

CURRENT OPPORTUNITIES AND FUTURE CHALLENGES

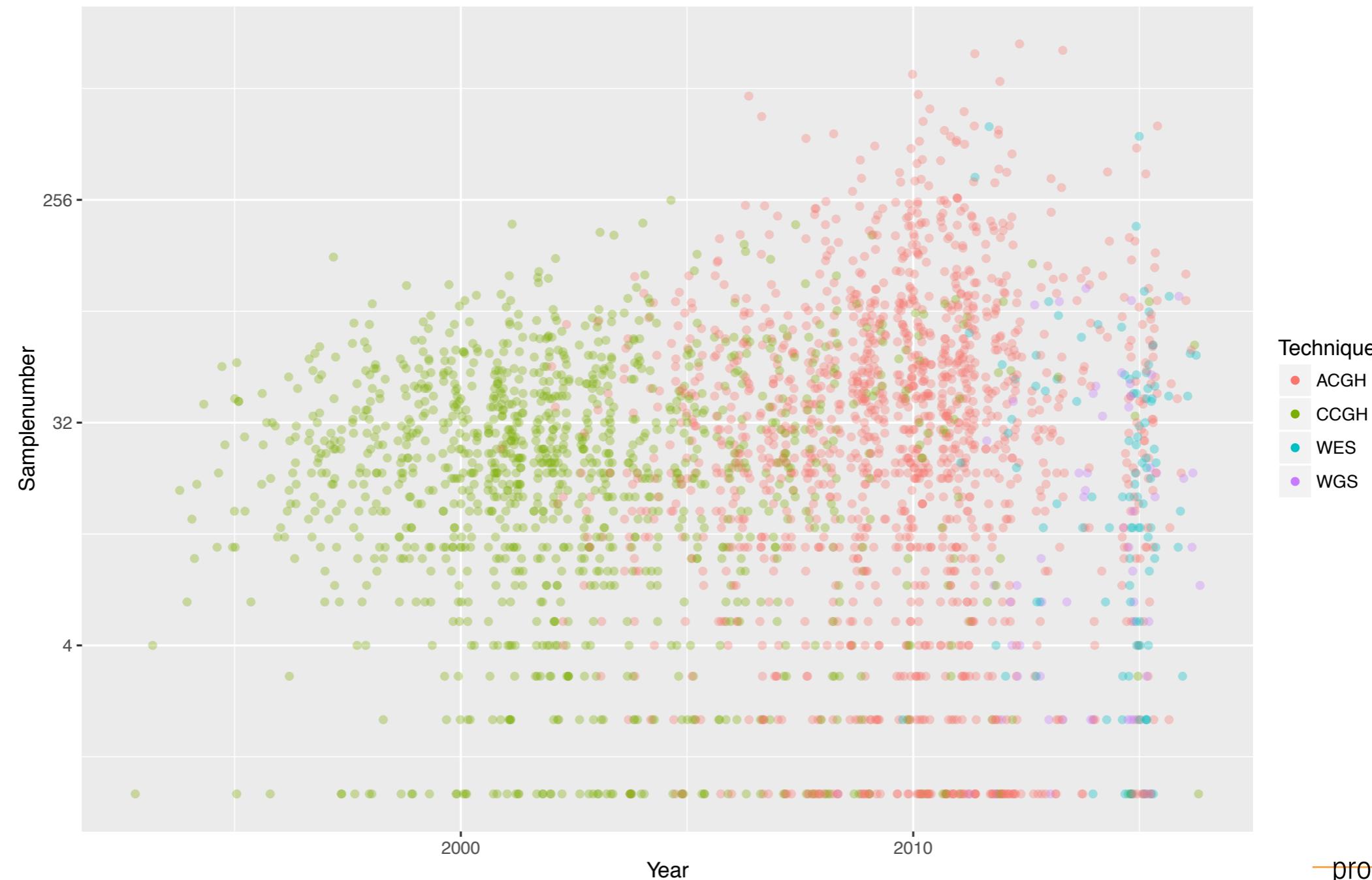
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# HARVESTING CANCER GENOME DATA

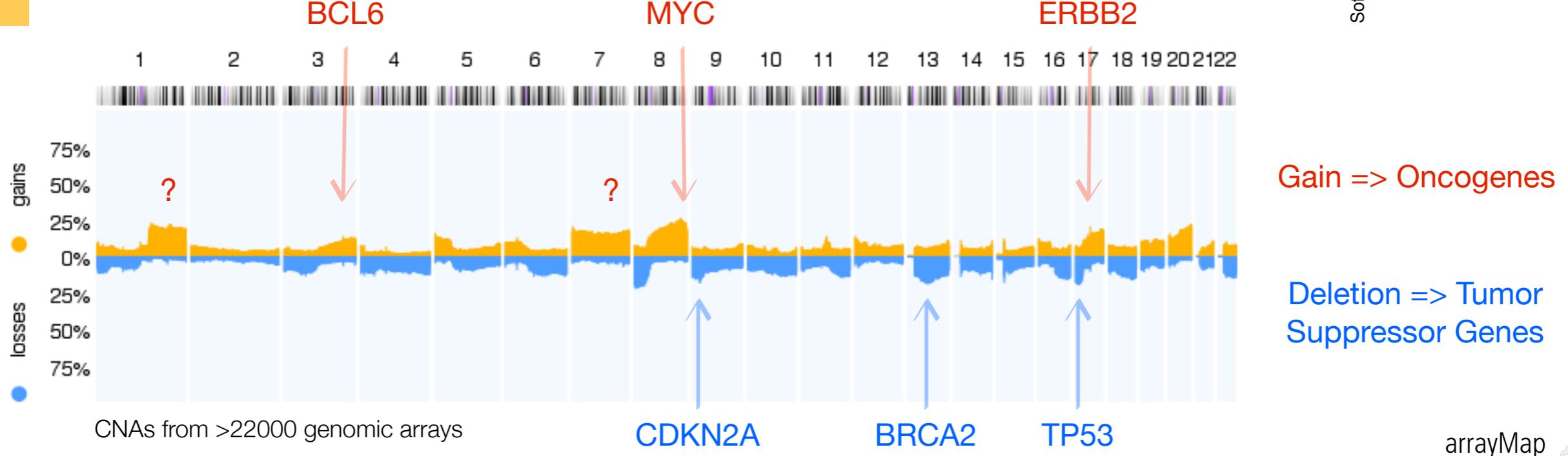
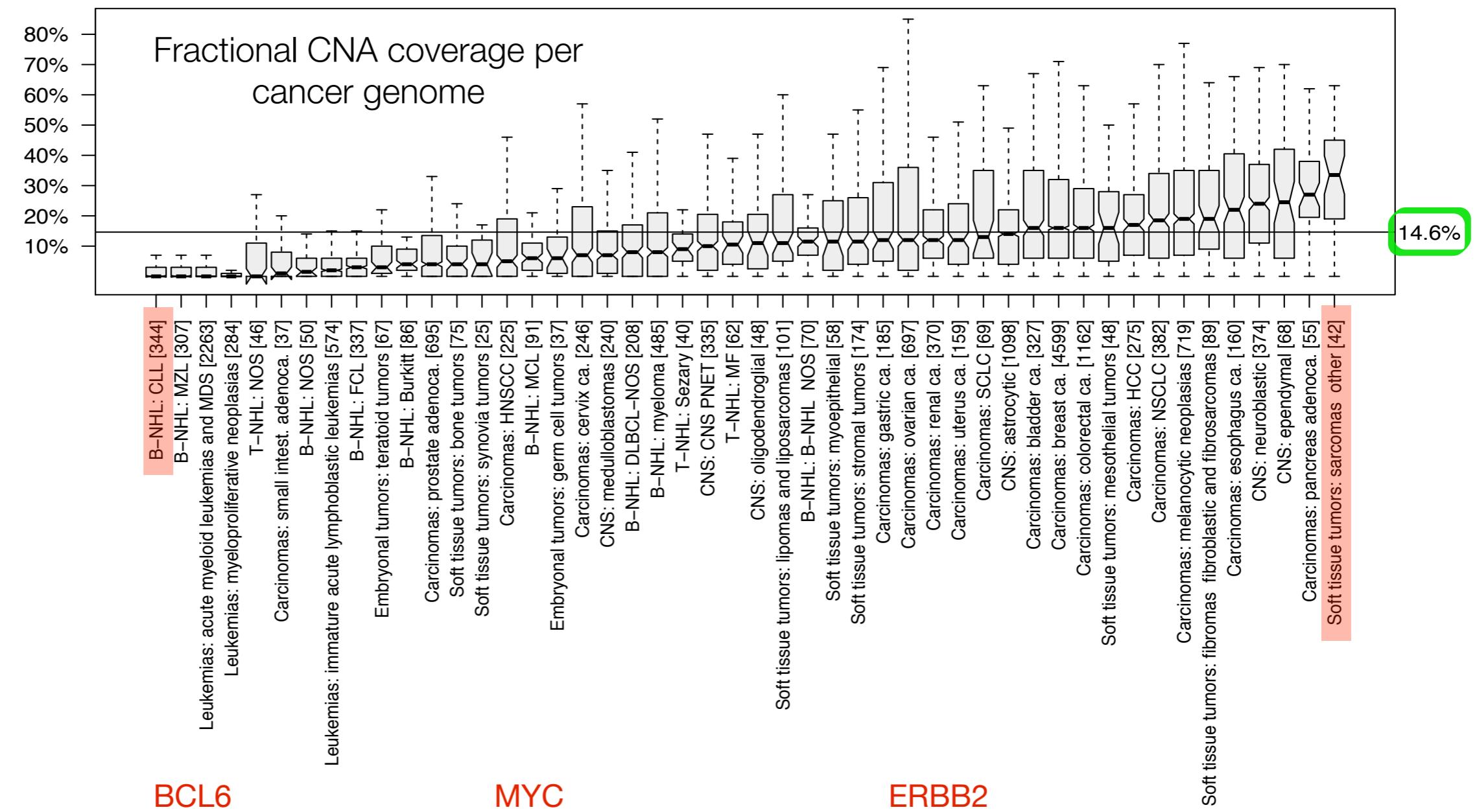
# THE PUBLICATION LANDSCAPE OF WHOLE GENOME SCREENING IN CANCER

## MOLECULAR CYTOGENETICS & SEQUENCING STUDIES FOR WHOLE GENOME PROFILING

Cancer Samples per Publication for Different Techniques  
[129417 samples from 2747 publications]



# GENOMIC COPY NUMBER IMBALANCED PROVIDE WIDESPREAD SOMATIC VARIANTS IN CANCER





# techniques

cCGH, aCGH, WES, WGS

## aCGH (+?)

## scope

**sample** (e.g. combination of several experiments); **literature** tracking

## experiment

## content

**>31000** samples  
**>2700** publications

>60000 arrays

# raw data presentation

no (link to sources if available)

yes (raw, log2, segmentation if available)

# per sample re-analysis

no; supervised result (mostly as provided through publication)

yes (re-segmentation,  
thresholding, size filters ...)

## **final data**

# annotated/interpreted CN status for GP and cytogenetic regions

## unsupervised CN status for GP and cytogenetic regions

## **main purposes**

- Distribution of CNA target regions in most tumor types (>350 ICD-O)
  - Cancer classification

- Gene specific hits
  - Genome feature correlation  
(fragile sites ...)

[Search Samples](#)[Search Publications](#)[Gene CNA Frequencies](#)[User Data](#)[Array Visualization](#)[Progenetix](#)[Citation](#)[User Guide](#)[Registration & Licensing](#)[People](#)[External Links ↗](#)FOLLOW US ON [twitter](#)

130.60.23.21

arrayMap is a curated reference database and bioinformatics resource targeting copy number profiling data in human cancer. The arrayMap database provides an entry point for meta-analysis and systems level data integration of high-resolution oncogenomic CNA data. The current data reflects:



65042 genomic copy number arrays



986 experimental series



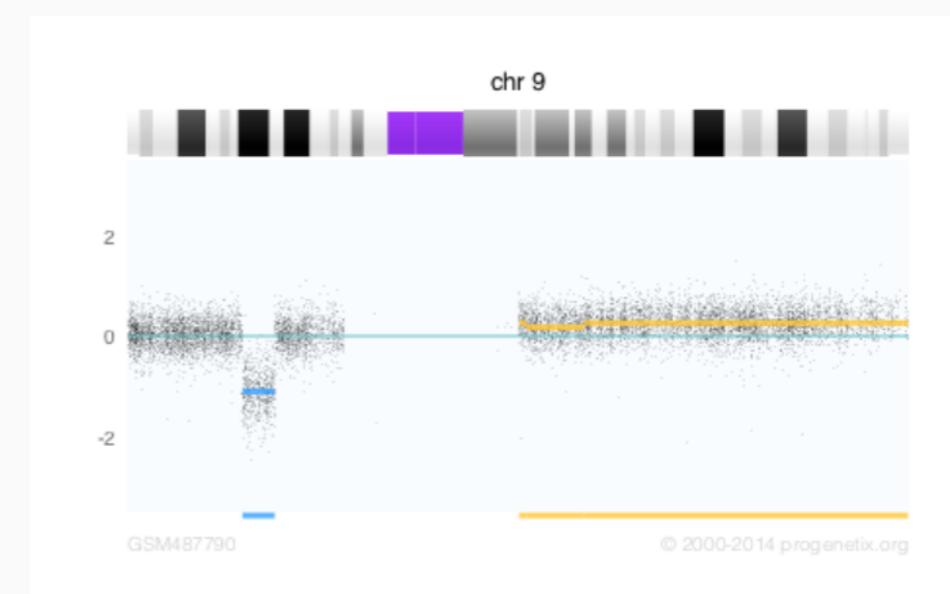
333 array platforms



253 ICD-O cancer entities



716 publications (Pubmed entries)



For the majority of the samples, probe level visualization as well as customized data representation facilitate gene level and genome wide data review. Results from multi-case selections can be connected to downstream data analysis and visualization tools, as we provide through our Progenetix project.

arrayMap is developed by the group "Theoretical Cytogenetics and Oncogenomics" at the Institute of Molecular Life Sciences of the University of Zurich.

BRAIN TUMOURS	5791 samples ↗	[?]
BREAST CANCER	8594 samples ↗	[?]
COLORECTAL CANCER	3470 samples ↗	[?]
PROSTATE CANCER	1366 samples ↗	[?]
STOMACH CANCER	1457 samples ↗	[?]

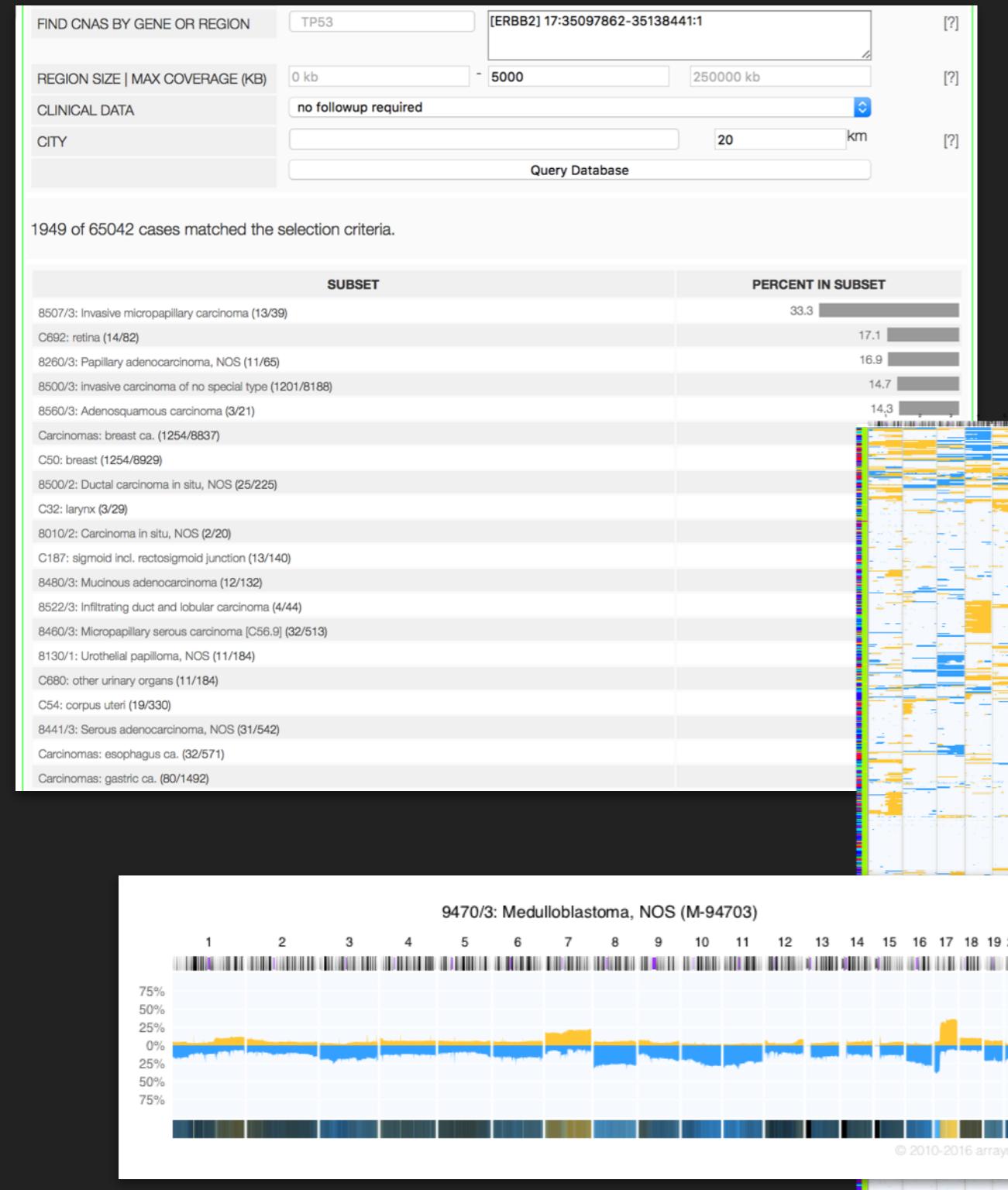
## ARRAYMAP NEWS

**2016-04-11: Sorting cancer subset tables****2015-03-23: SIB Profile 2015****More news ...**

Feel free to use the data and tools for academic research projects and other applications. If more support and/or custom analysis is needed, please contact Michael Baudis regarding a collaborative project or a special license.



# THE ARRAYMAP CANCER GENOME RESOURCE



## ICD Morphologies

64485 samples from arraymap have an associated "ICDMORPHOLOGYCODE" label.

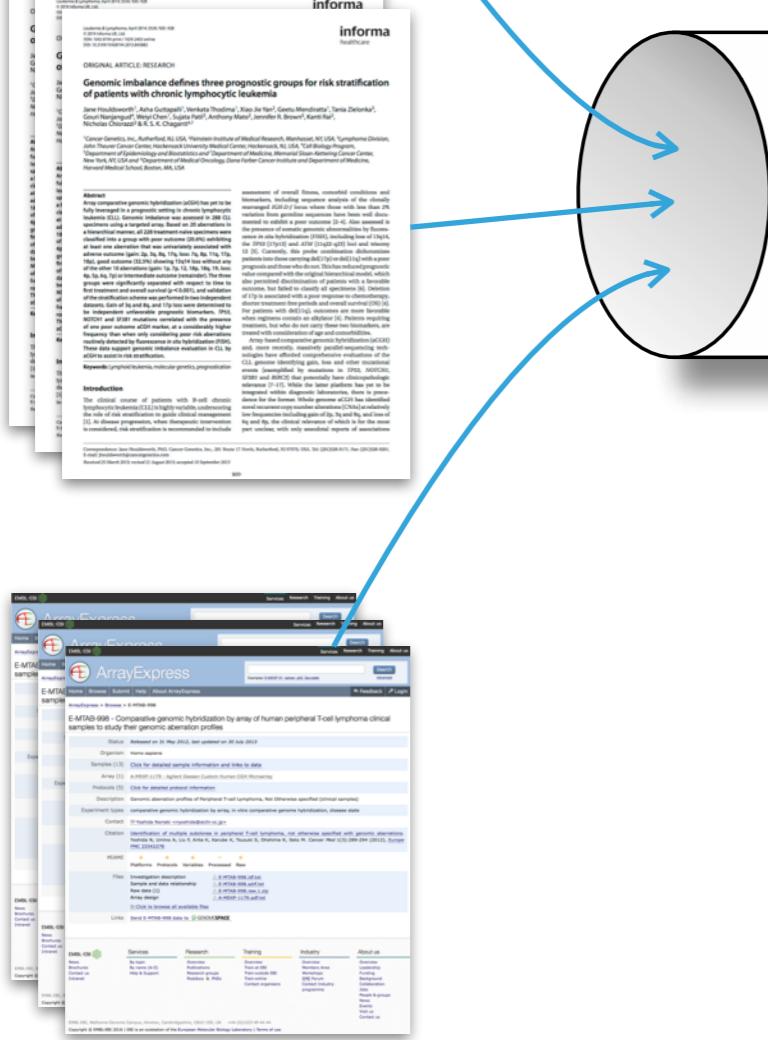
31902 samples from progenetix have an associated "ICDMORPHOLOGYCODE" label.

400 subsets of type ICDMORPHOLOGYCODE will be parsed.

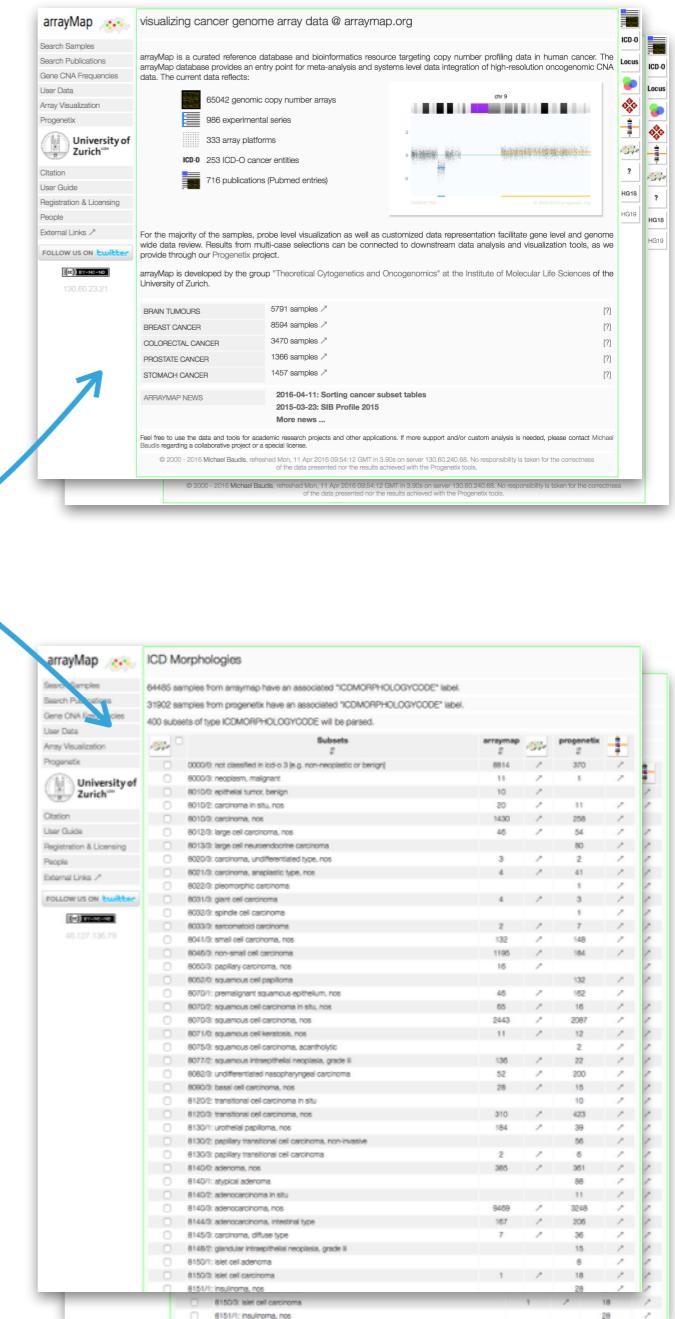
	<b>Subsets</b>	<b>arraymap</b>
<input type="checkbox"/>	8140/3: adenocarcinoma, nos	9469 ↗
<input type="checkbox"/>	0000/0: not classified in icd-o 3 [e.g. non-neoplastic or benign]	8814 ↗
<input type="checkbox"/>	8500/3: invasive carcinoma of no special type	8188 ↗
<input type="checkbox"/>	9861/3: acute myeloid leukemia, nos	2831 ↗
<input type="checkbox"/>	8070/3: squamous cell carcinoma, nos	2443 ↗
<input type="checkbox"/>	9440/3: glioblastoma, nos	2294 ↗
<input type="checkbox"/>	9823/3: b-cell chronic lymphocytic leukemia/small lymphocytic lymphoma	2114 ↗
<input type="checkbox"/>	9470/3: medulloblastoma, nos	2052 ↗
<input type="checkbox"/>	9835/3: acute lymphoblastic leukemia, nos	1789 ↗
<input type="checkbox"/>	8010/3: carcinoma, nos	1430 ↗
<input type="checkbox"/>	8720/3: malignant melanoma, nos	1405 ↗
<input type="checkbox"/>	9500/3: neuroblastoma, nos	1333 ↗
<input type="checkbox"/>	small cell carcinoma	1195 ↗
<input type="checkbox"/>	clear cell renal cell carcinoma	1095 ↗
<input type="checkbox"/>	large cell lymphoma, nos	1044 ↗
<input type="checkbox"/>	follicular lymphoma, nos	867 ↗

UID	SERIESID	PMID	ICDMORPHOLOGYCODE	ICDTOPOGRAPHYCODE
GSM1000061	GSE36942	23457519	8070/3	C10
GSM1000062	GSE36942	23457519	8070/3	C10
GSM1001316	GSE40777	23571474	8070/3	C53
GSM1001317	GSE40777	23571474	8010/3	C34
GSM1001318	GSE40777	23571474	8070/3	C09
GSM1001319	GSE40777	23571474	8010/3	C34
GSM1002668	GSE40834	24047479	9823/3	C42
GSM1002669	GSE40834	24047479	9823/3	C42
GSM1002670	GSE40834	24047479	9823/3	C42
GSM1002671	GSE40834	24047479	9823/3	C42
GSM1002672	GSE40834	24047479	9823/3	C42
GSM1002673	GSE40834	24047479	9823/3	C42
GSM1002674	GSE40834	24047479	9823/3	C42
GSM1002675	GSE40834	24047479	9823/3	C42
GSM1002676	GSE40834	24047479	9823/3	C42
GSM1002677	GSE40834	24047479	9823/3	C42
GSM1002678	GSE40834	24047479	9823/3	C42
GSM1002679	GSE40834	24047479	9823/3	C42
GSM1002680	GSE40834	24047479	9823/3	C42

# ARRAYMAP (META)DATA PIPELINE



Automagical Processing Engine™

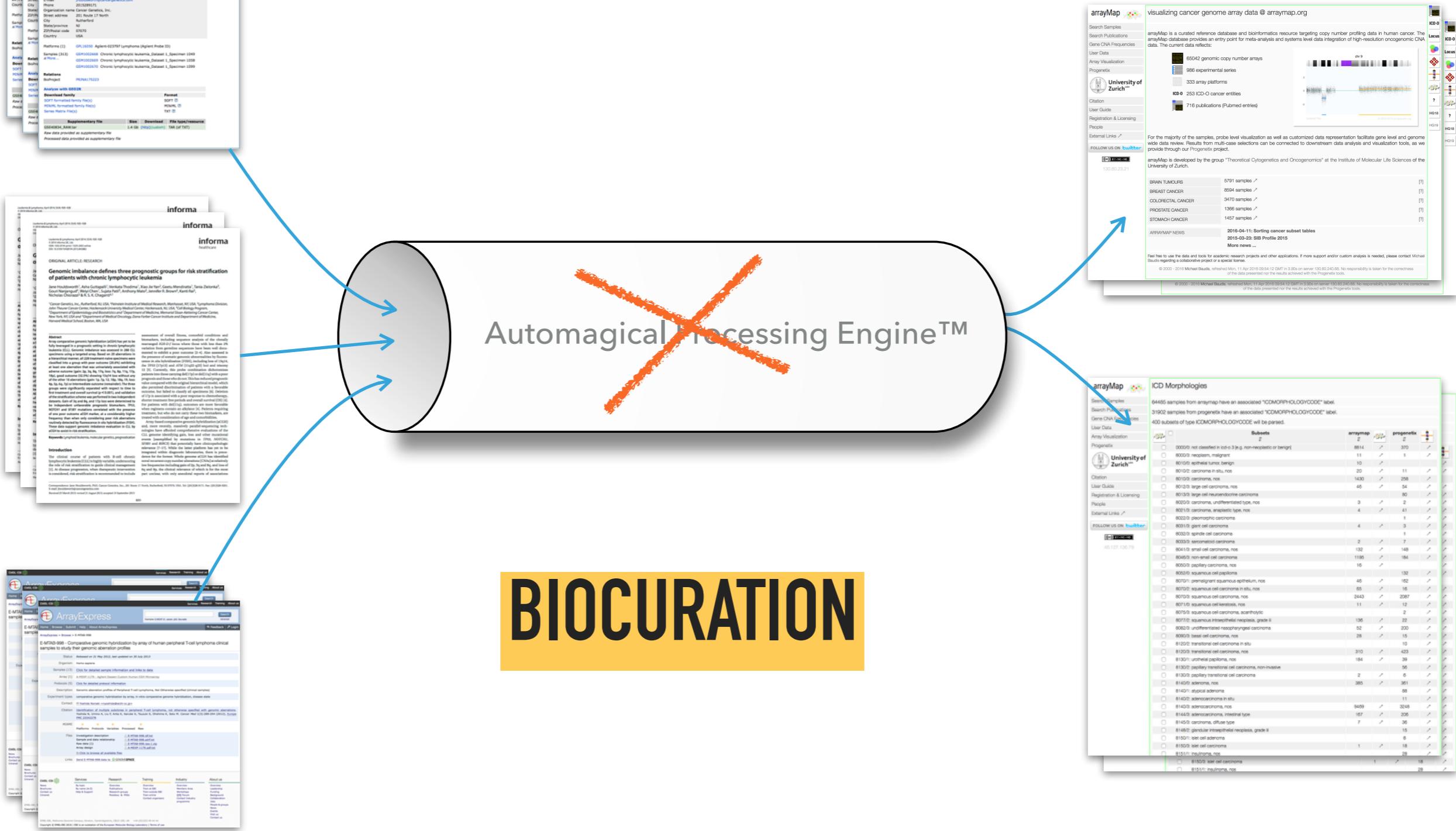


arrayMap

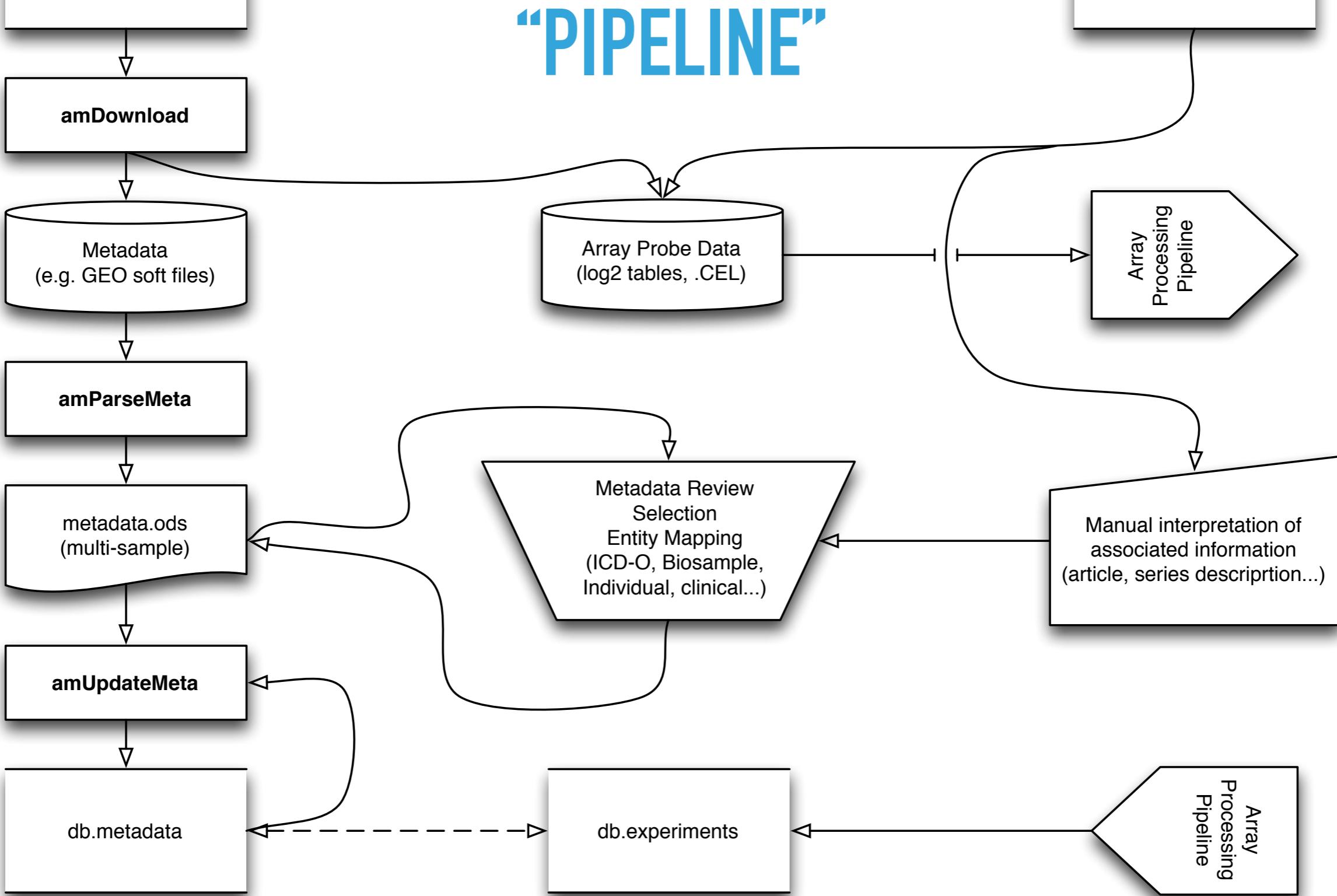


# ARRAYMAP (META)DATA

# “PIPELINE”



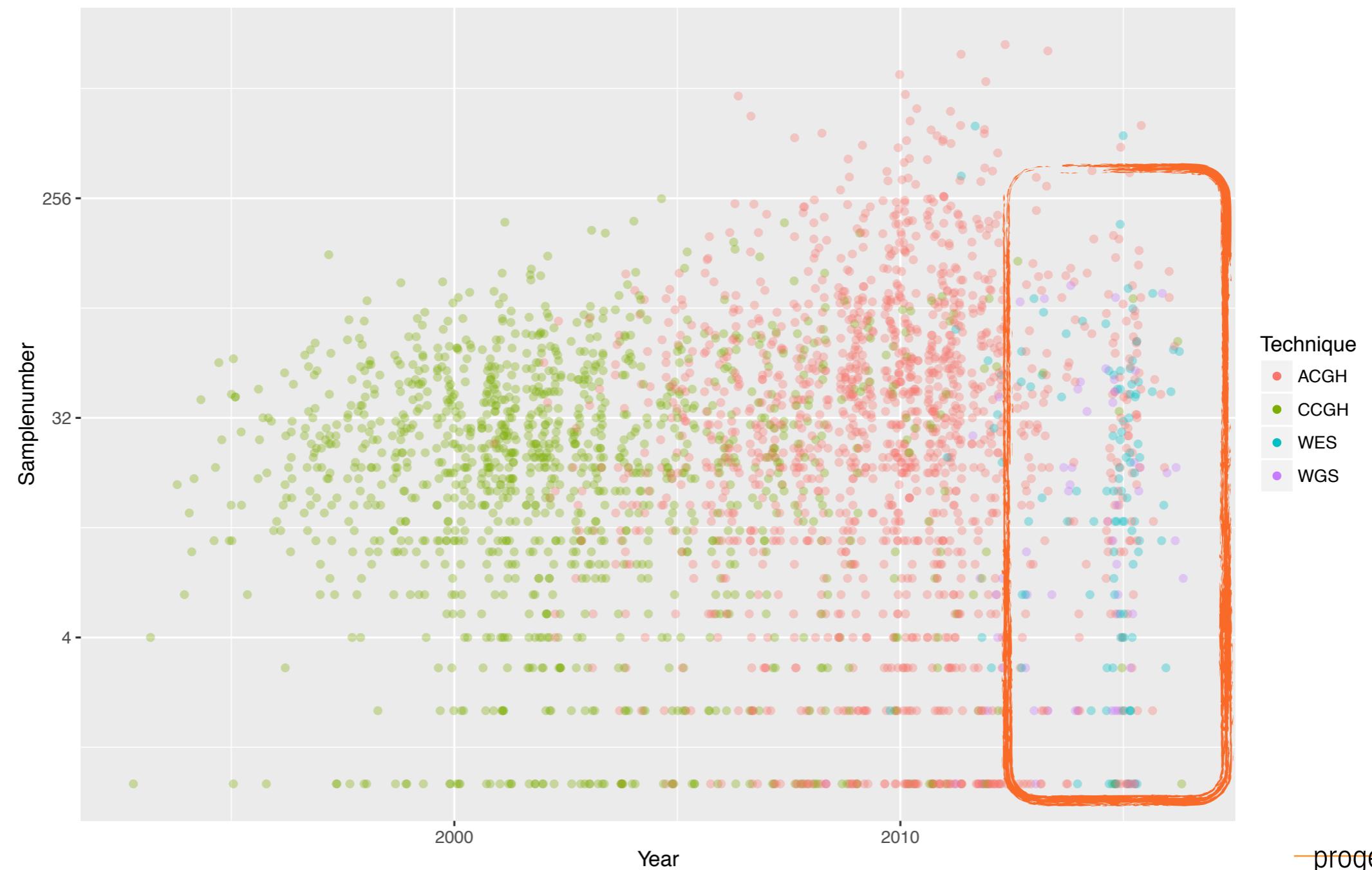
# ARRAYMAP (META)DATA



# THE PUBLICATION LANDSCAPE OF WHOLE GENOME SCREENING IN CANCER

## SHIFT TO SEQUENCING BASED TECHNIQUES LEADS TO SEVERELY LIMITED DATA ACCESSIBILITY

Cancer Samples per Publication for Different Techniques  
[129417 samples from 2747 publications]



A large, dark background image showing a perspective view of many DNA double helix molecules, creating a sense of depth and scale.

**Genomics API**

Learn how the Genomics API is advancing information sharing for DNA data providers and consumers on a global scale and get involved in further development.

→ [Genomics API](#)

○ ○ ●

## Our Work

The diverse members of the Global Alliance are working together to create interoperable approaches to catalyze projects that will help unlock the great potential of genomic data. Our four [Working Groups](#) advance [Initiatives](#) that develop key [Work Products](#).

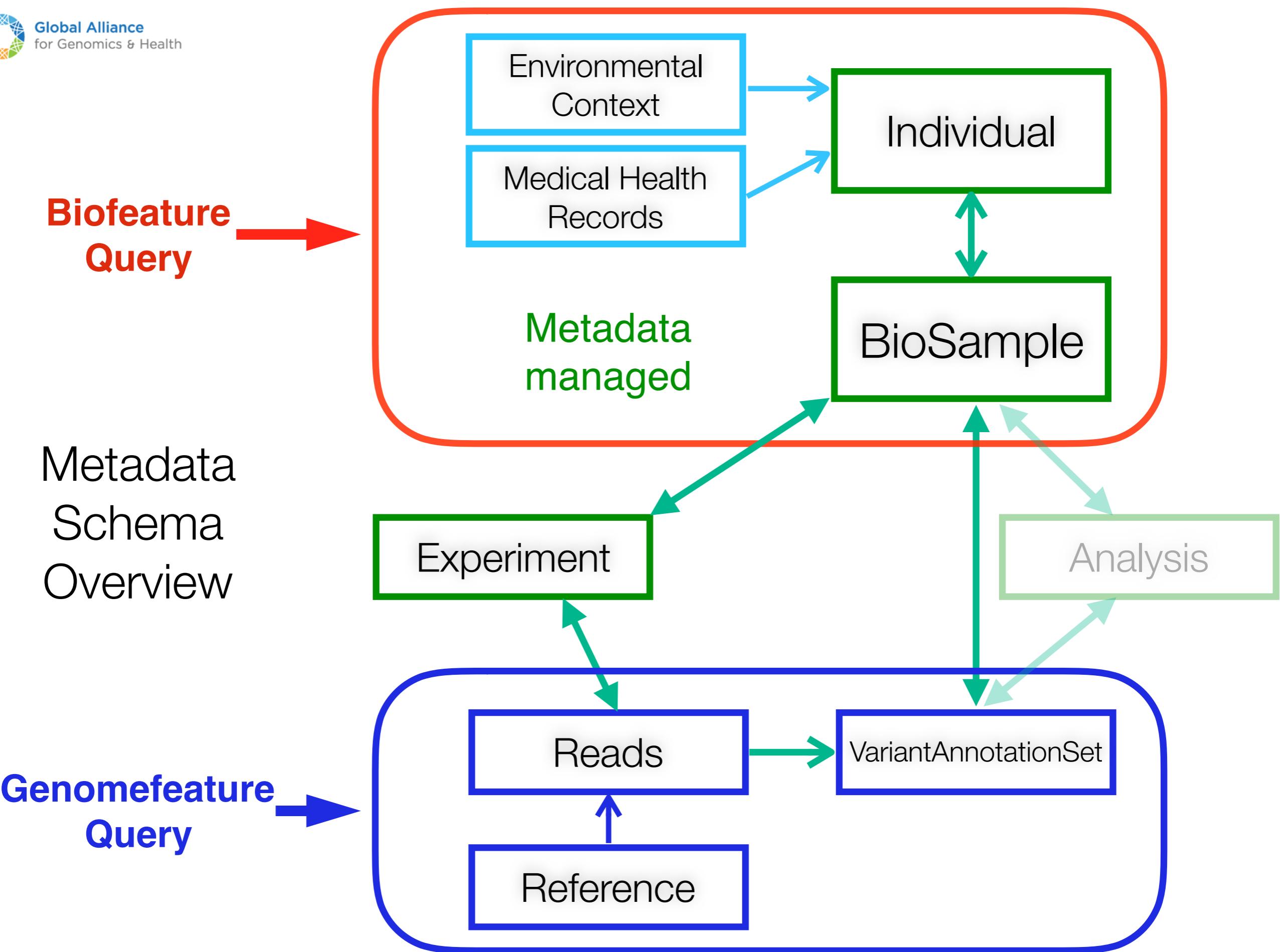
# GA4GH API promotes sharing



The mission of the Global Alliance for Genomics and Health is to accelerate progress in human health by helping to establish a **common framework** of harmonized approaches to enable **effective and responsible** sharing of **genomic and clinical data**, and by catalyzing data sharing projects that drive and demonstrate the value of data sharing.

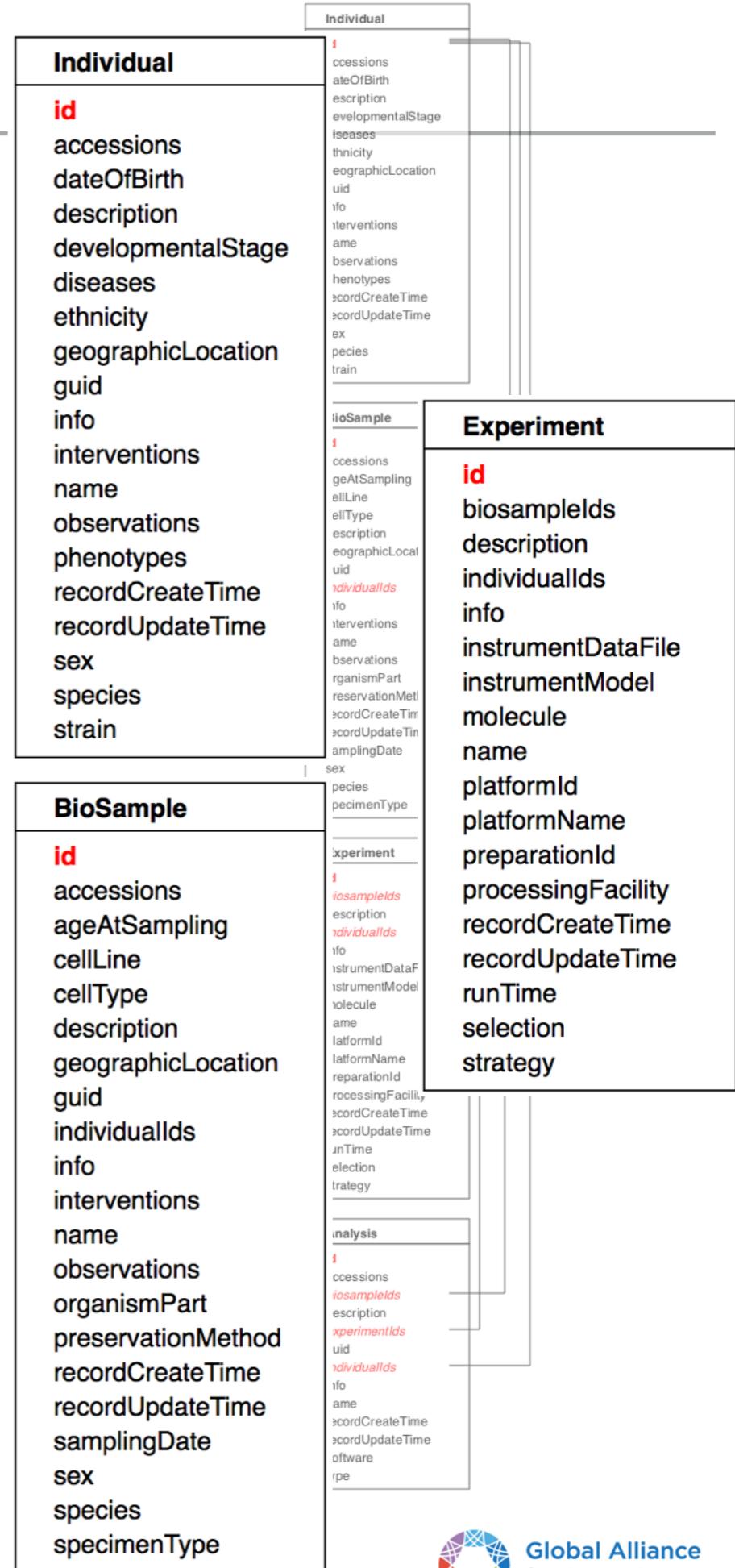
# GA4GH DATA ANNOTATION PRINCIPLES

- ▶ Ontologies
  - ▶ limited use of named attributes
  - ▶ “OntologyTerm” object type as core for biological and experimental features
- ▶ External standards
  - ▶ ISO8601 time formats
- ▶ GA4GH managed standards
  - ▶ maintenance of core sequence file and data formats (VCF, BAM ...) through affiliate partners/members of the Data Working Group



## METADATA SCHEMA - “BIODATA” OBJECTS

- ▶ *Individual* (i.e., basic biological entity) and *BioSample* (e.g. micro dissected part of a tissue biopsy, environmental sample) are the basic “Bioobjects”
- ▶ *Experiment* describes the technical procedures used in the analysis of (an aliquot) of the *BioSample*
- ▶ *Analysis* may be used to store “interpreted” results of an experiment
- ▶ *VariantAnnotationSet* and other low-level analyses reference *Individual*, *Biosample*, *Experiment* for feature inheritance

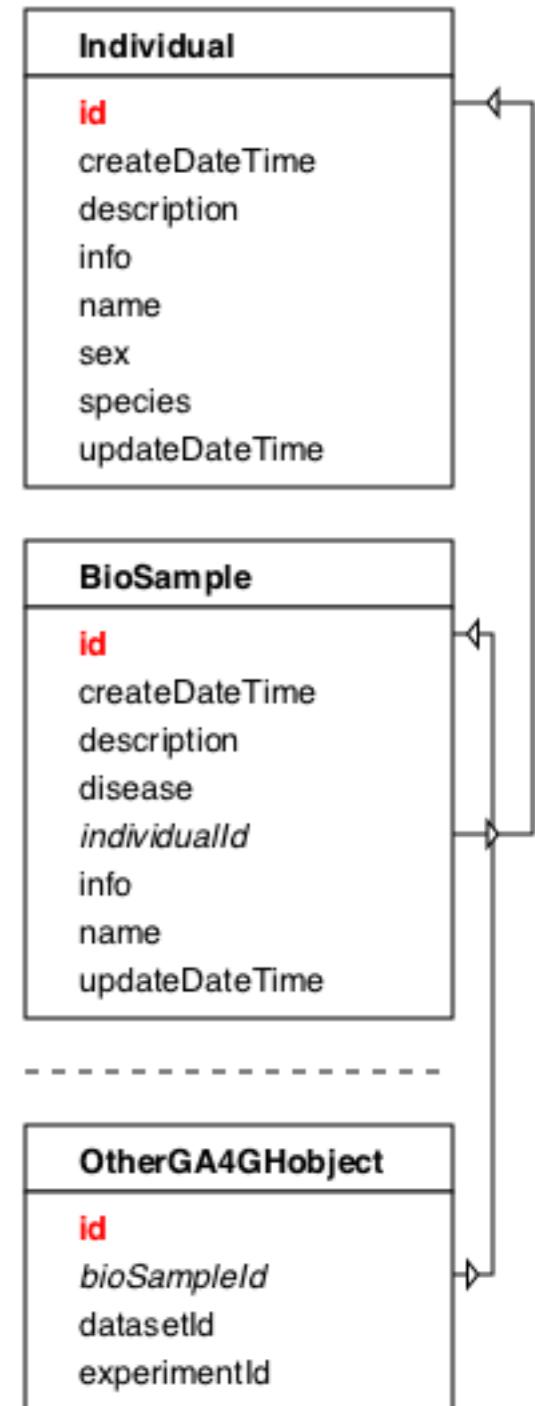


## OBJECT ANNOTATIONS

---

# ONTOLOGYTERM IN THE GA4GH SCHEMA – CURRENT STATUS

```
/**  
An ontology term describing an attribute. (e.g. the phenotype attribute  
'polydactyly' from HPO)  
*/  
record OntologyTerm {  
    /**  
    Ontology source identifier - the identifier, a CURIE (preferred) or PURL for an  
    ontology source e.g. http://purl.obolibrary.org/obo/hp.owl  
    It differs from the standard GA4GH schema's "id" in that it is a URI pointing to  
    an information resource outside of the scope of the schema or its implementation.  
    */  
    string id;  
  
    /* Ontology term - the representation the id is pointing to.*/  
    union { null, string } term = null;  
  
    /**  
    Ontology source name - the name of ontology from which the term is obtained  
    e.g. 'Human Phenotype Ontology'  
    */  
    union { null, string } sourceName = null;  
  
    /**  
    Ontology source version - the version of the ontology from which the OntologyTerm  
    is obtained; e.g. 2.6.1. There is no standard for ontology versioning and some  
    frequently released ontologies may use a datestamp, or build number.  
    */  
    union { null, string } sourceVersion = null;  
}
```



# BIOFEATURE OBJECTS AS ONTOLOGY WRAPPERS?

```
"bioFeatures": [  
    {  
        "description": "squamous cell carcinoma, base of tongue, stage 2",  
        "ageAtObservation": "P56Y6M",  
        "timeOfObservation": "2015-03-24T15:23:00Z",  
        "updateDateTime": "2016-04-14T09:02:00Z",  
        "ontologyTerms": [  
            {  
                "ontologyId": "http://purl.obolibrary.org/obo/DOID_0050865",  
                "term": "tongue squamous cell carcinoma",  
                "sourceName": "disease_ontology",  
                "sourceVersion": "2016-01-25"  
            },  
            {  
                "ontologyId": "http://purl.obolibrary.org/obo/UBERON_0006919",  
                "term": "tongue squamous epithelium",  
                "sourceName": "Uberon multi-species anatomy ontology",  
                "sourceVersion": "2016-01-25"  
            },  
            {  
                "ontologyId": "http://purl.obolibrary.org/obo/UBERON_0010033",  
                "term": "posterior part of tongue",  
                "sourceName": "Uberon multi-species anatomy ontology",  
                "sourceVersion": "2016-01-25"  
            },  
        ],  
    }  
]
```

We're sorry but something has gone wrong. We have been notified of this error.

# ONTOLOGIES YOU CAN TRUST?

NPEx NLMC THIS X-Lab

**NPE**

**SNOMED CT Browser**  
UK Clinical Edition April 2016

[Concept Search](#)  
[About SNOMED-CT](#)

You have searched for: medulloblastoma  
[Go back to search results](#)

- Disorder of brain
- Glioma (disorder)
- Neuroendocrine tumor (disorder)
- Primary malignant neoplasm

**Name:** Medulloblastoma See more descriptions.  
**Concept ID:** 443333004  
**Read Code:** XUjPT  
**ICD-10 Codes:** C716

- Classic medulloblastoma
- Medulloblastoma of cerebellum (disorder)

# ONTOLOGIES YOU CAN TRUST?

NPEx NLMC THIS X-Lab

You have searched for: medulloblastoma  
[Go back to search results](#)

NPEx NLMC THIS X-Lab

**SNOMED CT Browser**  
UK Clinical Edition April 2016  
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[About SNOMED-CT](#)

**NPEx**  
**SNOMED CT Browser**  
UK Clinical Edition April 2016  
[Concept Search](#)  
[About SNOMED-CT](#)

Name: Medulloblastoma  
Concept ID: 255046005  
Read Code: X78dr  
ICD-10 Codes: D357 C755 D355 C759 C751 D440 C754 D351 D446 D448 C798 D356 D358 C753 C752 D352 C750 D443 D359 D354 C758 D445 D093 D353 D350 D442 D444 D441 D449 D447

**Neoplastic disease**

**Name:** Neuroendocrine tumor (disorder) See more descriptions.  
**Concept ID:** 255046005  
**Read Code:** X78dr  
**ICD-10 Codes:** D357 C755 D355 C759 C751 D440 C754 D351 D446 D448 C798 D356 D358 C753 C752 D352 C750 D443 D359 D354 C758 D445 D093 D353 D350 D442 D444 D441 D449 D447

- + [Apudoma \(disorder\)](#)
- + [Benign neuroendocrine tumor \(disorder\)](#)
- + [Carcinoid tumour](#)
- + [Extra-adrenal paraganglioma \(disorder\)](#)
- + [Gastrointestinal hormone-secreting endocrine tumor \(disorder\)](#)
- + [Malignant neuroendocrine tumor \(disorder\)](#)
- + [Malignant pheochromocytoma \(disorder\)](#)
- + [Medulloblastoma](#)
- + [Neuroblastoma](#)
- [Neuroendocrine neoplasm of larynx](#)
- + [Neuroendocrine neoplasm of lung \(disorder\)](#)
- [Olfactory neuroblastoma](#)
- + [Paraganglioma \(disorder\)](#)
- + [Primitive neuroectodermal tumour](#)
- [Retinoblastoma](#)
- [Somatostatinoma \(disorder\)](#)

...  
+ [... \(disorder\)](#)  
+ [... \(disorder\)](#)

# ONTOLOGIES YOU CAN TRUST?

NPEx NLMC THIS X-Lab

**NPEx**

SNOMED CT Browser  
UK Clinical Edition April 2016  
Concept Search  
About SNOMED-CT

You have searched NPEx NLMC THIS X-Lab  
Go back to search results

Disorder of Glioma (disorder)  
Neuroendocrine tumor (disorder)  
Primary malignant glioma (disorder)

**NPEx**

SNOMED CT Browser  
UK Clinical Edition April 2016

**Name:** Medulloblastoma  
**Concept ID:** 101400004  
**Read Code:** X0J1  
**ICD-10 Codes:** C716

Classic medulloblastoma  
Medulloblastoma of cerebellum

ICD-10 Codes: C716

Medulloblastomas are

- embryonal
- neuroepithelial
- brain
- neoplasias

NPEx NLMC THIS X-Lab

**NPEx**

SNOMED CT Browser  
UK Clinical Edition April 2016  
Concept Search  
About SNOMED-CT

Neoplastic disease

**Name:** Neuroendocrine tumor (disorder)  
**Descriptions:** See more descriptions.  
**Concept ID:** 255046005  
**Read Code:** X78dr  
**ICD-10 Codes:** D357 C755 D355 C753 D446 D448 C798 D356 D358 C753 C759 D354 C758 D445 D093 D353 D449 D447

+ Apudoma (disorder)  
+ Benign neuroendocrine tumor  
+ Carcinoid tumour  
+ Extra-adrenal paraganglioma  
+ Gastrointestinal hormone-secreting tumour  
+ Malignant neuroendocrine tumour  
+ Malignant pheochromocytoma  
+ Medulloblastoma  
+ Neuroblastoma  
+ Neuroendocrine neoplasm of lung  
+ Neuroendocrine neoplasm of other sites  
+ Olfactory neuroblastoma  
+ Paraganglioma (disorder)  
+ Primitive neuroectodermal tumour  
+ Retinoblastoma  
+ Somatostatinoma (disorder)

**Name:** Glioma (disorder) See more descriptions.  
**Concept ID:** 393531001  
**Read Code:** .B1M5  
**ICD-10 Codes:** C719

+ Anaplastic astrocytoma of central nervous system (disorder)  
+ Dysembryoplastic neuroepithelial tumor (disorder)  
+ Ependymoma  
+ Glioblastoma multiforme (disorder)  
+ Glioma of spinal cord (disorder)  
+ Intracranial glioma (disorder)  
+ Malignant glioma of central nervous system (disorder)  
+ Malignant glioma of eye  
+ Medulloblastoma  
+ Mixed glioma  
+ Oligodendrogioma  
+ Optic glioma  
+ Primary malignant astrocytoma of central nervous system (disorder)  
+ Primitive neuroectodermal tumour

... BUT NOT GLIOMAS & MOST CERTAINLY NOT A NEUROENDOCRINE TUMOURS

Source:www.snomedbrowswer.com

## ONTOLOGIES ARE RARELY USED IN CASE REPORTING

- ▶ Medical practice relies on established, slow moving classification systems.
- ▶ Medical diagnoses consist of an abundance of observations and classification items.
- ▶ We do not have (never will?) enough ontology concepts for detailed disease descriptions (Where to stop?)
- ▶ Relationships may help - but how to do them uniformly?

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- ▶ Relationships may help - but how to do them uniformly?

**THE GOLD STANDARD FOR A MEDICAL DIAGNOSIS IS STILL WELL WRITTEN PROSE.**

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## CORE PROBLEMS AND CONCEPTS TO BE ADDRESSED

- ▶ suitability of **ontologies as core of metadata** features for federated data mining
- ▶ mapping ontologies: **WHO** and **HOW**
- ▶ identification of essential non-OT attributes and stable definition using internationally accepted standards
- ▶ development of a strategy for implementation of **ontology based data annotations for reference data resources**, e.g. Elixir, EBI, SIB ...



### DRIVING GA4GH METADATA SCHEMA

#### ▶ arrayMap for GA4GH

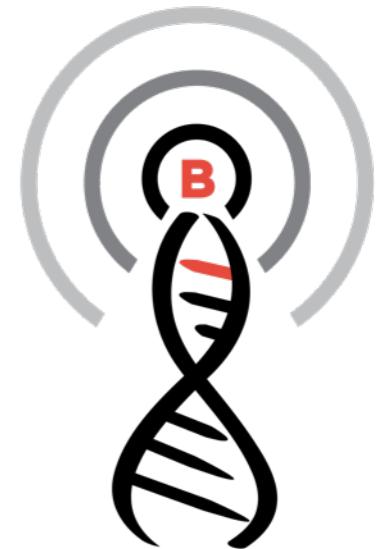
- metadata schema development through implementation of arrayMap resource data
- testing of OntologyTerm object for covering biodata
- implementation using EMBL-EBI  ontology services



### DRIVING BEACON DEVELOPMENT

#### ▶ Beacon<sup>+</sup>

- CNV/CNA as first type of structural variants
- disease specific queries
- quantitative reporting



## DRIVING GA4GH METADATA SCHEMA



### arrayMap for GA4GH

- metadata schema development through implementation of arrayMap resource data
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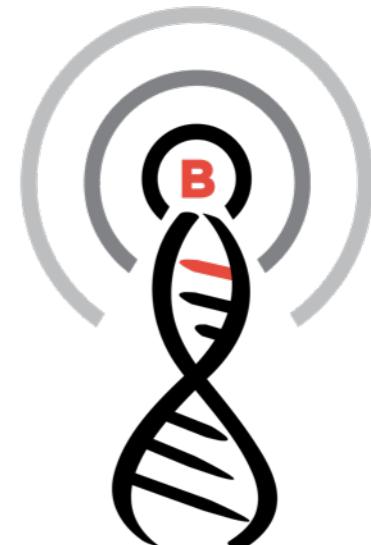


## DRIVING BEACON DEVELOPMENT



### Beacon<sup>+</sup>

- CNV/CNA as first type of structural variants
- disease specific queries
- quantitative reporting



# MAPPING ARRAYMAP TO GA4GH TRANSITIONAL

```
[  
  {  
    "individuals" : [  
      {  
        "createDateTime" : "2015-01-01T12:00:00Z",  
        "id" : "AM_IND_18769486_MB0262",  
        "sex" : {  
          "ontologyId" : "http://purl.obolibrary.org/obo/PATO_0020001",  
          "sourceName" : "Ontology: PATO (Phenotypic quality)"  
        },  
        "species" : {  
          "ontologyId" : "http://purl.obolibrary.org/obo/NCBITaxon_9606",  
          "sourceName" : "NCBITaxon Ontology"  
        },  
        "updateDateTime" : "2016-04-13T18:51:01Z"  
      }  
    ]  
  },  
  {  
    "biosamples" : [  
      {  
        "ageAtSampling" : "P14Y",  
        "createTime" : "2015-01-01T12:00:00Z",  
        "diagnosis" : {  
          "description" : "medulloblastoma [classic]",  
          "ontologyTerms" : [  
            {  
              "ontologyId" : "http://purl.bioontology.org/ontology/SNMI/M-94703",  
              "sourceName" : "Systematized Nomenclature of Medicine, International Version",  
              "term" : "Medulloblastoma, NOS"  
            },  
            {  
              "ontologyId" : "http://purl.bioontology.org/ontology/SNMI/M-94703",  
              "sourceName" : "Systematized Nomenclature of Medicine, International Version",  
              "term" : "Medulloblastoma, NOS"  
            }  
          ]  
        }  
      }  
    ]  
  }]
```

# Beacon ArrayMap

First Prototype of a Beacon v0.2 implementation for ArrayMap.

See [documentation](#) and [open questions](#).

<b>Chromosome</b>	11
<b>Position</b>	34439881
<b>Reference</b>	GRCh38
<b>Dataset</b>	(8070/3) squamous cell carcinoma, nos
<b>Variant Class</b>	DEL (Deletion)

[http://beacon-arraymap.vital-it.ch/v0.2/query?  
chromosome=11&position=34439881&reference=GRCh38&dataset=8070/3&variantClass=DEL](http://beacon-arraymap.vital-it.ch/v0.2/query?chromosome=11&position=34439881&reference=GRCh38&dataset=8070/3&variantClass=DEL)

<http://beacon-arraymap.vital-it.ch/info>

[http://beacon-arraymap.vital-it.ch/v0.3/query?  
referenceName=11&start=34439881&assemblyId=GRCh38&datasetIds=8070/3&variantClass=DEL](http://beacon-arraymap.vital-it.ch/v0.3/query?referenceName=11&start=34439881&assemblyId=GRCh38&datasetIds=8070/3&variantClass=DEL)

```
{  
  "query": {  
    "referenceName": "11",  
    "start": "34439881",  
    "assemblyId": "GRCh38",  
    "datasetIds": "8070/3"  
  },  
  "response": {  
    "exists": "overlap",  
    "info": "ok",  
    "error": null,  
    "observed": 57,  
    "NOT_BEACON_ARRAYMAP_DEBUG_INFO": {  
      "matchedSegments": [  
        {  
          "matchedSampleUID": "GSM675751",  
          "matchedDataSet": "8070/3",  
          "matchedSegment": {  
            "SEGSTART": 232718,  
            "SEGSOURCE": "aCGH",  
            "CHRO": "11",  
            "SEGSIZE": 134462435,  
            "SEGVALUE": -0.2637,  
            "SEGTYPE": -1,  
            "SEGSTOP": 134695153  
          }  
        }  
      ],  
      ...  
    },  
    "NOT_BEACON_totalInDataSet": 0  
  }  
}
```

Heinz Stockinger, Séverine Duvaud & SIB Technology Group

NI AI  
MICHAEL BAUDIS  
(HAOYANG CAI)  
PAULA CARRIO CORDO  
LINDA GROB  
SAUMYA GUPTA  
(NITIN KUMAR)  
ALESSIO MILANESE

ANTHONY BROOKES  
MARK DIEKHANS  
MELISSA HAENDEL  
SARAH HUNT  
STEPHEN KEENAN  
SUZY LEWIS  
DAVID LLOYD  
MICHAEL MILLER  
HELEN PARKINSON  
ELEANOR STANLEY  
DAVID STEINBERG

SIB

HEINZ STOCKINGER  
SÉVERINE DUVAUD  
VASSILIOS IOANNIDIS  
DANIEL TEIXEIRA

ELIXIR & CRG

JORDI RAMBLA DE ARGILA  
SABELA DE LA TORRE PERNAS  
SUSANNA REPO



## RANDOM LINKS

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- ▶ [arraymap.org](http://arraymap.org)
- ▶ [beacon-arraymap.vital-it.ch](http://beacon-arraymap.vital-it.ch)
- ▶ [github.com/ga4gh/schemas/tree/metadata](https://github.com/ga4gh/schemas/tree/metadata)
- ▶ [www.progenetix.org/publications/](http://www.progenetix.org/publications/)
- ▶ [wiki.progenetix.org](http://wiki.progenetix.org)
- ▶ [ga4ghdata.org](http://ga4ghdata.org)
- ▶ [ga4ghdata.org/Sites/github/ga4gh/biosample/html/api/biodata.html](http://ga4ghdata.org/Sites/github/ga4gh/biosample/html/api/biodata.html)