

Data management to support deep learning approaches for microbial genomics

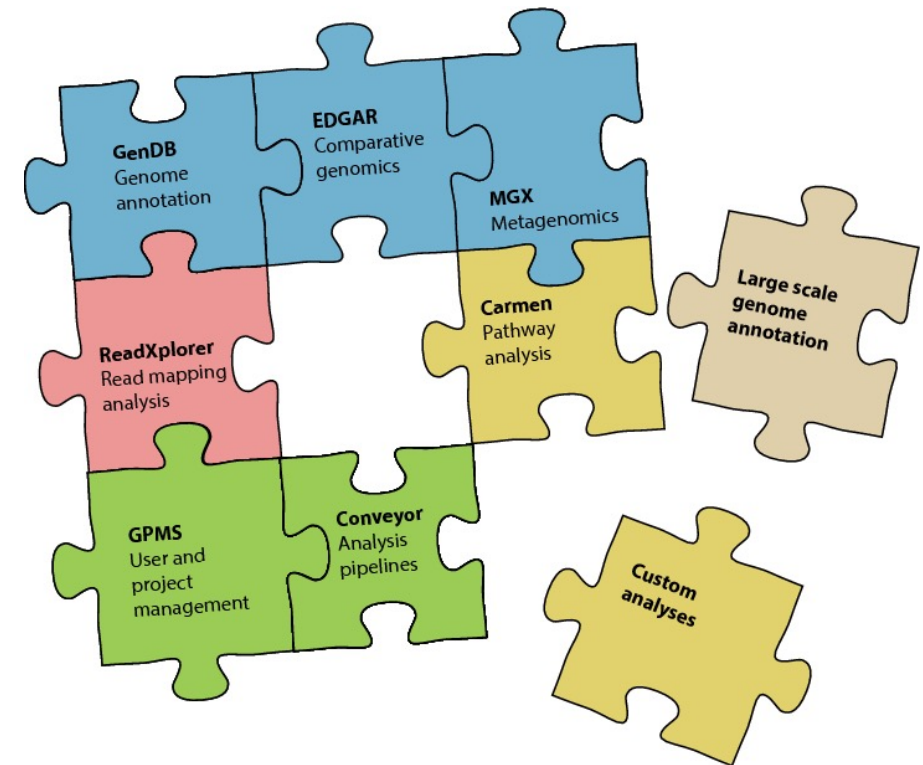
Prof. Dr. Alexander Goesmann
BVMed-Hygieneforum, 8.12.2021

Outline

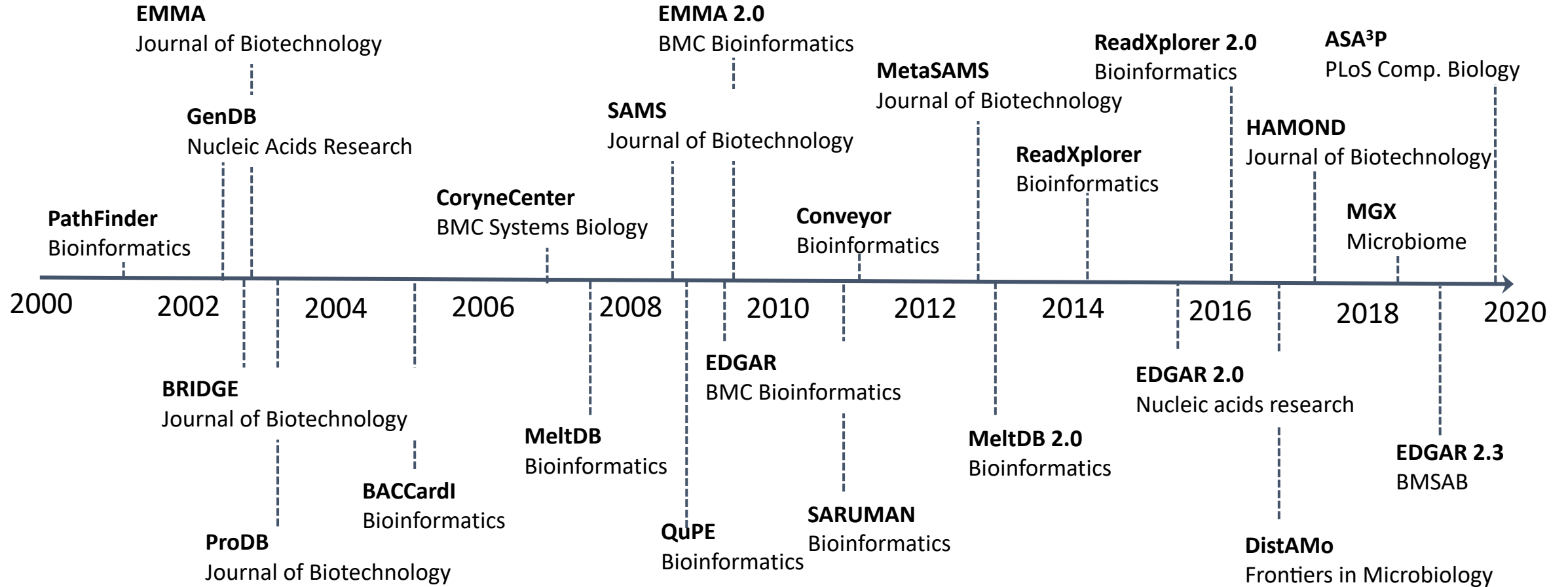
- Two decades of bioinformatics software development
- Current research projects and recent developments
- The Deep-iAMR project
- openBIS

Expertise of our group

- 20 years in bioinformatics software development
- Focus on microbial genomics and transcriptomics with some eukaryotic projects
- High-performance computing & scalable big data analysis
- Large portfolio of in-house developed software platforms
- Experience with various workflow systems such as Conveyor, Galaxy, Nextflow, Snakemake, CWL, ...
- Containerization for flexible cloud computing deployment
- de.NBI service center for microbial bioinformatics
- Close collaboration with ELIXIR on international level



Our collection of software tools



Our current research projects

- de.NBI
- NFDI4BioDiversity
- NFDI4Microbiota
- FAIR Data Spaces – Aufbau eines gemeinsamen Cloud-basierten Datenraums für Wirtschaft und Wissenschaft
- KFO 309 – Virus-induced lung injury
- GRK2355 – Regulatory networks in the mRNA life cycle: from coding to non-coding RNAs
- FOR5116 – Communication in host-microbe interaction via exRNA
- LOEWE Schwerpunkt "Diffusible Signals"
- ICIPS – Innovation und Koevolution in der sexuellen Reproduktion von Pflanzen
- Evolution von Gennetzwerken: Die Ranunculales als Modellordnung für evolutionäre Innovationen
- Deep-iAMR
- DeepDomains

The BiGi center for microbial bioinformatics



- Software applications continued as de.NBI services
- Bioinformatics consulting
- Training courses
- Software tools for the field of microbial genome research
- Reusable workflows including Galaxy server
- Storage and compute resources
- Cloud computing environment including Kubernetes

State-of-the-art sequencing technologies



HiSeq X Ten

Feature	Illumina HiSeq X Ten
Read length	150 bp
Reads/Run	6,000 Mio
Yield	18 Tb
Time/Run	72 hours
Price/Mb	0.007 \$
Price/Instrument	10 Mio \$

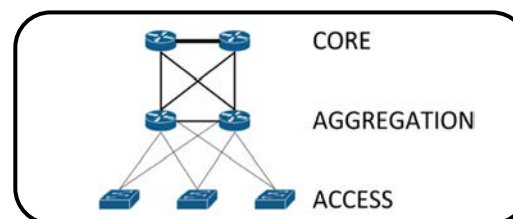
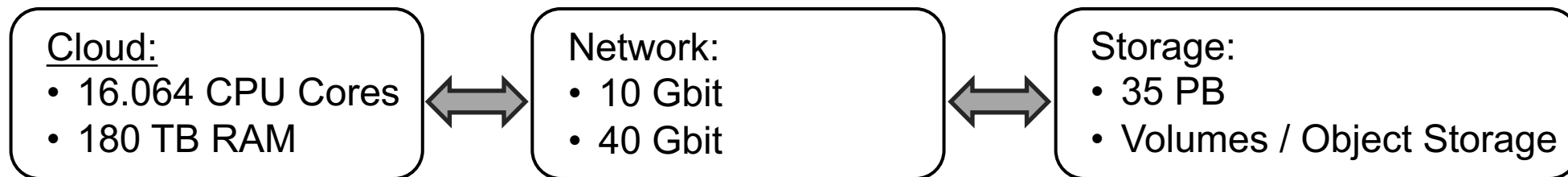
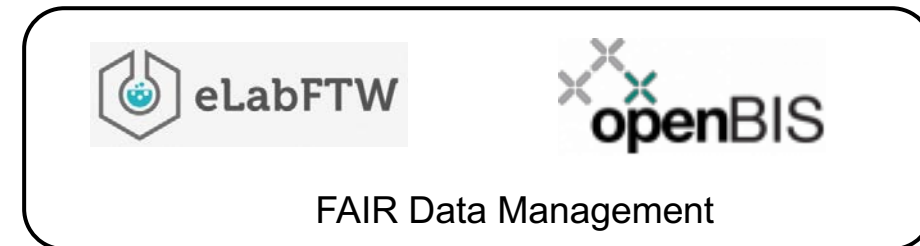
⇒ **1,000 \$ per human genome**

MinION™

Feature	MinION
Read length	10,000 bp
Reads/Run	up to 0.6 Mio
Yield	up to 6 Gb
Time/Run	up to 48 hours
Price of reagents/Run	99 \$
Price/Mb	0.20 \$
Price/Instrument	900 \$

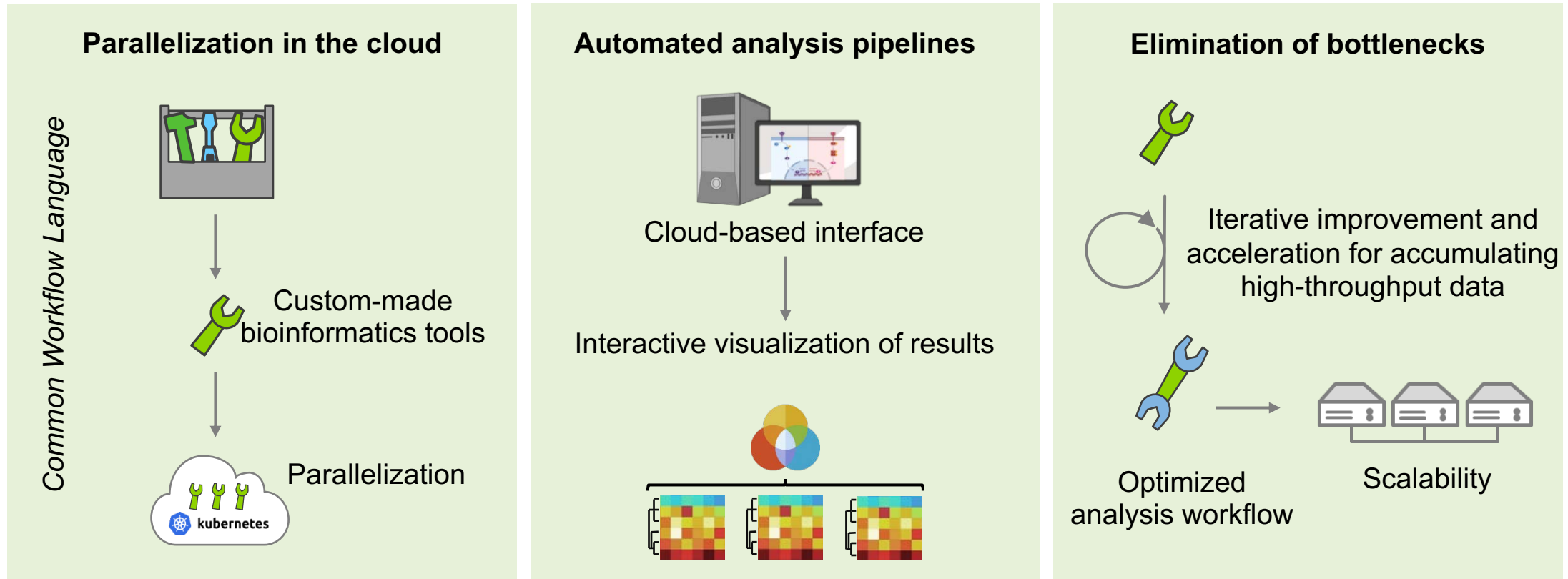


Data management and computational analyses



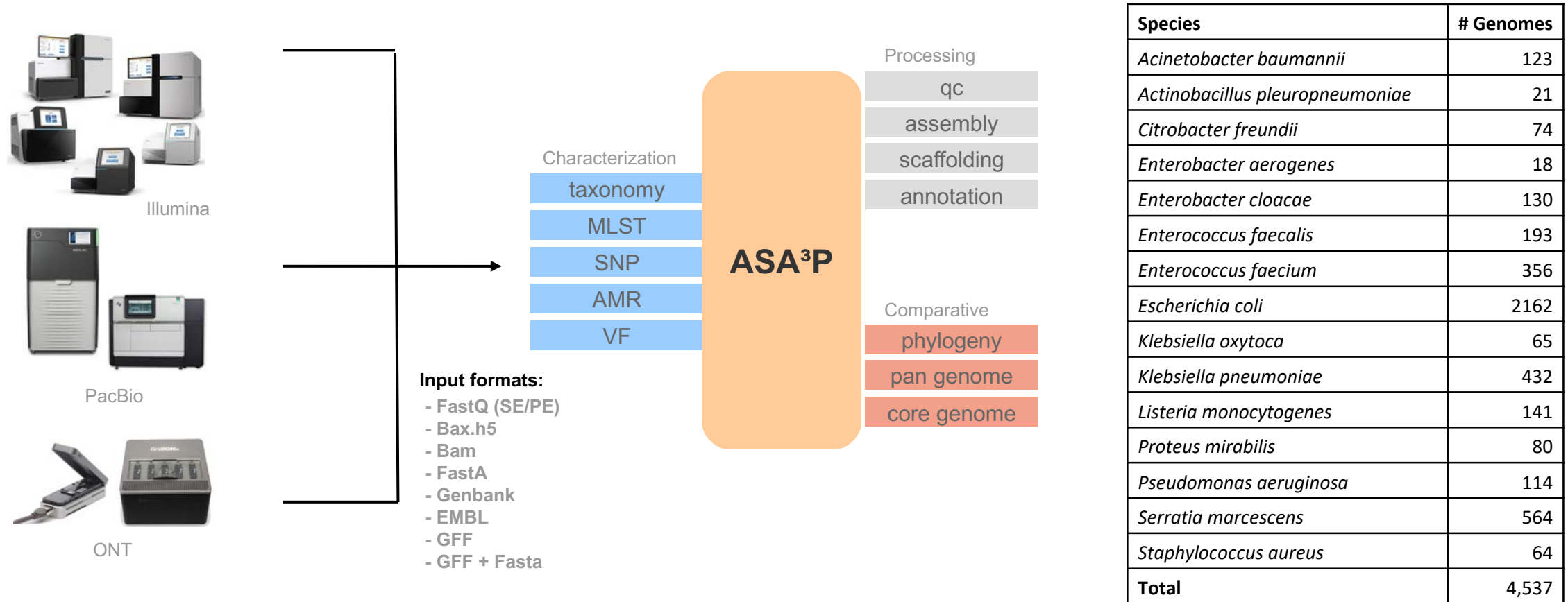
All systems are hosted on servers of the Bioinformatics Core Facility at JLU Giessen

Cloud-based analysis workflows



- Focus on next-generation sequencing data analysis workflows
- Continuous improvement of pipelines

ASA³P – Scalable analysis of microbial genomes



- Docker container for local execution
- Ready-to-use single VMs in de.NBI cloud with up to 144 vCPUs
- Full service with password protected web-based access
- Scalable cloud setup based on BiBiGrid to process 1,000+ genomes / day

Collaboration with Med. Microbiology, JLU



ASA³P – Main result page

- Genome Analyses
- Quality Control
- Assembly
- Scaffolds
- Annotation
- Genome Characterization
- Taxonomic Classification
- MLST
- Antibiotic Resistances
- Virulence Factors
- Reference Mapping
- SNP Detection
- Comparative Analyses
- Core/Pan Genome
- Phylogeny

🏠 example-ecoli-ST410

📄 This is an example project comparing various Ecoli ST410 strains published by Falgenhauer et al. 2016.

🔧 1.0.1 🌱 Escherichia

👤 Oliver

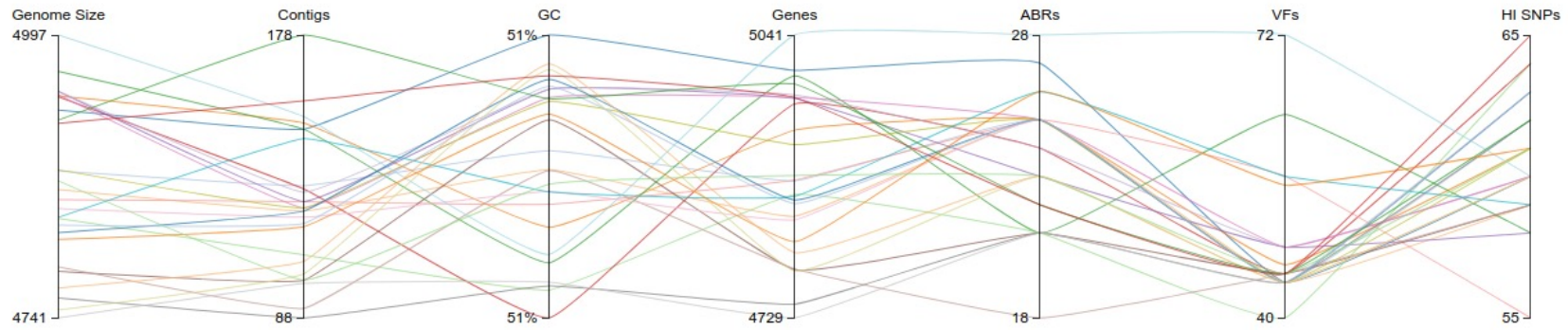
👤 Schwengers

✉ oliver.schwengers@computational.bio.uni-giessen.de

▶ 2017-12-05 14:36:45 +01:00

■ 2017-12-05 16:50:21 +01:00

🔄 02:13:36.046



Show 10 entries

Search:

	Genome	Tax Class	Genome Size	# Contigs	GC	# Genes	# ABR	# VF	# HI SNPs
1	E. coli 37B15-13-1E	Escherichia coli	4.929	148	51	5.002	27	44	60
2	E. coli 232B15-13-2E	Escherichia coli	4.874	130	51	4.880	25	44	62
3	E. coli 370B15-13-2A	Escherichia coli	4.942	150	51	4.936	25	46	61
4	E. coli 123074	Escherichia coli	4.857	122	51	4.841	25	44	59
5	E. coli 123445	Escherichia coli	4.964	148	51	4.996	21	63	58
6	E. coli E003488	Escherichia coli	4.831	108	51	4.865	21	40	64

ASA³P – Antibiotic resistance profiles

computational.bio.uni-giessen.de

example-ecoli-ST410 Dashboard Help

Dashboard / Antibiotic Resistances

Show 10 entries Search: csv

	Genome	ABR Profile	# ABR Target Drugs	# ABR Genes	# Potential ABR Genes	Details
1	Escherichia coli 37B15-13-1E		5	26	61	Q
2	Escherichia coli 232B15-13-2E		5	24	59	Q
3	Escherichia coli 370B15-13-2A		5	24	58	Q
4	Escherichia coli 123074		5	24	58	Q
5	Escherichia coli 123445		5	21	59	Q
6	Escherichia coli E003488		4	21	57	Q
7	Escherichia coli E006910		7	25	56	Q
8	Escherichia coli R37		6	25	55	Q
9	Escherichia coli R56		5	23	60	Q
10	Escherichia coli R61a		5	23	60	Q

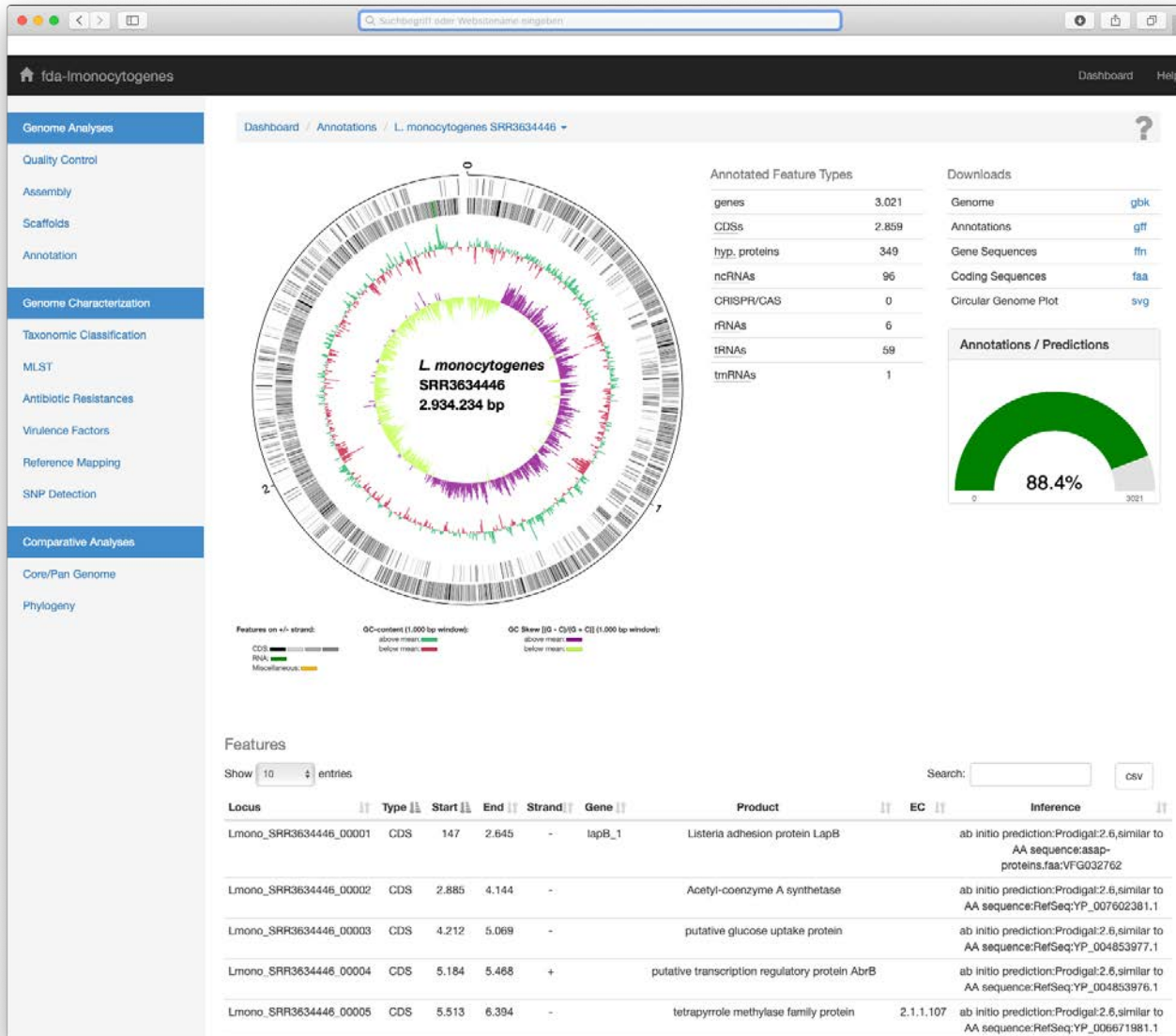
Showing 1 to 10 of 27 entries

Previous **1** 2 3 Next

ASA3P – Current status and features



Oliver Schwengers



Runtime

- 1,280 *Listeria monocytogenes* strains
- 24 VMs with 768 cores in cloud
- 1 day

Features

- Flexible configuration
- Extensible analysis modules
- Results in standard file formats
- Interactive visualization and browsing

Schwengers O, Hoek A, Fritzenwanker M, Falgenhauer L, Hain T, Chakraborty T, Goesmann A (2020) ASA³P: An automatic and scalable pipeline for the assembly, annotation and higher-level analysis of closely related bacterial isolates. PLoS Comput Biol. 2020 Mar 5;16(3):e1007134

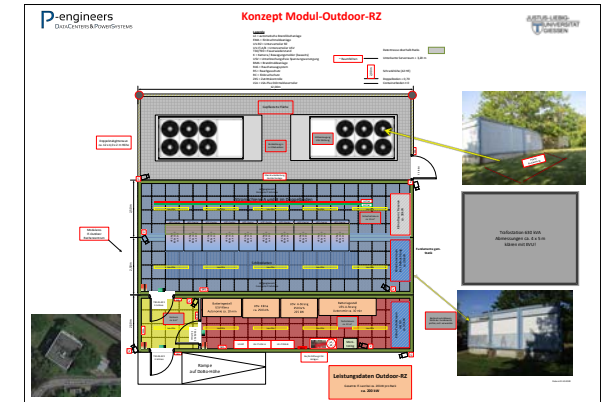
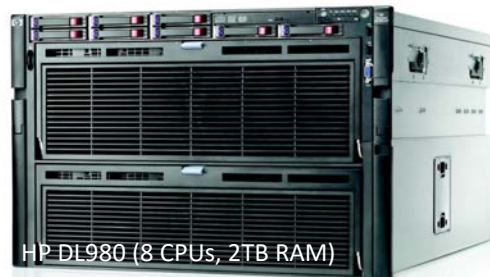
Expansion of IT Infrastructure

Extension of IT facilities

- Modular data center with 10 racks in container
- 200 kw total
- Investment of 1,5 Mio € (JLU)

Extension of de.NBI cloud

- Additional 16 PB of storage
- Compute nodes, GPU nodes, high-memory servers
- Investment of 2,2 Mio € (BMBF)



The Deep-iAMR project

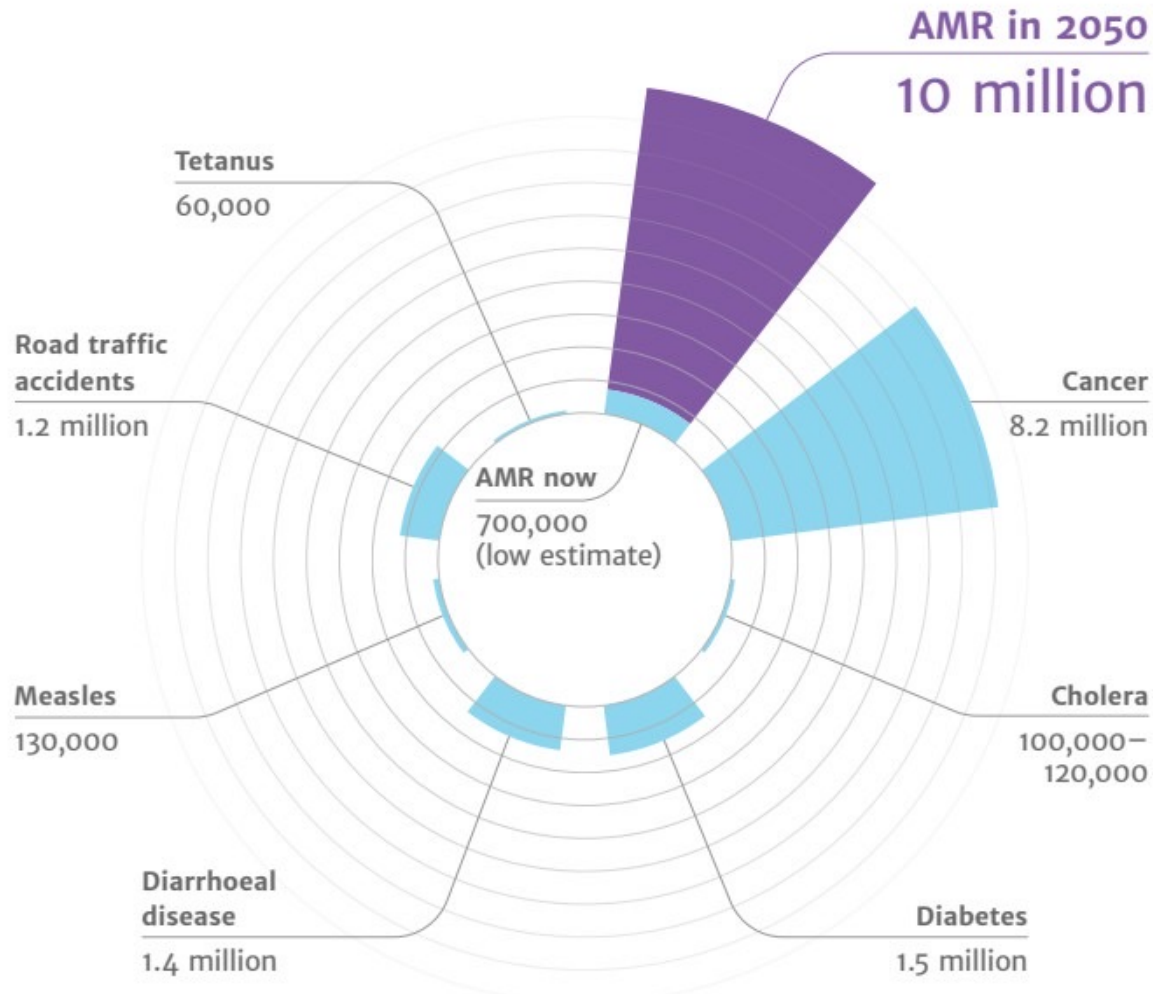
Deep-iAMR – The team

- Prof. Dr. Trinad Chakraborty (Medical Microbiology, JLU Giessen)
 - DNA sequencing, phenotypic genome characterization
 - Experimental validation
- Prof. Dr. Dominik Heider (Data Science in Biomedicine, University of Marburg)
 - Machine learning, deep learning
 - Model development, evaluation, optimization
- Prof. Dr. Alexander Goesmann (Bioinformatics and Systems Biology, JLU Giessen)
 - Genome assembly and annotation
 - Bioinformatic genome characterization
- Project duration: 2020 – 2022
- BMBF funding: 1.1 Mio €
- FKZ 031L0209A, 031L0209B



<https://www.gesundheitsforschung-bmbf.de/de/deep-iamr-identifizierung-von-neuen-antimikrobiellen-resistenz-targets-durch-deep-learning-10900.php>

Deep-iAMR – Motivation



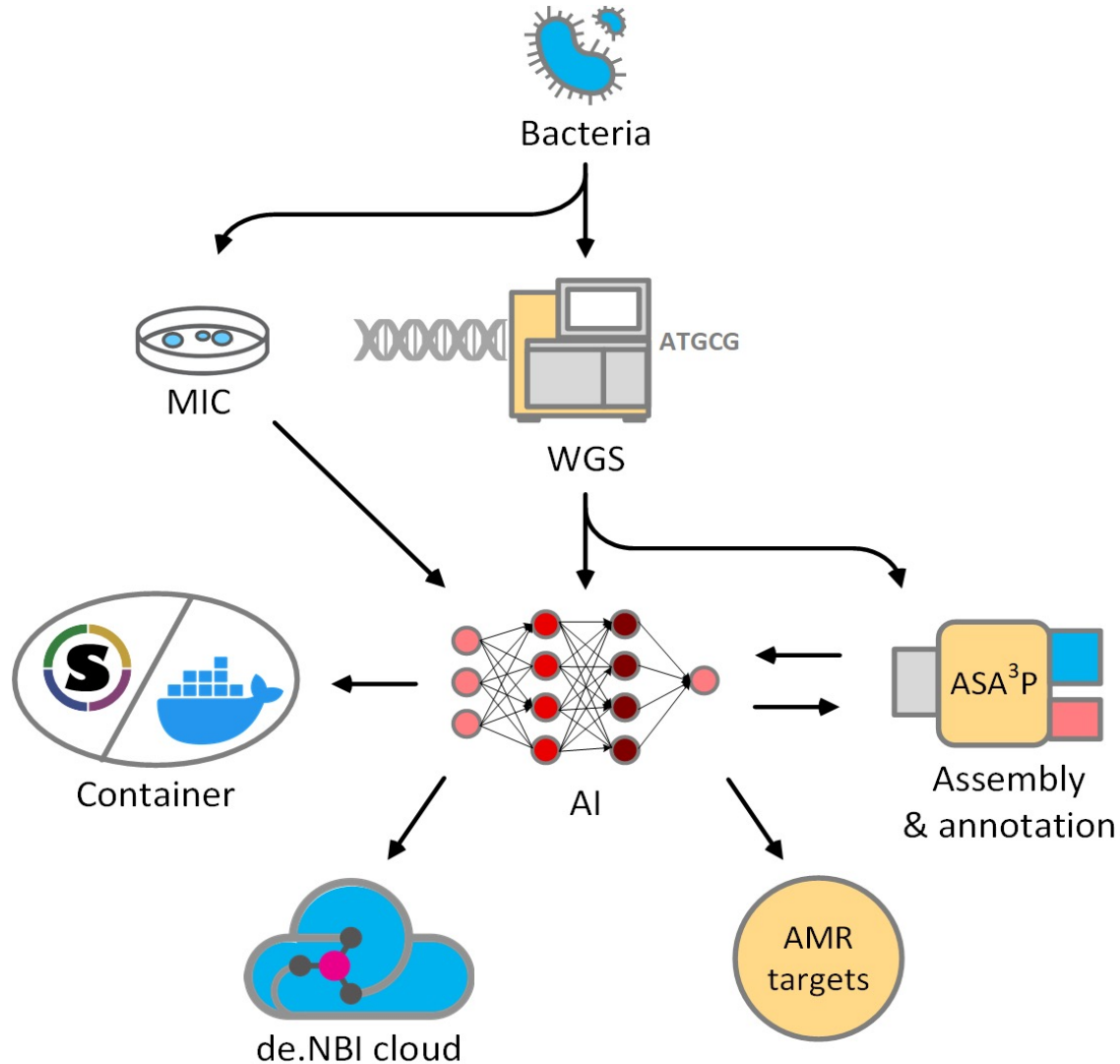
Source: <https://amr-review.org>

Bacteria ...

- are unicellular
- are omnipresent on earth
- have extremely diverse genomes
- have growth rates down to 9.8 min
- can exchange genetic material, including antibiotic resistance genes

- AMR & MDR bacteria pose a raising threat worldwide
- Even „last resort“ drugs become ineffective
- Global concern for humans, animals, environment → ONE HEALTH approach
- Potentially up to 10 M deaths per year in 2050 without effective measures

Deep-iAMR



- Sequencing of more than 1,000 *E. coli* genomes and their plasmids
- Analysis of ~1,500 public samples
- Determination of minimal inhibitory concentrations (MIC)
- Evaluation of various feature types (e.g. DNA sequence patterns, SNPs, genes)
- Construction of different machine learning models and performance evaluation
- Experimental validation
- Iterative refinement

Goal: Better characterization of resistance profiles and identification of potential new AMR targets

Bakta

Bakta Web

Rapid & standardized annotation of bacterial genomes & plasmids

Submit Jobs Viewer Info Download GitHub
(1.0.0|2.0.0)

Paste your fasta sequences here or select a fasta file from your computer below...

File auswählen AJ431260.1.fasta

Organism

Genus and species (optional) Strain (optional)

Locus prefix (optional) Locus tag prefix (optional)

Annotation

Complete genome Keep contig headers

Min contig length: 1

Translation table: 11: The Bacterial, Archaeal

Mono-/Diderm: ?

Prodigal training file: Datei auswählen Kei...ählt

Replicons

Original sequence id	Length	New sequence id	Type	Topology	Name
AJ431260.1	79370	Optional...	Contig	linear	Optional...

Submit

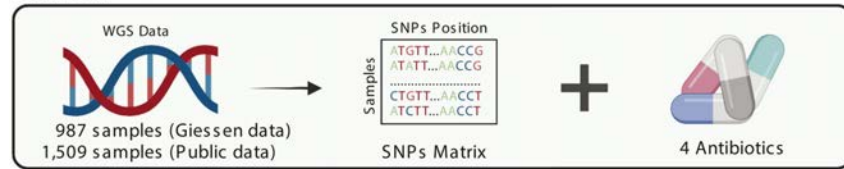
- Rapid and standardized annotation of bacterial genomes and plasmids
- Alignment-free sequence identification
- Command-line application for local installation
- Web-based portal to annotate and browse genomes
- Comprehensive feature annotation including CDS, short ORFs, tRNAs, ncRNAs, CRISPR, ...
- Runtime ~10 min for a single genome

⇒ bakta.computational.bio

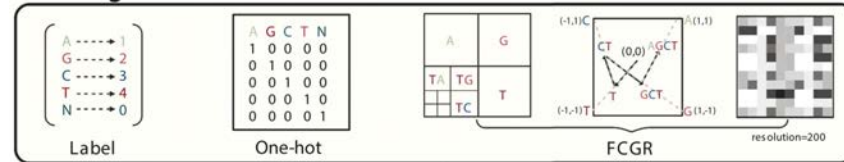
Schwengers O, Jelonek L, Dieckmann M, Beyvers S, Blom J, Goesmann A (2021) Bakta: rapid & standardized annotation of bacterial genomes via alignment-free sequence identification. *Microbial Genomics*, 7(11). DOI: 10.1099/mgen.0.000685

Prediction of antimicrobial resistance

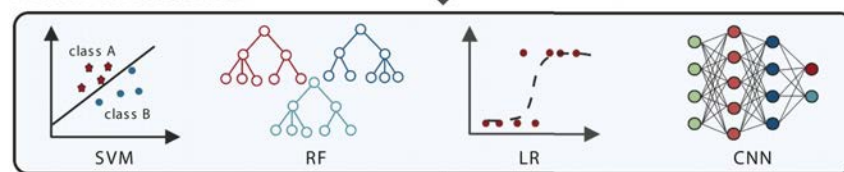
Dataset



Encoding



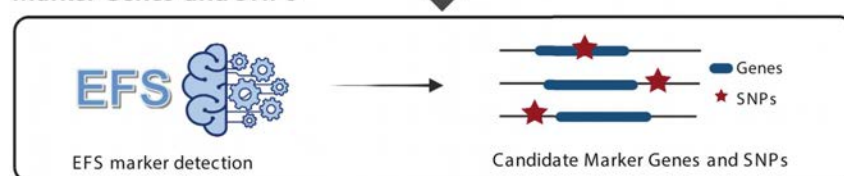
Model Construction



Evaluation



Marker Genes and SNPs



- Experimental data for 987 local samples
- Focus on four antibiotics: ciprofloxacin, cefotaxime, ceftazidime and gentamicin
- Investigation of four machine learning methods for predicting AMR to four different drugs in *E.coli* from whole-genome sequence data, here mainly SNPs
- Performance evaluation based on cross-validation on our own data and testing of model performance on public data
- Identification of candidate marker genes and SNPs
- In-depth experimental validation and further characterization ongoing

Ren Y, Chakraborty T, Doijad S, Falgenhauer L, Falgenhauer J, Goesmann A, Hauschild AC, Schwengers O, Heider D (2021) Prediction of antimicrobial resistance based on whole-genome sequencing and machine learning. *Bioinformatics*, 6:btab681.

Scientific outreach



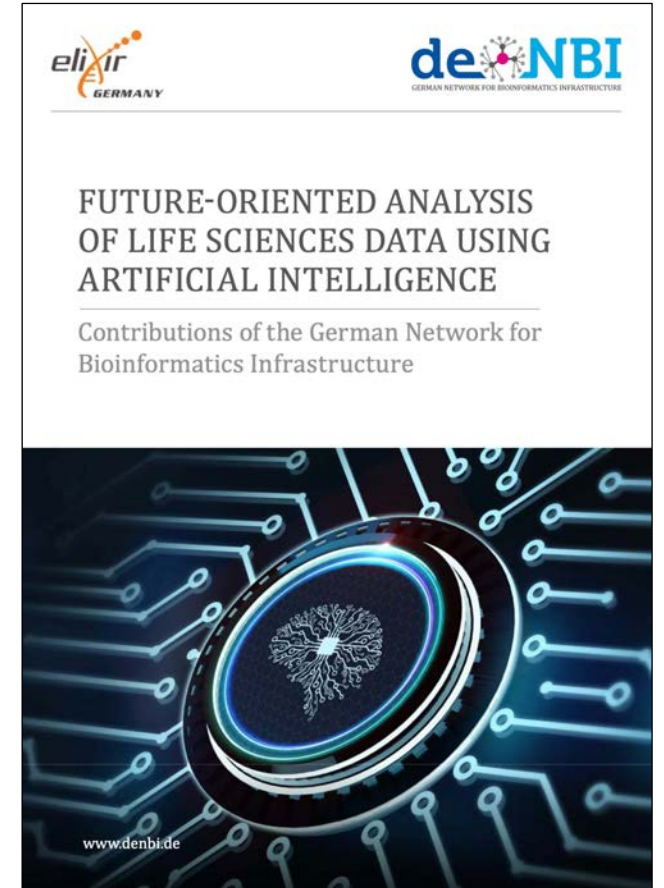
Oliver Schwengers



Can Imirzalioglu



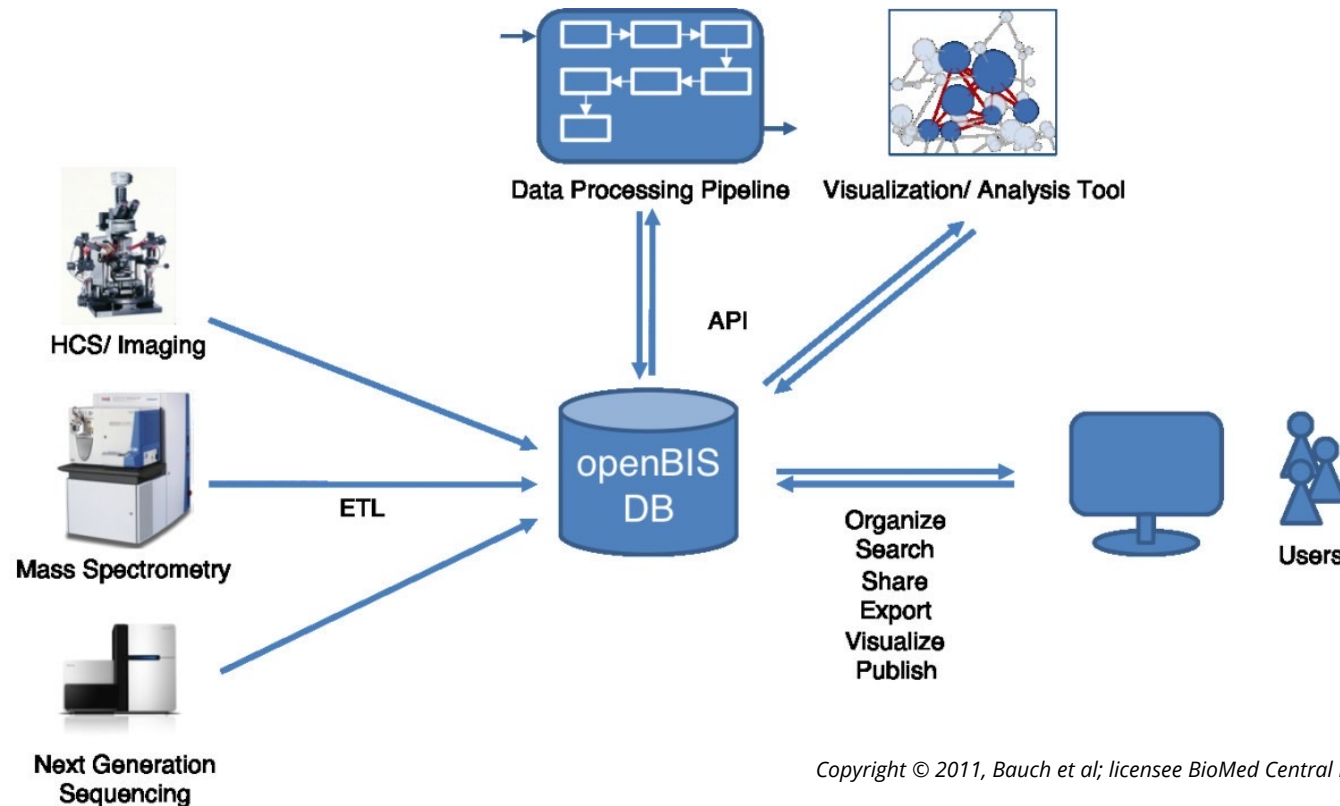
<https://www.youtube.com/watch?v=UCv8QEKwXts>



https://www.denbi.de/images/Downloads/deNBI_KI_brochure.pdf

openBIS

openBIS – System overview



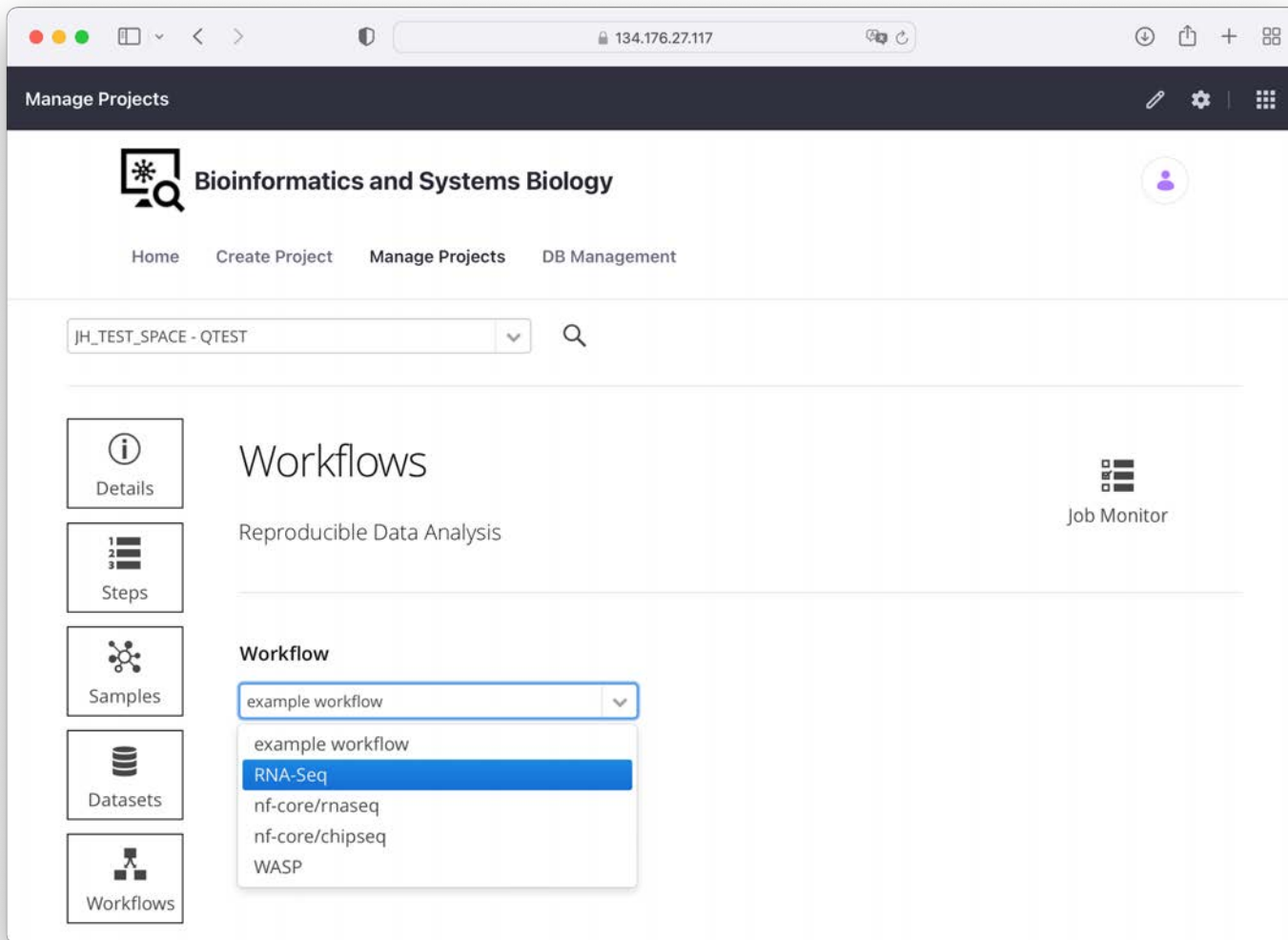
- Digital notebook
- Data management
- Inventory management
- Highly generic data schema
- Modular system design
- Access and rights management
- Support for integrated data analysis
- Excel-compatible import/export

=> openbis.ch

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Bauch A, Adamczyk I, Buczek P, Elmer FJ, Enimanev K, Glyzowski P, Kohler M, Pylak T, Quandt A, Ramakrishnan C, Beisel C, Malmström L, Aebersold R, Rinn B (2011) openBIS: a flexible framework for managing and analyzing complex data in biology research. BMC Bioinformatics, 12:468.

openBIS – Current work



- Local installation & system configuration
- Scalable setup
- Access to HPC & storage
- Data encryption based on Crypt4GH
- Development & integration of workflow registry

Thanks for your attention!

Contact: alexander.goesmann@cb.jlug.de

Homepage: www.computational.bio



Federal
state of
Hesse

