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# Datenqualität in der Bioinformatik / Genomdaten

03.05.2018

Roland Eils

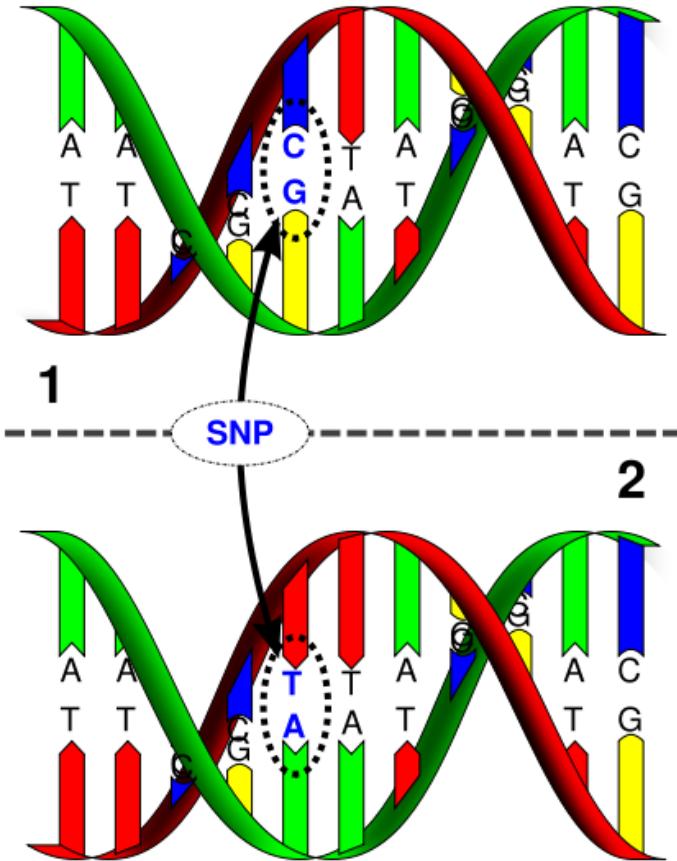
# Wir sind alle (fast) gleich



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# Variationen im humanen Genom



Individuen unterscheiden sich an jeder 1000. Position im Genom

Polymorphismen  
(vererbte Punktmutationen)

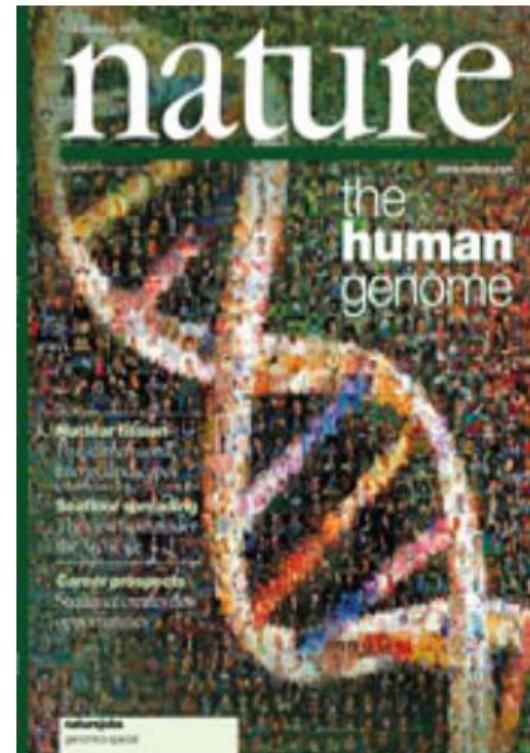
Somatische Varianten  
(erworbene Punktmutationen)

[http://www.science.marshall.edu/murraye/341/Images/416px-Dna-SNP\\_svg.png](http://www.science.marshall.edu/murraye/341/Images/416px-Dna-SNP_svg.png)

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# Evolution of Large-scale Genome Analysis

- 2000: Human genome working drafts
    - All data freely released
  - Project took about 10 years and cost about \$3 billion
- 
- 2008: Major genome centers can sequence the same number of base pairs as were produced for the HGP



**Every 16 hours**

~~Every day~~

~~Every 2.5 days~~

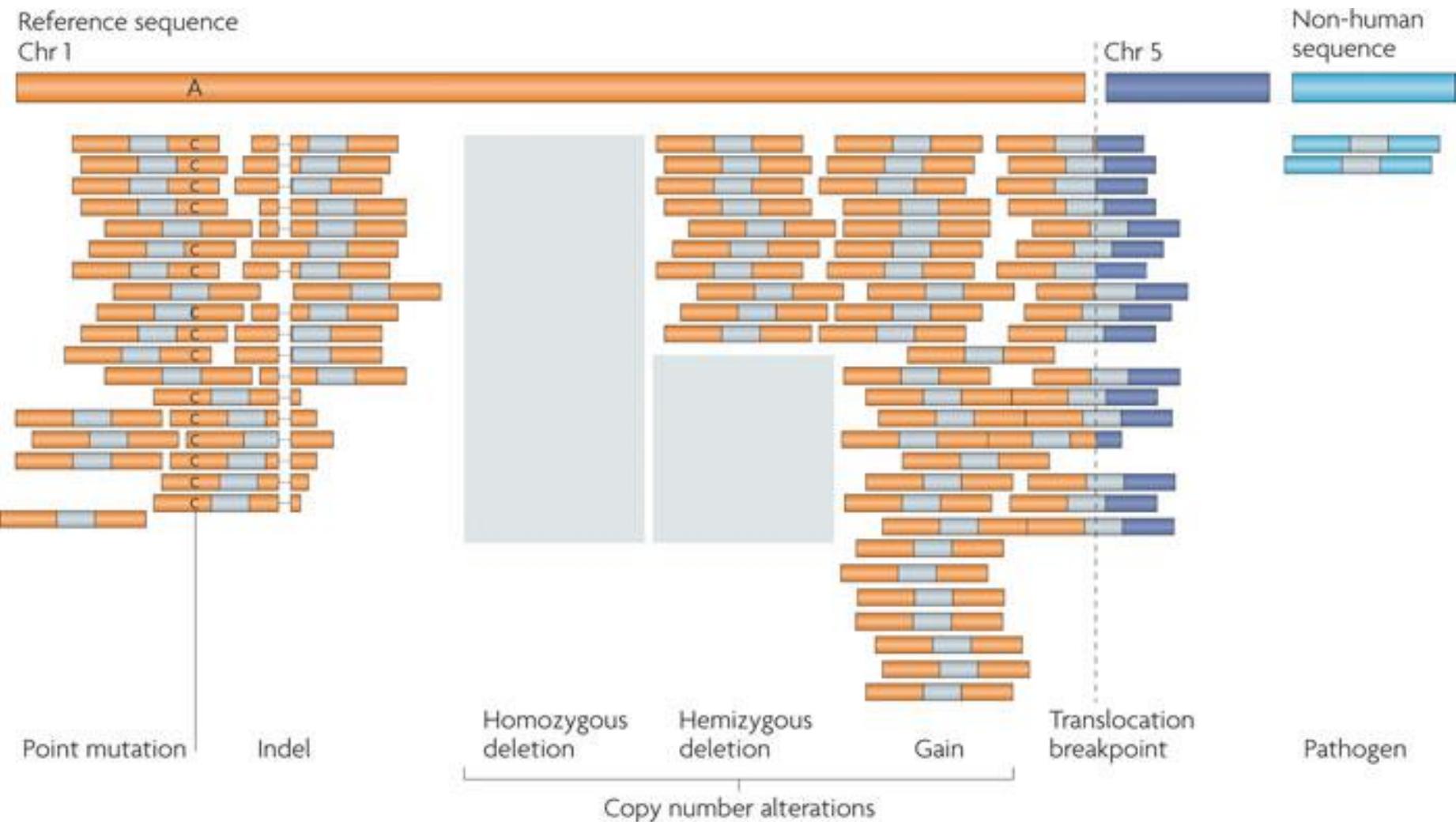
• ~~Every 4 days~~

**1000 Genomes**

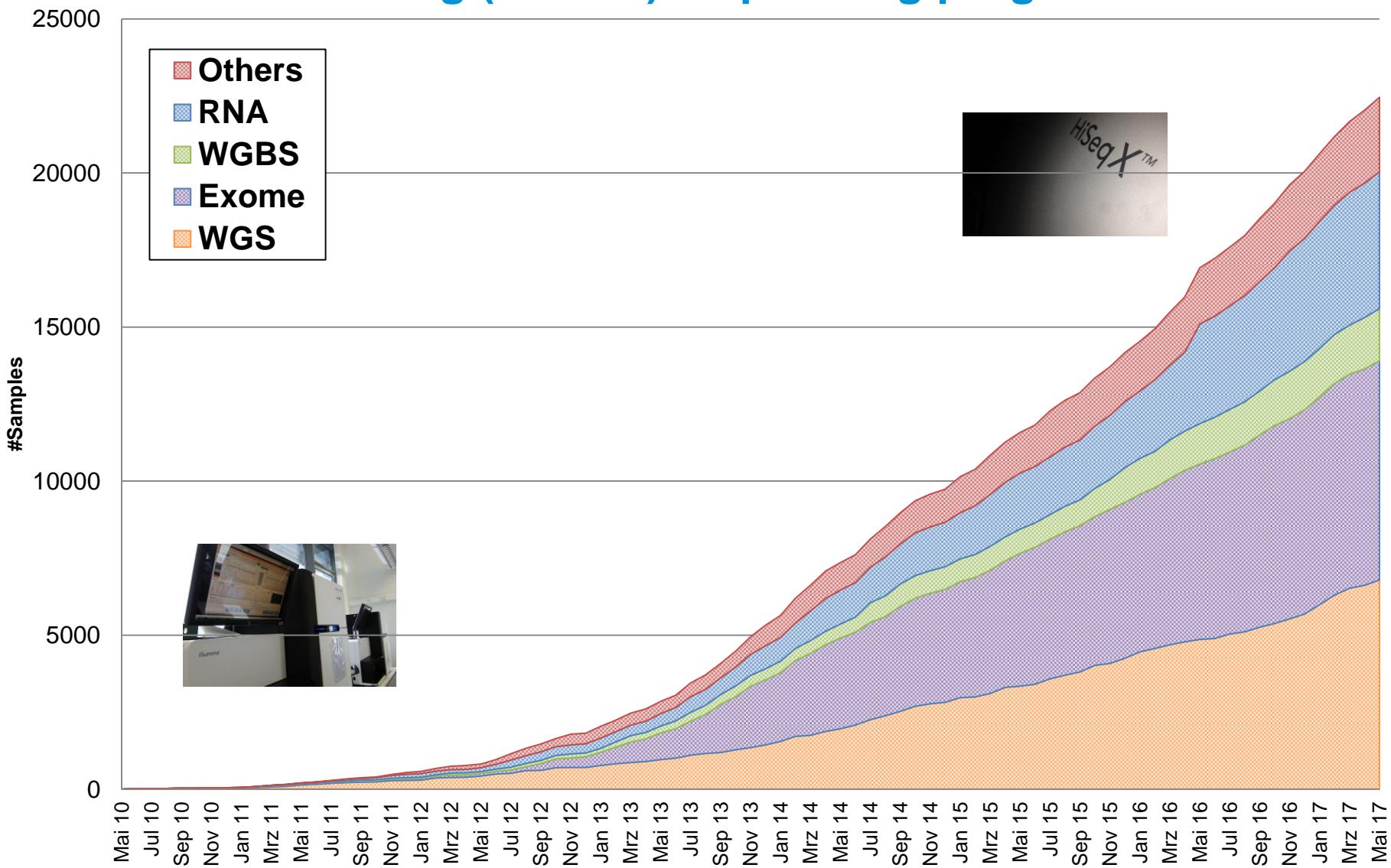
A Deep Catalog of Human Genetic Variation



# Varianten im Genom



# Number of Samples (approx. 25,000) sequenced in Heidelberg (clinical) sequencing program



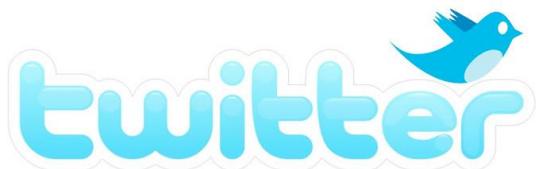
# Big Data in Genomics: eilslabs vs. Facebook



**600 Terabytes per day**

(Source: Vagata, P., & Wilfong, K. (2014). Scaling the Facebook data warehouse to 300 PB.

<https://code.facebook.com/posts/229861827208629/>



**12 Terabytes per day**

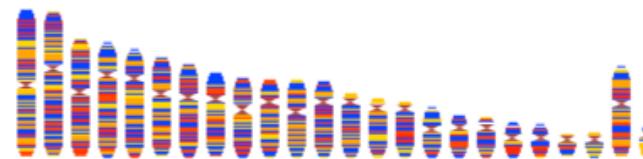
(Source: Zhao, L., Sakr, S., Liu, A., & Bouguettaya, A. (2014). Cloud Data Management, Springer)



**11 Terabytes per day**



# International Cancer Genome Consortium



<b>Brain Cancer</b> United States	
<b>Breast Cancer</b> European Union / United Kingdom 	
<b>Breast Cancer</b> France	
<b>Breast Cancer</b> United Kingdom	
<b>Chronic Lymphocytic Leukemia</b> Spain	
<b>Colon Cancer</b> United States	
<b>Gastric Cancer</b> China	
<b>Leukemia</b> United States	
<b>Liver Cancer</b> France	
<b>Liver Cancer</b> Japan	
<b>Lung Cancer</b> United States	
<b>ICGC Goal:</b> To obtain a comprehensive description of genomic, transcriptomic and epigenomic changes in 50 different tumor types and/or subtypes which are of clinical and societal importance across the globe.	
<b>90 projects committed</b>	
<b>Malignant Lymphoma</b> Germany	
<b>Oral Cancer</b> India	
<b>Ovarian Cancer</b> Australia	
<b>Ovarian Cancer</b> United States	
<b>Pancreatic Cancer</b> Australia	
<b>Pancreatic Cancer</b> Canada	
<b>Pediatric Brain Tumors</b> Germany	
<b>Prostate Cancer</b> Canada	
<b>Prostate Cancer</b> Germany	
<b>Rare Pancreatic Tumors</b> Italy	
<b>Renal Cancer</b> European Union / France 	



International network of cancer genome projects. *Nature* **464**, 993-998 (15 April 2010)

[HTML](#)

# What have we learnt so far?



## PedBrain Tumor

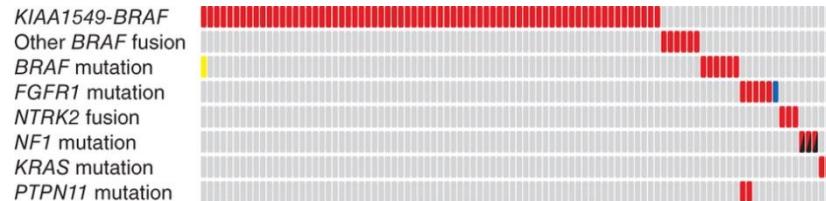
Dissecting the genomic complexity underlying medulloblastoma.

Nature 2012



Recurrent somatic alterations of FGFR1 and NTRK2 in pilocytic astrocytoma

Nature Genetics 2013



Decoding the regulatory landscape of medulloblastoma by methylation sequencing

Nature 2014

Comprehensive molecular profiling identifies novel drivers and subtypes underlying medulloblastoma

Nature 2017

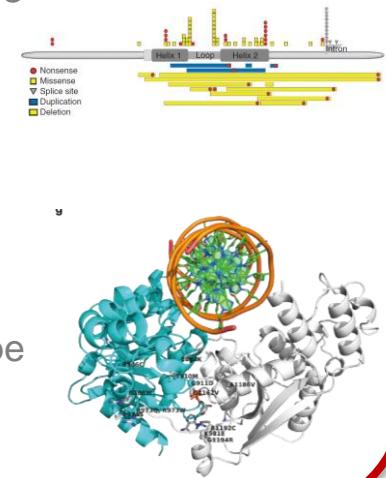
## Malignant Lymphoma

Recurrent mutation of the *ID3* gene in Burkitt lymphoma identified by integrated genome, exome and transcriptome sequencing.

Nature Genetics 2012

Linking differential DNA methylation in gene regions with the mutational landscape of Burkitt lymphoma

Nature Genetics 2015



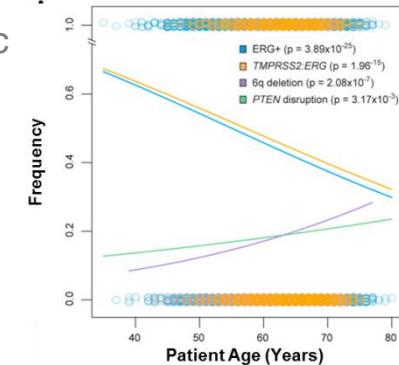
## Early Onset Prostate Carcinoma

Androgen driven somatic alteration landscape

Cancer Cell 2013

BAZ2A is involved in epigenetic alterations in prostate cancer

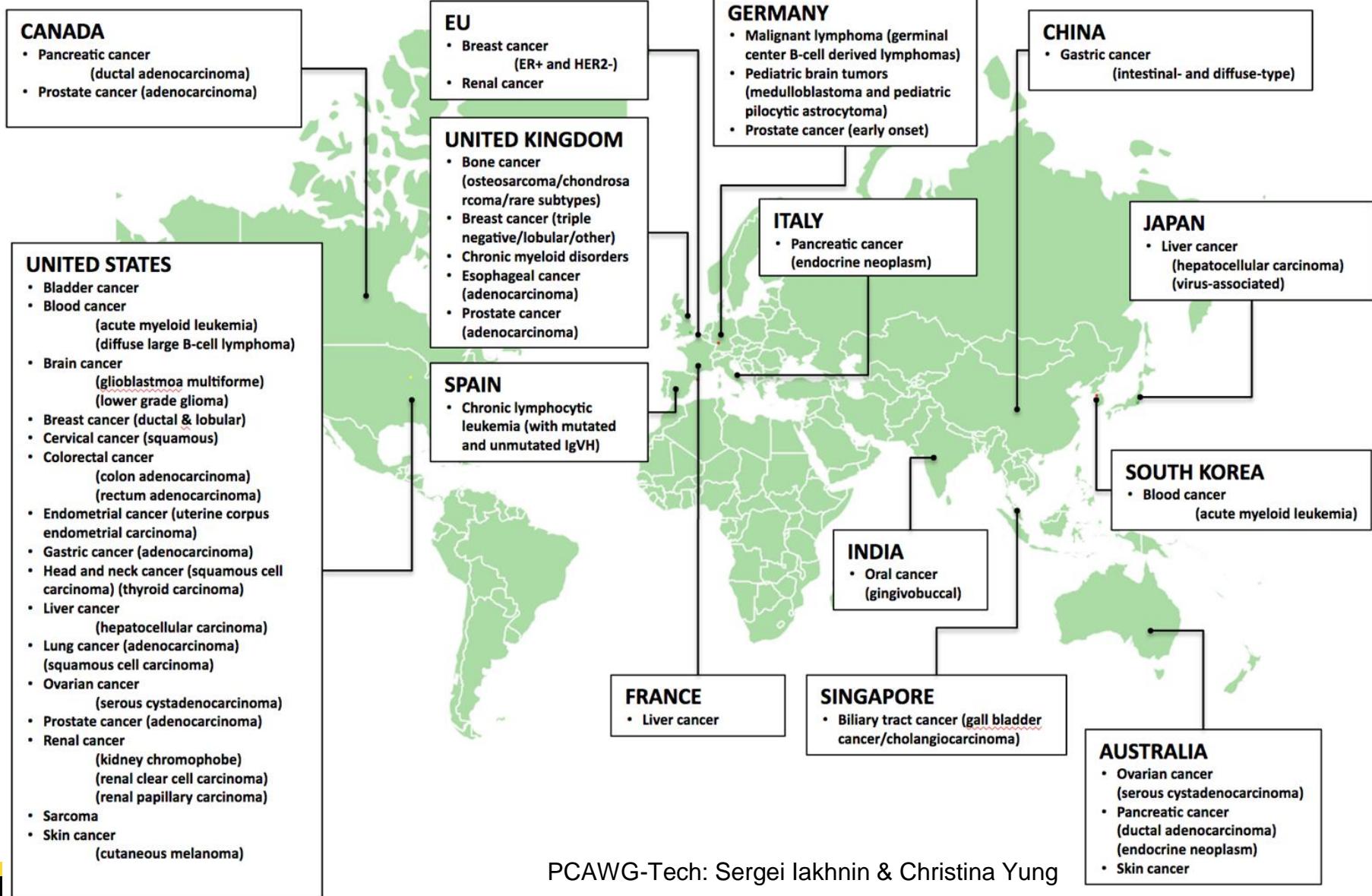
Nature Genetics, 2015



# Impact des ICGC-Projekts: >200 Publikationen

Jurisdiction	Publications
Germany	74
Spain	65
Japan	47
Canada	20
UK	8
France	4
Australia	4
Saudia Arabia	2
Singapore	1

# Weltweites PanCancer – Projekt: 2834 Tumorgenome aus 48 Projekten in 14 Rechtsgebieten, 20 primäre Krebstypen



PCAWG-Tech: Sergei Iakhnin & Christina Yung

# Technische Herausforderungen

- 2800 pairs of whole genomes amount to **~800TB raw data**
  - 1 WGS alignment & 3 core variant calling workflows

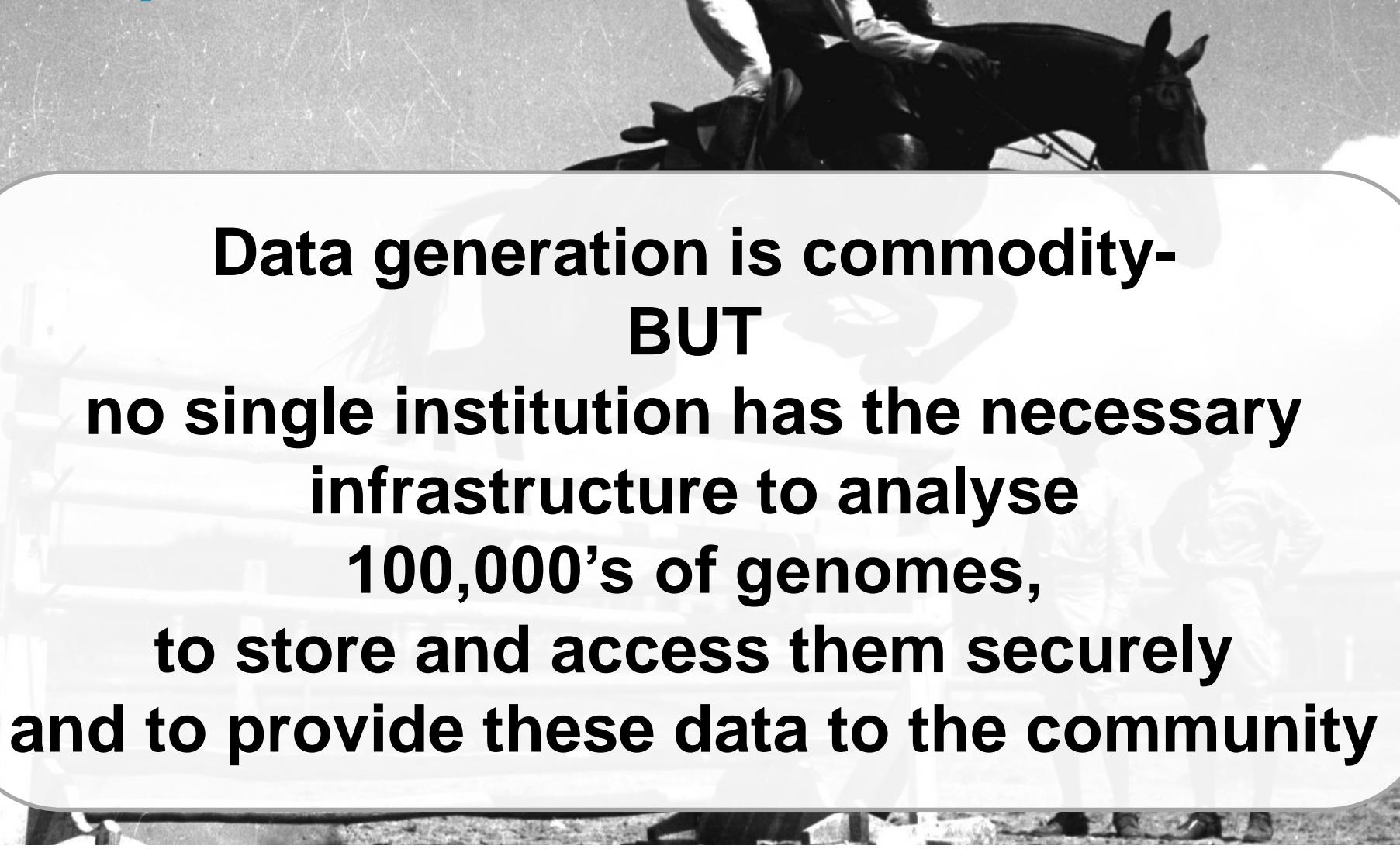
Workflow	Compute (Cores / RAM)	Average runtimes	Storage per donor
BWA-MEM alignment	8 / 16GB	5 days/specimen x 2	240GB
Sanger	8 / 32GB	4 days / donor	2GB
DKFZ/EMBL	16 / 64GB	2 days / donor	5GB
Broad	32 / 256GB	3 days / donor	35GB
Total per donor		19 days	282GB
<b>Total for 2800 donors</b>		<b>&gt;53,000 days (145 years)</b>	<b>~800TB (30 years HD movie)</b>

Over **700** researchers and **130** projects organized into **16** Research Working Groups.

PCAWG-Tech: Junjun Zhang

# The Challenge of Genomics Data Exploitation

DATA  
SCIENCE  
INNOVATION



**Data generation is commodity-  
BUT  
no single institution has the necessary  
infrastructure to analyse  
100,000's of genomes,  
to store and access them securely  
and to provide these data to the community**

# Ethical and legal issues related to genome clouds



UNIVERSITÄT HEIDELBERG | ZUKUNFT SEIT 1386



## Home

### Activities

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- Press Conference
- Symposium
- Lecture with Prof. Knoppers
- Opening with Prof. Bartram
- Publications

### Project Description

- Project Group
- Project Speaker
- Project Management
- Research Staff
- Associated Project Members

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- Ethical and Legal Issues
- Reports
- Research Centres and Networks

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## EURAT - Ethical and Legal Aspects of Whole Genome Sequencing



### NEWS

#### Comments on the Code

Prof. Rehmann-Sutter and Dr. Mahr discuss the EURAT-Code in a book chapter.

[Hyperlink](#) (August 2015)

#### On incidental findings

Members of the EURAT-group and other researchers register an absence of incidental findings in genomic research and discuss the consequences for the ethical debate.

[Hyperlink](#) (July 2015)

#### On big data

Genomics will be one of the largest data producers - EURAT-members Prof. von Kalle and Prof. Eils comment this development.

[Hyperlink](#) (July 2015)

#### On cloud-computing

## Position Paper (12.6.2013)

Cornerstones for an ethically and legally informed practice of whole genome sequencing

[http://www.uni-  
heidelberg.de/totalsequenzierung/english.html](http://www.uni-heidelberg.de/totalsequenzierung/english.html)



# Privacy Highlights



These "privacy highlights" provide an overview of some core components of our data handling practices. Please be sure to read our [full privacy statement](#).

1. We collect information when you register an account, self-report information through surveys, forms, features or applications, use our Services, upload your own content to our Services, use social media connections and features, refer your contacts to us, share information through various interactions with us and our partners, and via cookies and similar tracking technologies (see our [Cookie Policy](#)).
2. We use information in general (i) to provide, analyze and improve our Services, (ii) as we reasonably believe is permitted by laws and regulations, including for marketing and advertising purposes, (iii) to protect the security and safety of our company, employees, customers as we reasonably believe is permitted by laws and regulations, (iv) to comply with laws and regulations we are subject to, and (v) when you consent, for research purposes, the results of which could be used to develop therapeutics.

CONTINUE

# Increased Significance for Personalized Medicine

## NCT Master Workflow

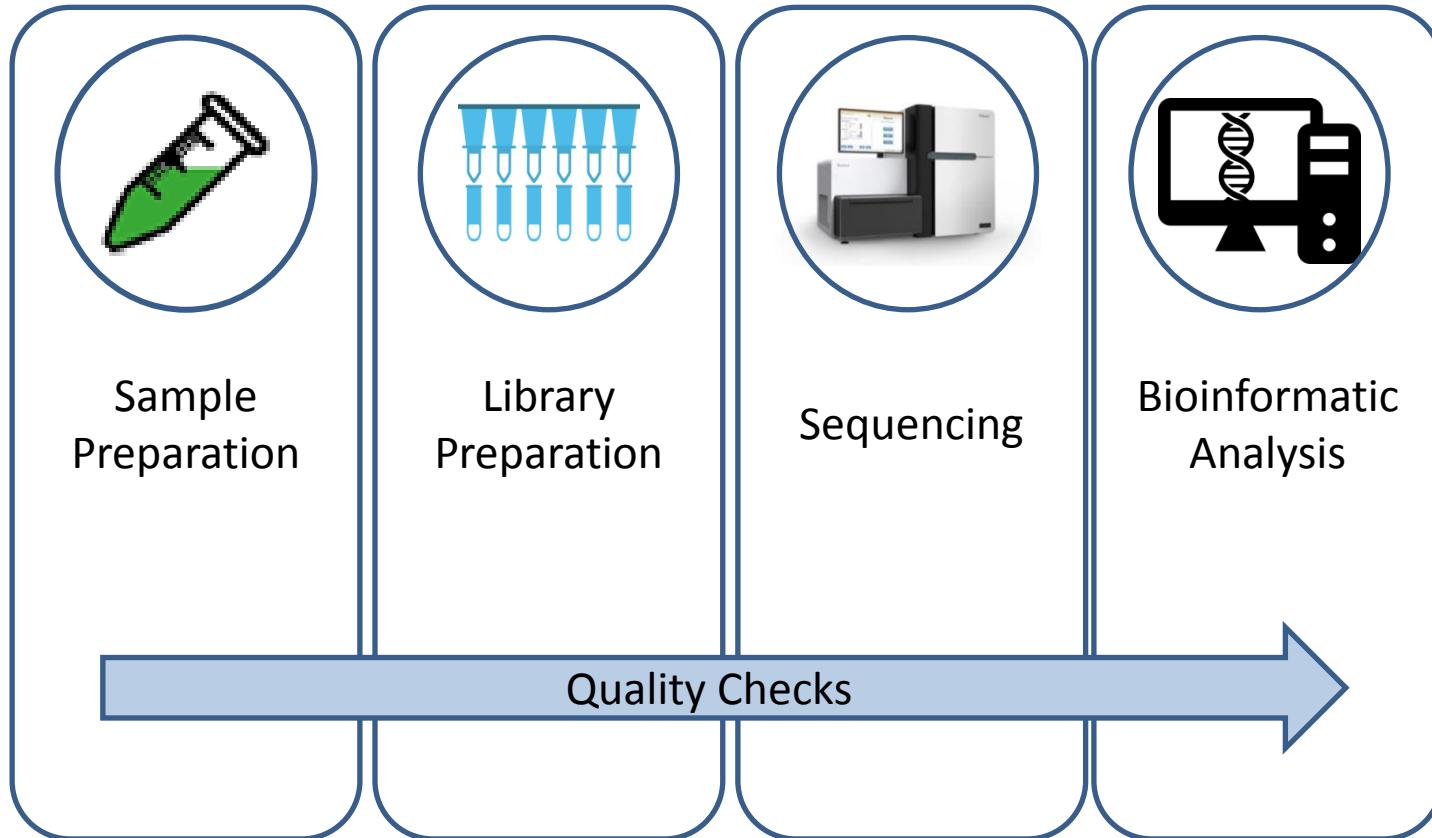
Patient enrolment	Sample assessment, asservation and processing	Molecular profiling and bioinformatics analysis	Clinical interpretation of molecular data	Validation of immediately actionable lesions	Molecular tumor board	Treatment
- Diagnosis - NCT MASTER consent	- Biopsy and blood withdrawal - Pathological diagnosis - Biobanking - Analyte extraction and QC	- Exome and transcriptome high throughput sequencing - SNVs, CNVs, indels - Fusions, expression - Germline (e.g. TP53, BRCA1)	- Literature research - Data quality assessment - Target identification - functional validation and further investigation of molecular results - continuously learning system - GUIDE	- Certified laboratory - Sanger sequencing, FISH, etc. - Target identification	- Clinicians, translational oncologists, bioinformaticians, scientists, case management - Reporting of important lesions - Suggestion for clinical action - Secondary validation	- Targeted therapy - Combination therapy - NCT MASTER trial - NCT IITS - N-of-1 Trial - SOC

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# Quality of NGS Data



All steps of the NGS workflow impact the data quality

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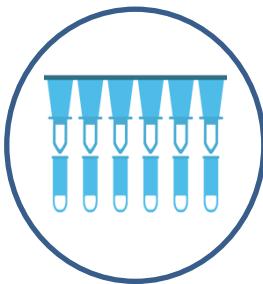
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und Forschung

# Impact on Data Quality



e.g.

- Tumor content, purity
- DNA quantity and quality
- Contamination
- Metadata labelling



e.g.

- Library concentration
- Barcode/adaptor errors
- PCR amplification errors

# Impact on Data Quality



e.g.

- Sequencing depth (coverage)
- Length of reads
- Duplication rate



e.g.

- Variant allele frequency
- Filtering (specificity, sensitivity)
- Reference genome used
- Analysis pipelines/versions used
- Including world knowledge into the results

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# Quality Assurance & Control



- Standard Operation Procedures (SOPs)
- Quality Checks:

Individual	Sample Type	QC status	Cov. w/o N	ChrX Cov. w/o N	ChrY Cov. w/o N	Lib Prep Kit	Mapped Reads %	Duplicates %	Properly Paired %	Single %	Insert Size Median	Diff Chrom %
K20K-1YUYYE	BLOOD1	✓	38.10	19.51	14.55	II TruSeq Nano DNA	99.97	10.96	92.72	0.04	394.00	10.64
K20K-1YUYYE	PATIENT-DERIVED-CULTURE1	✓	41.27	47.51	1.09	II TruSeq Nano DNA	100.00	10.60	95.55	0.00	395.00	5.73
K20K-27ANNP	BLOOD1	✓	41.65	21.49	17.58	II TruSeq Nano DNA	100.00	9.18	96.88	0.01	347.00	3.75
K20K-27ANNP	PATIENT-DERIVED-CULTURE1	✓	42.70	42.99	0.78	II TruSeq Nano DNA	100.00	13.23	95.91	0.00	351.00	5.21
K20K-27ANNP	PATIENT-DERIVED-CULTURE2	✓	41.12	42.16	0.94	II TruSeq Nano DNA	100.00	14.19	96.65	0.00	324.00	4.21
K20K-27ANNP	PATIENT-DERIVED-CULTURE3	✓	39.44	40.93	0.91	II TruSeq Nano DNA	99.99	9.09	95.73	0.02	330.00	4.87
K20K-27ANNP	PATIENT-DERIVED-CULTURE4	✓	39.82	39.85	0.88	II TruSeq Nano DNA	99.99	11.27	96.62	0.02	324.00	4.02
K20K-27ANNP	PATIENT-DERIVED-CULTURE5	✓	39.91	41.24	0.92	II TruSeq Nano DNA	100.00	10.78	96.22	0.00	319.00	4.63

- Standards to ensure comparability and exchange (fastq, bam, vcf)
- Professional software development in an agile framework (scrum)

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# Metadata for NGS



Patient ID, Sample, Tissue Type, Cell Type,  
Disease, library, devices used, reference  
genome...

→ Essential for interpretability,  
reproducibility, comparability

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# Challenges of Data Quality

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- Lack of standardization of data generation
- Bioinformatic Workflows not fully standardised
- NGS Workflow not yet clinically “certified”
- **But:** community has long-standing tradition (and willingness!) to successfully address data quality/ standardization issues

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