

# Representing Verifiable Statistical Computations as linked data

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# This talk in one slide



Describe the WebIndex Project

Represents an statistical index

Data Model based

Computation and validation process

Visualization

# Web Index

Measure WWW's contribution to development and  
human rights by country

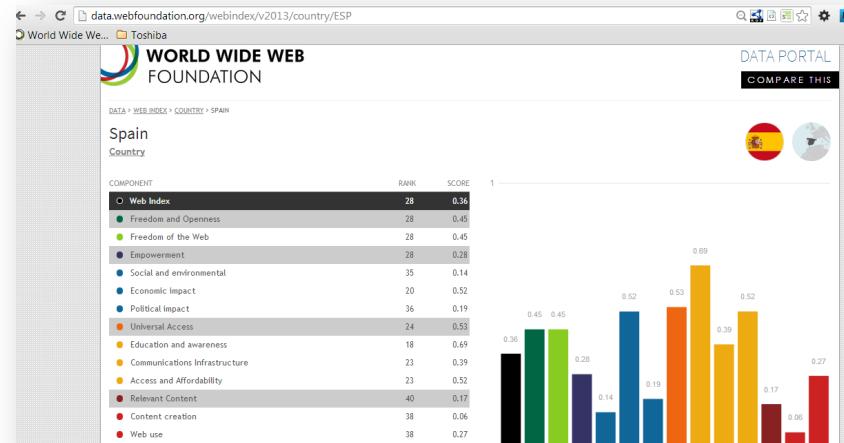
Developed by the Web Foundation

Web page:

<http://thewebindex.org>

Linked data portal:

<http://data.webfoundation.org/webindex/2013>



# Technical details

Index made from

81 countries, 5 years (2007-12)

116 indicators:

84 Primary (questionnaires)

32 Secondary (external sources)

Linked data portal

Modeled on top of RDF Data Cube

Linked data: DBpedia, Organizations, etc.

# Different versions

2012. Visualizations & linked data portal

- RDF representation based on RDF Data Cube

- Internal validation

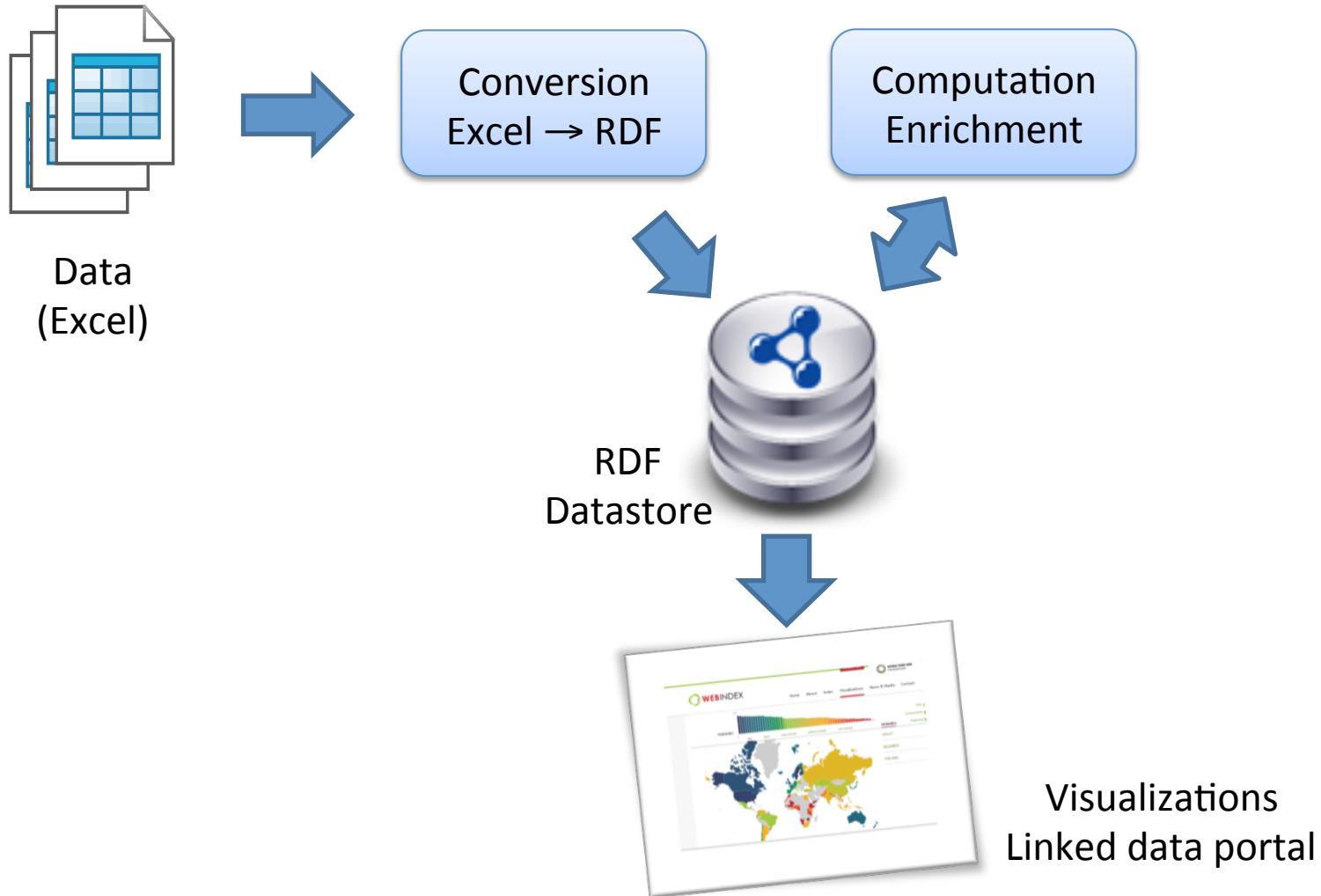
- No representation of computations

2013. Include data about computations

- Goal: External agents can verify data & computations

2014. Currently in development

# Webindex workflow



# Computation process (1)

Simplified with one indicator, 3 years and 4 countries

Country	2009	2010	2011
Spain	4	5	3
Finland	4		6
Armenia	1		
Chile	6	8	

Country	2009	2010	2011
Spain	4	5	3
Finland	4	5	6
Armenia	1	1	1
Chile	6	8	10.6

Mean  
 $x\downarrow i = x\downarrow i-1 + x\downarrow i+1 / 2$

Average growth  
 $x\downarrow n \cdot x\downarrow n-1 / x\downarrow n-2 + \dots$

Country	2009	2010	2011
Spain	4	5	3
Finland	4	5	6
Armenia	1	1	1
Chile	6	8	10.6

Country	2009	2010	2011
Spain	-0.57	-0.57	-0.92
Finland	-0.57	-0.57	-0.14
Chile	1.15	1.15	1.06

z-score  
 $z = x - \mu / \sigma$

# Computation Process (2)

Simplified with one indicator, 3 years and 4 countries

Normalize Data (z-scores)

Country	2009	2010	2011
Spain	-0.57	-0.57	-0.92
Finland	-0.57	-0.57	-0.14
Chile	1.15	1.15	1.06

Adjust data

Country	A	B	C	D	...
Spain	8	7	9.1	7.1	...
Finland	7	8	7.1	8	...
Chile	8	9	7.6	6	...

$$x \downarrow i = x \downarrow i + \delta$$

Group indicators

Country	Readiness	Impact	Web	Composite
Spain	5.7	3.5	5.1	4.5
Finland	5.5	3.9	7.1	4.9
Chile	6.7	4.5	7.6	5.1

Rankings

Country	Readiness	Impact	Web	Composite
Spain	2	3	3	3
Finland	3	2	2	2
Chile	1	1	1	1

# WeblIndex data model

Model based on RDF Data Cube

Main entity = **Observation**

Observations have **values by years**

Observations refer to **indicators** and **countries**

DataSets are published by **Organizations**

Datasets contain several slices

Slices group observations

Indicators are provided by **Organizations**

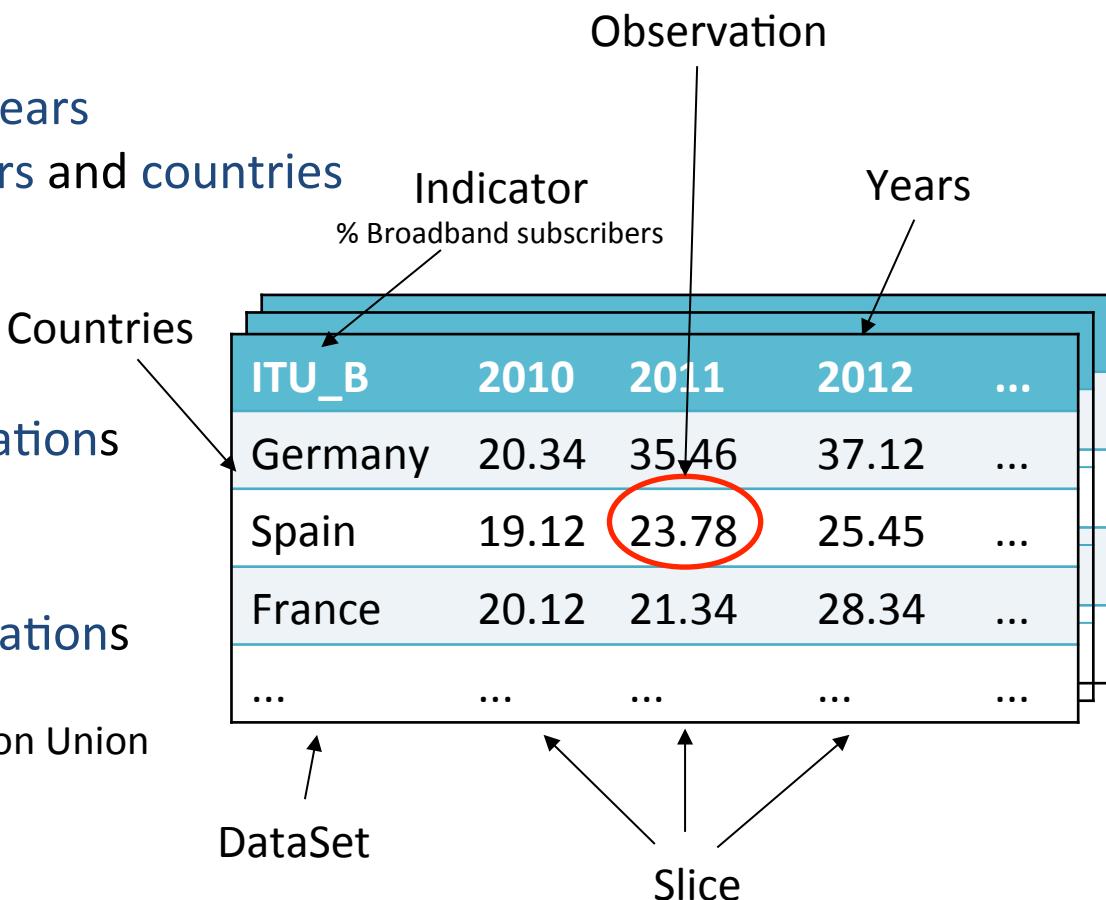
Examples

ITU = International Telecommunication Union

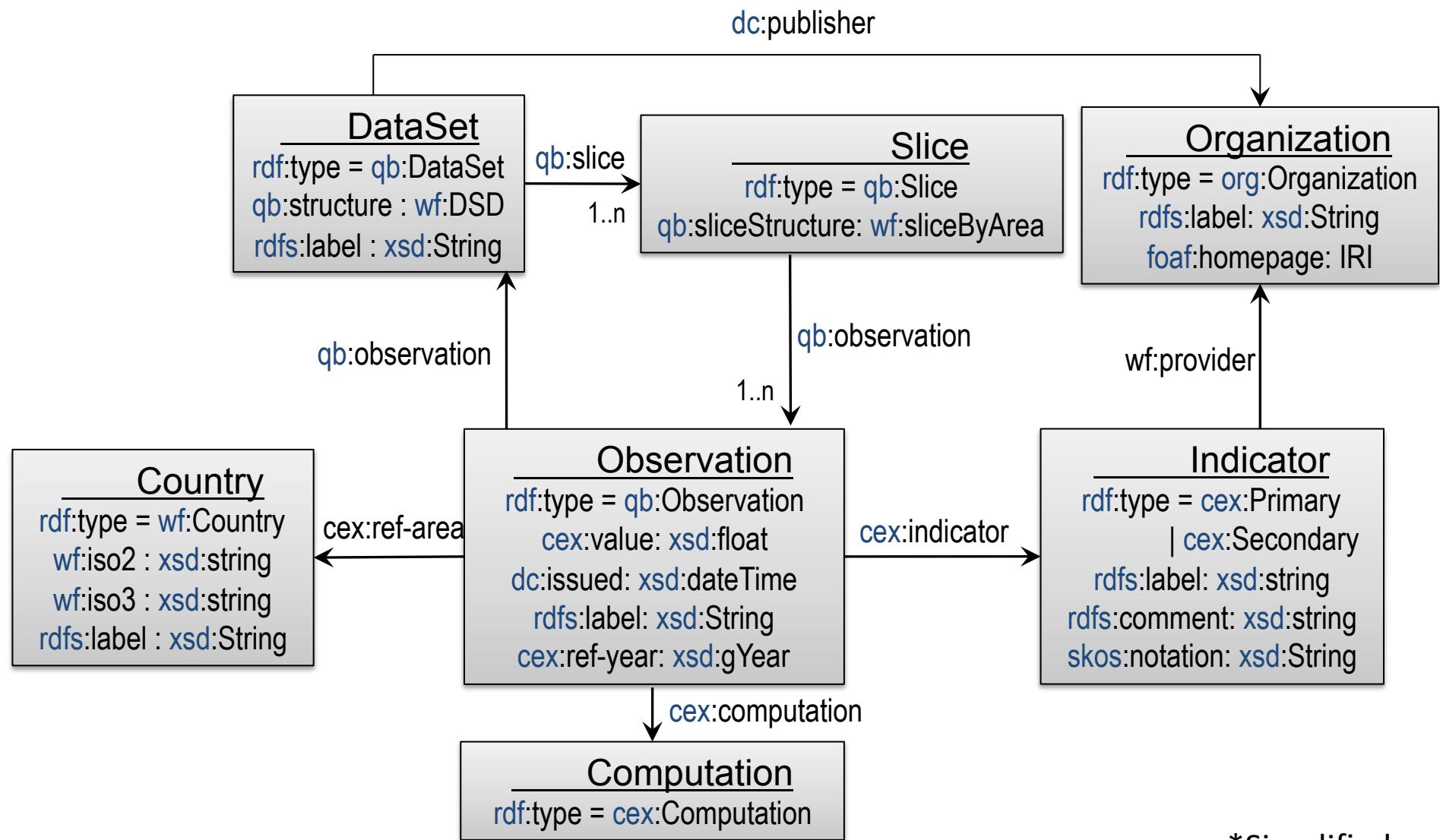
UN = United Nations

WB = World bank

...



# Data model\*



# Excel → RDF (Turtle)

ITU_B	2010	2011	2012	...
Germany	20.34	35.46	37.12	...
Spain	19.12	23.78	25.45	...
France	20.12	21.34	28.34	...
...	...	...	...	...

interrelated  
linked  
data

```

obs:obs8165 a qb:Observation ;
  rdfs:label "ITU_B in ESP, 2011" ;
  cex:indicator indicator:ITU_B ;
  qb:dataSet dataset:DITU ;
  cex:value "23.78"^^xsd:float ;
  cex:ref-year 2011 ;
  cex:ref-area country:Spain ;
  dc:issued "2013-05-30"^^xsd:date ;
  cex:computation cex:raw ;
  ...
  .
  
```

```

indicator:ITU_B
  a wf:SecondaryIndicator ;
  rdfs:label "Broadband subscribers %"
  .
  .
  dataset:DITU a qb:DataSet ;
  rdfs:label "ITU Dataset" ;
  dc:publisher org:ITU ;
  qb:slice slice:ITU10B ,
  slice:ITU11B ,
  .
  ...
  slice:ITU11B a qb:Slice ;
  qb:sliceStructure wf:sliceByYear ;
  qb:observation obs:obs8165,
  obs:obs8166,
  ...
  .
  org:ITU a org:Organization ;
  rdfs:label "ITU" ;
  foaf:homepage <http://www.itu.int/>
  .
  country:Spain a wf:Country ;
  wf:iso2 "ES" ; wf:iso3 "ESP" ;
  rdfs:label "Spain"
  .
  
```

# Computation process

## 1. First computation

Statistics experts using Excel



## 2. Second computation (WESO team)

1st. approach: SPARQL Update queries

Can reuse the validation queries



Declarative approach

Problem: Efficiency & debugging

## 2nd. approach: Special purpose program

Performs computations and adds metadata



# Computation representation

## Computex Vocabulary

Describes statistical computation procedures

Compatible with RDF Data Cube

### Some terms:

<code>cex:Concept</code>	Entities that are being indexed
<code>cex:Indicator</code>	Dimension whose values add information to the index
<code>cex:Computation</code>	Represents the different computation types It can be: <code>cex:Raw</code> , <code>cex:Mean</code> , <code>cex:Increment</code> , <code>cex:Copy</code> , <code>cex:Z-Score</code> , <code>cex:Ranking</code> , <code>cex:AverageGrowth</code> , <code>cex:WeightedMean</code>
<code>cex:WeightSchema</code>	Weight schema for a list of indicators

# Example of a computed observation

```
obs:c39049 a qb:Observation ;
rdfs:label "ITU B in ESP, 2011, Normalized" ;
cex:indicator indicator:ITU_B ;
qb:dataSet dataset:computed366 ;
cex:value "0.859"^^xsd:double ;
cex:ref-year 2011 ;
cex:ref-area country:Spain ;
cex:computation wi-comp:comp39050 ;
...
.
```

Normalization using z-score

$$z = \frac{x - \mu}{\sigma}$$

$$= 23.78 - 12.816 / 12.766 = 0$$



```
wi-comp:39050 a cex:Normalize ;
cex:stdDev "12.766"^^xsd:double ;
cex:mean "12.816"^^xsd:double ;
cex:slice wi-slice:sliceITUB_2011 ;
cex:observation obs:obs8165 ;
.
```

```
obs:obs8165 a qb:Observation ;
cex:value "23.78"^^xsd:double ;
...
.
```

```
wi-slice:sliceITU_B_2011 a qb:Slice ;
qb:observation obs:8471,
obs:8434, ...;
```

URI of computed observation:

[http://data.webfoundation.org/webindex/v2013/observation/computed\\_2011\\_1386752461095\\_39049](http://data.webfoundation.org/webindex/v2013/observation/computed_2011_1386752461095_39049)

# Verifying linked data contents

Once the linked data has been published

How can an external agent verify it?

2 approaches:

SPARQL Queries

Shape expressions



# SPARQL validation

CONSTRUCT queries like:

```
CONSTRUCT {  
  [ a cex:Error ; cex:errorParam # ... omitted  
    cex:msg "Observation has two different values" . ]  
} WHERE {  
  ?obs a qb:Observation .  
  ?obs cex:value ?value1 .  
  ?obs cex:value ?value2 .  
  FILTER ( ?value1 != ?value2 )  
}
```

Detects if one observation has more than 1 value



# SPARQL validation

More advanced queries like:

```
CONSTRUCT {  
    [ a cex:Error ; cex:errorParam # ...omitted  
      cex:msg "Mean value does not match" ] .  
} WHERE {  
    ?obs a qb:Observation ;  
    cex:computation ?comp ;  
    cex:value ?val .  
    ?comp a cex:Mean .  
    { SELECT (AVG(?value) as ?mean) ?comp WHERE {  
        ?comp cex:observation ?obs1 .  
        ?obs1 cex:value ?value ;  
    } GROUP BY ?comp  
    }  
    FILTER (abs(?mean - ?val) > 0.0001)  
}
```

Detects if an observation whose computation is declared as the mean is really the mean

# Shape Expressions validation

Shape expressions declare the shape of RDF data

Human readable and machine processable

Shape Expressions for team communication

Developers know which triples must generate/consume

```
<Observation> {
    rdf:type          (qb:Observation)
    , cex:value       xsd:float ?
    , dc:issued        xsd:dateTime
    , rdfs:label       xsd:string ?
    , qb:dataSet      @<DataSet>
    , cex:ref-area     @<Country>
    , cex:indicator    @<Indicator>
    , cex:ref-year      xsd:gYear
    , cex:computation  @<Computation>
}
```

# Visualization



Visualization tool: Wesby, Inspired by Pubby

Enables easy customization by templates

Different templates are chosen based on `rdf:type`

Data load on demand

SPARQL queries

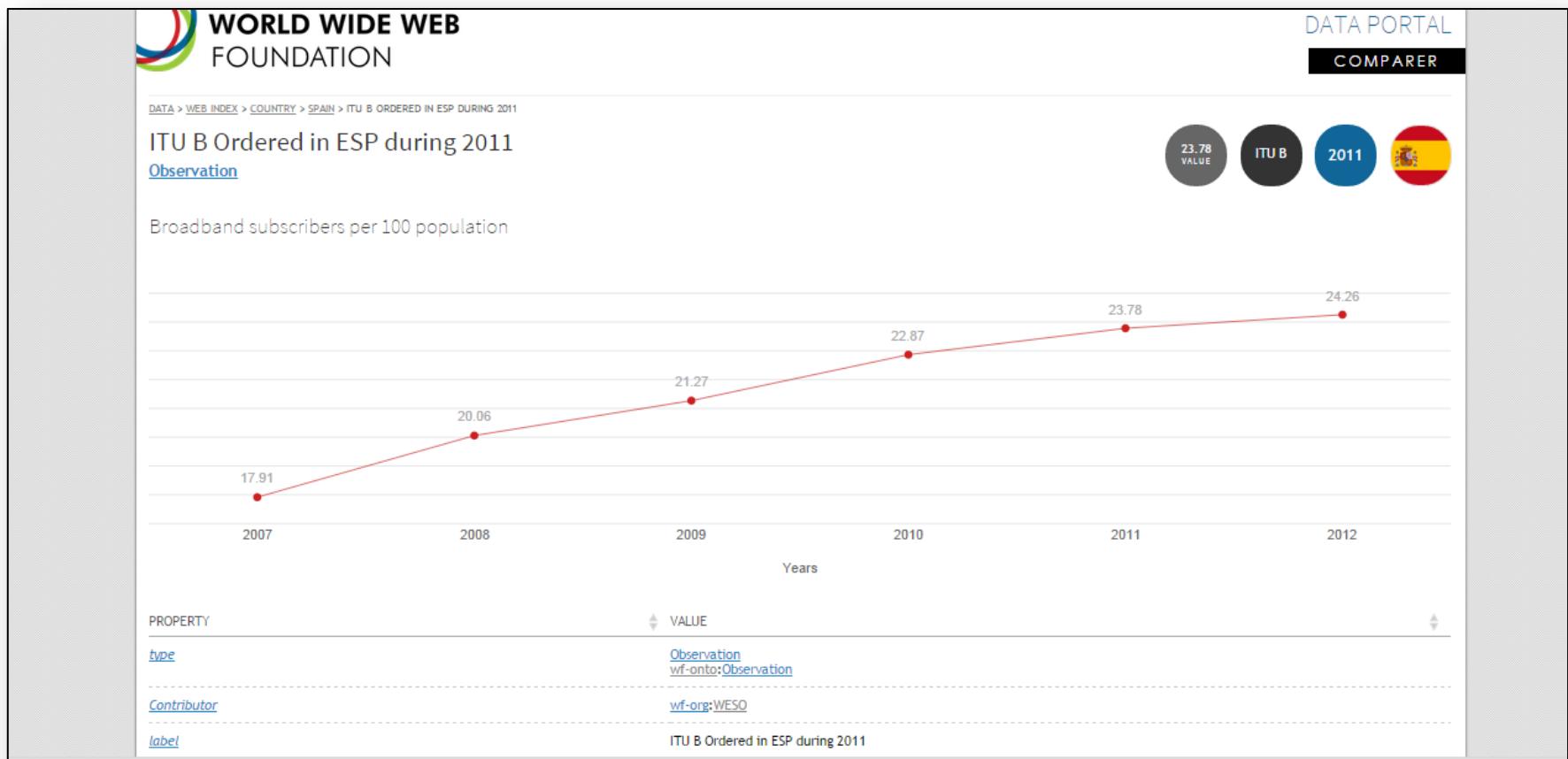
Responsive design and mobile friendly



# Visualization

Example: Template for Observations

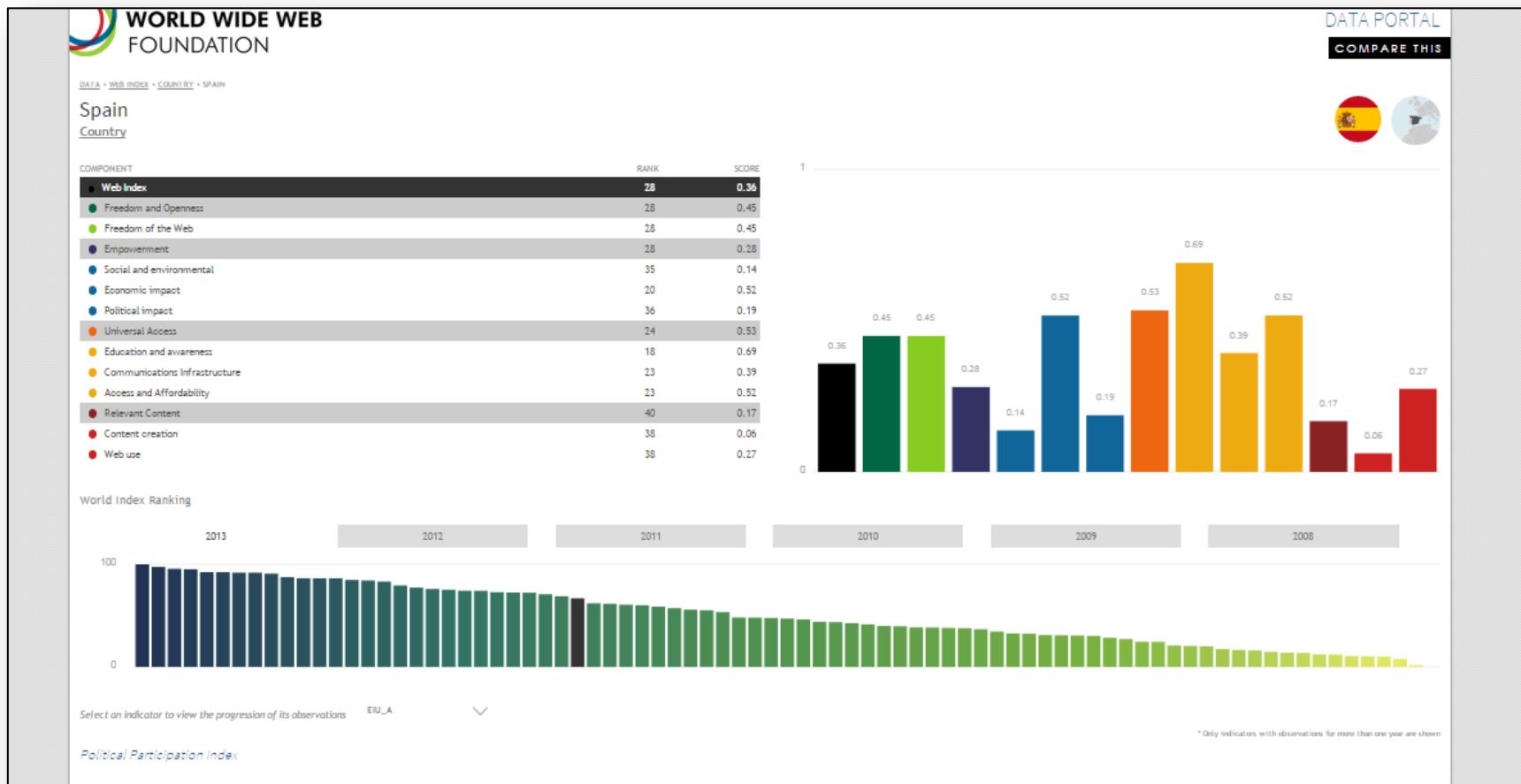
<http://data.webfoundation.org/webindex/v2013/observation/obs8003>



# Visualization

Example: Template for Countries

<http://data.webfoundation.org/webindex/v2013/country/ESP>



# Conclusions

WebIndex:

Linked data portal (medium size  $\approx$  3,5 mill triples)

It adds data about computation

Computations represented as linked data

We explored some possibilities for validation

SPARQL validation: very expressive, declarative

Shape Expressions: more readable

Visualization by templates

# Future work

Computex vocabulary was a first attempt

Further work to employ it in similar projects

Visualization of computations

Define wesby templates to visualize computations

Question: Was it worth the effort?

Producer/consumers balance

We **produced** data that can be externally verified

However, we still don't have consumers who need it

# End of presentation

More info:

WESO Research group  
<http://www.weso.es>