



GÖTEBORGS
UNIVERSITET

Bioinformatics
Core Facility

IDENTIFYING A DISEASE CAUSING MUTATION

Targeted resequencing

MARCELA DAVILA

3/MZO/2016

Core Facilities at Sahlgrenska Academy

Core Facilities

The Sahlgrenska Academy Core Facilities consist of seven centres, each offering access to advanced research infrastructures for all researchers.



The individual centres

Bioinformatics

Centre for Cellular Imaging (CCI)

Centre for Physiology and Bio-imaging (CPI)

Genomics

Laboratory for Experimental Biomedicine (EBM)

Mammalian Protein Expression (MPE)

Proteomics

Contact Information

Address

The Sahlgrenska Academy, Core Facilities, Box 413, SE 405 30 Göteborg, Sweden

[Contact form](#)

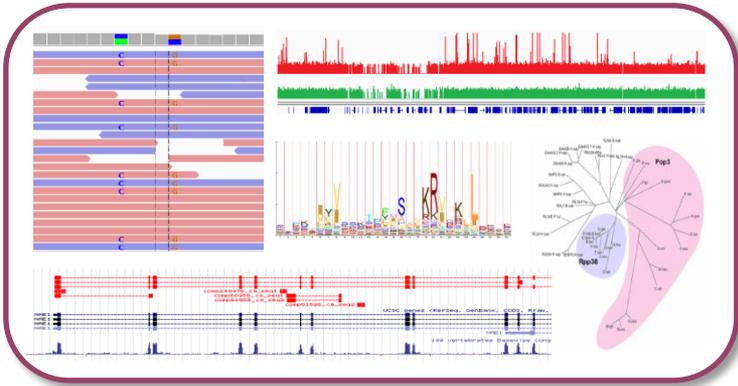


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Bioinformatics Core Facility

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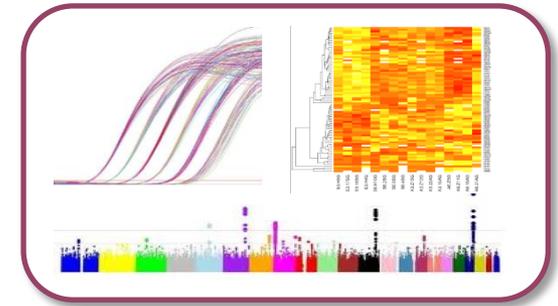
Bioinformatics



Software



Statistics



bioinformatics@gu.se

www.cf.gu.se/english/Bioinformatics/





Increasing statistical and bioinformatics knowledge

- Personalized training (software/programming)
- Courses
 - ❖ Genomics and Bioinformatics
 - ❖ Advanced NGS data analysis
 - ❖ Perl for life science researchers
 - ❖ Unix with applications to NGS data
- Seminars and workshops





Supporting local bioinformaticians

Master's thesis projects

Currently available projects

Analysis of the Ig heavy chain repertoire in the absence of SL chain
([project plan](#))

Contact: [Lill Mårtensson-Bopp](#), Inst. of Medicine

In search for the cell of origin in sarcoma. Transcriptome and DNAmethylome analysis of local and public databases combined with wet experiment data ([project plan](#))

Contact: [Pierre Åman](#) (phone: 0706-846085), Sahlgrenska Cancer Center, Dept. of Pathology

Estimating minimum host population size for Varicella zoster virus given different assumptions of reinfections ([project plan](#))

Contact: [Peter Norberg](#) (phone: 0735-316166), Dept. of Infectious Medicine

Continuous Vector Space Models for Medical Terms ([project plan](#))

Contact: [Devdatt Dubhashi](#), Department of Computer Science and Engineering, Chalmers University of Technology

Latent Topic Models for Medical Documents ([project plan](#))

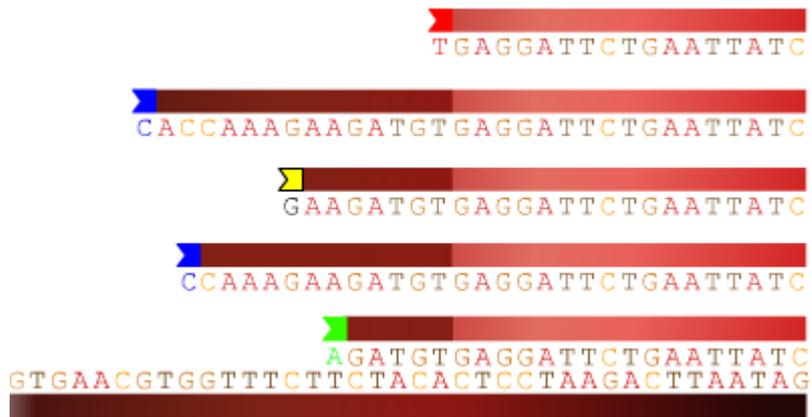
Contact: [Devdatt Dubhashi](#), Department of Computer Science and Engineering, Chalmers University of Technology

Acute myeloid leukemia analyzed with exome sequencing ([project plan](#))

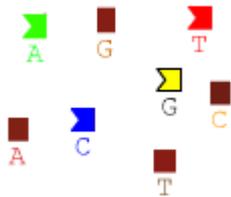
Contact: [Linda Fogelstrand](#) (phone: 46 31 342 9296), Department of Clinical Chemistry and Transfusion Medicine

Sanger sequencing

Dye-labeled terminator

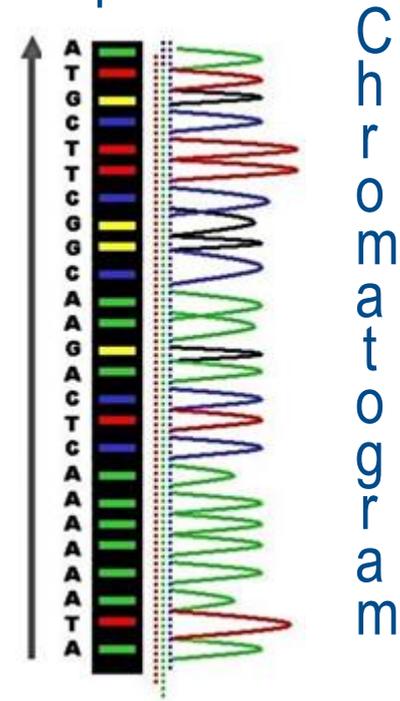


DNA template



Laser beam →

Capillar
electrophoresis



Next Generation Sequencing

Roche 454

Solexa Illumina

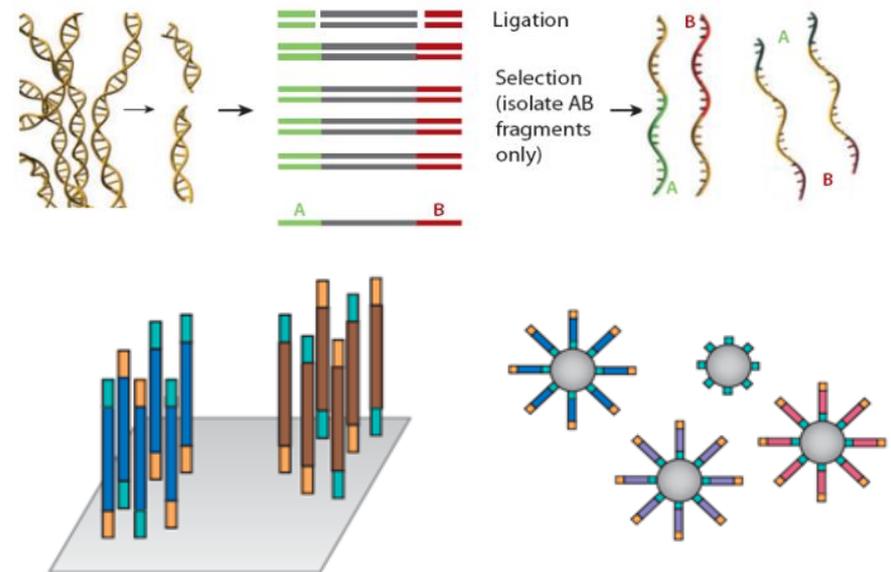
SOLiD Life Technologies

Ion Torrent Life Technologies

Qiagen



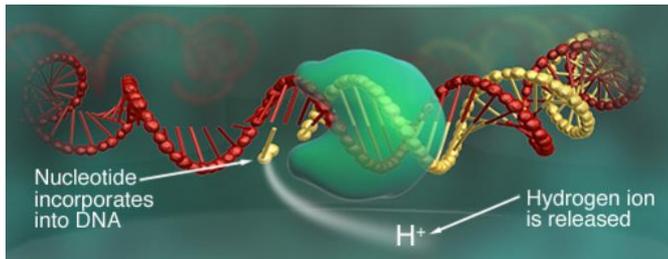
- ❖ DNA library preparation
- ❖ Amplification (ePCR, bridge PCR)
- ❖ Sequencing reaction
- ❖ Imaging
- ❖ Decoding



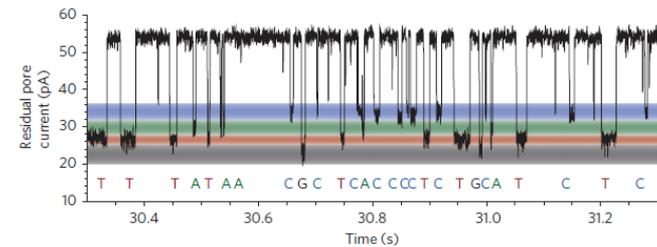
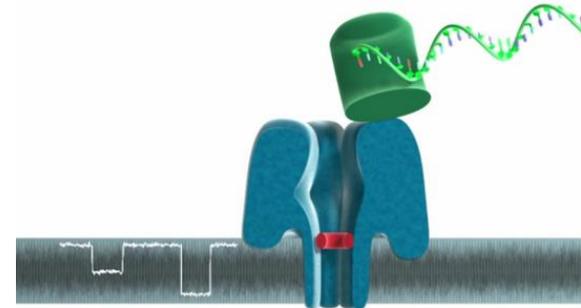


Third Generation Sequencing

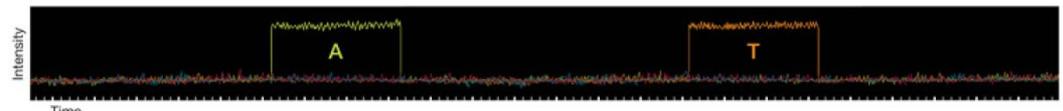
Single molecule- real time
No optics
Increased sequencing speed



Ion Torrent



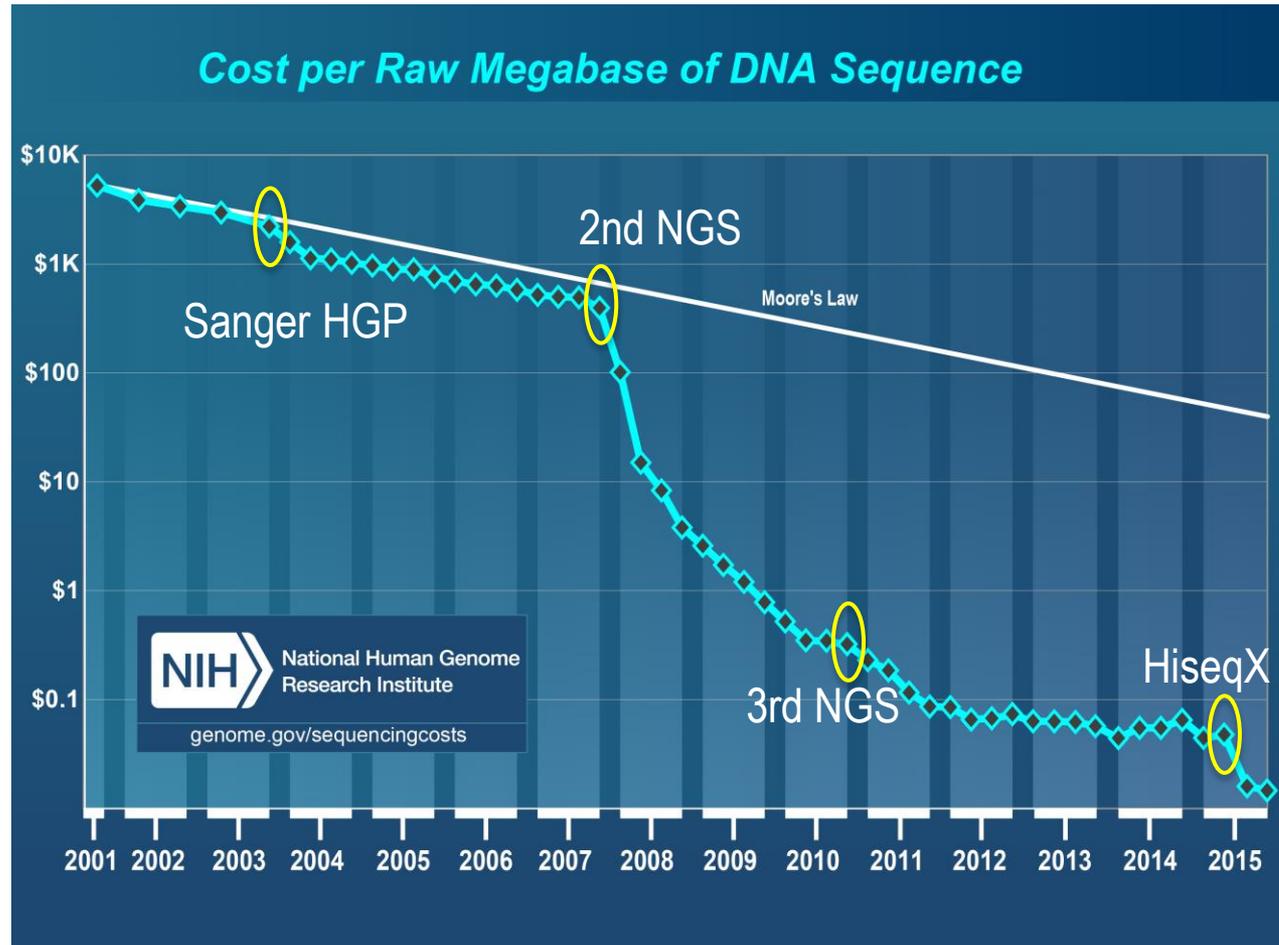
Nanopore



SMRT

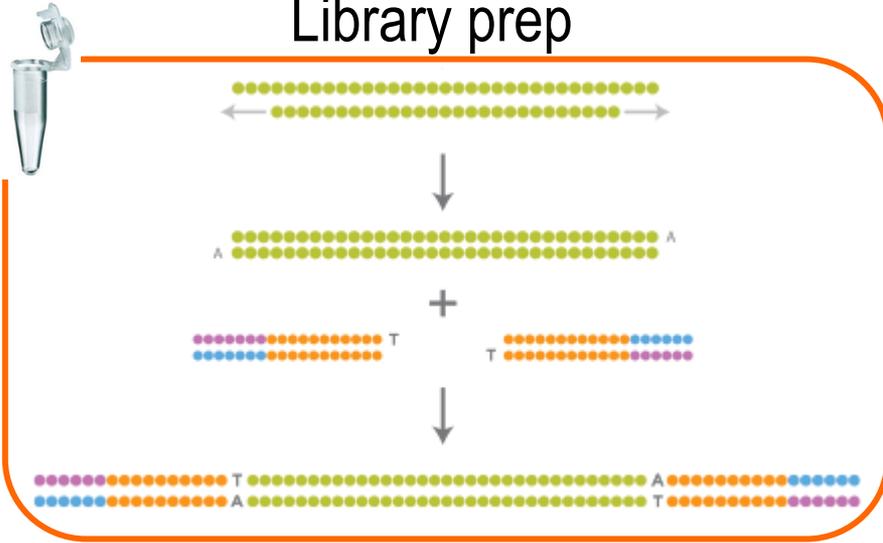


Sequencing Costs

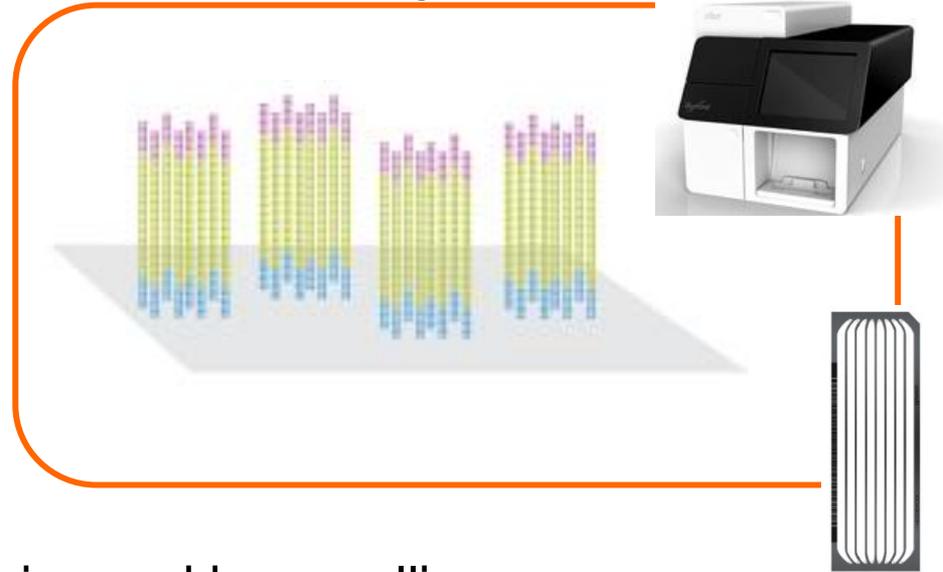


Illumina workflow

Library prep



Cluster generation



Sequencing, imaging and base calling



Fastq format

- 1) @SEQ_ID :instrument:run:flowcell:lane:tile:x:y pair:fail:control:index
- 2) sequence
- 3) marker
- 4) quality

```

1) @HWI-H200:53:D08U2ACXX:5:1101:1231:2012 1:N:0:TACAGC
2) GCATTTTAGTAGAACCAGNCATTTCCCCCNACNTCNNTNCGNNANNNTAA
3) +
4) @CCFFFFFHFFHHJJJJJ#3<FGIJJJJJ#1?###########

```



31



37



39



18



16

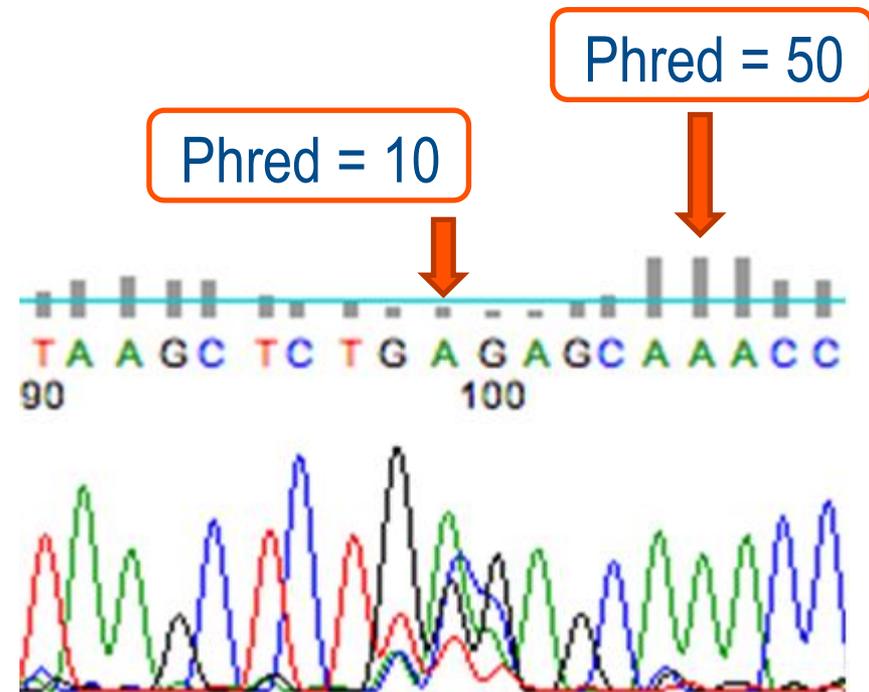


2

Phred quality score

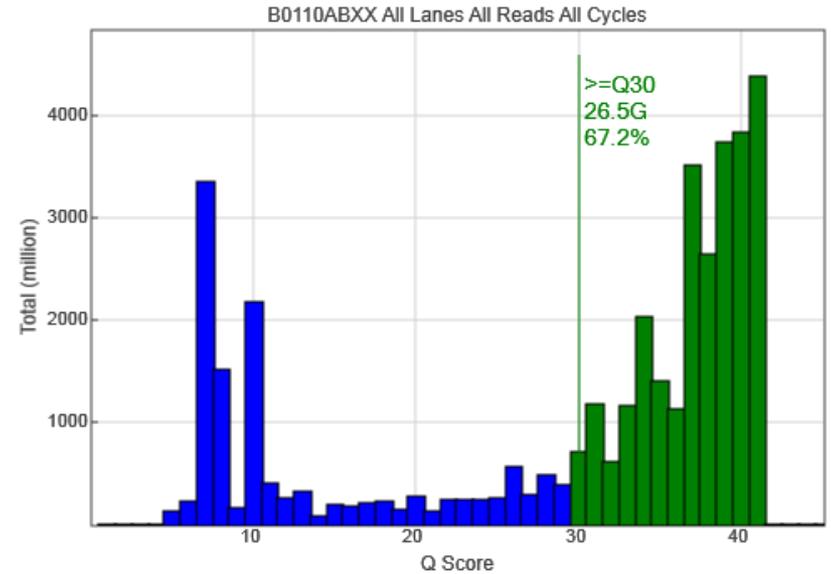
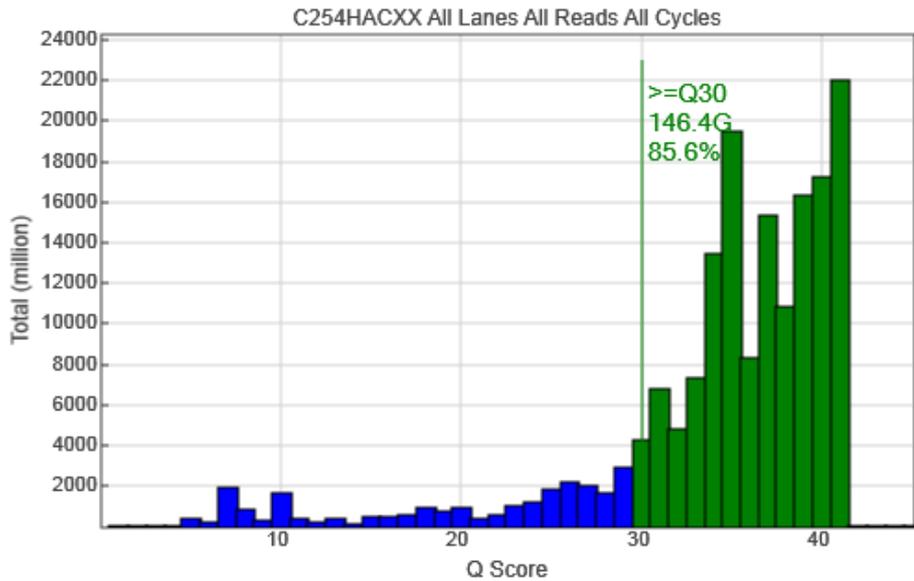
Probability that the base has been erroneously called

Phred score	P(called wrong)	Accuracy base call
10	1 in 10	90%
20	1 in 100	99%
30	1 in 1000	99,9%
40	1 in 10000	99,99%
50	1 in 100000	99,999%



Sequencing run Quality

QScore Distribution

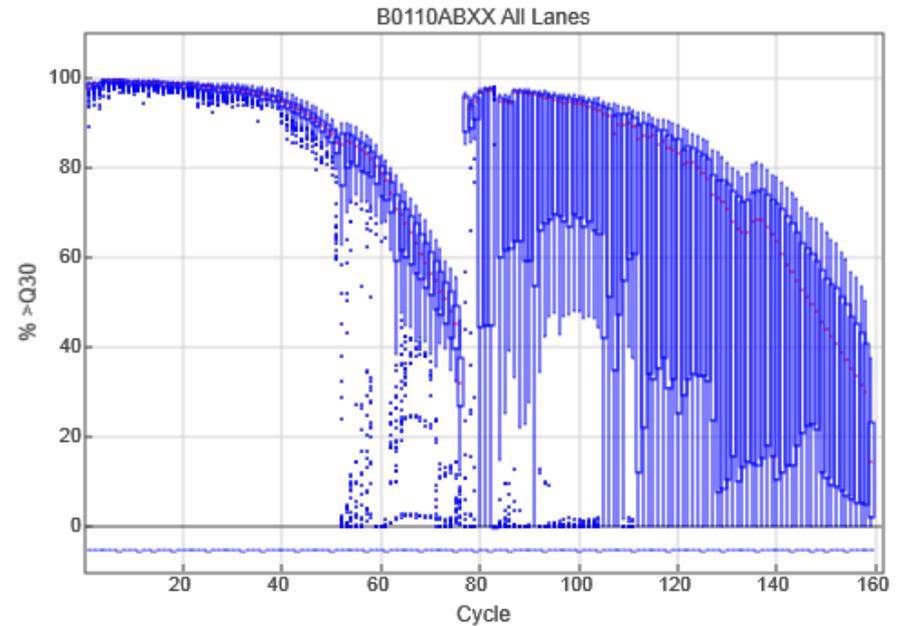
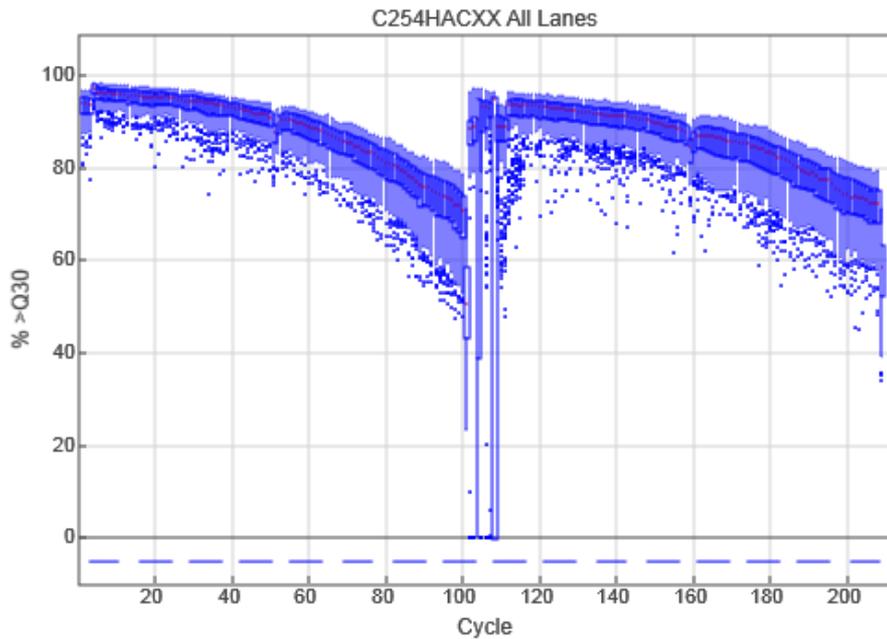


A succesful run should have 80% $\geq Q30$



Sequencing run Quality

Data by Cycle



Sequencing run Quality

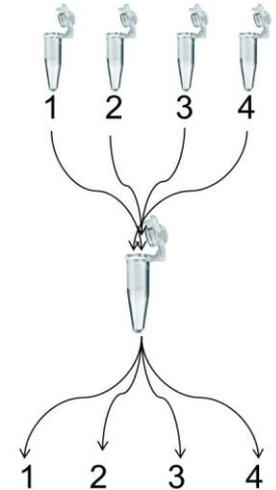
Demultiplexing

Total Reads	PF Reads	% Reads Identified (PF)	CV	Min	Max
116344024	100675880	96.5715	0.0514	22.6164	25.5666

Index Number	Sample Id	Project	Index 1 (I7)	Index 2 (I5)	% Reads Identified (PF)
1	S1		CGATGT		23.8324
2	S2		TTAGGC		25.5666
3	S3		TGACCA		22.6164
4	S4		AAACAT		24.5561

Total Reads	PF Reads	% Reads Identified (PF)	CV	Min	Max
29906232	28449264	98.0977	0.2024	11.7508	21.0338

Index Number	Sample Id	Project	Index 1 (I7)	Index 2 (I5)	% Reads Identified (PF)
1	S1		CGATGT		14.2264
2	S2		TGACCA		15.0889
3	S3		ACAGTG		7.75
4	S4		GCCAAT		18.2478
5	S5		CAGATC		11.7508
6	S6		CTTGTA		21.0338

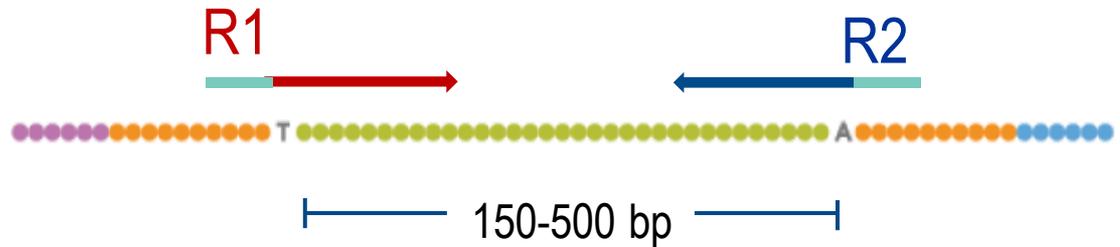


Different recepies

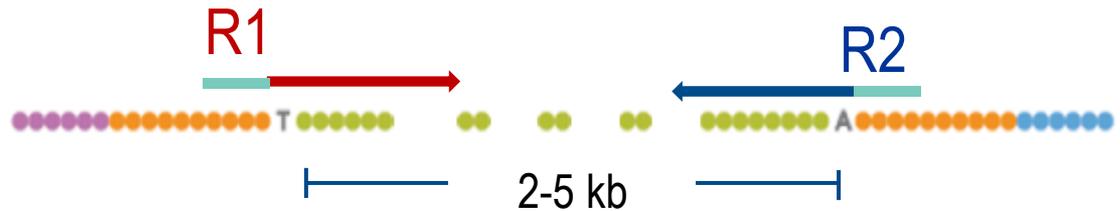
Single end (SE)



Paired-end (PE)

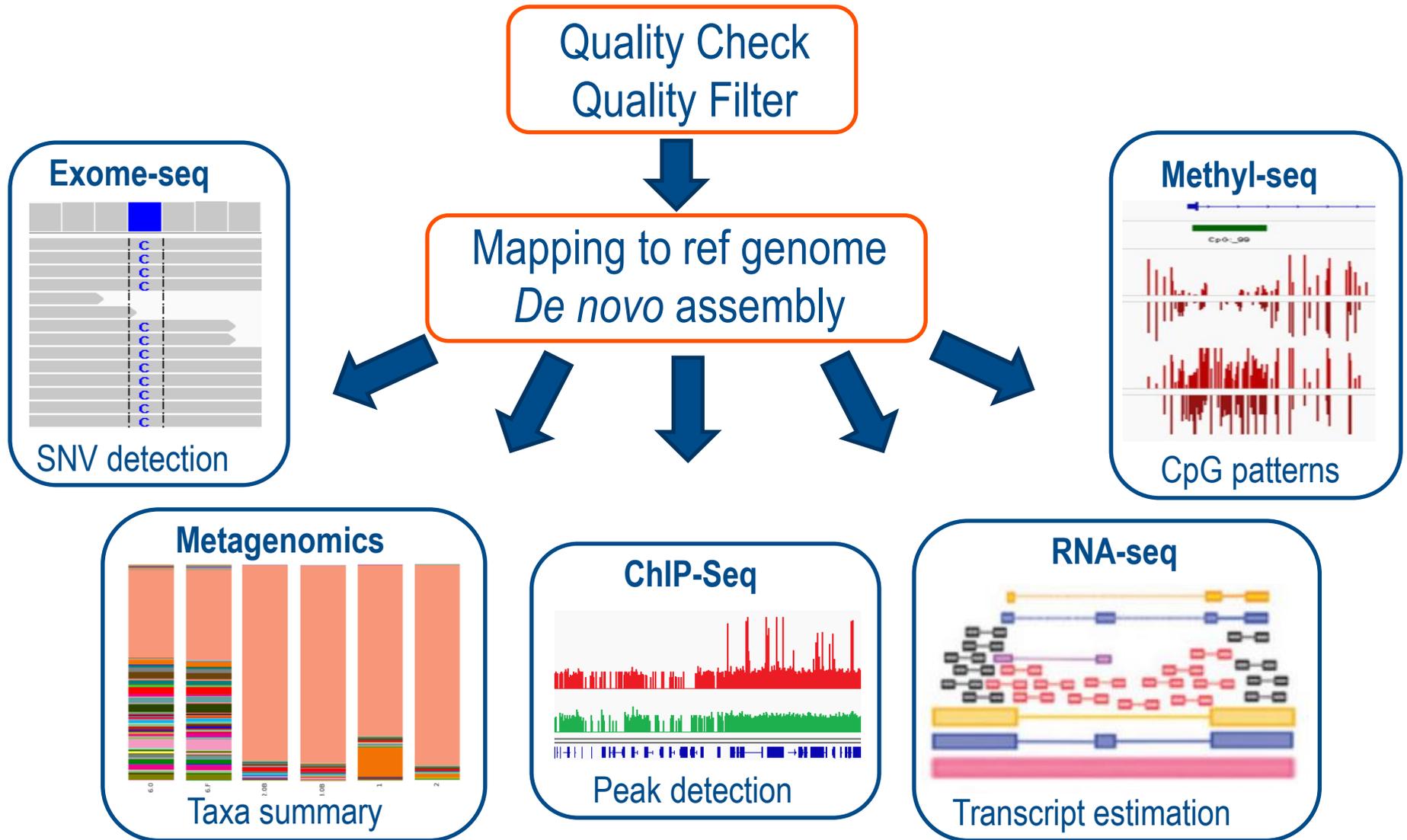


Mate-pair (MP)





Data handling workflow

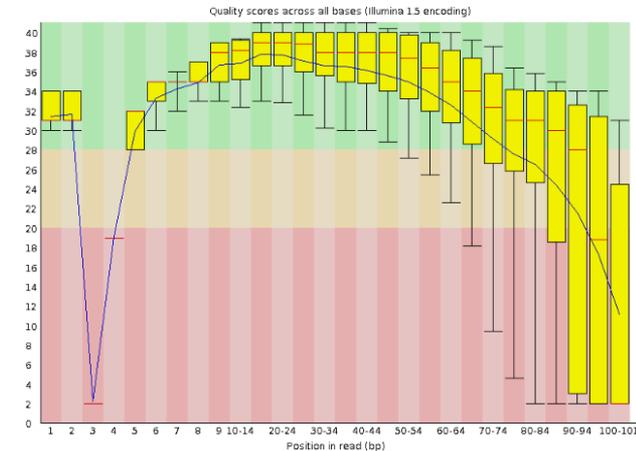
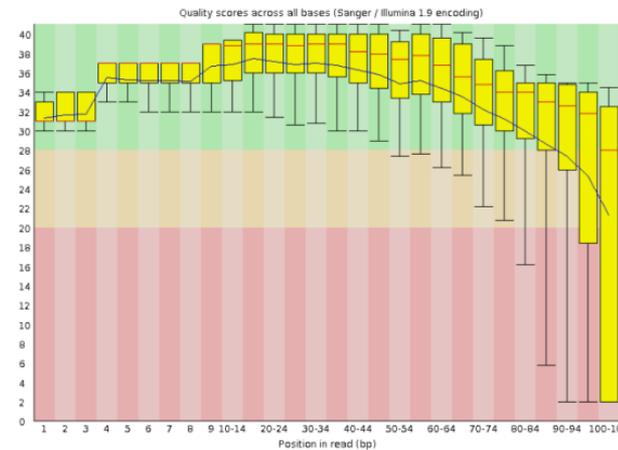
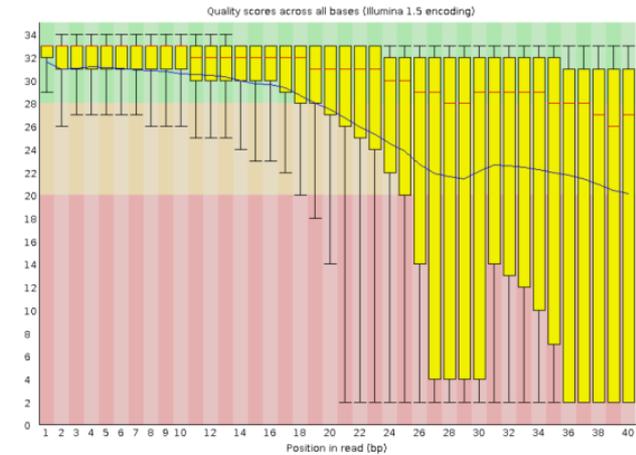
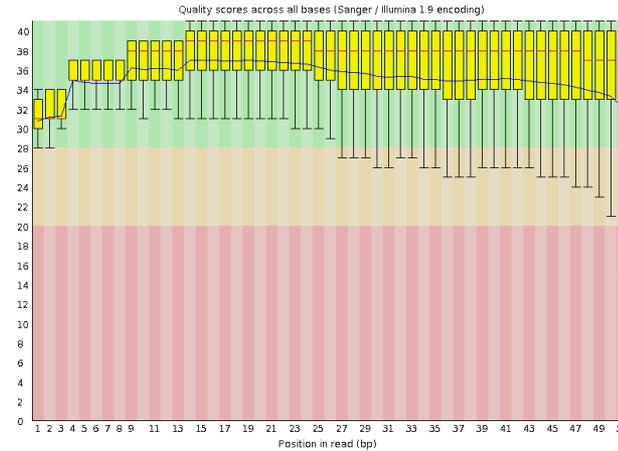




Quality check with FastQC

Summary

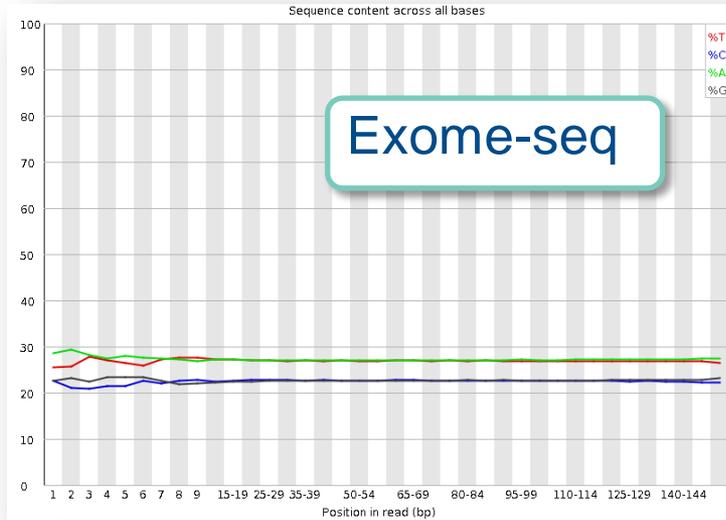
- ✓ [Basic Statistics](#)
- ✓ [Per base sequence quality](#)
- ✓ [Per sequence quality scores](#)
- ! [Per base sequence content](#)
- ✓ [Per base GC content](#)
- ✓ [Per sequence GC content](#)
- ✓ [Per base N content](#)
- ✓ [Sequence Length Distribution](#)
- ✓ [Sequence Duplication Levels](#)
- ✓ [Overrepresented sequences](#)
- ! [Kmer Content](#)



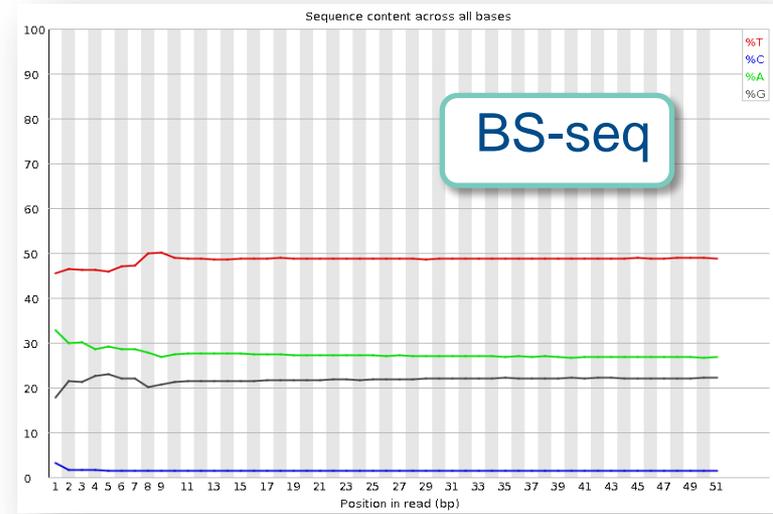


Per base sequence content

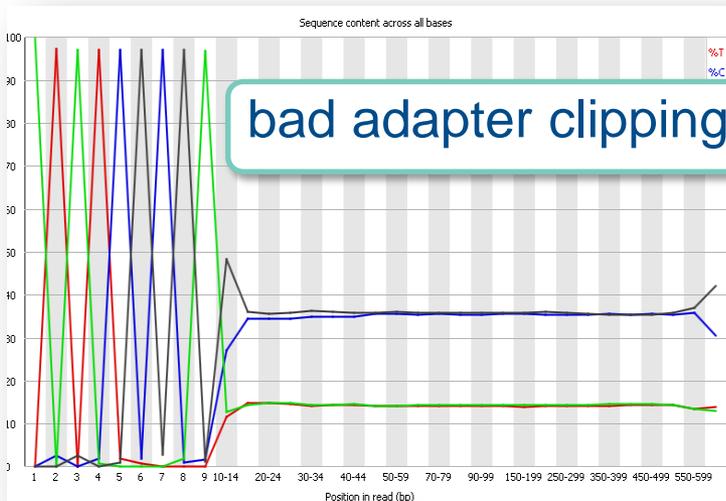
A



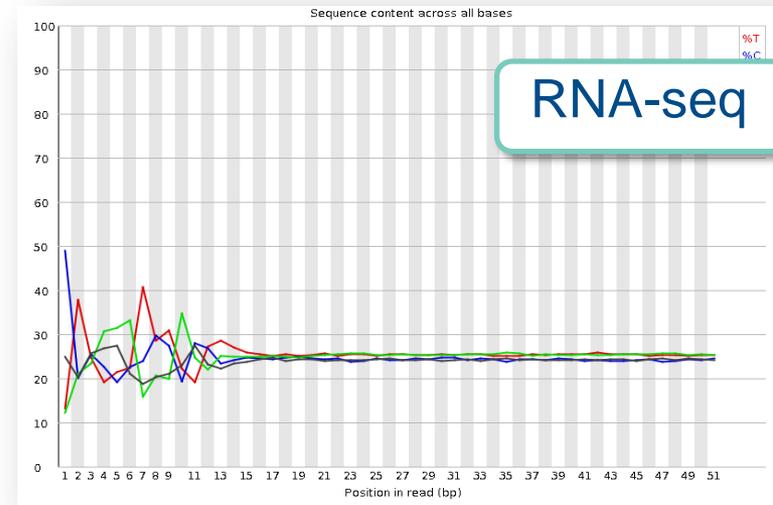
C



B

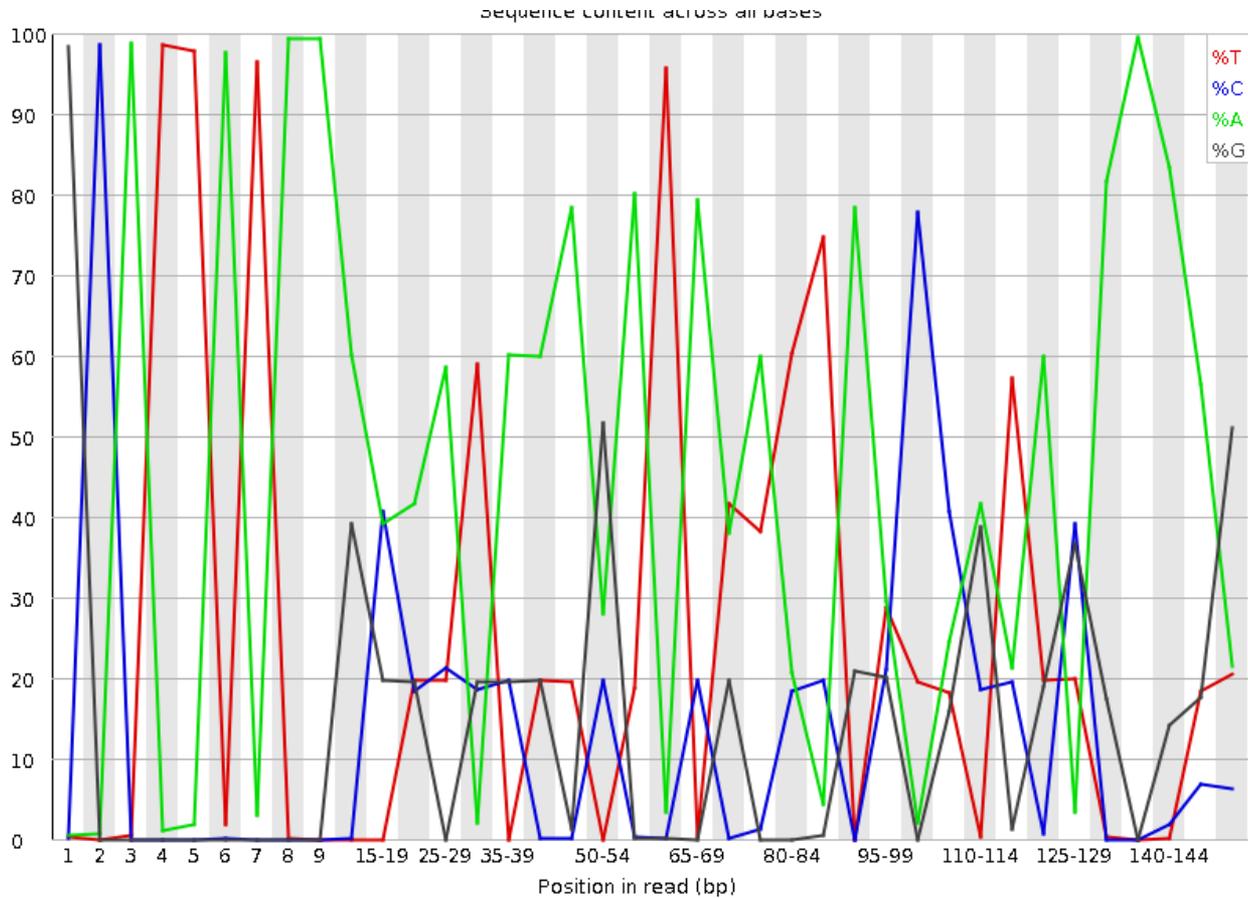


D





Per base sequence content

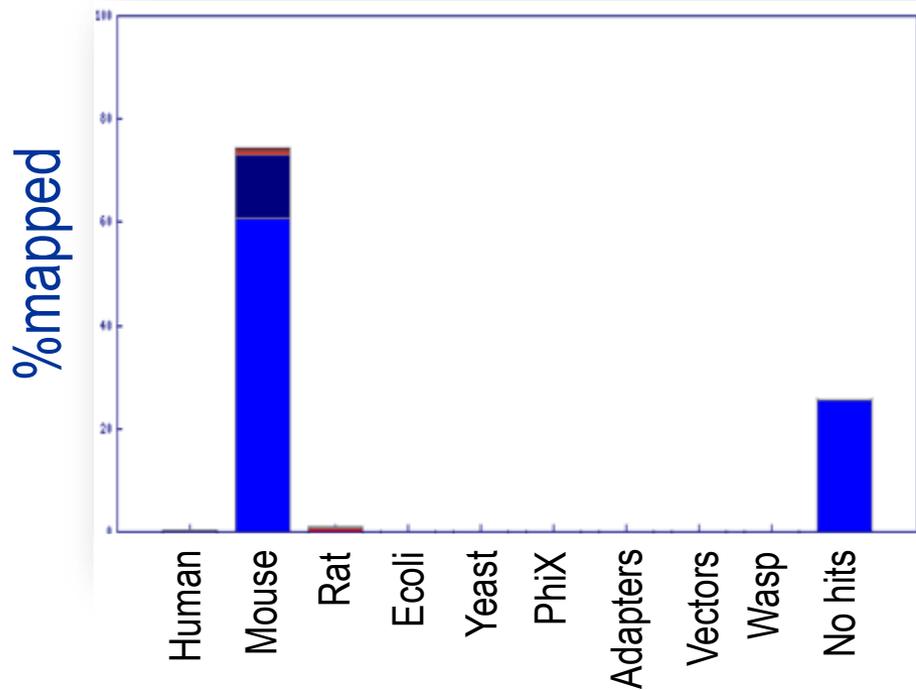


Amplicon seq

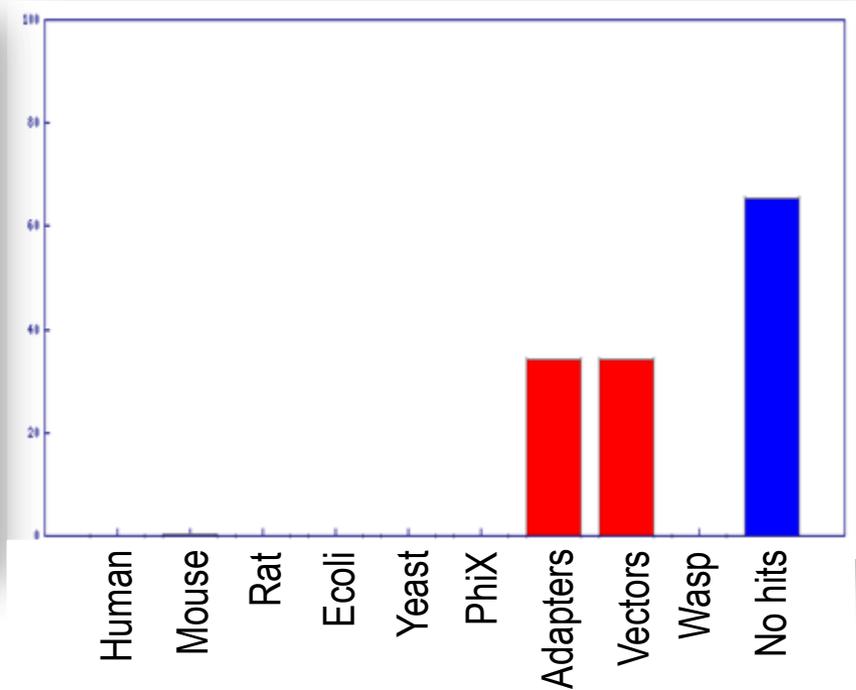


Contamination check with FastQScreen

Good



Bad



Quality Filter with PRINSeq

Ambiguous bases

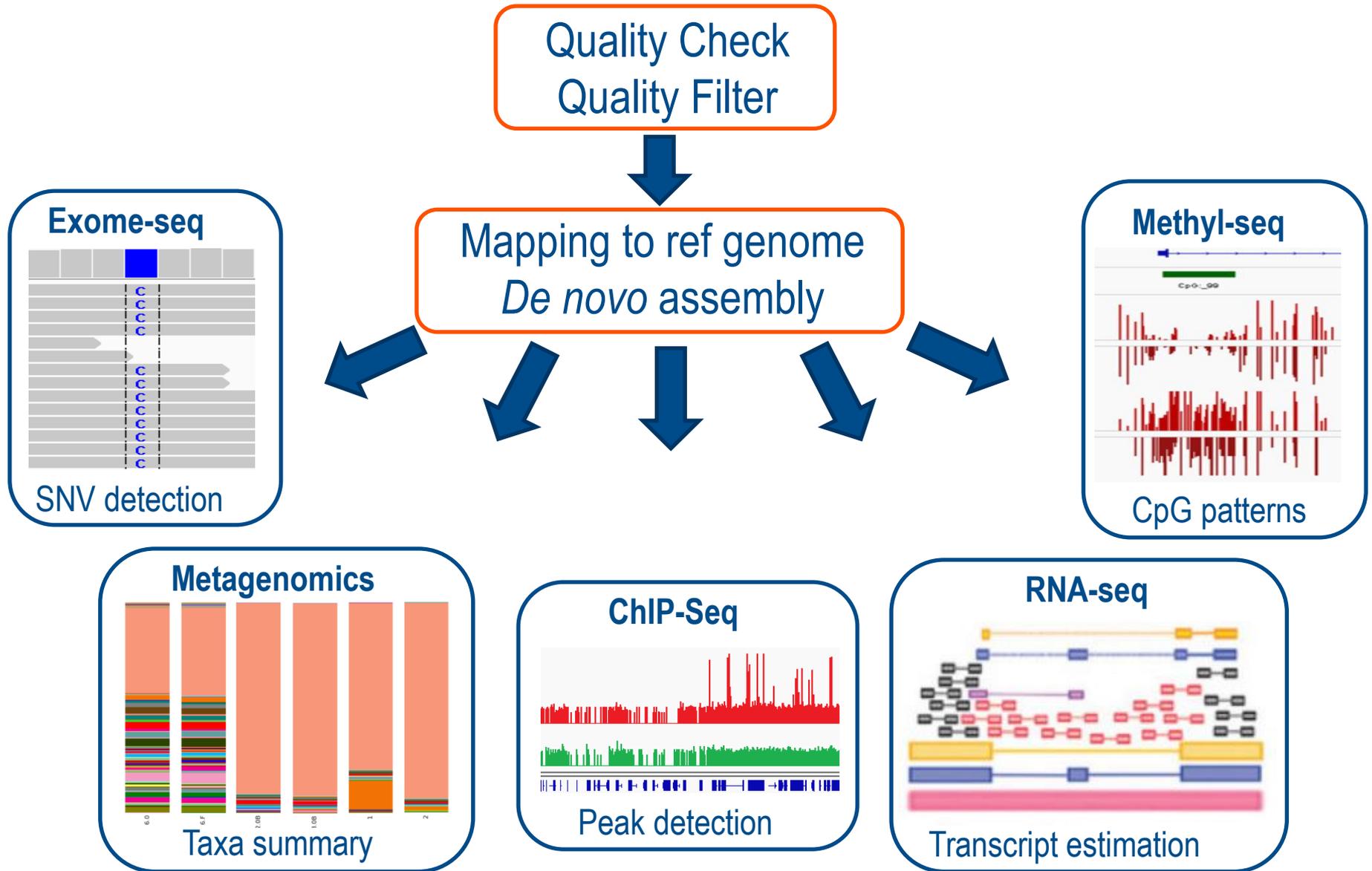


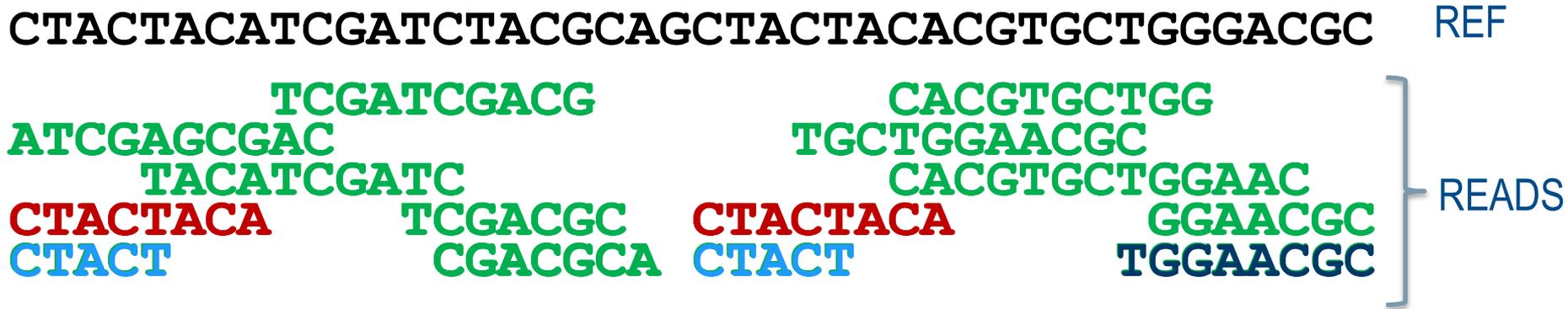
```
@HWI-H200:53:D08U2ACXX:5:1101:1231:2012 1:N:0:
GCATTTTAGTAGAACCAGNCATTTCCCCCNACNTCNNTNCGNNANNNNTAA
+
@CCFFFFFHFFHHJJJJJ#3<FGIJJJJJ#1?#####
```

|-----| X nts |-----|

↑
Low quality

Data handling workflow





WHERE to place the reads?

- a) Unique reads
- b) Everywhere possible
- c) Choose one randomly
- d) Use pair-end data

mean DNA fragment size:
40

Bfast, BioScope, **Bowtie**,
BWA, CLC bio, CloudBurst,
Eland/Eland2,
GenomeMapper, GnuMap,
Karma, **MAQ**, MOM, **Mosaik**,
MrFAST/MrsFAST, NovoAlign,
PASS, PerM, RazerS, RMAP,
SSAHA2, Segemehl, ...



BAM files

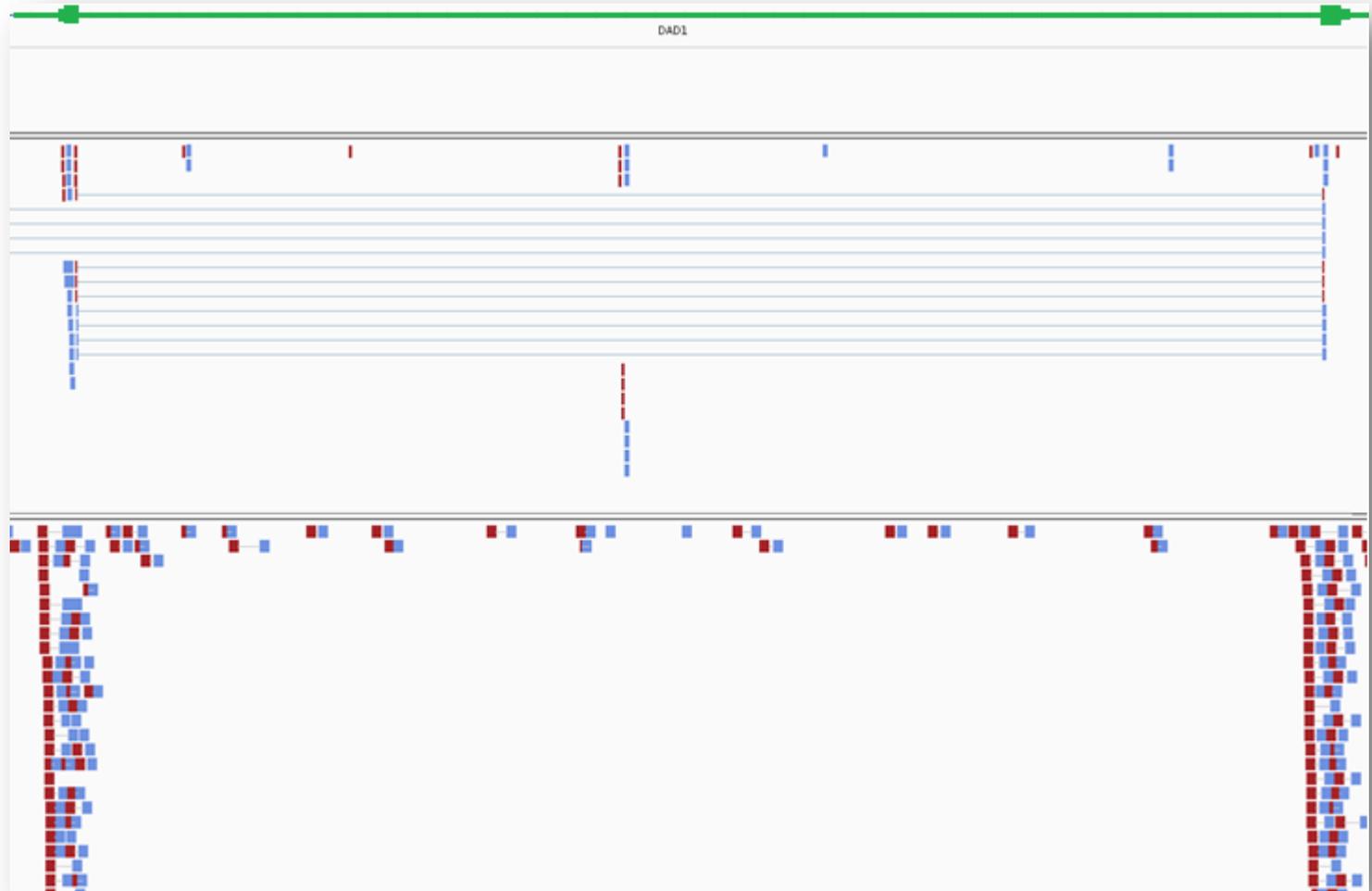


Mapping

HOW to place the reads? Ungapped, Gapped

RNA-seq

Exome





IGV – Integrative Genome Viewer



← coverage

reads

← My BAM

← gene

UCSC browser

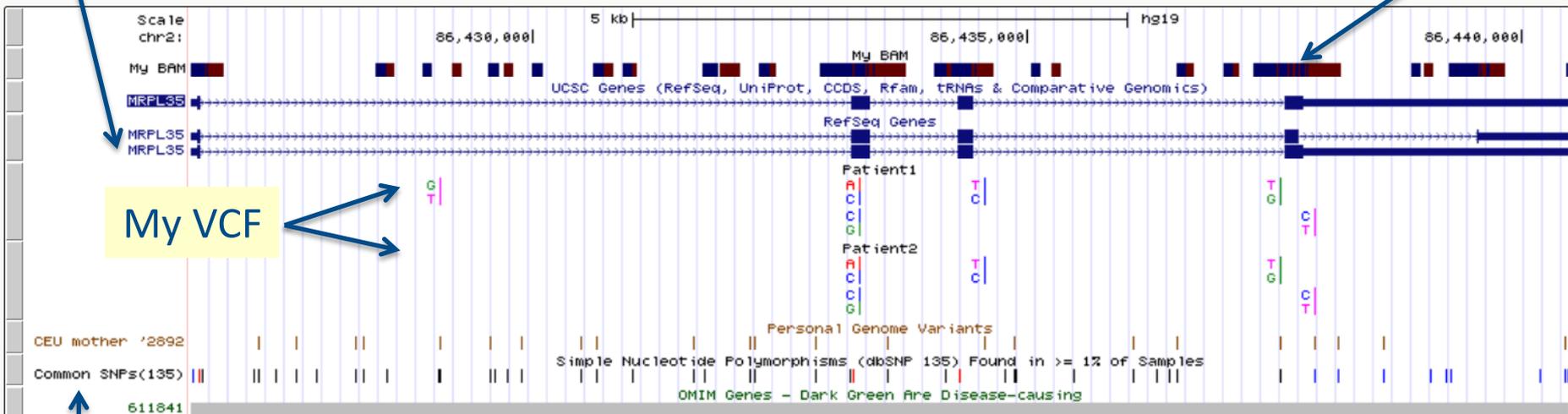
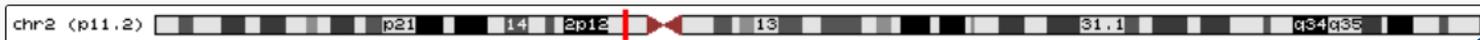
gene variants

UCSC Genome Browser on Human Feb. 2009 (GRCh37/hg19) Assembly

move <<< << < > >> >>> zoom in 1.5x 3x 10x base zoom out 1.5x 3x 10x

chr2:86,426,556-86,440,477 13,922 bp. enter position, gene symbol or search terms go

My BAM



My VCF

move start < 2.0 >

Click on a feature for details. Click or drag in the base position track to zoom in. Click side bars for track options. Drag side bars or labels up or down to reorder tracks. Drag tracks left or right to new position.

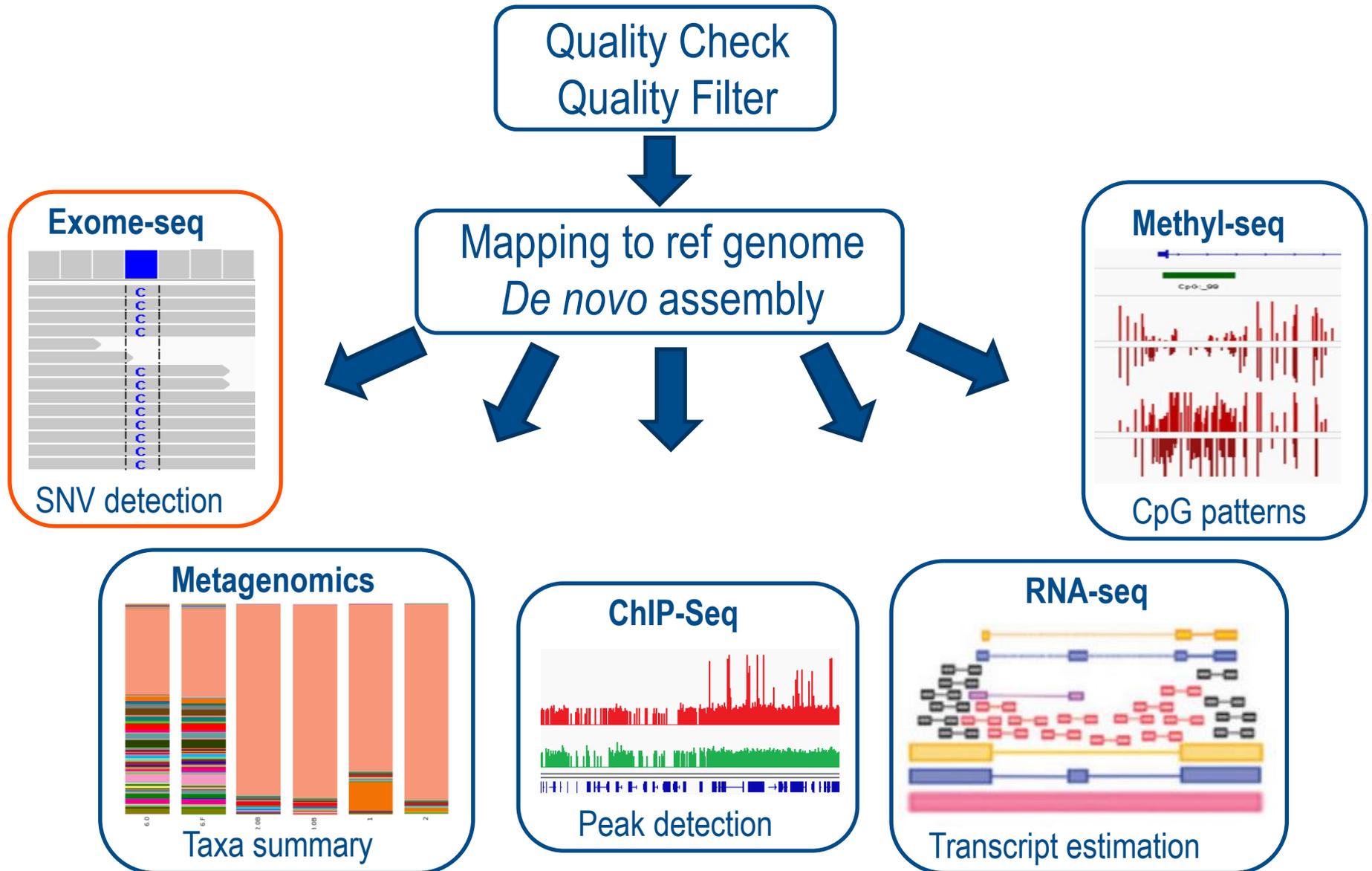
move end < 2.0 >

track search default tracks default order hide all manage custom tracks track hubs configure reverse resize refresh

Variation track

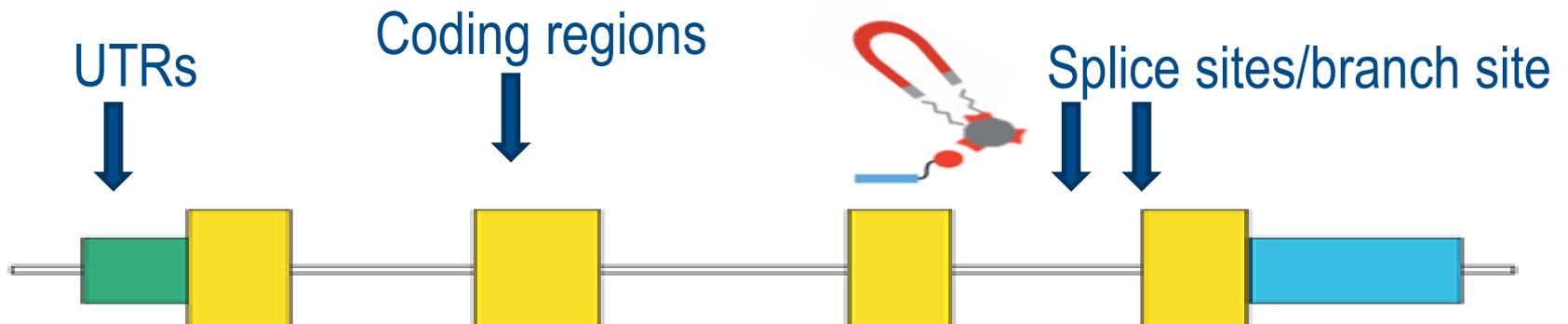


Data handling workflow



Modifications of a single gene
over 10,000 of human diseases (½ have a gene associated)

DISEASE	GENE	MUTATION
Thalassaemia	HBB	$\Delta \rightarrow$ frameshift
Sickle cell anemia	HBB	G6V
Cystic Fibrosis	CFTR	G542X ...
Fragile X syndrome	FMR1	CGG expansion
Huntington's	HTT	CAG +36 repeats





Enrichment kits

	NimbleGen v3	Agilent	TruSeq
Total	64,190,759	51,542,882	61,884,224
RefSeq (coding)	33,491,892	32,326,914	31,817,166
RefSeq (UTR)	NA	3,920,825	31,642,004
Ensembl (CDS)	31,690,383	33,472,589	31,918,846
Ensembl (all exons)	33,731,215	38,123,201	59,275,652
miRBase	59,996	55,249	27,963

Table 2: Databases Covered by the TruSeq Exome Enrichment kit

Database	% Database Covered
CCDS coding exons (31.3 Mb; hg19)	97.2%
RefSeq (regGene) coding exons (33.2 Mb; hg19)	96.4%
RefSeq (regGene) exons plus (67.8 Mb; hg19)*	88.3%
Encode/Gencode coding exons (Encyclopedia of DNA Elements) (25.6 Mb; hg19)†	93.2%
Predicted microRNA targets (9.0 Mb, hg19) ‡	77.6%

* Includes coding exons, 5' UTR, 3' UTR, microRNA, and other non coding RNA
† Manual V4
‡ mirbase 15 targets predicted by www.microrna.org.

Table 2: Databases Covered by the Nextera Exome Enrichment Kit

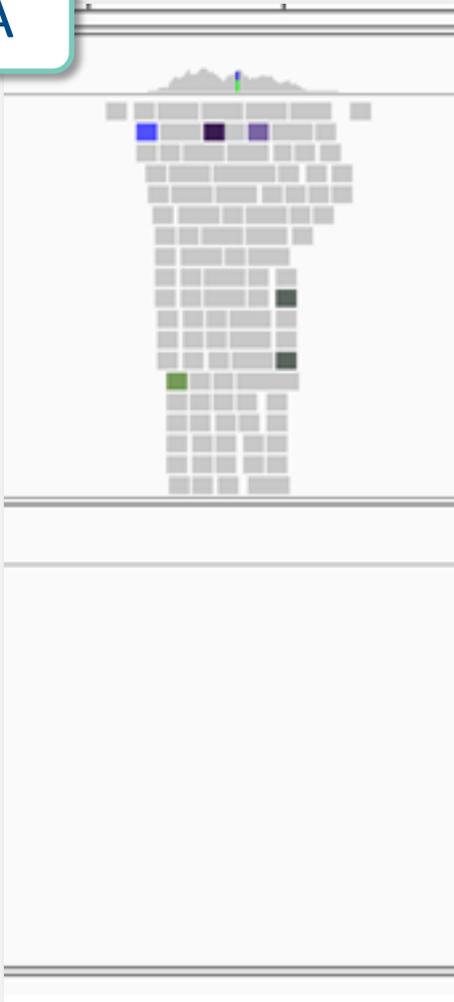
Database	% Database Covered	Description	Web Address
CCDS coding exons (31.3 Mb; hg19)	97.2%	Core set of human protein coding regions that are consistently annotated and of high quality	http://www.ncbi.nlm.nih.gov/projects/CCDS/CcidsBrowse.cgi
RefSeq (regGene) coding exons (33.2 Mb; hg19)	96.4%	Known protein-coding genes taken from the NCBI RNA reference collection	http://www.ncbi.nlm.nih.gov/RefSeq/
RefSeq (regGene) exons plus (67.8 Mb; hg19)*	88.3%	Known protein-coding genes taken from the NCBI RNA reference collection along with non-coding DNA	http://www.ncbi.nlm.nih.gov/RefSeq/
Encode/Gencode coding exons (Encyclopedia of DNA Elements) (25.6 Mb; hg19)†	93.2%	Project to identify all functional elements in the human genome	http://genome.ucsc.edu/cgi-bin/hgTrackUi?hgsid=183763205&c=chr13&g=wgEncodeGencode
Predicted microRNA targets (9.0 Mb, hg19) ‡	77.6%	Includes predicted microRNA targets	http://www.microrna.org/microrna/get-Downloads.do

* Includes coding exons, 5' UTR, 3' UTR, microRNA, and other non coding RNA
† Manual V4
‡ mirbase 15 targets predicted by www.microrna.org

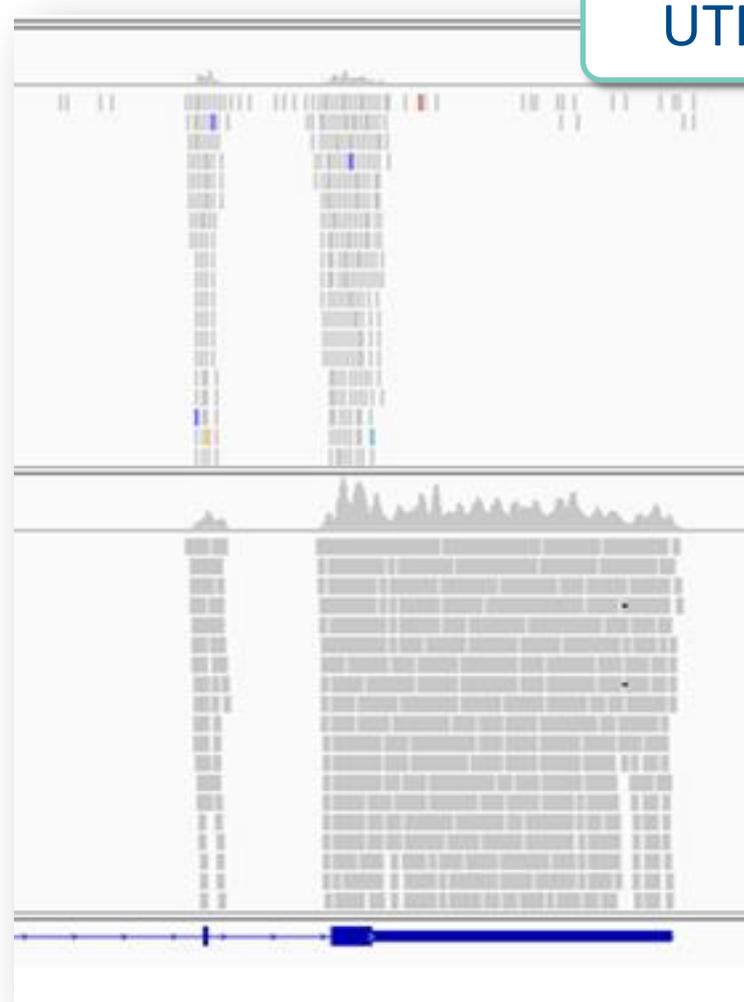


Enrichment kits

miRNA



UTR's



Realignment and recalibration

Correct alignments due to the presence of indels
Differentiate between polymorphisms and sequencing errors

```

ACGATGTTGCGAGGCTCGTAAAGCGGTCAAACGATGACGTTGCACGATACCGTGTCATGACT
ACGATGTTGCGAGGC      TAAAGCGGT      ATGACGTTGCACGATA      CATGACT
      ATGTTGCGAGGCTCG      CGGTC      CGATGACGCACGATA      TGCATGA
ACGATGTTGCGA      AAGCG      GACGTTGCACGATACC      ATGACT
ACGATA      CGAGGCTCGTAAAGC      ACGATGACGCACG      CCGTGTCAT
  
```

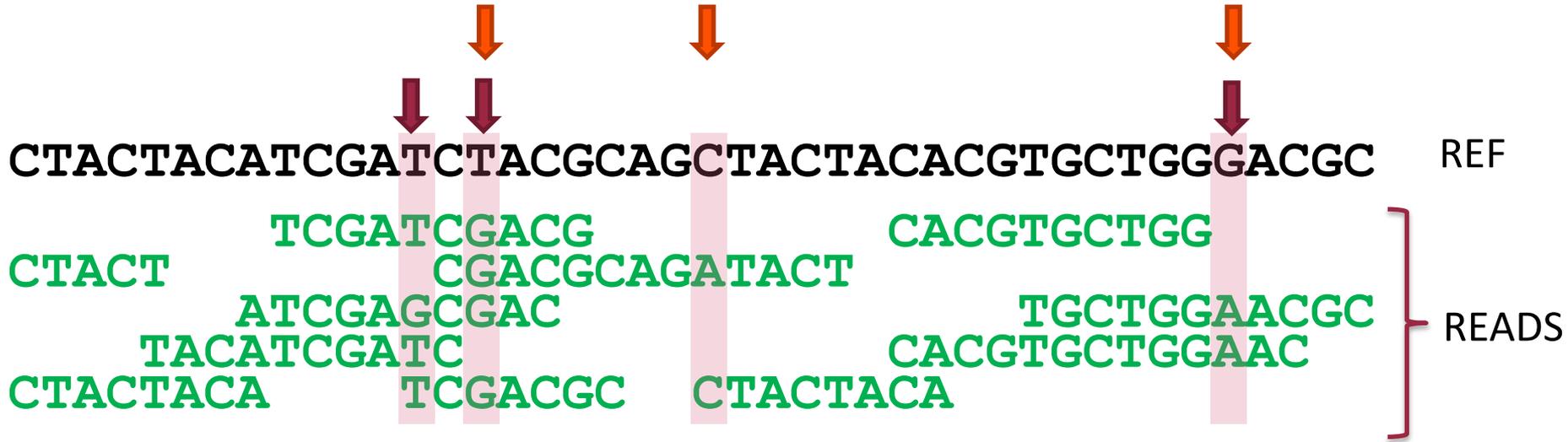


```

ACGATGTTGCGAGGCTCGTAAAGCGGTCAAACGATGACGTTGCACGATACCGTGTCATGACT
ACGATGTTGCGAGGC      TAAAGCGGT      ATGACGTTGCACGATA      CATGACT
      ATGTTGCGAGGCTCG      CGGTC      CGATGAC--GCACGATA      TGCATGA
ACGATGTTGCGA      AAGCG      GACGTTGCACGATACC      ATGACT
ACGATA      CGAGGCTCGTAAAGC      ACGATGAC--GCACG      CCGTGTCAT
  
```



Variant calling



Is it a variant?

What is the most likely genotype?

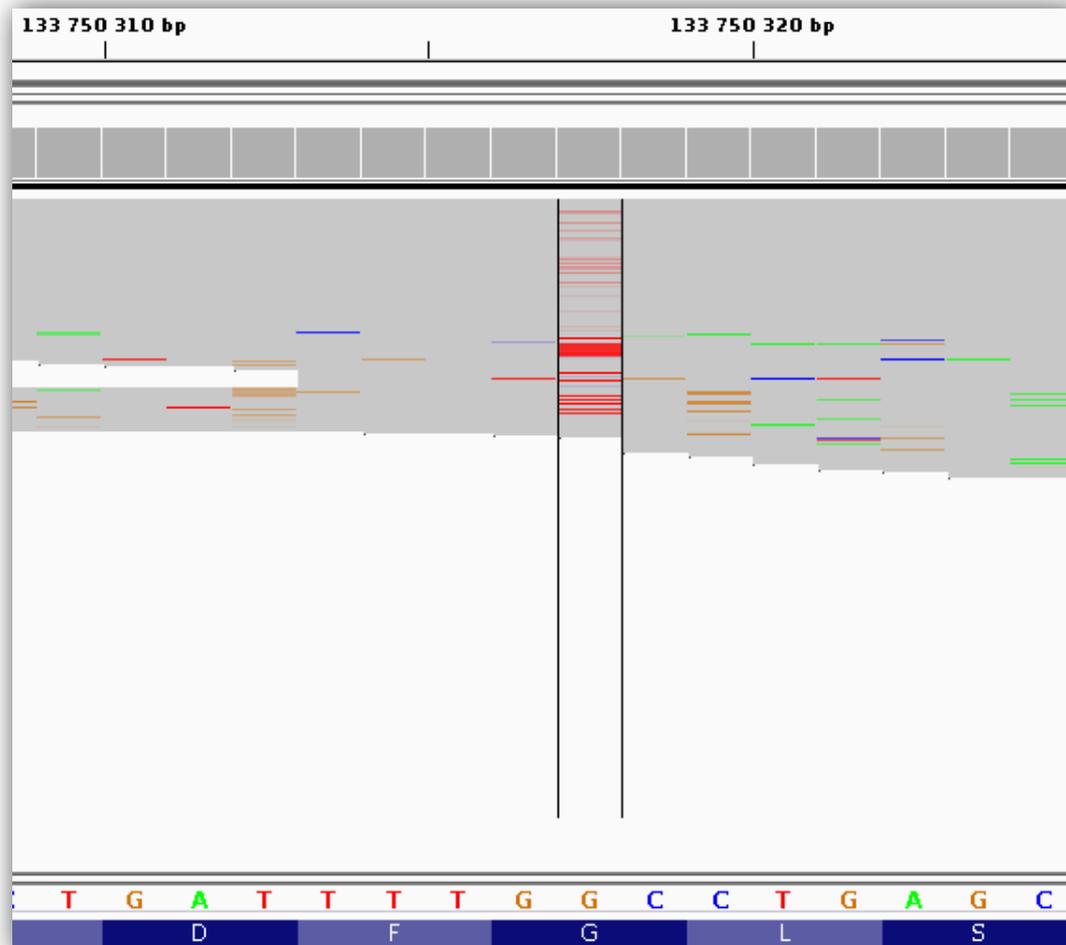
SOAP2, samtools,
GATK, Beagle, CRISP,
Dindel, FreeBayes,
SeqEM, VarScan,
Mutect



VCF files

Variant calling

Amplicon, quite noisy





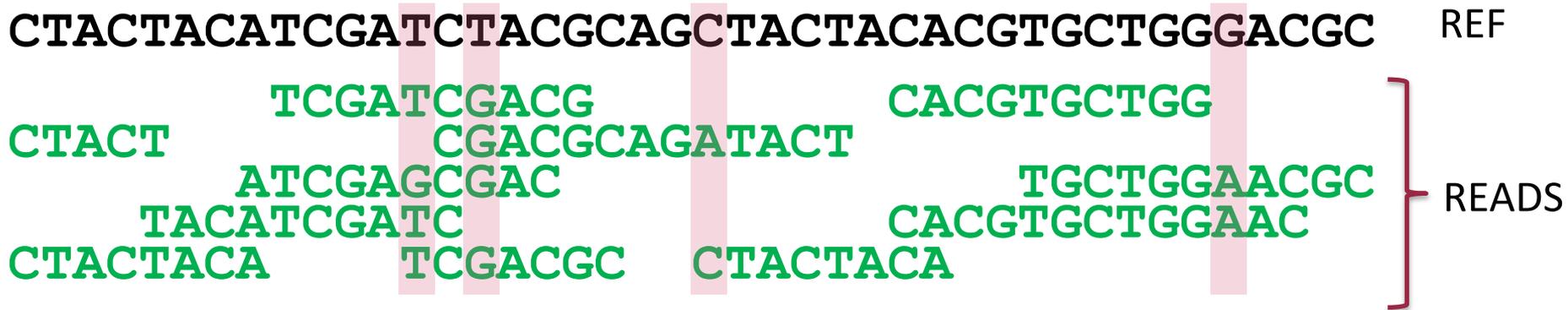
Variant call format <http://www.1000genomes.org/node/101>

HEADER
BODY

```
##fileformat=VCFv4.0
##fileDate=20090805
##source=myImputationProgramV3.1
##reference=1000GenomesPilot-NCBI36
##phasing=partial
##INFO=<ID=NS,Number=1,Type=Integer,Description="Number of Samples With Data">
##INFO=<ID=DP,Number=1,Type=Integer,Description="Total Depth">
##INFO=<ID=AF,Number=.,Type=Float,Description="Allele Frequency">
##INFO=<ID=AA,Number=1,Type=String,Description="Ancestral Allele">
##INFO=<ID=DB,Number=0,Type=Flag,Description="dbSNP membership, build 129">
##INFO=<ID=H2,Number=0,Type=Flag,Description="HapMap2 membership">
##FILTER=<ID=q10,Description="Quality below 10">
##FILTER=<ID=s50,Description="Less than 50% of samples have data">
##FORMAT=<ID=GT,Number=1,Type=String,Description="Genotype">
##FORMAT=<ID=GQ,Number=1,Type=Integer,Description="Genotype Quality">
##FORMAT=<ID=DP,Number=1,Type=Integer,Description="Read Depth">
##FORMAT=<ID=HQ,Number=2,Type=Integer,Description="Haplotype Quality">
#CHROM POS ID REF ALT QUAL FILTER INFO FORMAT NA00001 NA00002 NA00003
20 14370 rs6054257 G A 29 PASS NS=3;DP=14;AF=0.5;DB;H2 GT:GQ:DP:HQ 0|0:48:1:51,51 1|0:48:8:51,51 1/1:43:5:..
20 17330 . T A 3 q10 NS=3;DP=11;AF=0.017 GT:GQ:DP:HQ 0|0:49:3:58,50 0|1:3:5:65,3 0/0:41:3
20 1110696 rs6040355 A G,T 67 PASS NS=2;DP=10;AF=0.333,0.667;AA=T;DB GT:GQ:DP:HQ 1|2:21:6:23,27 2|1:2:0:18,2 2/2:35:4
20 1230237 . T . 47 PASS NS=3;DP=13;AA=T GT:GQ:DP:HQ 0|0:54:7:56,60 0|0:48:4:51,51 0/0:61:2
20 1234567 microsat1 GTCT G,GTACT 50 PASS NS=3;DP=9;AA=G GT:GQ:DP 0/1:35:4 0/2:17:2 1/1:40:3
```



Variant annotation



Annovar,
SIFT, PP2,
dbSNP,
GO,
KEGG,
OMIM
1000G

In which gene is it located?

Name, Description,
OMIM, Pathway, GO,
Expression profiles . . .

Where in the gene is it located?

Intron, exon, UTR,
intergenic region, splice site

Is there any AA change?

GAA -> GAG = E->E
GTT -> CTT = V->L
TGG -> TGA = W->X
TGA -> CGA = X->R

Is it a known SNP?

What impact does the AA
change have?
Damaging, benign

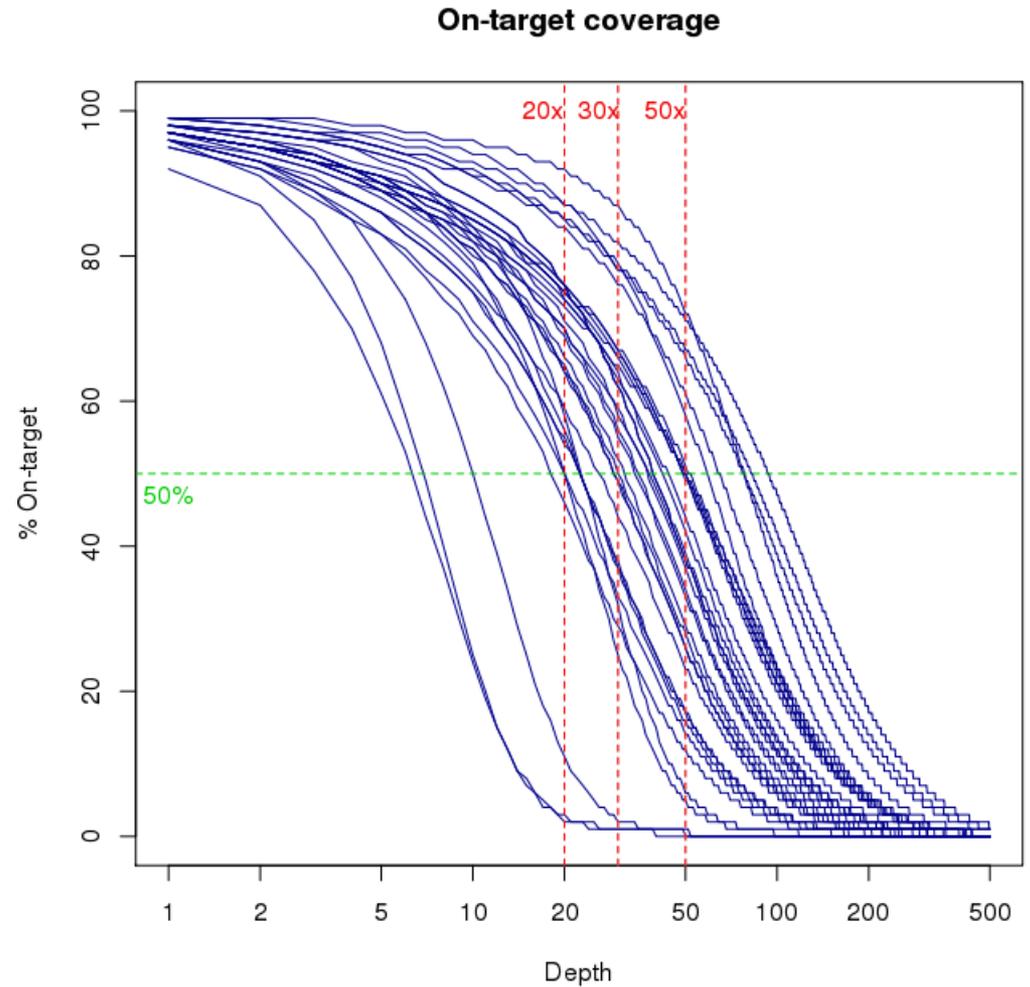


CSV files



Coverage

	S1	S2	S3
Gene1	100	200	50
Gene2	50	0	50
Gene3	50	0	55
Gene4	10	10	55
Coverage	52.5X	52.5X	52.5X





Variant Analysis

Ingenuity Variant Analysis (IVA)

Filter Cascade

Filter	Variants	Genes
	239	75
× Confidence	140	55
× Common Variants	96	41
× Predicted Deleterious	28	18
× Genetic Analysis	22	13
× Cancer Driver Variants	22	13
× Biological Context	22	13

Recalculate when filters change

Add Filter

Summary | Variants | Genes | Groups/Complexes | Pathways | Processes | Diseases | Overview

Edit Columns Export Create List Search gene, chr, or dbSNP 22 variants

Chr...	Position	Referen...	Sample ...	Variatio...	Gene Region	Gene Symbol	Protein Variant	Case Samples	Case S...	Control ...	Sample ...	Sample ...	Sample ...	Sample ...	Translation Impact	SIFT Functio...	PolyPhe...
4	1806188	A	C	SNV	Exonic, Introni	FGFR3	p.K403Q, p.K40...	1	0						missense	Tolerated	Benign
4	1808348	G	A	SNV	Exonic	FGFR3	p.E590E, p.E70...	1	0						synonymous		
4	55597551	A	G	SNV	Exonic	KIT	p.P729P, p.P73...	3	0						synonymous		
4	55597552	A	G	SNV	Exonic	KIT	p.T730A, p.T734...	3	0						missense	Tolerated	Benign
4	55597553	C	T	SNV	Exonic	KIT	p.T730I, p.T734...	3	0						missense	Tolerated	Possibly
4	55946286	C	A	SNV	Exonic	KDR	p.G1298V	1	0						missense	Tolerated	Benign
4	55955072	T	C	SNV	Exonic	KDR	p.E1158G	1	0						missense	Damaging	Possibly
4	55979547	A	C	SNV	Exonic	KDR	p.S300R	3	0						missense	Tolerated	Benign
4	153245399	T	C	SNV	Exonic	FBXW7	p.N480D, p.N51...	1	0						missense	Tolerated	Probably
9	133747535	A	G	SNV	Exonic	ABL1	p.E281G, p.E30...	1	0						missense	Damaging	Possibly
11	6677330	C	G	SNV	Promoter	DCHS1		1	0								
11	108180976	A	C	SNV	Exonic	ATM	p.H1951P	6	0						missense	Damaging	Probably
11	108205819	A	G	SNV	Exonic	ATM	p.R2712G	2	0						missense	Damaging	Probably
11	108236293	A	T	SNV	3'UTR	ATM		1	0								
12	121431376	C	T	SNV	Exonic	HNF1A	p.L194L	1	0						synonymous		
13	49027204	C	T	SNV	Exonic	RB1	p.P591S	1	0						missense	Activating	Benign
13	49027205	C	A	SNV	Exonic	RB1	p.P591H	1	0						missense	Tolerated	Benign
13	49027206	T	G	SNV	Exonic	RB1	p.P591P	1	0						synonymous		
14	105246551	C	T	SNV	Exonic	AKT1	p.E17K	1	0						missense	Damaging	Probably
16	68835595	T		Deletion	Exonic	CDH1	p.R63fs*20	1	0						frameshift		
17	7579471	GG		Deletion	Exonic, Promo	TP53	p.P33fs*76, p.P...	1	0						frameshift		
20	36031772	A	G	SNV	Exonic	SRC	p.E534G	1	0						missense	Tolerated	Benign

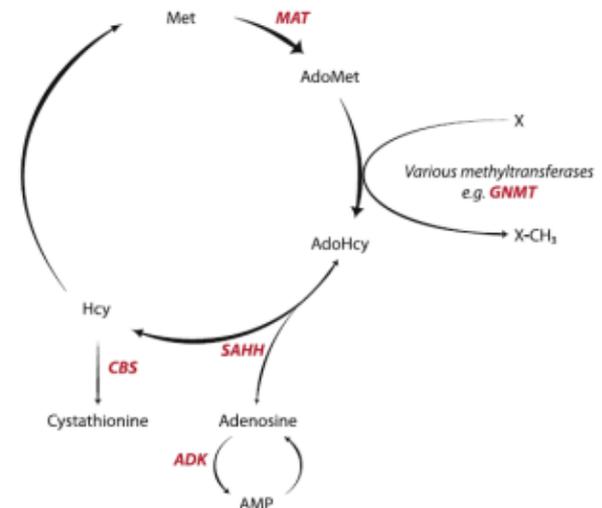
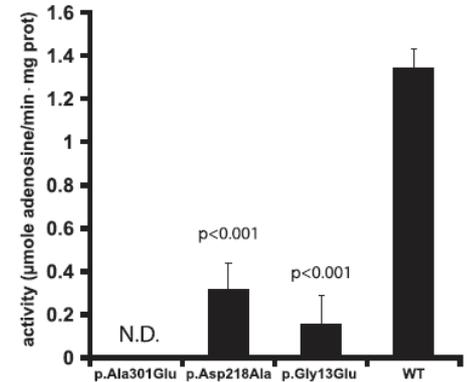
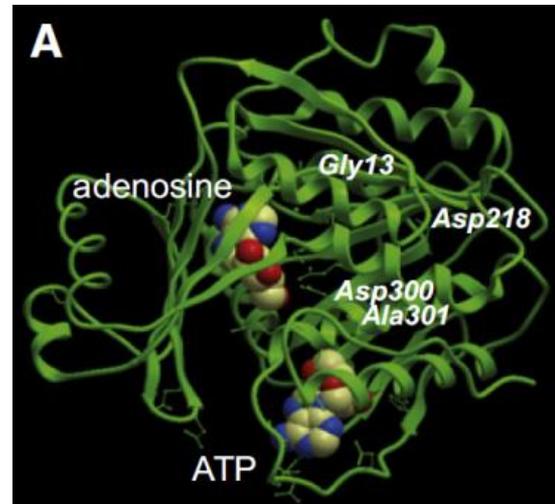
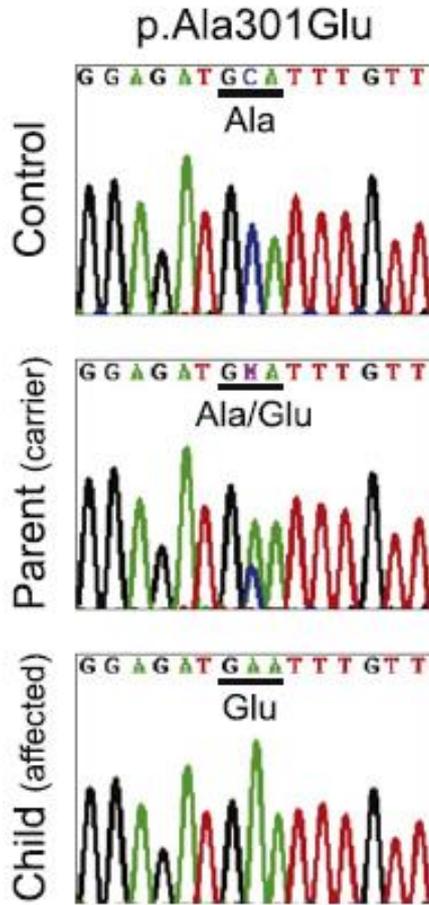
Legend [hide]

Function
loss normal gain

Confident Call
No Yes



Identification of disease causing mutation





ORIGINAL ARTICLE

Whole exome sequencing reveals mutations in *NARS2* and *PARS2*, encoding the mitochondrial asparaginyl-tRNA synthetase and prolyl-tRNA synthetase, in patients with Alpers syndrome

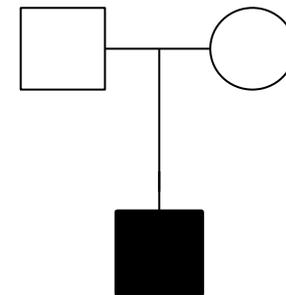
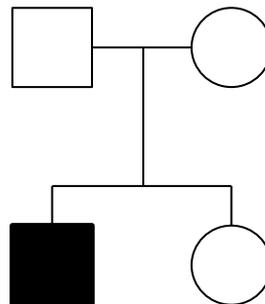
Alpers syndrome: progressive neurodegenerative disorder

POLG1 – Alpers Huttenlocher

FARS2 – encoding enzyme to charge mt tRNA with Phe

19 patients: 6 had *POLG1* mutations

For this study:





Exome sequencing

	Patient I		Patient II	
	Variants	Genes	Variants	Genes
Total	124,631	15,978	129,098	16,015
Genes encoding mitochondrial protein	1698	671	1882	681
Allele frequency <3%	98	94	100	86
Predicted deleterious	32	27	18	18
Recessive pattern of inheritance	1	1	2	1

Mutations in *PARS2* (Pro) and *NARS2* (Asn)

