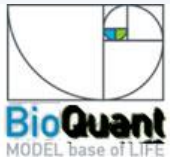


Big data in Next Generation Sequencing (NGS): Requirements and Challenges

Juergen Eils

Data Management Group @ eilslabs





DKFZ (German Cancer Research center) is the largest biomedical research institute in Germany

- In 2008, [Professor Harald zur Hausen](#) awarded the [Nobel Prize in Medicine](#) for discovering that human papillomaviruses (HPV) cause cervical cancer.

- More than 70 divisions and research groups,
- About 80 employees are working in the Bioinformatics division eilsLabs

About 20 employees are working in the data management team

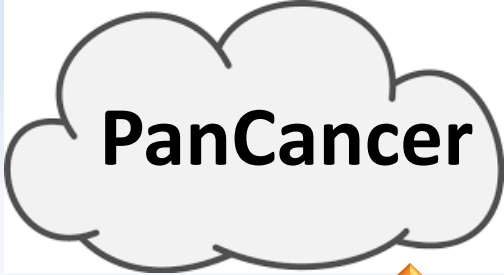
NGS in personalized oncology

Structure of the talk

- NGS projects
- Infrastructure, cloud
- Pipelines and software

Data flow at DKFZ

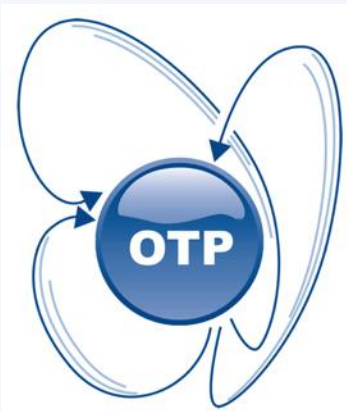
Major projects



DKFZ-HIPO



NCT POP



Cores (2 clusters)	2,500
Memory (2 clusters)	15,0 TB
Storage: 1,400 disks, 4,400 TB	

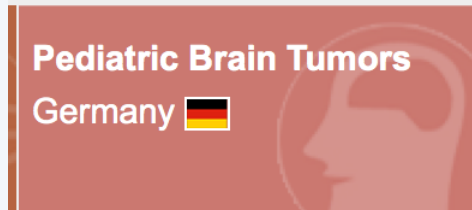
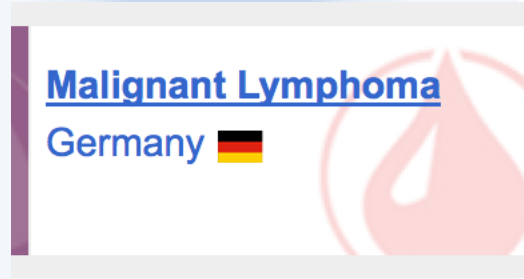
Cores	1,500
Memory	5.2 TB
Storage: 2,000 disks, 4,600 TB	



ICGC - big data project

ICGC Goal: 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.

- 1. PedBrainTumor:** Coordinated at DKFZ (Lichter/Eils)
 - Pilocytic astrocytoma (most common pediatric brain tumor)
 - Medulloblastoma (most common malignant pediatric brain tumor)
- 2. Prostate Cancer - Early Onset:** Coordinated at DKFZ & University Hospital Hamburg (Sültmann / Sauter)
- 3. Malignant Lymphoma:** Coordinated at Univ. Kiel (Siebert), DKFZ responsible for data analysis and data management (Eils)



The screenshot shows the International Cancer Genome Consortium (ICGC) website. At the top, there is a search bar and navigation links for Home, Cancer Genome Projects, Committees and Working Groups, Policies and Guidelines, and Media. The main content area features a grid of project banners for various cancer types and countries, including:

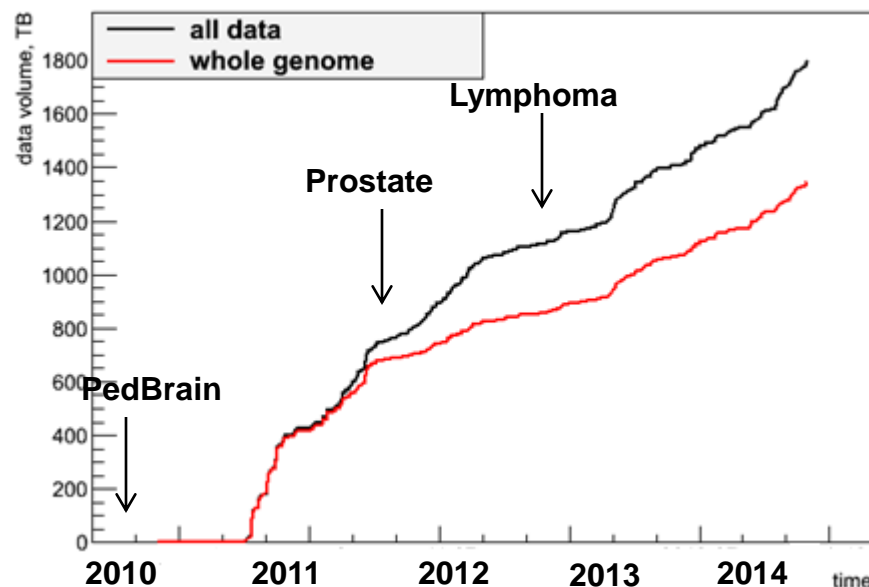
- any Tract Cancer (Japan)
- Bladder Cancer (China, United States)
- Blood Cancer (South Korea, United States)
- Blood Cancer (United States)
- Bone cancer (France)
- Brain Cancer (Canada)
- Brain Cancer (United States)
- Breast Cancer (United States)
- Breast Cancer (France)
- Breast Cancer (Mexico)
- Breast Cancer (South Korea)
- Breast Cancer (United Kingdom)
- Breast Cancer (United States)
- Cardiac Cancer (United States)
- Chronic Lymphocytic Leukemia (Spain)
- Chronic Myeloid Leukemia (United Kingdom)
- Colorectal Cancer (China)
- Endometrial Cancer (United States)
- Esophageal Cancer (China)
- Esophageal Cancer (United Kingdom)
- Eye Cancer (France)
- Gastric Cancer (China)
- Gastric Cancer (United States)
- Ovarian Cancer (Australia, China, United States)
- Pancreatic Cancer (Australia, Canada, China)
- Pancreatic Cancer (United States)
- Pediatric Brain Tumors (Germany)
- Prostate Cancer (Canada, China)
- Prostate Cancer (China)
- Prostate Cancer (France)
- Prostate Cancer (Germany)
- Prostate Cancer (United States)
- Rare Pancreatic Tumors (Italy)
- Rectal Cancer (United States)
- Rectal Cancer (China)
- Rectal Cancer (European Union / France)
- Renal Cancer (United States)
- Skin Cancer (United States)
- Soft tissue cancer (France)
- Thyroid Cancer (China)
- Thyroid Cancer (South Africa)

 On the right side, there are sections for 'ICGC Goal', 'Launch Data Portal', 'Apply for Access to Controlled Data', 'Announcements' (including a 15/May/2014 announcement about data release 16), and 'The ICGC-TCGA DREAM Somatic Mutation Calling Challenge'. At the bottom right, there is a 'nature' journal article snippet and an 'About ICGC' section.

The NGS data flood from 3 German ICGC projects

Status end of 2014

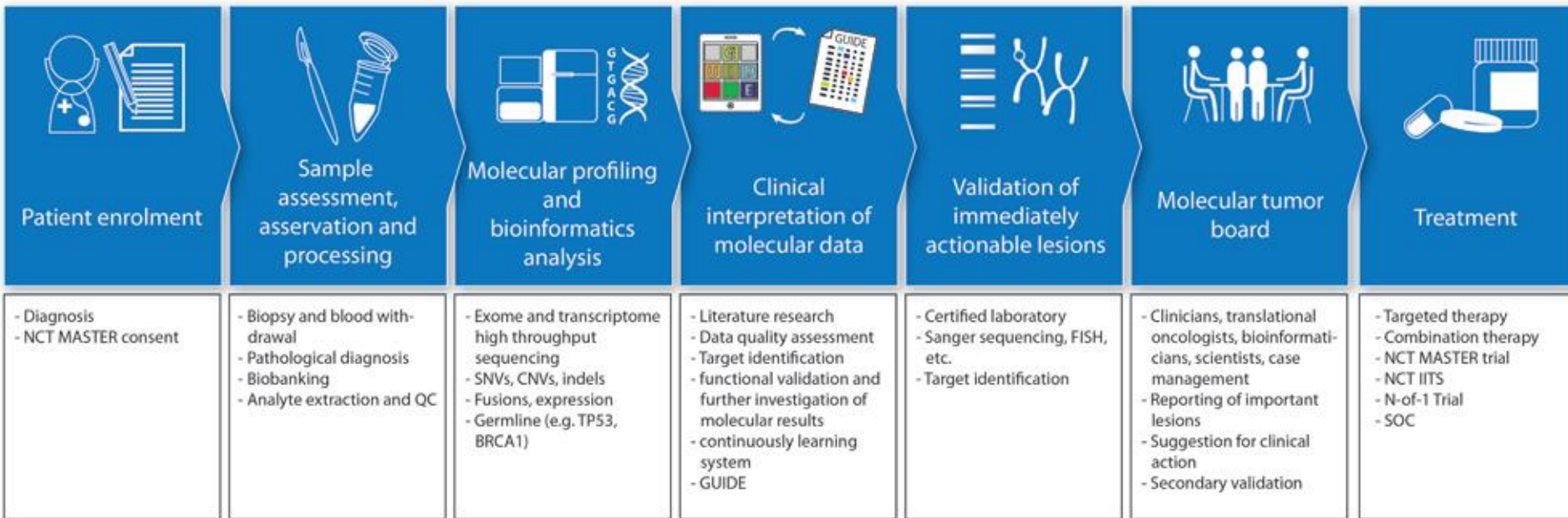
	WGS*	WES*	RNAseq	Mate-pair*	WGBS*
PedBrain-Medulloblastoma	599	53	174	232	62
PedBrain-Astrocytoma	316	-	94	10	-
Early Onset-Prostate	99	38	39	97	-
Malignant Lymphoma	232	12	106	8	35
Glioblastoma	101	10	29		8



*Tumor and normal counted separately

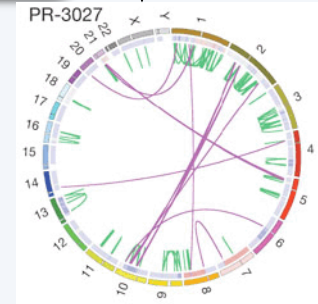
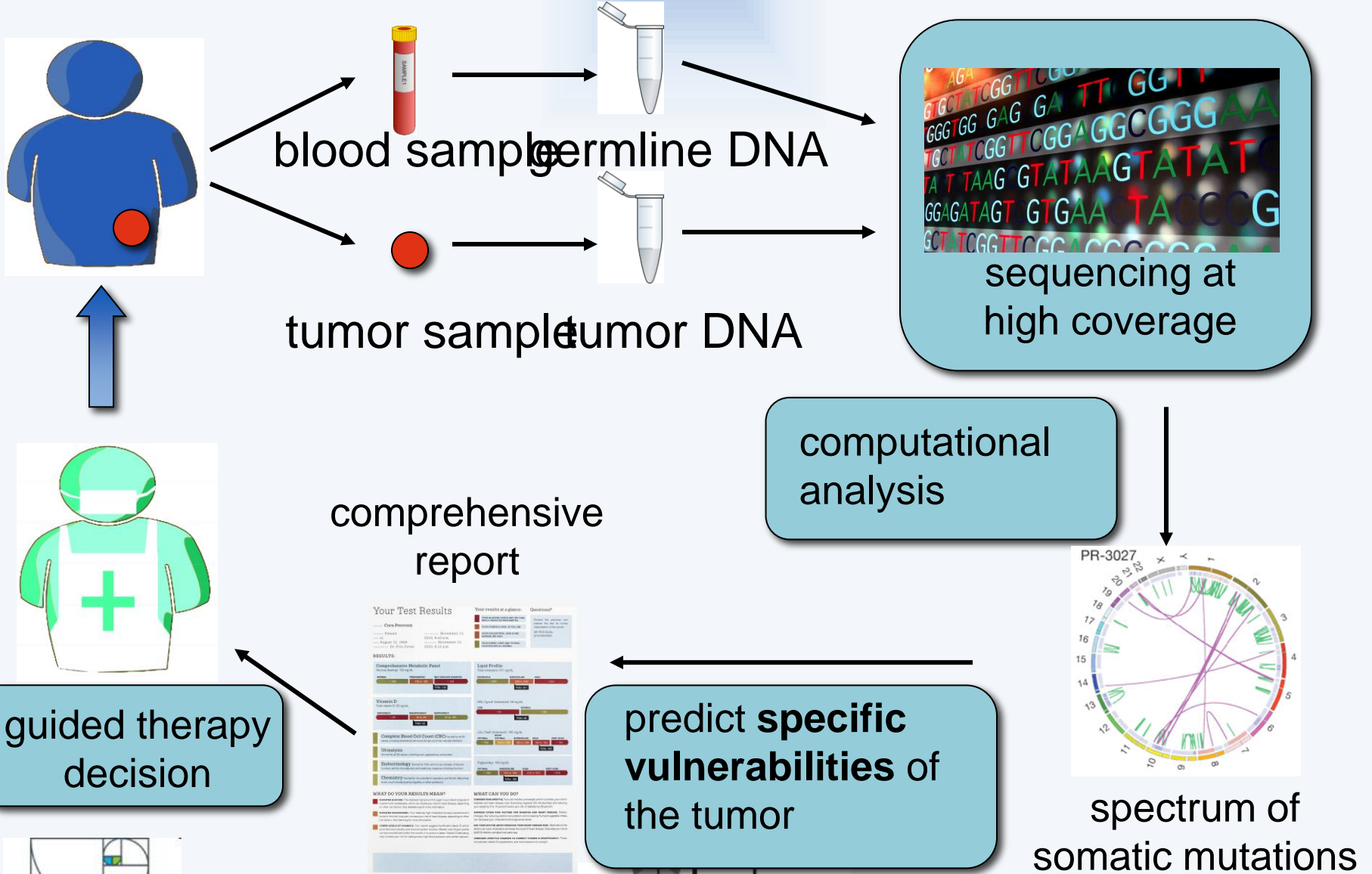
- only main data types shown
- combined for all 3 ICGC projects

dkfz.hipo: Precision Oncology



- Mission: Bringing Genome Sequencing to the Patient
- Currently 50 projects selected including glioblastoma, pediatric cancers, CLL, sarcoma, gastric, colon, prostate, pancreatic, lung, breast and head/neck cancer
- 2015 1500 pat. /year, 2016 2500 p. /y, 2017 3500 p. /y,
- Goal: providing sequencing profile to each cancer patient (20.000 p.a.)

Goal: Genomic Cancer Medicine



Inform INdividualized Therapy FOr Relapsed Malignancies in Childhood: 250-300 cases for feasibility study



NGS in personalized oncology

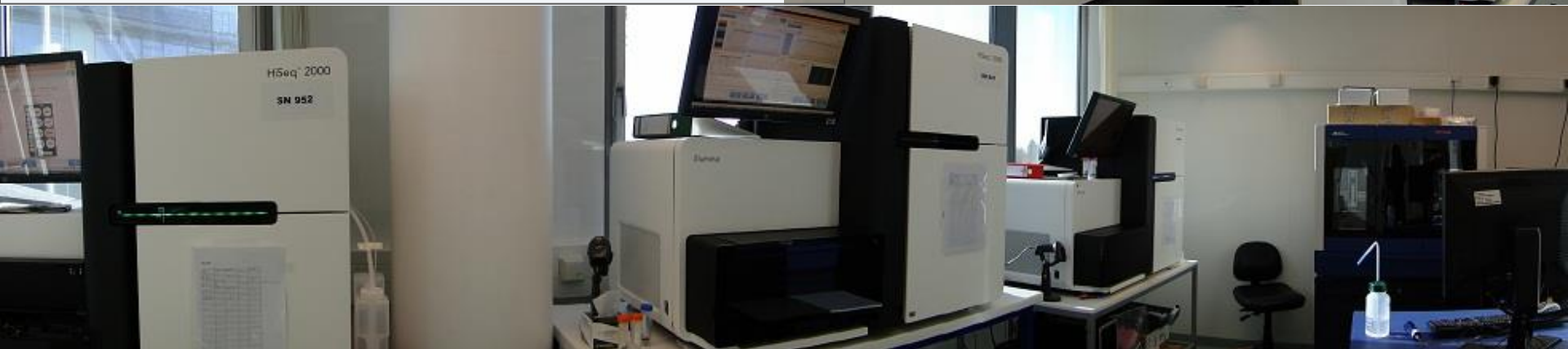
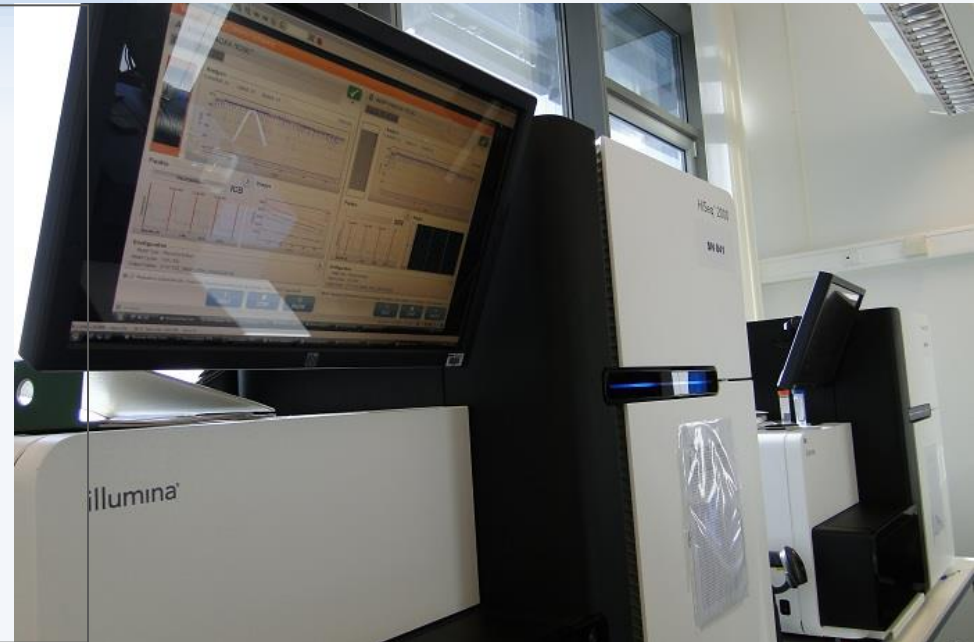
Structure of the talk

- NGS projects
- Infrastructure, cloud
- Pipelines and software

Genome Profiling Core Facility (GPCF)

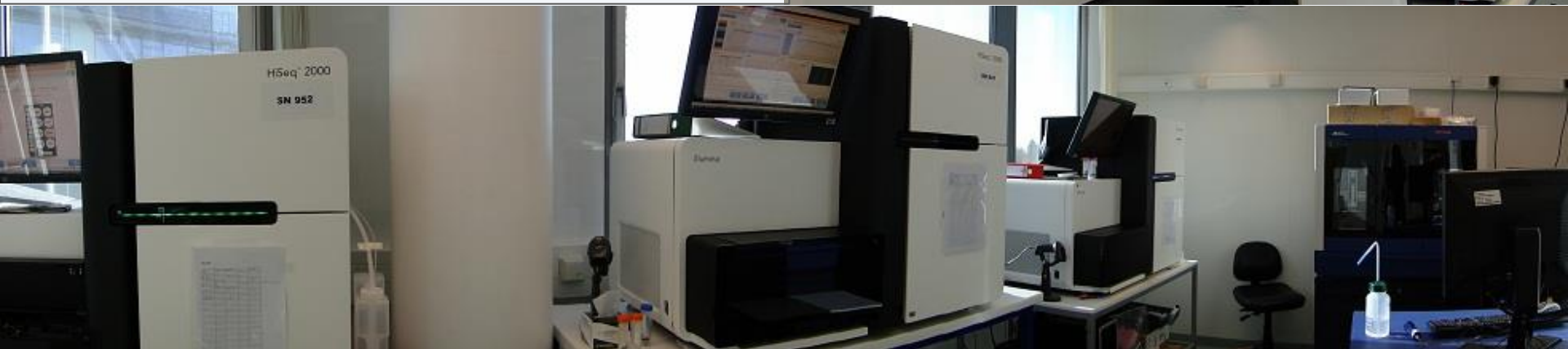
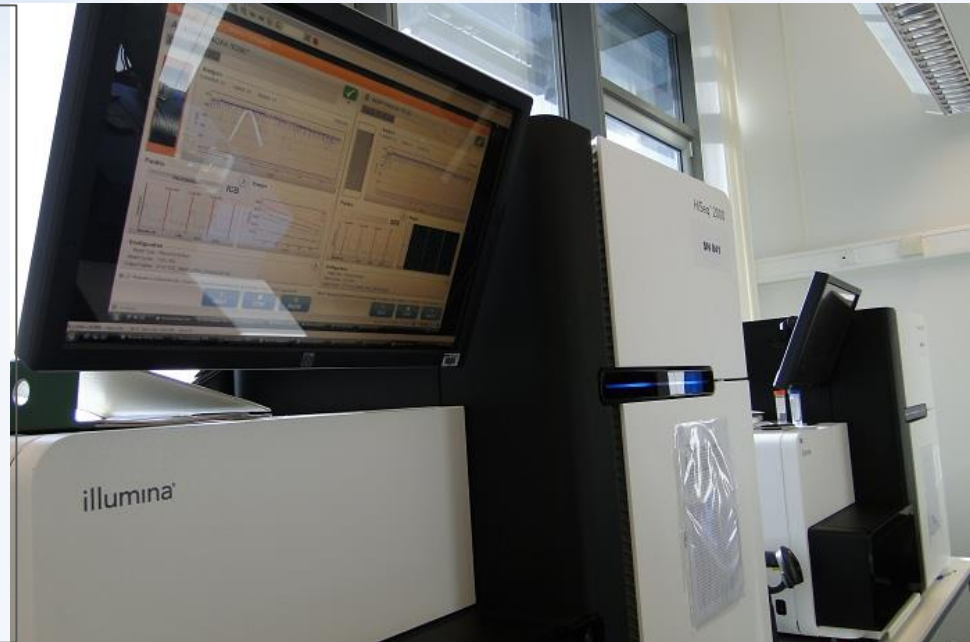
Equipment

- 14 Illumina HiSeq 2000 / 2500
- 2 Illumina MiSeq
- 1 454 FLX
- 2 HiSeq X, 8 more in 2015 (some old HiSeq will go...)



Some Petabase numbers

Sequencer are the data producer
One Genome has roughly 3 Gbases
3.000.000.000 Bases
The standard coverage
rate is 30x to 40x
One sequenced genome
requires 100 GBases



One whole genome 30x requires

- Minimal 200-300 GB raw data
- (FASTQ and BAM)

Experience: 20 Byte for one Base

- Raw data, quality data, alternative base calls, results, several alignments, methylom seq, RNA seq, small RNA seq, other seqs, mirror

- 20 bytes per base:
2 TB each genome

2500 WGS require

5 PB data space

~5.368.709.120 MB

~1.300 Hard disks of 4 TB

Some Petabyte numbers (science)

X Ten technology



The HiSeq X Ten contains 10 sequencing systems.

HiSeq X™ Ten

Population Power

Composed of 10 HiSeq X Systems, the HiSeq X Ten is the first sequencing platform that breaks the \$1000 barrier for a 30x human genome. The HiSeq X Ten System is ideal for population-scale projects focused on the discovery of genotypic variation to understand and improve human health. It can rapidly sequence tens of thousands of samples at high genome coverage, delivering a comprehensive catalog of human variation within and outside coding regions.

- Tens of thousands of whole human genomes per year
- \$1000 human genome, including depreciation, sample preparation, and labor

- **Fr. 8.000 patients genome analysis (30x) in WGS**
- **In 8 EB ment for 10 million data base 1000000 Dollars requested**
- **16\$ Bill year by experience**
- **Looking gap ~ 15-20 EB clinical research and practice**

Usable Computing Capacities Heidelberg Campus

Computing-Cores >6000

Memory >20TB

Storage: 15.000 TB

UNIVERSITÄT
HEIDELBERG



BioQuant
MODEL base of LIFE

Cores

Memory

Storage: 4.500 TB

**Glas Fibre
Connection**

Cores

>6000

Memory

>20 TB

Storage: 10.500 TB

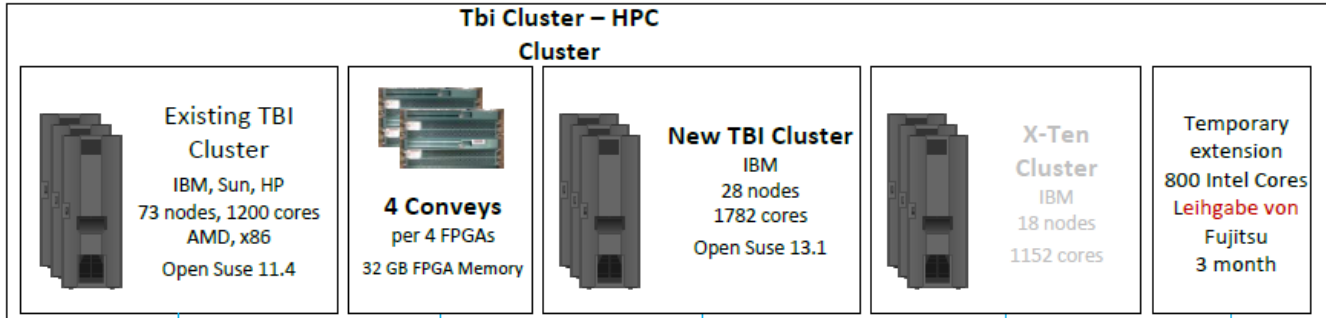
dkfz.



dkfz.

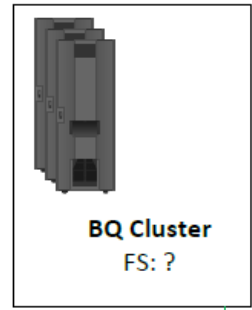
Bioinformatics Infrastructure without details

Compute

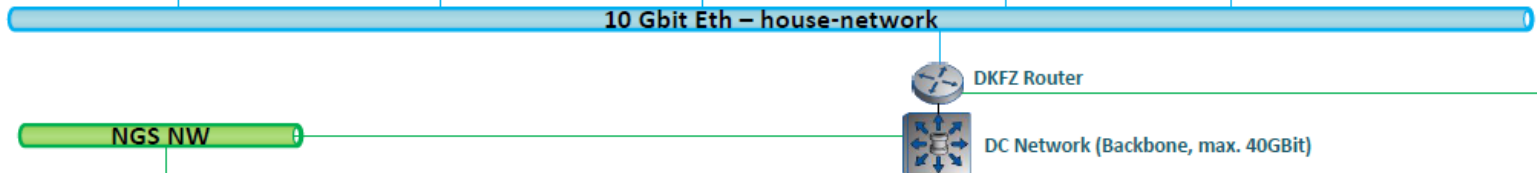


PanCancer Cloud
1000 Cores
allocation: 60%
Issue: encryptions, waiting times

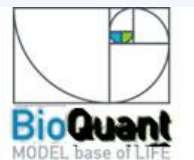
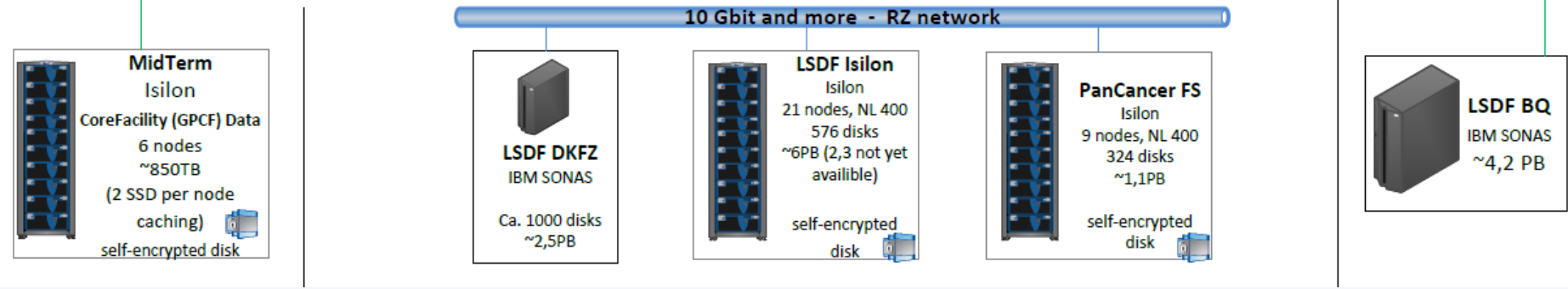
BQ



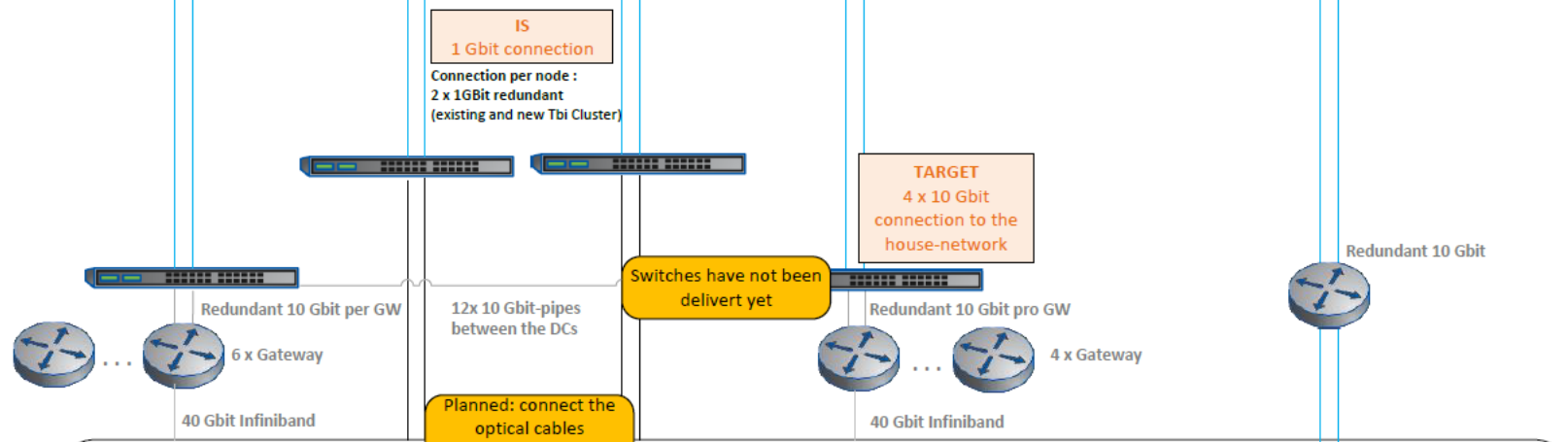
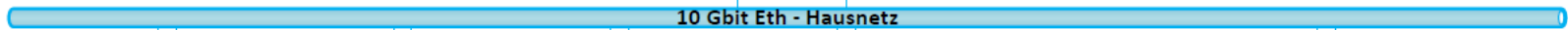
Network



Storage



Tbi Cluster Infrastructure



Tbi Cluster – HPC Cluster

2 Conveys
each 4 FPGAs
32 GB FPGA memory

Existing TBI Cluster
(nodes will be migrated in the new infrastructure)
IBM, Sun, HP, 73 nodes, Open Suse 11.4
1200 cores AMD, x86, 256 RAM per node (2 nodes with 1 TB RAM)
Per nodes 32-38 Cores, 2units per nodes (116-20 nodes with 4 units)

Factors which prohibits the extension of the cluster:

- 1.) network limitations
- 2.) kilowatt-limitation sourced by the aircondition limitations
- 3.) floor load

2 Conveys
each 4 FPGAs
32 GB FPGA memory

New TBI Cluster
IBM, 28 nodes, 1782 cores, 256 RAM per node, Open Suse 13.1
Per node 64 cores, 2 units per node

X-Ten Cluster
IBM, 18 nodes, 1152 cores, 256 RAM per node
per node 64 cores, 2 units per node

Temporary extension
800 Intel Cores
Loan from Fujitsu
3 month

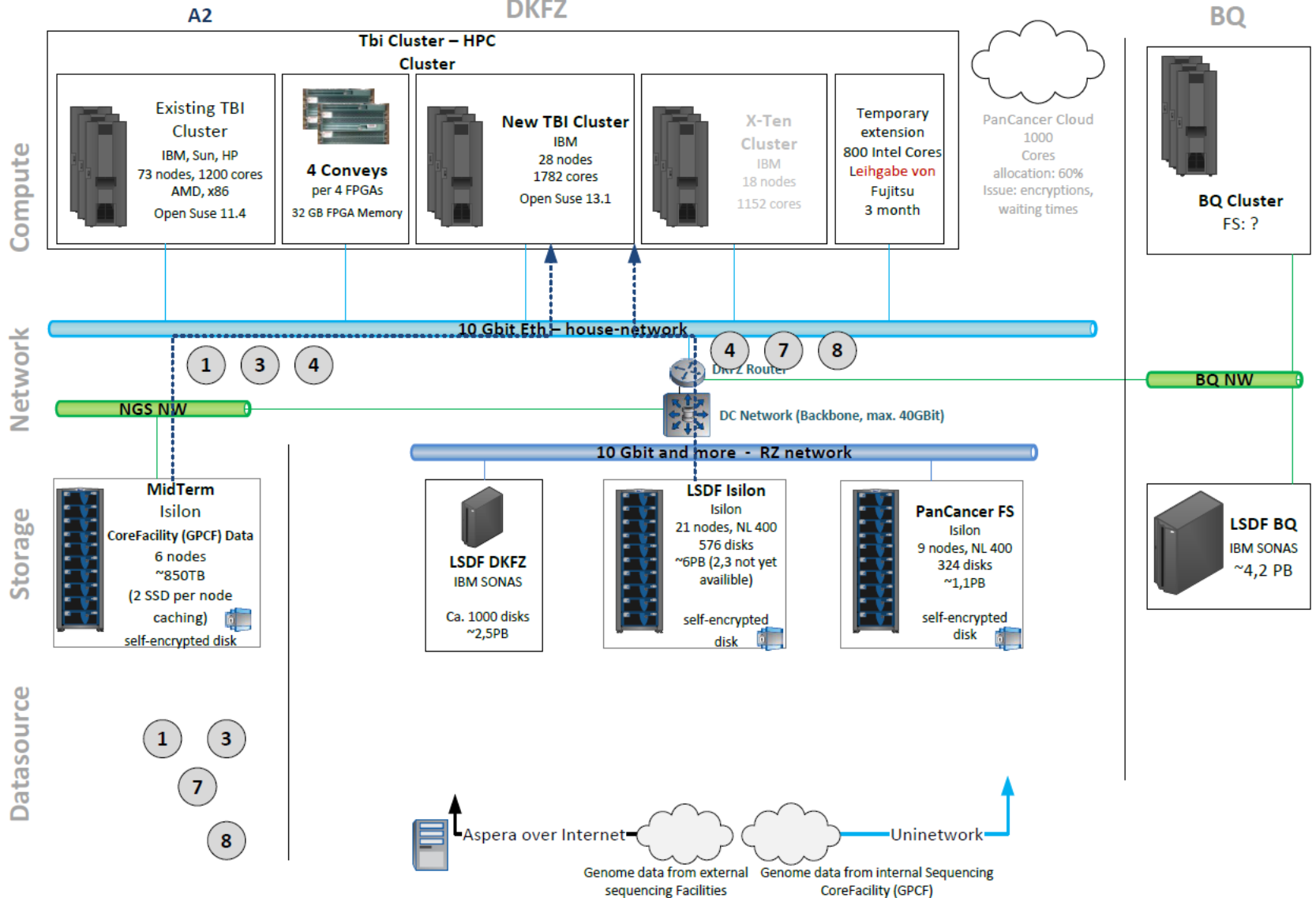
As soon as the new Tbi Cluster is ready, some nodes of the existing Tbi Cluster will be switched off, some will be intergrated into the new TBI Cluster.
Some nodes will be moved to the room 2.127.

room 2.127 – 6 racks

room 3.323 – 4 racks

DC TP3

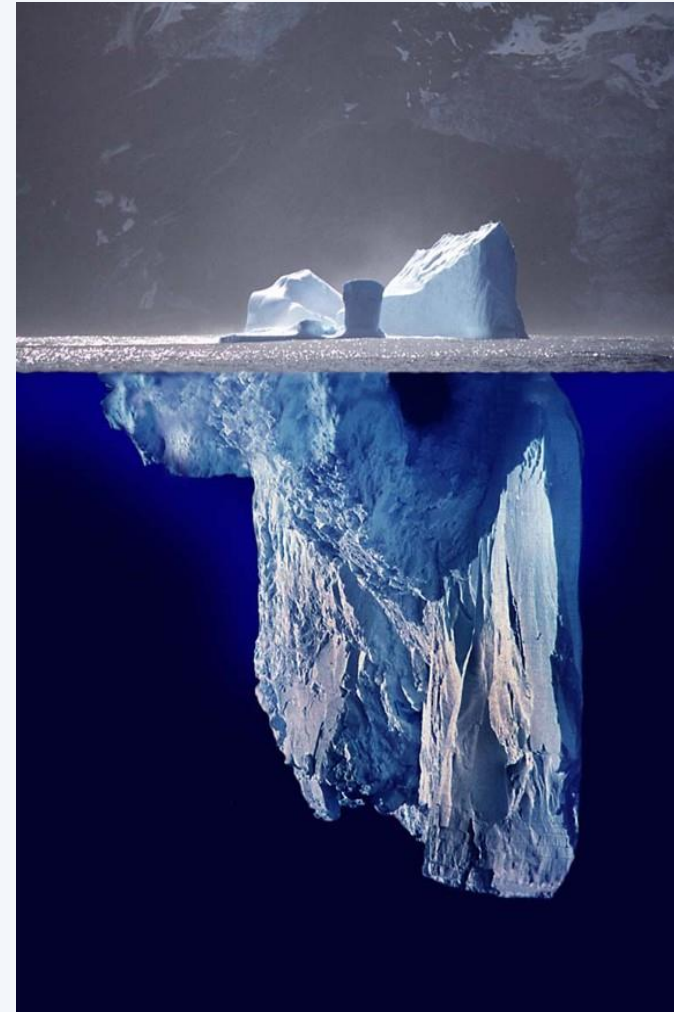
Dataflow_on_infrastructur_BWA_MEM



Cloud approaches

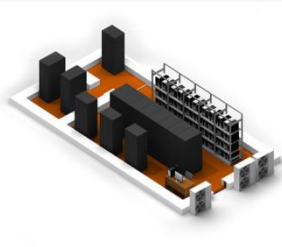
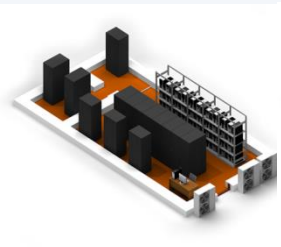
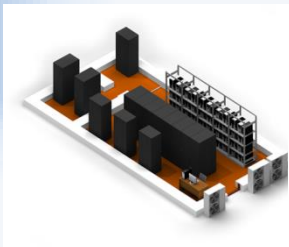
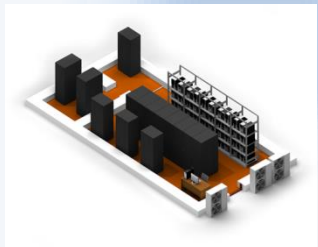
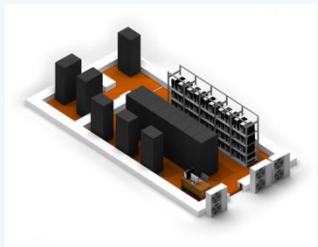
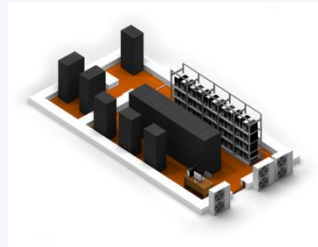
The PanCancer Project

- **Goals:**
 - Characterization of commonalities, differences of cancer types
 - Understand what's going on in the 95% of the cancer genome that isn't protein-coding
 - Non-coding RNAs
 - Regulatory elements
 - Amplifications/deletions & other structural changes
- **Resources:**
 - >2500 whole genome tumor/normal pairs from ICGC and TCGA
 - 15 working groups
 - 130 research subprojects



Phase II: Synchronize Alignments & Mutation Calls

Aligned Reads (500 TB)



University of Chicago
Bionimbus Protected Data
Cloud

DKFZ, Heidelberg

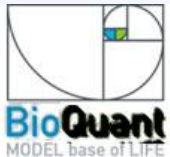
European Bioinformatics
Institute, Hinxton UK

Barcelona
Supercomputer
Center

IMSUT+RIKEN,
Tokyo

ETRI,
Seoul

Mutation Calls (10 TB)



Cloud Approach PanCancer

ICGC Researchers and Working Groups

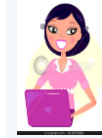
University of Chicago
Bionimbus Protected
Data Cloud

DKFZ, Heidelberg
European Bioinformatics
Institute, Hinxton UK

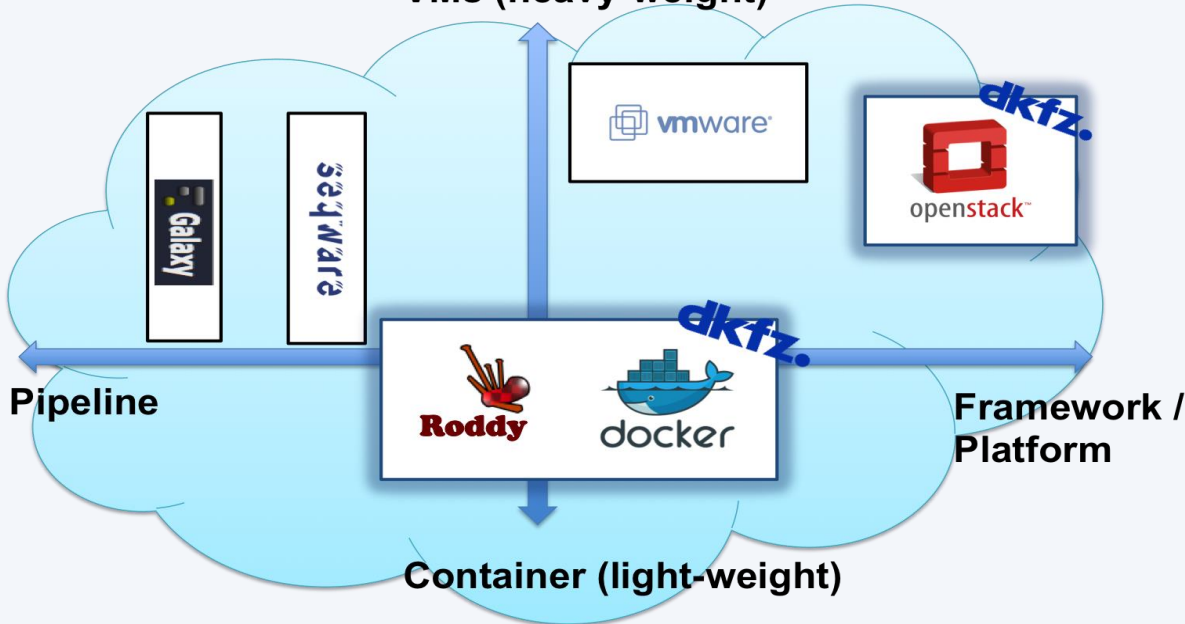
Barcelona
Supercomputer
Center

IMSUT+RIKEN,
Tokyo

ETRI,
Seoul



VMs (heavy-weight)



The ICGC Pan-Cancer Project: Participation of eilslabs / DKFZ



Genomes (top 3 centers)



Variant Calling Pipelines



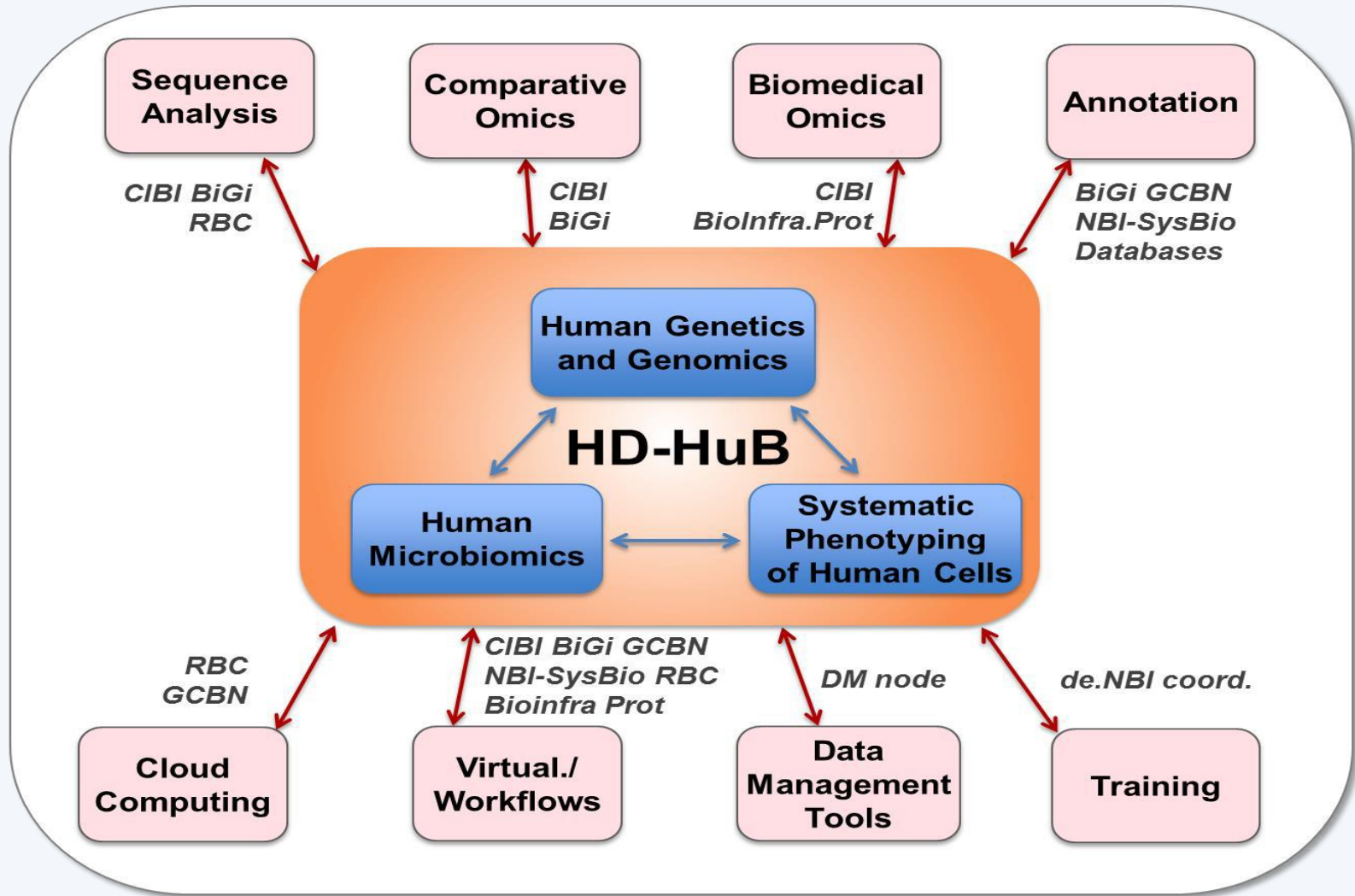
Data and Computing Centers



Co-Lead of ICGC Pan-Cancer Working Groups

- Pathogens in cancer (R. Eils, P. Lichter, DKFZ and Xiaoping Su, MD Anderson)
- Integration of epigenome and genome (B. Brors, C. Plass, DKFZ, and Peter Laird, USC)

Cloud Approach de.NBI



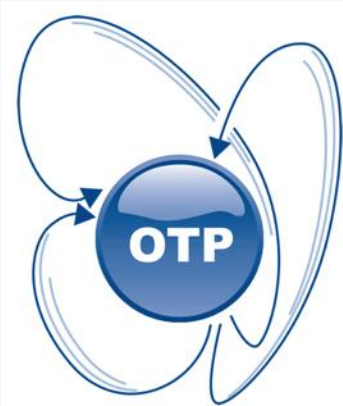
Data flow at DKFZ

Major projects

DKFZ-HIPO



NCT POP

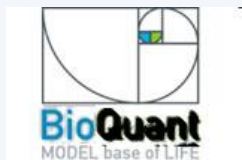


Data Hub

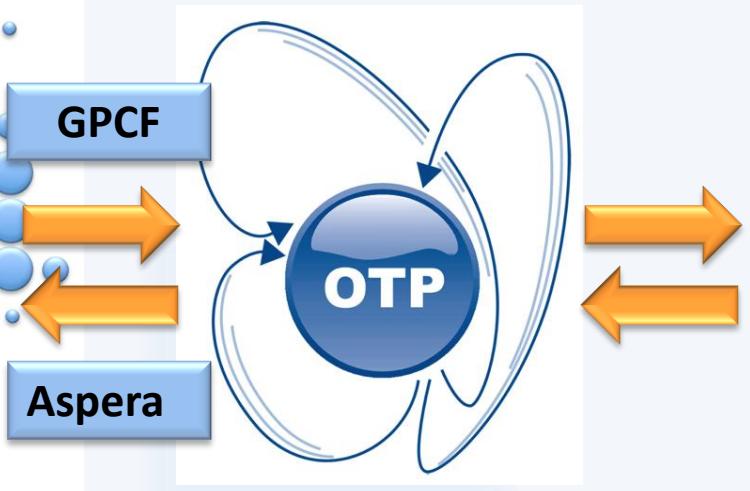
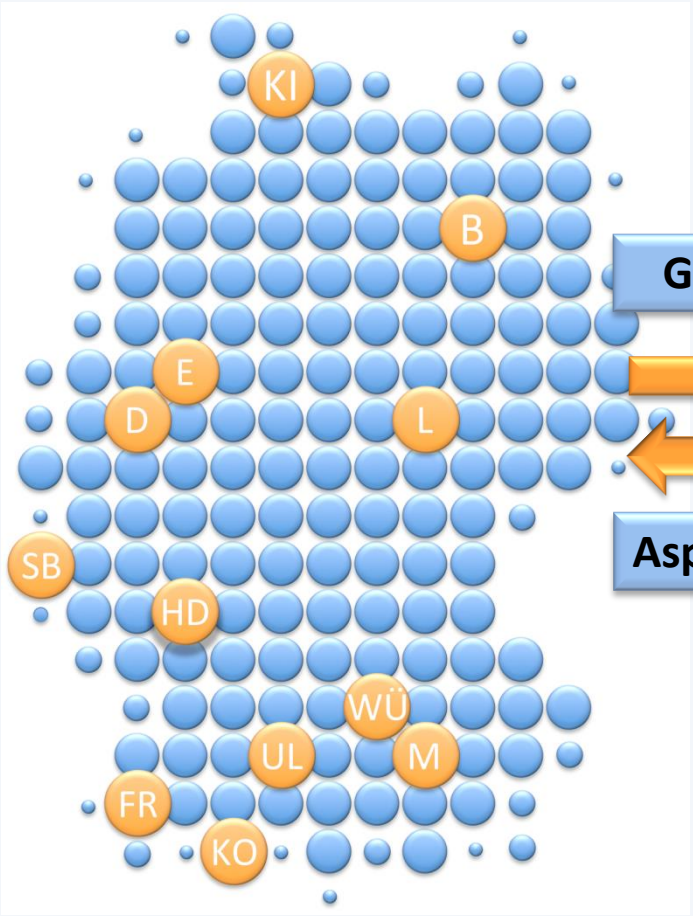
Cores (2 clusters)	2,500
Memory (2 clusters)	15,0 TB
Storage: 1,400 disks	4,400 TB

Cores	1,500
Memory	5.2 TB
Storage: 2,000 disks	4,600 TB

BioQuant
MODEL base of LIFE



Sequence centers in Germany



Data Hub

Cores (2 clusters)	2,500
Memory (2 clusters)	15,0 TB
Storage: 1,400 disks	4,400 TB

Cores	1,500
Memory	5.2 TB
Storage: 2,000 disks	4,600 TB

Receiving
NGS fastq data

Processing
Alignment & Merging

Providing
Structured data

NGS in personalized oncology

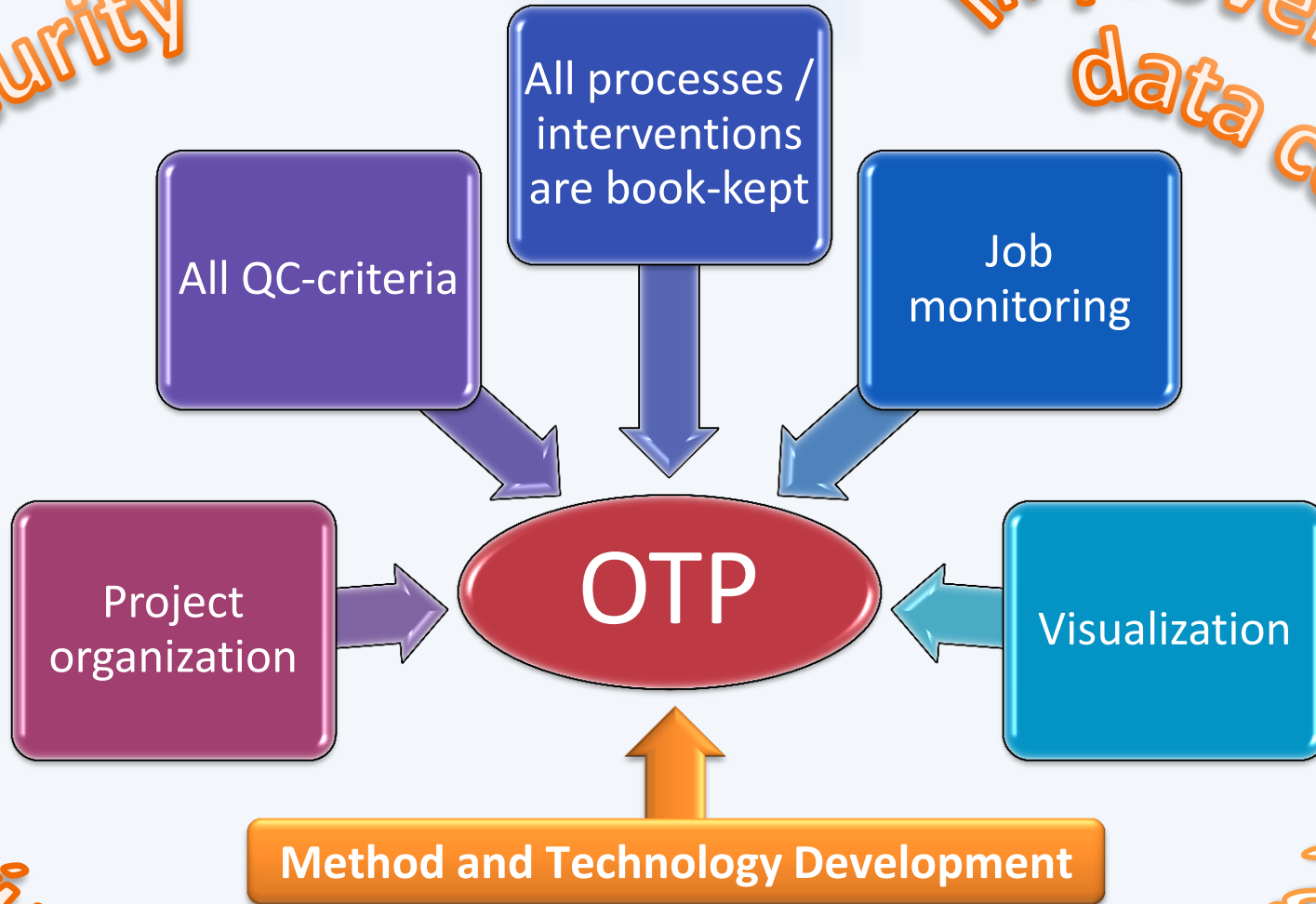
Structure of the talk

- NGS projects
- Infrastructure, cloud
- Pipelines and software

OTP: Central research platform

Security

*Improvement
data center*



Privacy

Data transfer

OTP: processing framework

INDIVIDUALS SEQUENCES RUNS PROCESSES OVERVIEW ▾

Enable auto refresh

Workflow	Count	Count of Failed	Last Success
QualityAssessmentWorkflow	186	1	Fri Sep 13 2013
ConveyBwaAlignmentWorkflow	185	1	19:25:52
FastqcSummaryWorkflow	637		15:43:54

INDIVIDUALS SEQUENCES RUNS PROCESSES OVERVIEW ▾ HOME LOGOUT

Number of projects in OTP

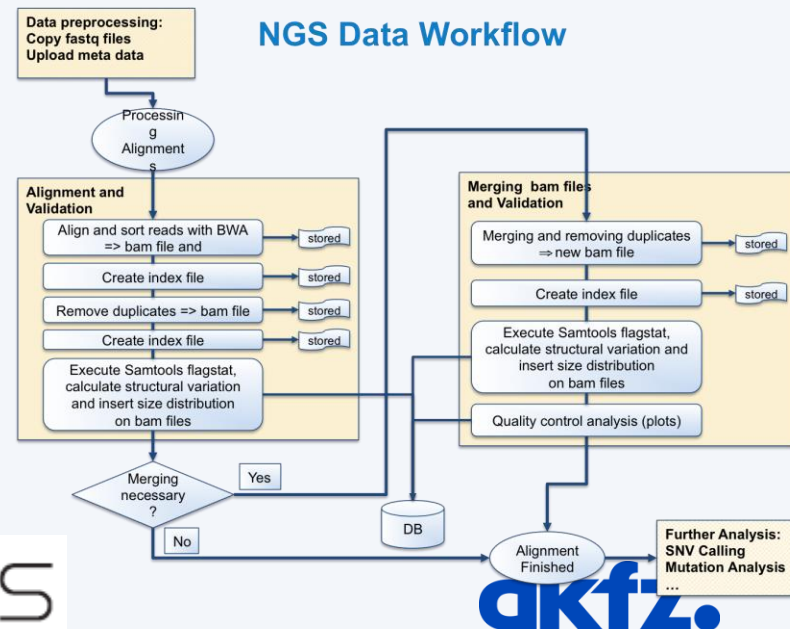
Number of sequence lanes registered in OTP

Samples processed by sequencing technologies in OTP

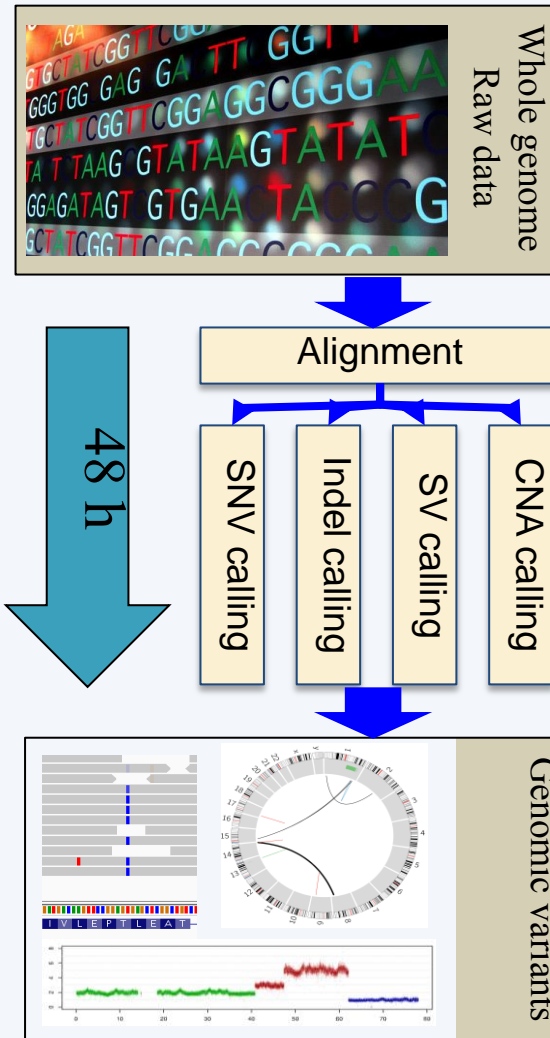
Number of projects using sequencing technologies in OTP

Thu Aug 01 2013 1 sec 248 msec

- Processing frameworks for huge NGS projects:
 - Project organization
 - To speed-up: All routine jobs run automatically
 - No more manual shell scripts
 - Alignment and QC done by pushing a button
 - Automatic information when a process was broken



Processing of NGS data



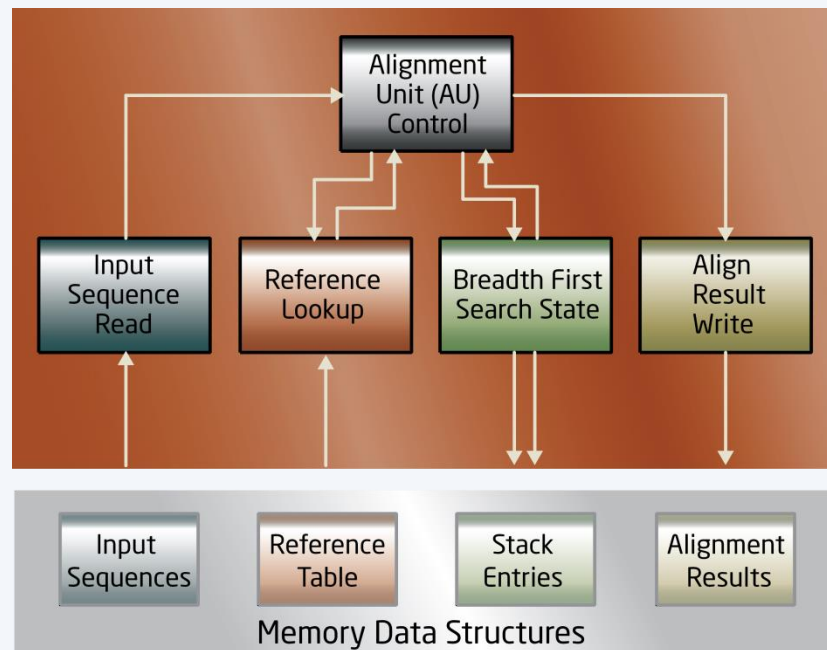
- processing of 30x whole genome from raw data to variant calls in < 48 h
- accelerated by:
 - streamlined process (e.g. merge + mark duplicates in one step)
 - use of pipes to avoid I/O (input/output: here writing to / reading from disks)
 - hardware-accelerated alignment (Convey)

Variants	Tool
SNVs	DKFZ SNV pipeline
Small Indels	Platypus pipeline (Rimmer et al.)
CNVs	ICGC ACEseq

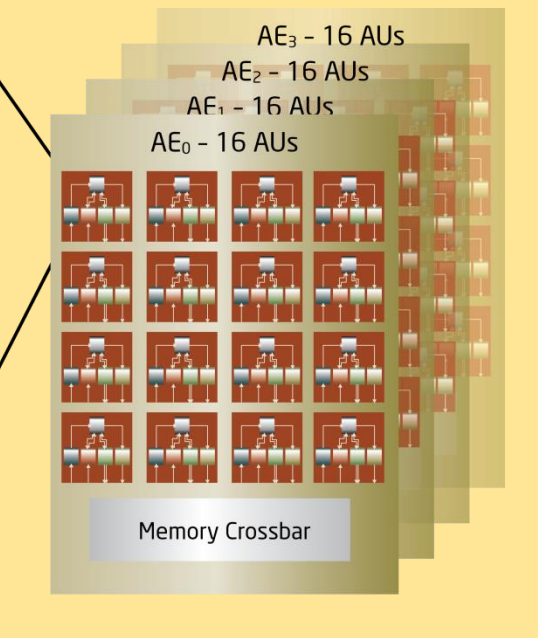
Example of acceleration : Convey HC-2



BWA Personality



FPGA-based Co-Processor (4 x Xilinx Virtex 5/6)



- Implemented in hardware on coprocessor FPGAs
- 64 alignment units with 32-stage pipeline = 2048 simultaneous alignment operations
- **20x speed-up** compared to alignment with 8 cores
- **saves 800 CPU-hours** per whole genome pair (tumor + control)
- reduces start-to-end-time of QC-pipeline from 62 hours to 38 hours on average

Overview about projects, samples

Organizational issues

- Typical obvious questions:
 - Which sequencing type was done on my sample?
 - Was the sequencing deep enough, how big is the coverage?
 - Where is my sample actually processed?
 - Where is my data?
 - What's going on?
 - What are the results of my NGS experiment?

More important issues

- Typical not obvious questions:
 - Who has the permission to distribute the data?
 - Who can be asked?
 - Whom has the data given at which time?
 - Has person xyz inhouse the permission to access the data?
 - Who is responsible: the coordinator, the PI, the Professor
 - Is sequencing data personalized data?
- These aspects are often underestimated
- => Big or many projects lead to communication stress
- => Data privacy, policies and ethic rules

DMG
Heads

Chris Lawerenz, Jürgen Eils

DMG
Developer
Team

Manuel Prinz, Alexander Balz
Pavel Komardin, Phillip Kensche
Eva Reisinger, Stefan Borufka
Gideon Zipprich, Charles Imbusch
Florian Kärcher, Amal Mertens
Andreas Kling, Jonas Stadter
Jan Matuschek, Jules Kerssemakers

DMG
Support
Team

Ingrid Scholz
Serkan Oelmez, Bärbel Felder
Christina Jaeger-Schmidt