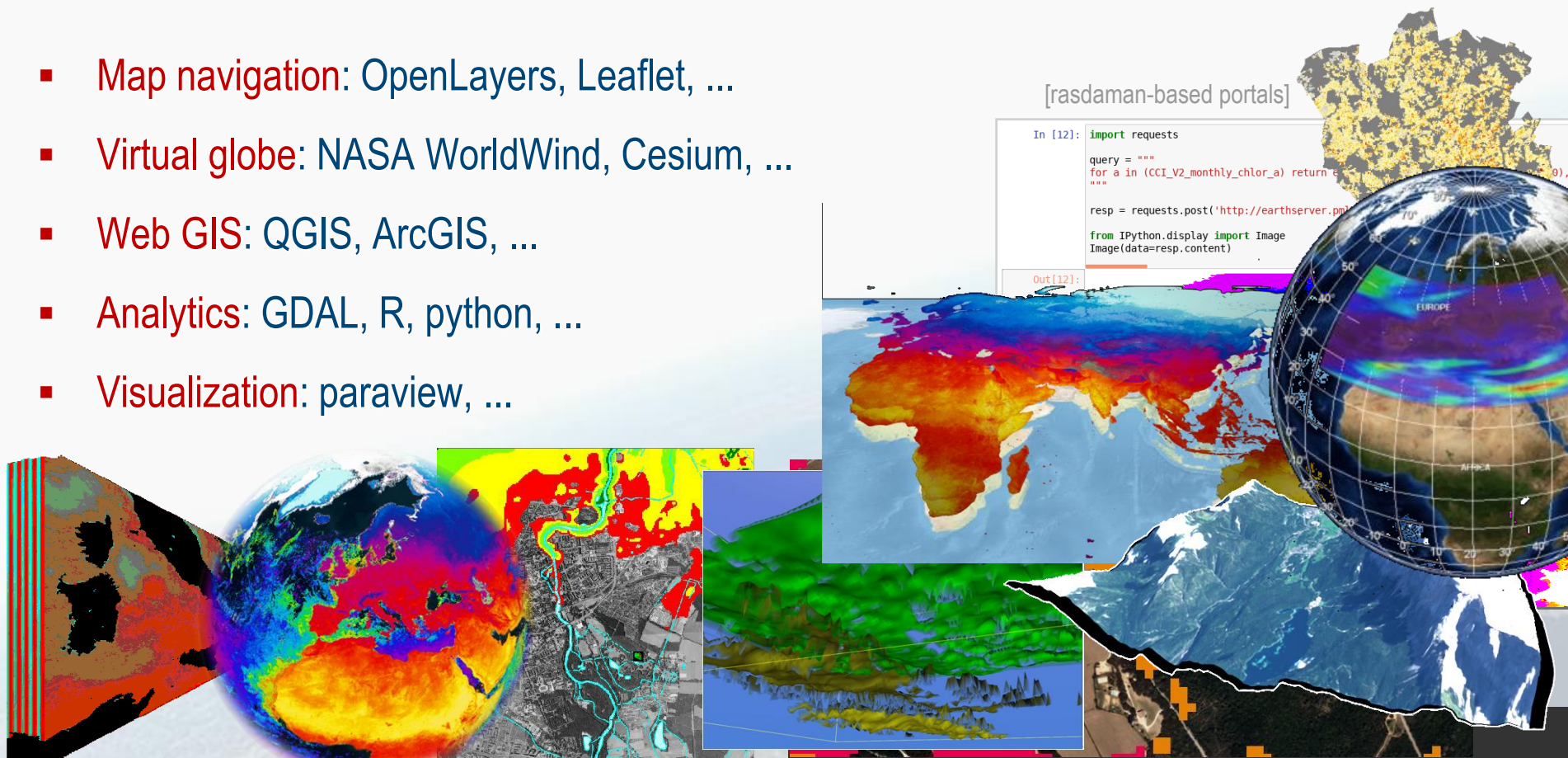
In [12]: `import requests`

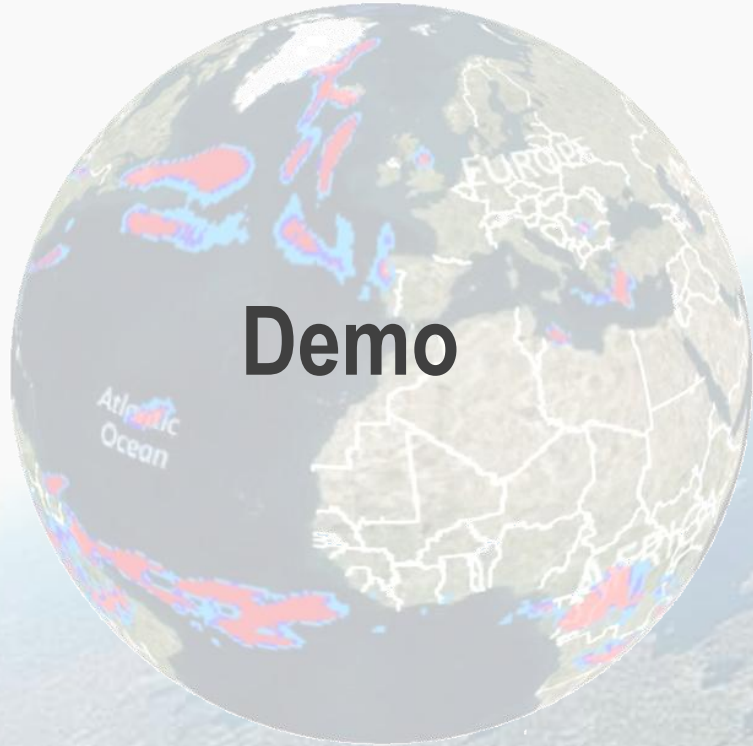
```
query = """
for a in (CCI_V2_monthly_chlor_a) return E
"""
```

```
resp = requests.post('http://earthserver.p...
```

```
from IPython.display import Image
Image(data=resp.content)
```

Out[12]:

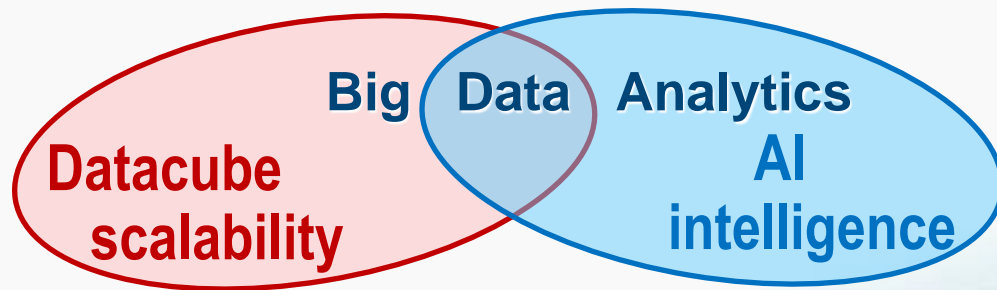




Demo



AI-Cube



- federated EO datacubes + advanced EO AI + natural language processing
- BigEarthNet Large-Scale Benchmark Archive
 - 590,326 tagged Sentinel-1/2 pairs
- Jacobs University, TU Berlin, rasdaman GmbH; Sep 2021, 18 months





Real-time Moving Source Integration

- drone → 5G → rasdaman datacube → visual client
 - DLR MACSnano on Vector UAV, 1 image/sec
 - 2 seconds latency
- Live @ Sep 2022 NATO C-UAS tech show



ORBiDANSe

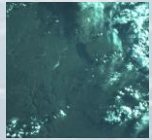
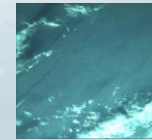
= Orbital Big Data AnalYTics Service

- „Process close to source“ → datacube engine on **nanosat**
- Answer analytics questions = avoid full download
 - Save bandwidth
 - Deliver insight, not pixels



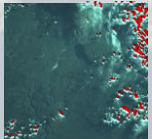
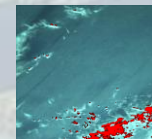
Exp1

Exp2



Ex 1: (naive) radiometry correction

Ex 2: (naive) cloud mask



Federation

Connecting Datacube Lakes into Spaces

- Increasing number of Datacube Lakes by individual institutions
- Connecting into Data Space through federation
- Many initiatives, like GAIA-X and EarthServer
- EarthServer: **location-transparent** datacubes



EarthServer

- datacube provider federation
 - 140+ PB **location-transparent** data space
 - Open standards, **zero-coding**
- Open, free, transparent, democratic
 - Open & private; free & commercial
- Latest: NCHC Taiwan



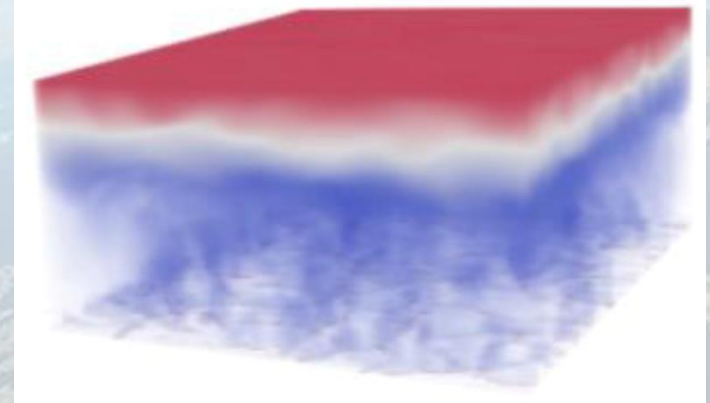
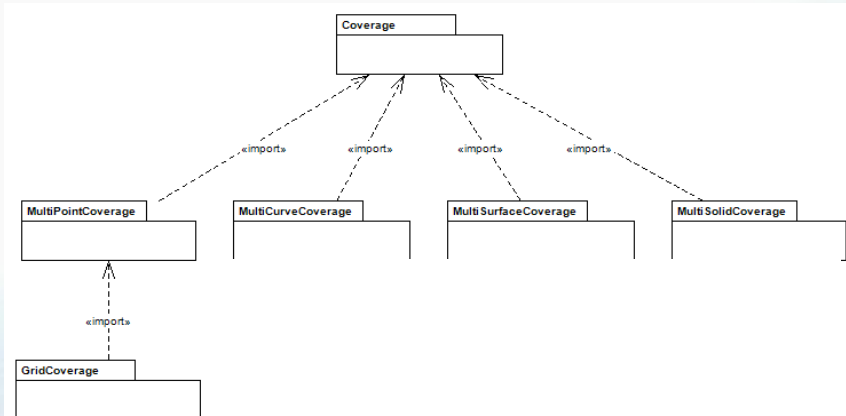
Standards



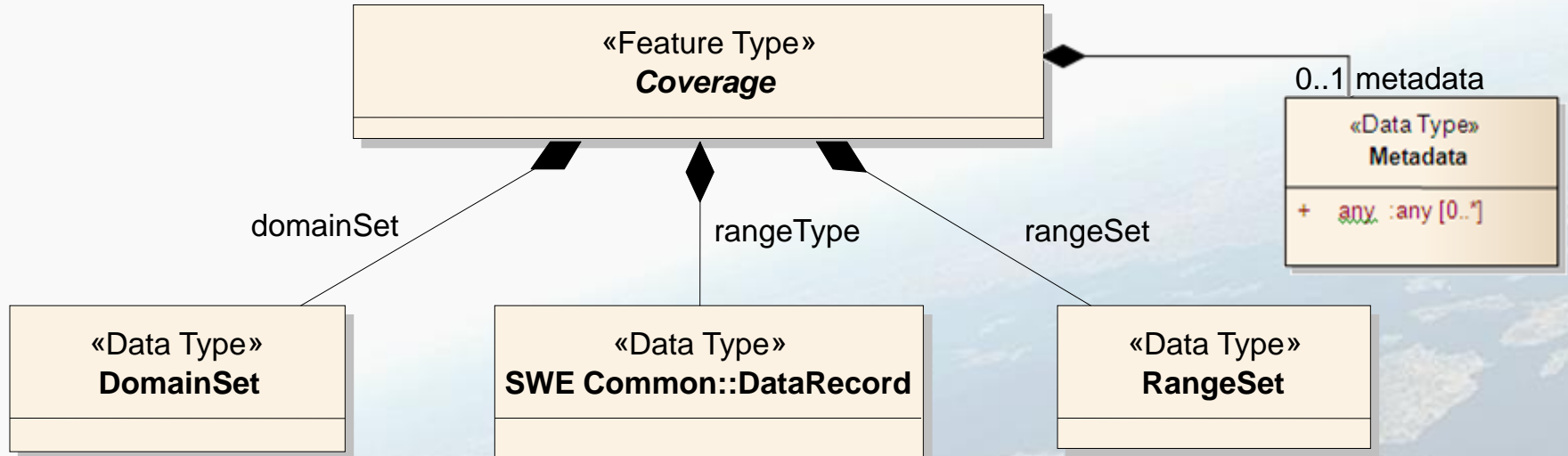
Why Standards?

Datacubes & Coverages

- In standardization: **coverage** = digital representation of (physical) **field**
 - In practice: regular & irregular grids, point clouds, general meshes
- Space, time, other axes; discrete & continuous



Coverage Definition



A Simple Coverage, in GML

```

<generalGridCoverage ... gml:id="CIS_001">
  <domainSet>
    <generalGrid srsName="http://www.opengis.net/def/crs-compound?
      1=http://www.opengis.net/def/crs/EPSSG/0/4979
      &amp;2=http://www.opengis.net/def/crs/OGC/0/AnsiDate"
      axisLabels="Lat Long h date">
      <regularAxis axisLabel="Lat" uomLabel="deg" lowerBound="40" upperBound="60" resolution="10"/>
      <regularAxis axisLabel="Long" uomLabel="deg" lowerBound="-10" upperBound="10" resolution="10"/>
      <irregularAxis axisLabel="h" uomLabel="m">
        <c> 0</c>
        <c>100</c>
      </irregularAxis>
      <irregularAxis axisLabel="date" uomLabel="d">
        <c>2015-12-01</c>
        <c>2015-12-02</c>
      </irregularAxis>
      <gridLimits srsName="http://www.opengis.net/def/crs/OGC/0/Index4D" axisLabels="i j k l">
        <indexAxis axisLabel="i" lowerBound="0" upperBound="2"/>
        <indexAxis axisLabel="j" lowerBound="0" upperBound="2"/>
        <indexAxis axisLabel="k" lowerBound="0" upperBound="1"/>
        <indexAxis axisLabel="l" lowerBound="0" upperBound="1"/>
      </gridLimits>
    </generalGrid>
  </domainSet>
  <rangeSet>
    <dataBlock>
      <v>01</v> <v>02</v> <v>03</v> <v>04</v> <v>05</v> <v>06</v> <v>07</v> <v>08</v> <v>09</v>
      <v>01</v> <v>02</v> <v>03</v> <v>04</v> <v>05</v> <v>06</v> <v>07</v> <v>08</v> <v>09</v>
      <v>01</v> <v>02</v> <v>03</v> <v>04</v> <v>05</v> <v>06</v> <v>07</v> <v>08</v> <v>09</v>
    </dataBlock>
  </rangeSet>
  <rangeType>
    <swe:DataRecord>
      <swe:field name="panchromatic">
        <swe:Quantity definition="http://opengis.net/def/property/OGC/0/Radiance">
          <swe:uom code="W.m-2.sr-1.nm-1"/>
        </swe:Quantity>
      </swe:field>
    </swe:DataRecord>
  </rangeType>
</generalGridCoverage>
  
```

A Simple Coverage, in JSON

```
{ "type": "CoverageByDomainAndRangeType",
  "domainSet": {
    "type": "DomainSetType",
    "generalGrid": {
      "type": "GeneralGridCoverageType",
      "srsName": "http://www.opengis.net/def/crs/OGC/0/Index2D",
      "axisLabels": ["i", "j"],
      "axis": [ { "type": "IndexAxisType", "axisLabel": "i", "lowerBound": 0, "upperBound": 2 },
                { "type": "IndexAxisType", "axisLabel": "j", "lowerBound": 0, "upperBound": 2 } ]
    }
  },
  "rangeSet": { "type": "RangeSetType",
                "dataBlock": { "type": "VDataBlockType", "values": [1,2,3,4,5,6,7,8,9] } },
  "rangeType": { "type": "DataRecordType",
                 "field": [ { "type": "QuantityType",
                              "definition": "ogcType:unsignedInt",
                              "uom": { "type": "UnitReference", "code": "10^0" } } ]
  }
}
```

A Simple Coverage, in RDF

```

<http://www.opengis.net/cis/1.1/examples/CIS_05_2D>
<http://www.w3.org/1999/02/22-rdf-syntax-ns#type>
<http://www.opengis.net/cis/1.1/CoverageByDomainAndRangeType> .

<http://www.opengis.net/cis/1.1/examples/CIS_05_2D>
<http://www.opengis.net/cis/1.1/domainSet>
<http://www.opengis.net/cis/1.1/examples/CIS_DS_05_2D> .
<http://www.opengis.net/cis/1.1/examples/CIS_DS_05_2D>
<http://www.opengis.net/cis/1.1/generalGrid>
<http://www.opengis.net/cis/1.1/examples/CIS_DS_GG_05_2D> .
<http://www.opengis.net/cis/1.1/examples/CIS_DS_05_2D>
<http://www.w3.org/1999/02/22-rdf-syntax-ns#type>
<http://www.opengis.net/cis/1.1/DomainSetType> .
<http://www.opengis.net/cis/1.1/examples/CIS_DS_GG_05_2D>
<http://www.opengis.net/cis/1.1/axis>
<http://www.opengis.net/cis/1.1/examples/CIS_DS_GG_I_05_2D> .
<http://www.opengis.net/cis/1.1/examples/CIS_DS_GG_05_2D>
<http://www.opengis.net/cis/1.1/axis>
<http://www.opengis.net/cis/1.1/examples/CIS_DS_GG_J_05_2D> .
<http://www.opengis.net/cis/1.1/examples/CIS_DS_GG_05_2D>
<http://www.opengis.net/cis/1.1/axisLabels>
<http://www.opengis.net/cis/1.1/axisLabels0> .
<http://www.opengis.net/cis/1.1/axisLabels0> <http://www.w3.org/1999/02/22-rdf-syntax-ns#first> "i" .

```


ISO Coverages

	Geometry/data model	Function/processing model
abstract	19123-1 Coverage Fundamentals = OGC AT6 adopted	19123-3 Coverage Processing Fundamentals = OGC WCPS adopted
concrete	19123-2 Coverage Implementation Schema = OGC CIS todo: CIS 1.0 → CIS 1.1	19123-4 Coverage Services = OGC WCS & OAPI-Coverages ? Potential future

OGC Coverages

- Coverage data model: Coverage Implementation Schema (CIS)
 - = ISO 19123-2
 - CIS 1.1 adds General Grid Coverage aka **datacubes**
 - Open-ended encodings

- Coverage service models:
 - WCS suite (mature, proven)
 - OAPI-Coverages (under construction since 5+ years)
 - Environmental Data Retrieval (EDR): generic, little semantics

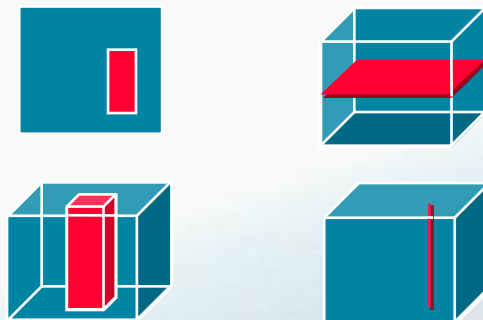
- *Note: WMS = pictures, WCS = data*

OGC Web Coverage Service (WCS)

- WCS **Core**: access to spatio-temporal coverages & subsets

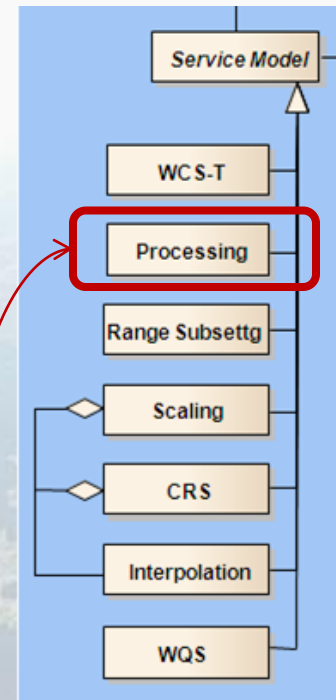
- Encoding on the fly

- subset = **trim** | **slice**



- WCS **Extensions**: optional functionality facets, including **WCPS**

- rasdaman implements WCS Core & all extensions, reference implementation*



Conclusion

- rasdaman v10: substantial enhancements, readily available to AWI
- EarthServer: location-transparent federation – aka Datacube Space
 - Copernicus, atmospheric, land governance, and many more – continuously growing
- ...all based on open coverage standards
- Questions? baumann@rasdaman.com