

# Next Generation Sequencing and

## **Bioinformatics Analysis Pipelines**

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## Today's lecture

- Management of NGS data at NGI/SciLifeLab
- Examples of analysis pipelines:
  - Human exome & whole genome sequencing
  - Assembly using long reads
  - Clinical routine sequencing















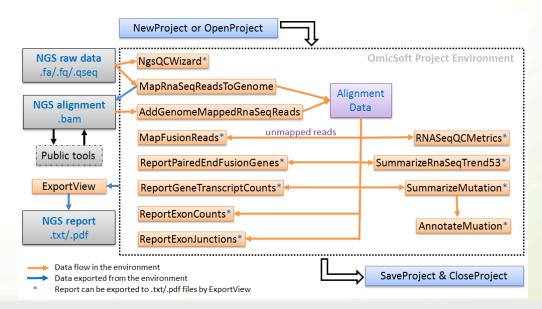


## What is an analysis pipeline?

Basically just a number of steps to analyze data



Pipelines can be simple or very complex...







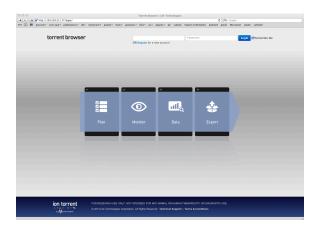






## Some analysis pipelines for NGS data

## **Ion Torrent**Torrent Suite Software



**Illumina** GATK, Galaxy,...



**PacBio**SMRT analysis portal



- Enables variant calling, de novo assembly, RNA expression analyses, ...
- Many other tools exists, also from commercial vendors





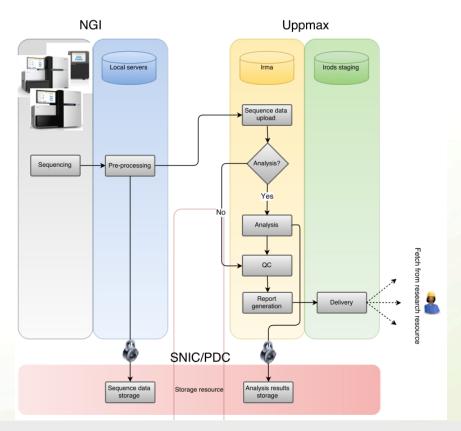






## Data processing at NGI

- Raw data from is processed in automated pipelines
- Delivered to user accounts at UPPNEX













## In-house development of pipelines

- In some cases NGI develops own pipelines
- But only when we see a need for a specific analysis

#### Some examples follows:

- I. Building a local variant databases (WES/WGS)
- II. Assembly of genomes using long reads
- III. Clinical sequencing Leukemia Diagnostics



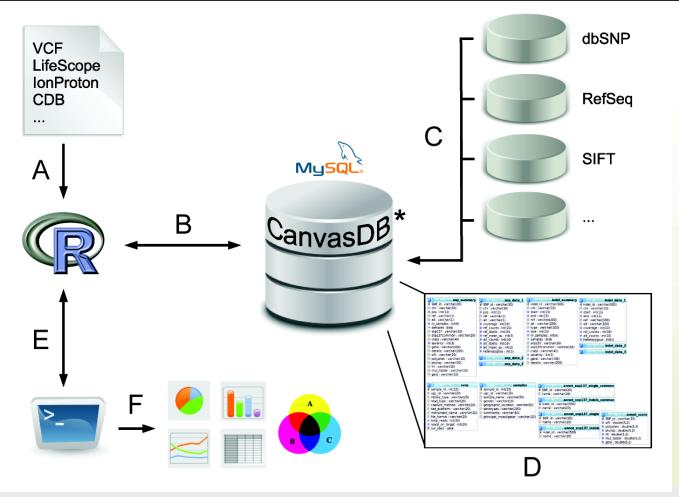








## Example I: Computational infrastructure for exome-seq data













## Background: exome-seq

- Main application of exome-seq
  - Find disease causing mutations in humans

#### Advantages

- Allows investigate all protein coding sequences
- Possible to detect both SNPs and small indels
- Low cost (compared to WGS)
- Possible to multiplex several exomes in one run
- Standardized work flow for data analysis

#### Disadvantage

All genetic variants outside of exons are missed (~98%)







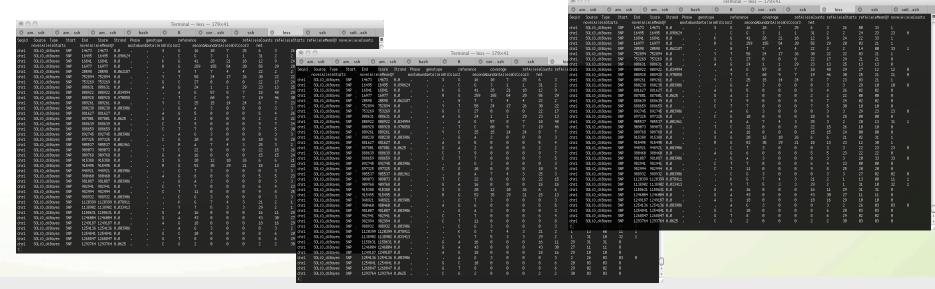




## Exome-seq throughput

- We are producing a lot of exome-seq data
  - 4-6 exomes/day on Ion Proton
  - In each exome we detect
    - Over 50,000 SNPs
    - About 2000 small indels
  - => Over 1 million variants/run!
    - In plain text files









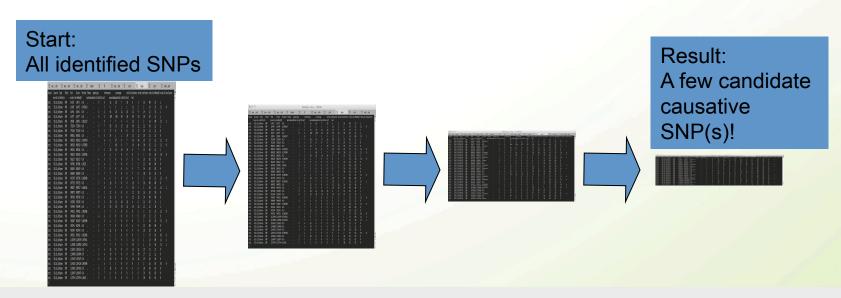






## How to analyze this?

- Traditional analysis A lot of filtering!
  - Typical filters
    - Focus on rare SNPs (not present in dbSNP)
    - Remove FPs (by filtering against other exomes)
    - Effect on protein: non-synonymous, stop-gain etc
    - Heterozygous/homozygous
  - This analysis can be automated (more or less)













## Why is this not optimal?

#### Drawbacks

- Work on one sample at time
  - Difficult to compare between samples
- Takes time to re-run analysis
  - When using different parameters
- No standardized storage of detected SNPs/indels
  - Difficult to handle 100s of samples
- Better solution
  - A database oriented system
    - Both for data storage and filtering analyses



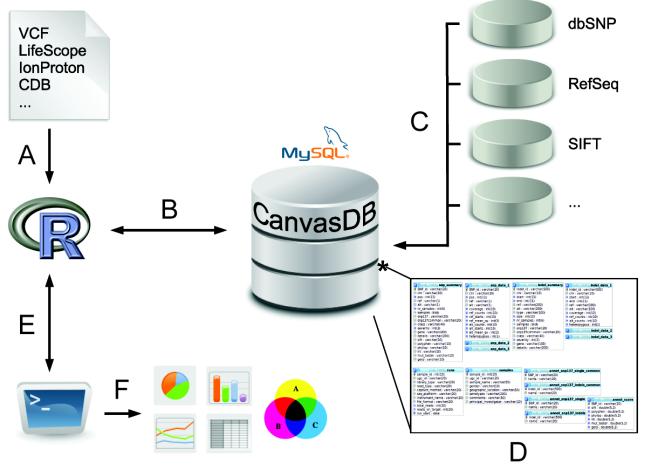








## Analysis: In-house variant database



\*CANdidate Variant Analysis System and Data Base

Ameur et al., Database Journal, 2014



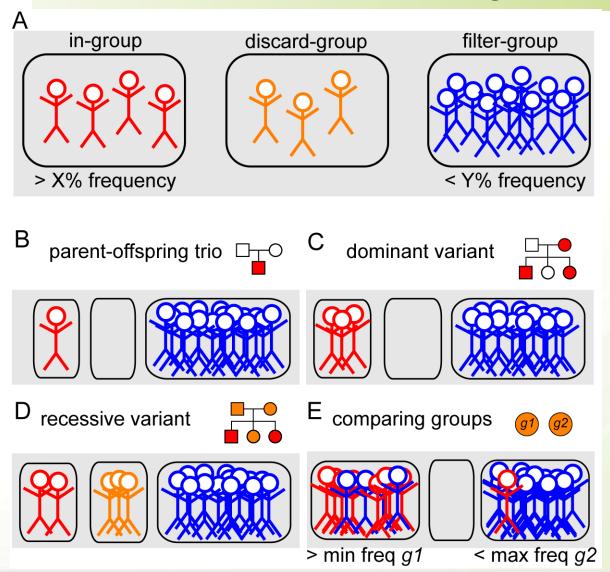








## CanvasDB - Filtering







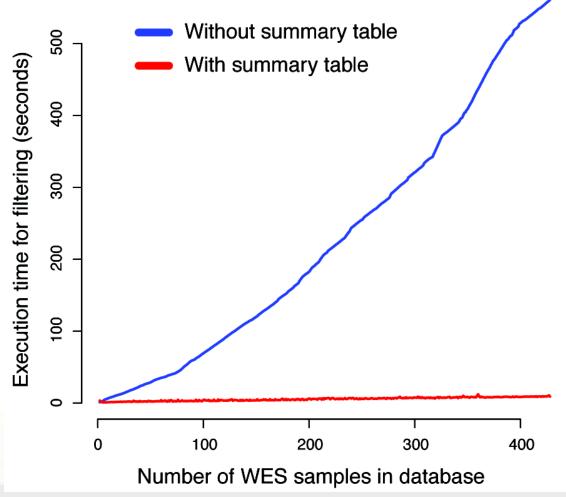






## CanvasDB - Filtering speed

Rapid variant filtering, also for large databases







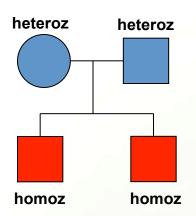






## An exome-seq project

- Hearing loss: 2 affected brothers
  - Likely a rare, recessive disease
  - => Shared homozygous SNPs/indels



- Sequencing strategy
  - TargetSeq exome capture
  - One sample per PI chip



nr reads	(% mapped)	76M-89M (97%)
mapped reads	(% on target)	73M-88M (83%)
SNPs	(% in dbSNP)	85k-93k (93%)
Indels	(% in dbSNP)	5k-6k (48%)





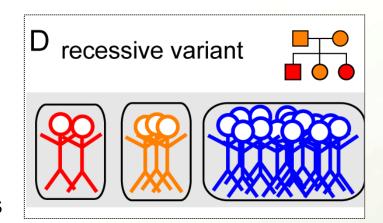


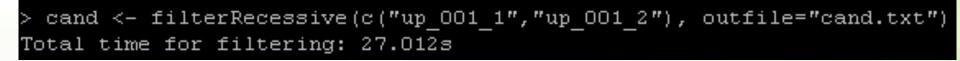




## Filtering analysis

- CanvasDB filtering for a variant that is...
  - rare
    - at most in 1% of ~700 exomes
  - shared
    - found in both brothers
  - homozygous
    - in brothers, but in no other samples
  - deleterious
    - non-synonymous, frameshift, stop-gain, splicing, etc...









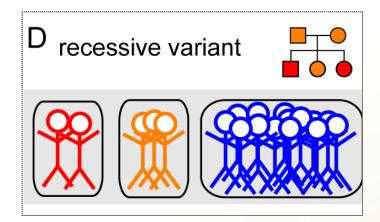






## Filtering results

- Homozygous candidates
  - 2 SNPs
    - stop-gain in STRC
    - non-synonymous in PCNT
  - 0 indels



- Compound heterozygous candidates (lower priority)
  - in 15 genes

```
        sample_name
        class
        chr
        pos
        ref
        alt
        snp137
        gene
        ref_counts
        alt_counts

        up_001_1
        stopgain
        chr15
        43896948
        G
        A rs144948296
        STRC
        3
        55

        up_001_2
        stopgain
        chr15
        43896948
        G
        A rs144948296
        STRC
        5
        55

        up_001_1
        nonsynonymous
        chr21
        47808772
        G
        A rs35044802
        PCNT
        1
        14
```

=> Filtering is fast and gives a short candidate list!











## STRC - a candidate gene

#### STRC

From Wikipedia, the free encyclopedia

Stereocilin is a protein that in humans is encoded by the STRC gene. [1][2][3]

This gene encodes a protein that is associated with the hair bundle of the sensory hair cells in the inner ear. The hair bundle is composed of stiff microvilli called stereocilia and is involved with mechanoreception of sound waves. This gene is part of a tandem duplication on chromosome 15; the second copy is a pseudogene. Mutations in this gene cause autosomal recessive non-syndromic deafness.<sup>[3]</sup>

=> Stop-gain in STRC is likely to cause hearing loss!



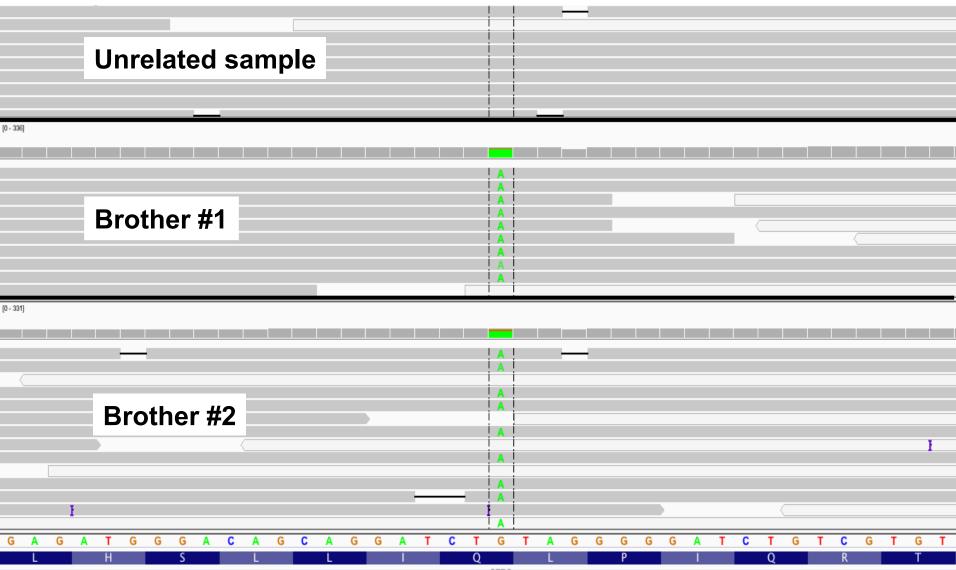








## IGV visualization: Stop gain in STRC













## STRC, validation by Sanger

• Sanger validation

Stop-gain site

\*A04\_0\_032 Fragment base #172. Base 172 of 366 \*

T C C C C T A N A G A T C C T G C T G T C C A T C T C

Brother #1

\*A05\_0\_047 Fragment base #168. Base 168 of 363 \*

T C C C C T A N A G A T C C T G C T G T C C C A T C T C

Brother #2

\*Brother #2

- Does not seem to be homozygous..
  - Explanation: difficult to sequence STRC by Sanger
    - Pseudo-gene with very high similarity
- New validation showed mutation is homozygous!!











### CanvasDB – some success stories

#### Solved cases, exome-seq - Niklas Dahl/Joakim Klar

Neuromuscular disorder NMD11
Artrogryfosis SKD36
Lipodystrophy ACR1
Achondroplasia ACD2
Ectodermal dysplasia ED21

Ectodermal dysplasia ED21 Achondroplasia ACD9

Ectodermal dysplasiaED1ArythrodermaAV1IchthyosisSD12

Muscular dystrophy DMD7
Neuromuscular disorder NMD8

Welanders myopathy (D) W

Skeletal dysplasia SKD21

Visceral myopathy (D) D:5156

Ataxia telangiectasia MR67

Exostosis SKD13

Alopecia AP43

Epidermolysis bullosa SD14

Hearing loss D:9652











Success rate >80% for

recent Proton projects!

## CanvasDB - Availability

CanvasDB system freely available on GitHub!

#### Installation of the CanvasDB system

This section describes how to download and install CanvasDB on your local computer. Make sure that MySQL, R and ANNOVAR are running on your computer before starting the installation.

Step 1. Download code from github

```
$ git clone https://github.com/UppsalaGenomeCenter/CanvasDB.git
$ cd CanvasDB
```

Step 2. Set the current path to 'rootDir' in canvasDB.R











## Next Step: Whole Genome Sequencing



Capacity of HiSeq X Ten: 320 whole human genomes/week!!!

⇒ More work on pipelines and databases needed!











## Whole Genome Sequencing Projects

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#### UK to launch 100,000 genomes project as Obama backs DNA drive

Fri. Jan 30 2015

- \* Genomes project starts recruitment in England on Feb. 2
- \* U.S. to analyse genetic data from 1 million Americans

#### By Ben Hirschler

LONDON, Jan 30 (Reuters) - Gene research is getting a boost on both sides of the Atlantic, with scientists in England set to launch a project on Feb. 2 to analyse 100,000 entire human genomes and U.S. President Barack Obama backing a big new DNA data drive.

The twin projects show the accelerating work by researchers to understand the underlying basis of diseases and develop medicines targeted to the genetic profile of individual patients.

Obama will announce the U.S. plan to analyse genetic information from more than 1 million American volunteers on Friday as a central part of an initiative to promote so-called precision medicine, officials said.

The 100,000 genomes project in England, meanwhile, was first unveiled by the British government two years ago -- but the 11 centres charged with collecting samples will only begin full-scale recruitment from next week. The aim is to complete the programme by the end of 2017.

Such large-scale genomic research has become possible because the cost of genome sequencing has plummeted in recent years to around \$1,000 per genome. That is a far cry from 15 years ago when it cost some \$3 billion to get the first human genome.

In the case of the British project, all the sequencing will be carried out by U.S. biotech company Illumina, which has pioneered fast and cheap technology to read genetic code.

The 100,000 genomes project is focusing on patients with rare diseases, and their families, as well as people with common cancers. The idea is to tease out the common drivers of disease to help develop better drugs and diagnostic tests.

In addition to helping doctors understand more about disease, the government also hopes the scheme will make the state-run National Health Service a world leader in science and boost Britain's life sciences industry.

The project will actually recruit around 75,000 participants, rather than 100,000, since people with cancer will provide two genomes -- one derived from the healthy cells in their body and one from their tumour. By comparing the two, experts hope to find the exact genetic changes causing cancer. (Editing by Susan Thomas)

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#### PERSPECTIVE

## Big Data: Astronomical or Genomical?

**Table 1. Four domains of Big Data in 2025.** In each of the four domains, the projected annual storage and computing needs are presented across the data lifecycle.

Astronomy 25 zetta-bytes/year	Twitter	YouTube	Genomics
25 zotta hytochroar			
25 Zella-byles/yeal	0.5-15 billion tweets/year	500-900 million hours/year	1 zetta-bases/year
1 EB/year	1-17 PB/year	1-2 EB/year	2-40 EB/year
In situ data reduction	Topic and sentiment mining	Limited requirements	Heterogeneous data and analysis
Real-time processing	Metadata analysis		Variant calling, ~2 trillion central processing unit (CPU) hours
Massive volumes			All-pairs genome alignments, ~10,000 trillion CPU hours
Dedicated lines from antennae to server (600 TB/s)	Small units of distribution	Major component of modern user's bandwidth (10 MB/s)	Many small (10 MB/s) and fewer massive (10 TB/s) data movement
	In situ data reduction  Real-time processing  Massive volumes  Dedicated lines from antennae	1 EB/year In situ data reduction Topic and sentiment mining Real-time processing Metadata analysis  Massive volumes  Dedicated lines from antennae Small units of	1 EB/year 1-17 PB/year 1-2 EB/year In situ data reduction Topic and sentiment mining Real-time processing Metadata analysis  Massive volumes  Dedicated lines from antennae Small units of Major component of modern user's

doi:10.1371/journal.pbio.1002195.t001

## Analysis of WGS data @ SciLifeLab

We have a working group for WGS at SciLifeLab!

wgs-toolbox@scilifelab.se

Contacts with Genomics England initiated for analyses



















#### The SciLifeLab Human WGS Initiative

- WGS of patient cohorts (n=10,000 ind/year)
- Genetic Variant Database for the Swedish Population (n=1000)



















## The Swedish Genetic Variant Project

- A. Identify a cohort that reflects the genetic structure of the Swedish population
- B. Generate WGS data using short- and long-read MPS technologies
- C. Establish a user-friendly database to make information available to the research community (association analyses) and clinical genetics laboratories.

















## Twin Registry samples used as control cohort

- Inclusion based on twinning
- Distribution like population density

- General population-prevalence of disease
- 10,000 individuals have been analysed with SNP arrays

Identify 1,000 individuals based on genetic structure and diversity across Sweden









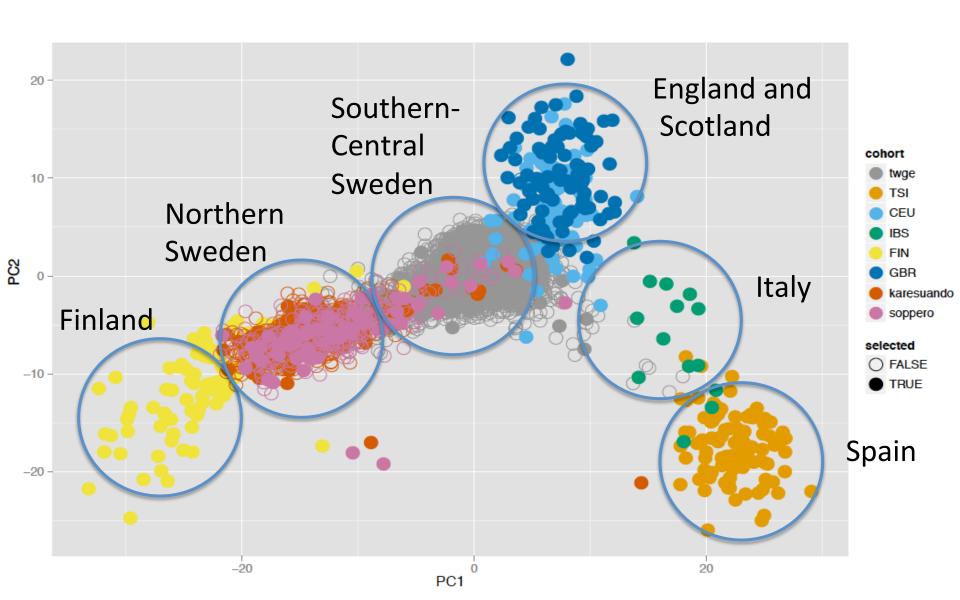








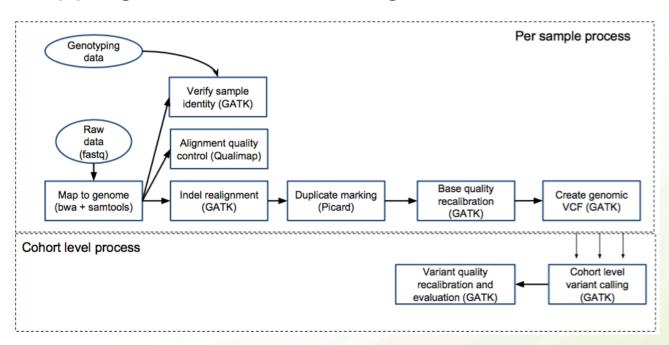
## Principal components of European samples from 1,000 genomes project and 10,000 Swedish samples



### Illumina WGS of Swedish control cohort

Step 1: 30X Illumina data of the 1,000 individuals

Step 2: Mapping and variant calling



Step 3: Making genotype frequencies available for download



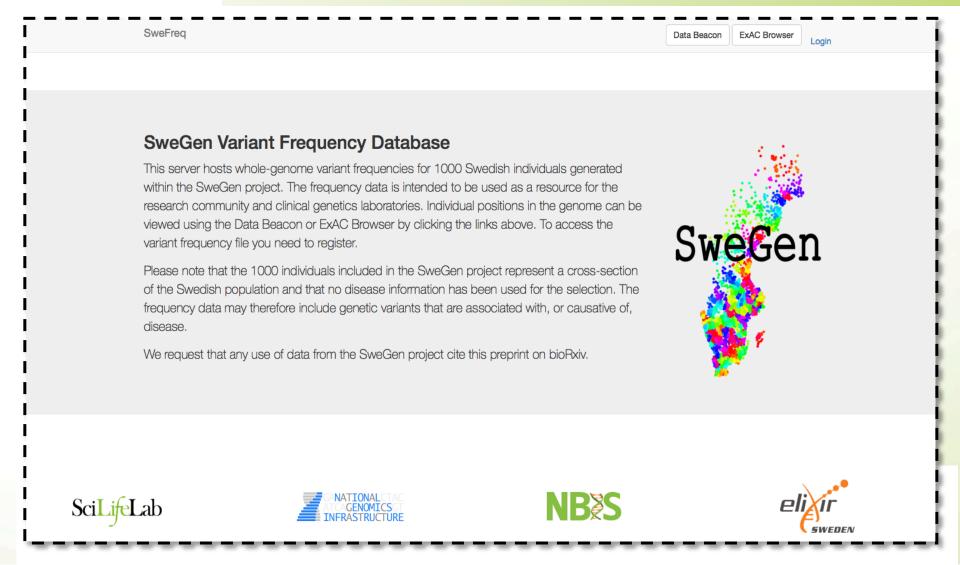








## Making frequency data available



Aggregated frequencies now available from swefreq.nbis.se!

## Example II:

## Assembly of genomes using Pacific Biosciences













## Genome assembly using NGS

- Short-read de novo assembly by NGS
  - Requires mate-pair sequences
    - Ideally with different insert sizes
  - Complicated analysis
    - Assembly, scaffolding, finishing
    - Maybe even some manual steps
  - => Rather expensive and time consuming
- Long reads really makes a difference!!
  - We can assemble genomes using PacBio data only!





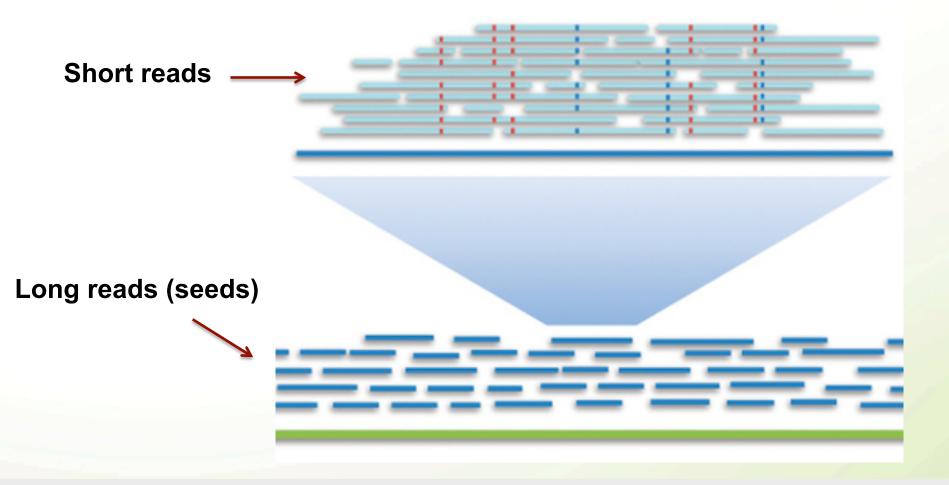






## HGAP de novo assembly

HGAP uses both long and shorter reads







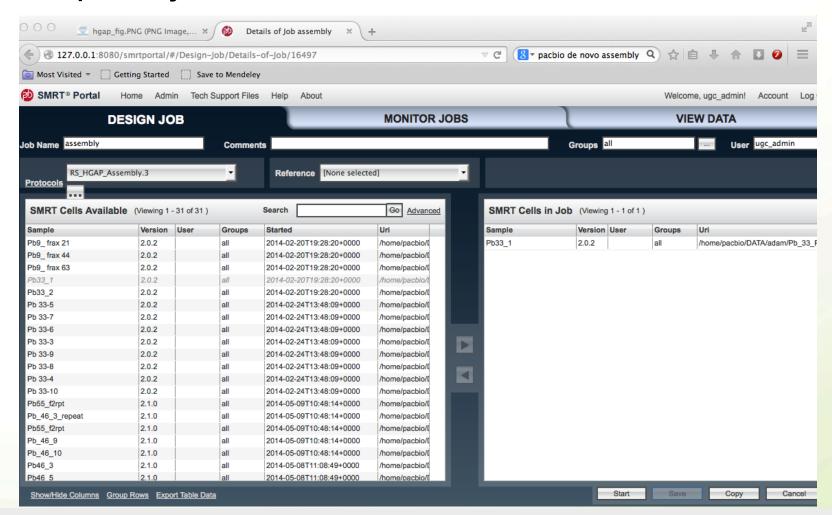






## PacBio assembly analysis

Simple -- just click a button!!







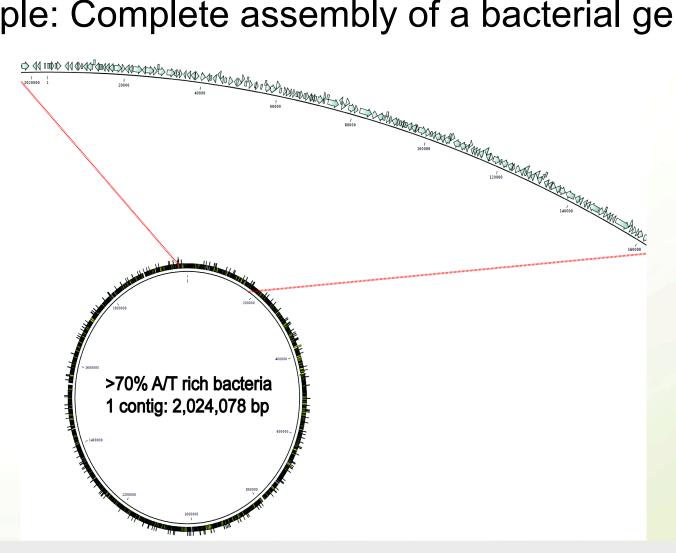






## PacBio assembly, example result

Example: Complete assembly of a bacterial genome













### PacBio assembly – recent developments

Also larger genomes can be assembled by PacBio..

2013 2014 Spinach<sup>5</sup> 1 Gb Contig N50 Drosophila4 531 kb 170 Mb Arabidopsis<sup>3</sup> Contig N50 120 Mb Yeast2 4.5 Mb Contig N50 Bacteria<sup>1</sup> 12 Mb 7.1 Mb 1-10 Mb Resolve most Human<sup>6</sup> Finished chromosomes 3.2 Gb Genomes Contig N50 4.4 Mb Max=44 Mb (Assembly powered by Google Cloud)





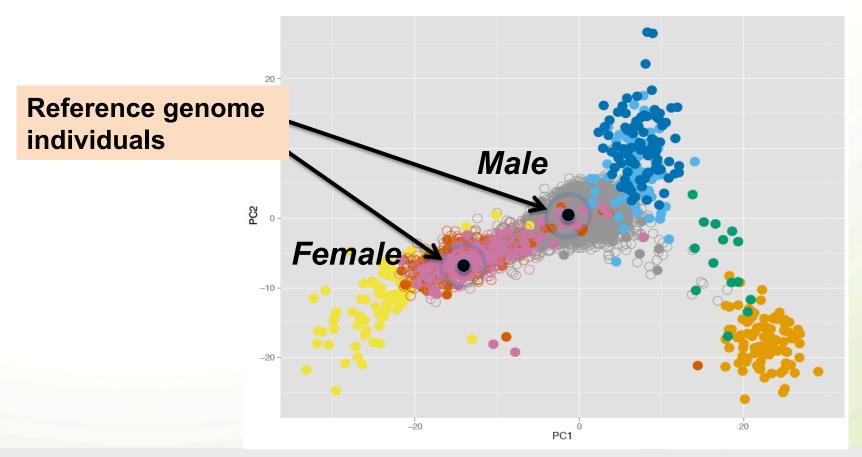






### De novo WGS of Swedish cohort

Establish Swedish reference genome sequences by *de novo* assembly of long-reads: *PacBio+BioNano+10X Genomics* 













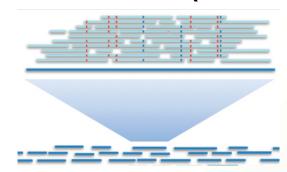
### De novo assembly of 75X PacBio data

Assembly (FALCON)

**Error correction (2 x Quiver)** 



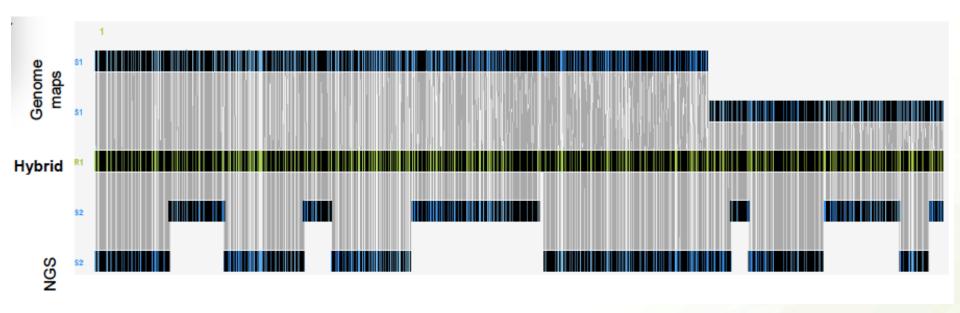




**Analysis time: 1 month/genome** 

	Individual 1	Individual 2
Assembly size	3,039,619,582	3,024,752,299
Nr contigs	11,249	11,601
Longest contig	36,8 Mb	54,1 Mb
N50	8,9 Mb	8,3 Mb

### Hybrid scaffolding, PacBio + BioNano

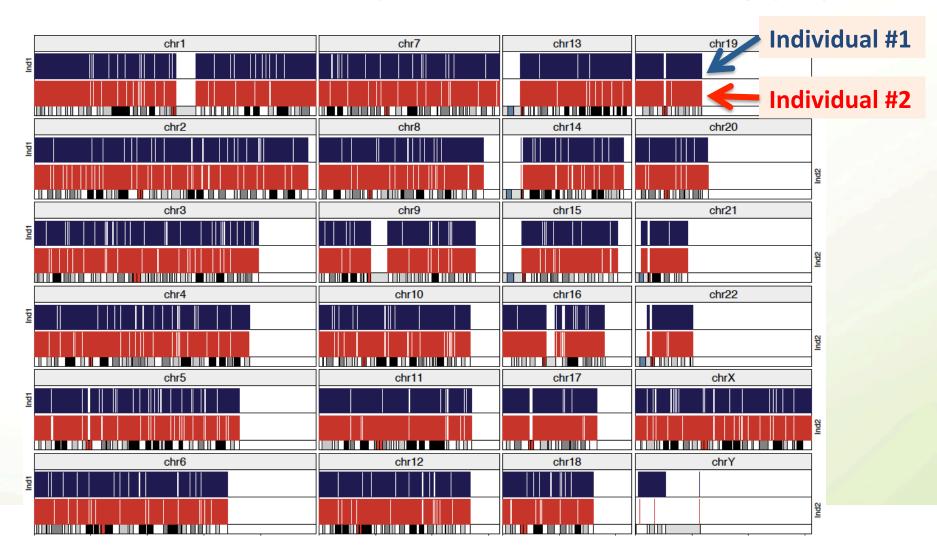


Hybrid scaffolding with two labellings resulted in

- 3,1 Gb assembly, 51 Mb N50 (for individual #1)
- 3,1 Gb assembly, 46 Mb N50 (for individual #2)

### Aligning contigs to human reference

> 99% of bases can be aligned to human reference (hg38)



### Example III:

## Clinical sequencing for Leukemia Treatment









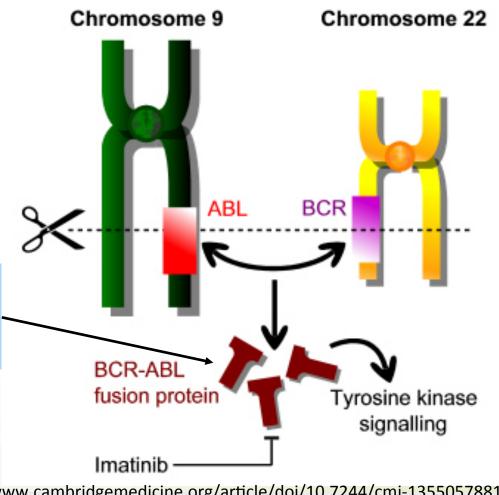




## Chronic Myeloid Leukemia

BCR-ABL1 fusion protein – a CML drug target

The BCR-ABL1 fusion protein can acquire resistance mutations following drug treatment









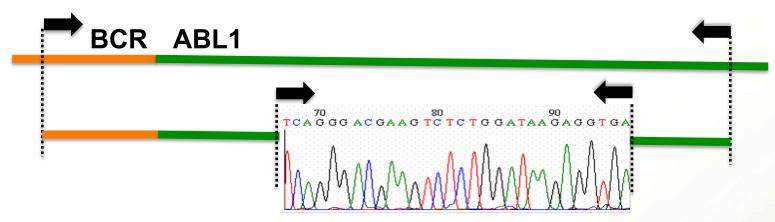






### Traditional mutation screening in BCR-ABL1

Nested PCR and Sanger sequencing:



### Limitations:

- Mutations at frequencies below 10-20% not seen
- Biases may be introduced by nested PCR
- Whole BCR-ABL1 fusion transcript not sequenced
- Clonal composition of mutations not determined

















### Our clinical diagnostics pipeline for BCR-ABL1

Cavelier et al. BMC Cancer (2015) 15:45 DOI 10.1186/s12885-015-1046-v



#### RESEARCH ARTICLE

**Open Access** 

# Clonal distribution of *BCR-ABL1* mutations and splice isoforms by single-molecule long-read RNA sequencing

Lucia Cavelier<sup>1\*†</sup>, Adam Ameur<sup>1†</sup>, Susana Häggqvist<sup>1</sup>, Ida Höijer<sup>1</sup>, Nicola Cahill<sup>1</sup>, Ulla Olsson-Strömberg<sup>2</sup> and Monica Hermanson<sup>1</sup>

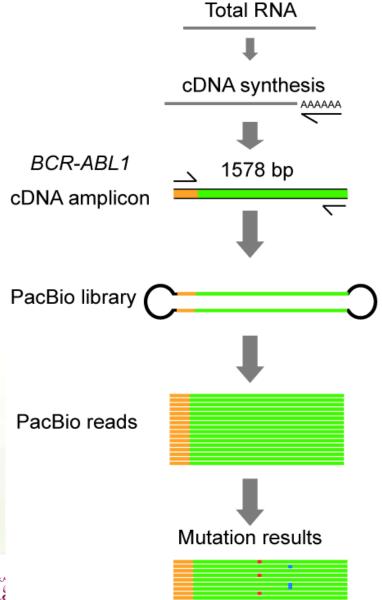
#### Abstract

**Background:** The evolution of mutations in the *BCR-ABL1* fusion gene transcript renders CML patients resistant to tyrosine kinase inhibitor (TKI) based therapy. Thus screening for *BCR-ABL1* mutations is recommended particularly in patients experiencing poor response to treatment. Herein we describe a novel approach for the detection and surveillance of *BCR-ABL1* mutations in CML patients.

Methods: To detect mutations in the BCR-ABL1 transcript we developed an assay based on the Pacific Biosciences (PacBio) sequencing technology, which allows for single-molecule long-read sequencing of BCR-ABL1 fusion transcript molecules. Samples from six patients with poor response to therapy were analyzed both at diagnosis and follow-up. cDNA was generated from total RNA and a 1,6 kb fragment encompassing the BCR-ABL1 transcript was amplified using long range PCR. To estimate the sensitivity of the assay, a serial dilution experiment was performed.

Results: Over 10,000 full-length BCR-ABL1 sequences were obtained for all samples studied. Through the serial dilution analysis, mutations in CML patient samples could be detected down to a level of at least 1%. Notably, the assay was determined to be sufficiently sensitive even in patients harboring a low abundance of BCR-ABL1 levels. The PacBio sequencing successfully identified all mutations seen by standard methods. Importantly, we identified several mutations that escaped detection by the clinical routine analysis. Resistance mutations were found in all but one of the patients. Due to the long reads afforded by PacBio sequencing, compound mutations present in the same molecule were readily distinguished from independent alterations arising in different molecules. Moreover, several transcript isoforms of the BCR-ABL1 transcript were identified in two of the CML patients. Finally, our assay allowed for a quick turn around time allowing samples to be reported upon within 2 days.

**Conclusions:** In summary the PacBio sequencing assay can be applied to detect *BCR-ABL1* resistance mutations in both diagnostic and follow-up CML patient samples using a simple protocol applicable to routine diagnosis. The method besides its sensitivity, gives a complete view of the clonal distribution of mutations, which is of importance when making therapy decisions.







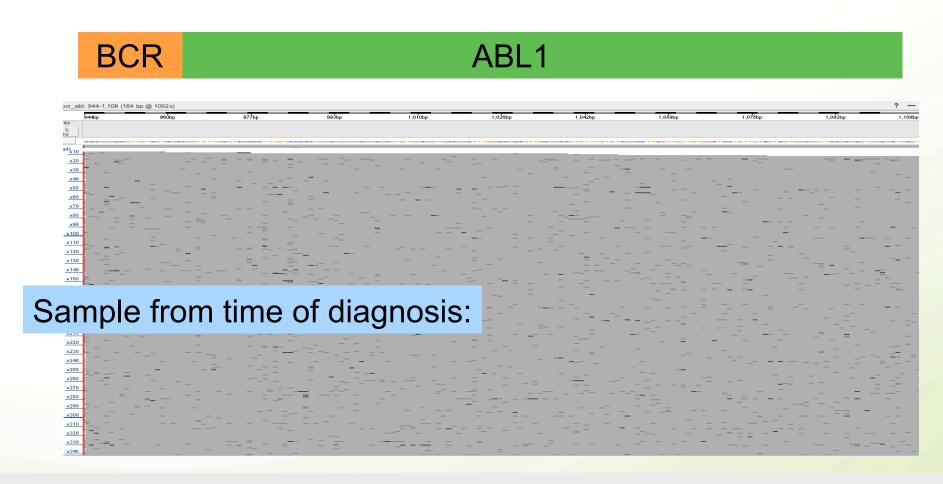






### BCR-ABL1 mutations at diagnosis

PacBio sequencing generates ~10 000X coverage!





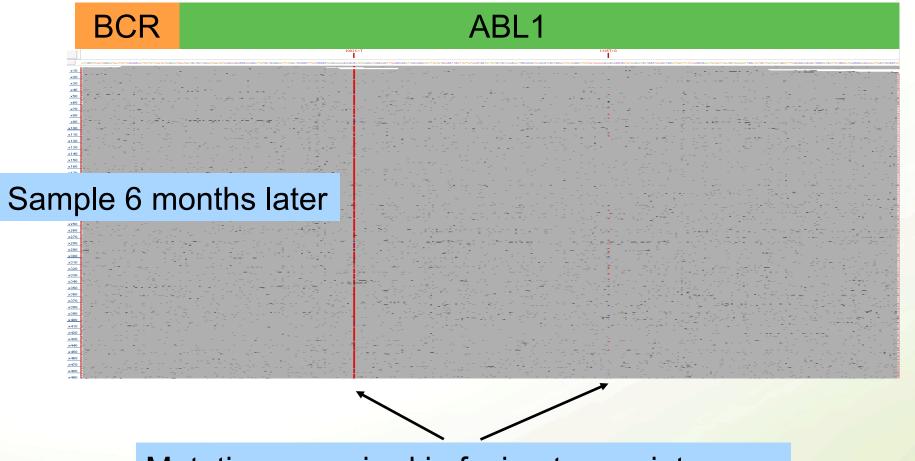


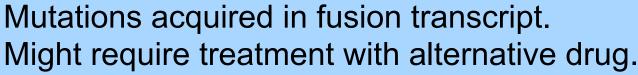






### BCR-ABL1 mutations in follow-up sample









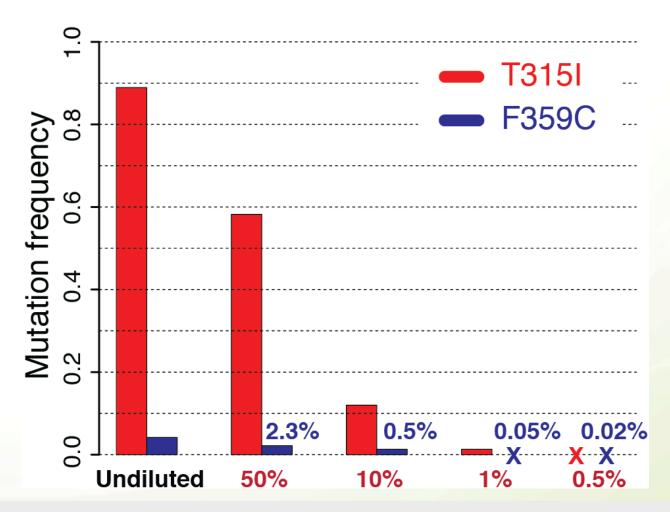






### BCR-ABL1 dilution series results

Mutations down to 1% detected!





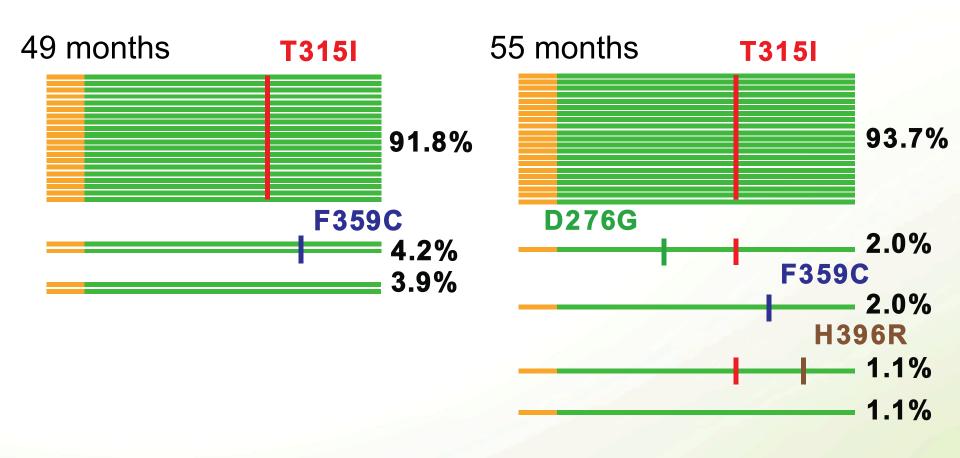








### **BCR-ABL1 - Compound mutations**



















### Analysis method for BCR-ABL1 mutations

Create CCS reads and screen all known resistance mutations

CAVA analysis - count number of WT and MUT sequences

WT sequence: TATATCATCACTGAGTTCATG

MUT sequence: TATATCATCATTGAGTTCATG

BCR-ABL1 resistance mutation

- Classify each mutation
  - Less than 500X coverage => Unresolved
  - At least 0.5% mutation frequency => Positive
  - Otherwise => **Negative**









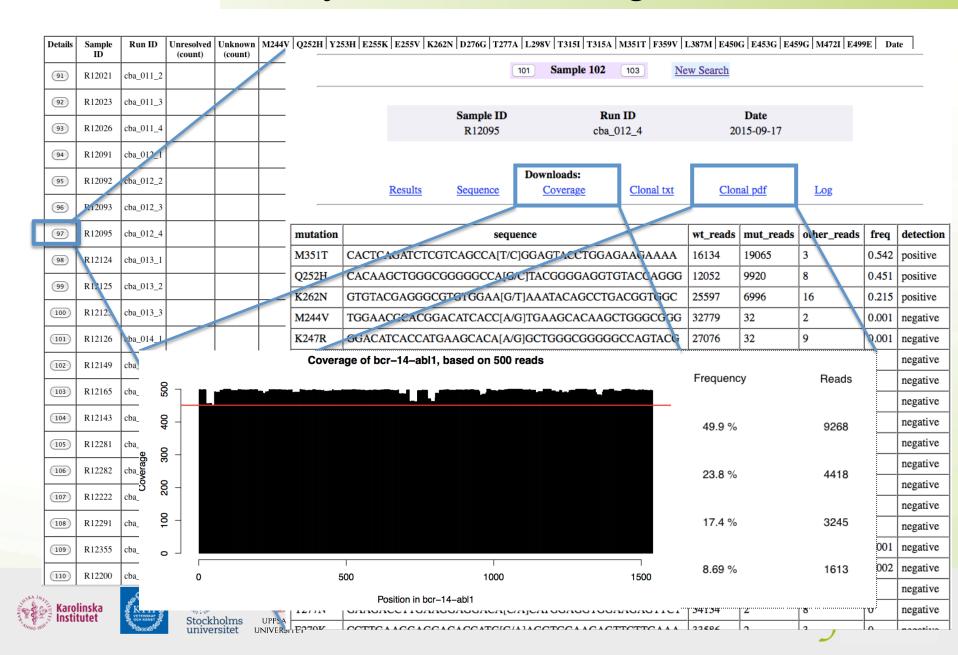








### Web system for sharing results



### Clinical Diagnosis of BCR-ABL1 mutations

### **Clinical Genetics**



- Collection of samples
- Seq library preparation

### **Sequencing Facility**



- SMRT sequencing
- CAVA analysis

### IT developers



 Web server for results

- Ongoing routine service, 0-4 samples/week.
- Over 150 patient samples run so far
- 100% consistency with Sanger results















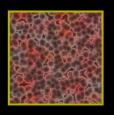


## What we sequence at NGI /

## SciLifeLab





















































Alzheimer's disease

Whole-genome sequencing

Gene therapy Infection screen

Whole-transcriptome sequencing

Target sequencing

Cancer prognosis

**Gene regulation** 

Crohn's disease

**Genomics of ageing** 

**Exome sequencing** 

Schizophrenia

**Cancer diagnostics** 

Organ donor matching

**Gut microflora** 

**Gene fusions** 

RNA editing

HCV

Scoliosis

Immune response

**Monogenic disorders** 

Sudden infant death

**Cervical cancer** 

Lynch syndrom

Leukemia **Scoliosis** 

**HLA typing** 

Dvslexia

MRSA / BRSA screen

Sudden cardiac arrest

Transcriptional regulation **Prenatal diagnostics** 

**Muscle dystrophy** Individualised cancer therapy

and much more...











