High-throughput sequencing

Robert Lyle
Department of Medical Genetics
Oslo University Hospital
Robert.Lyle@medisin.uio.no

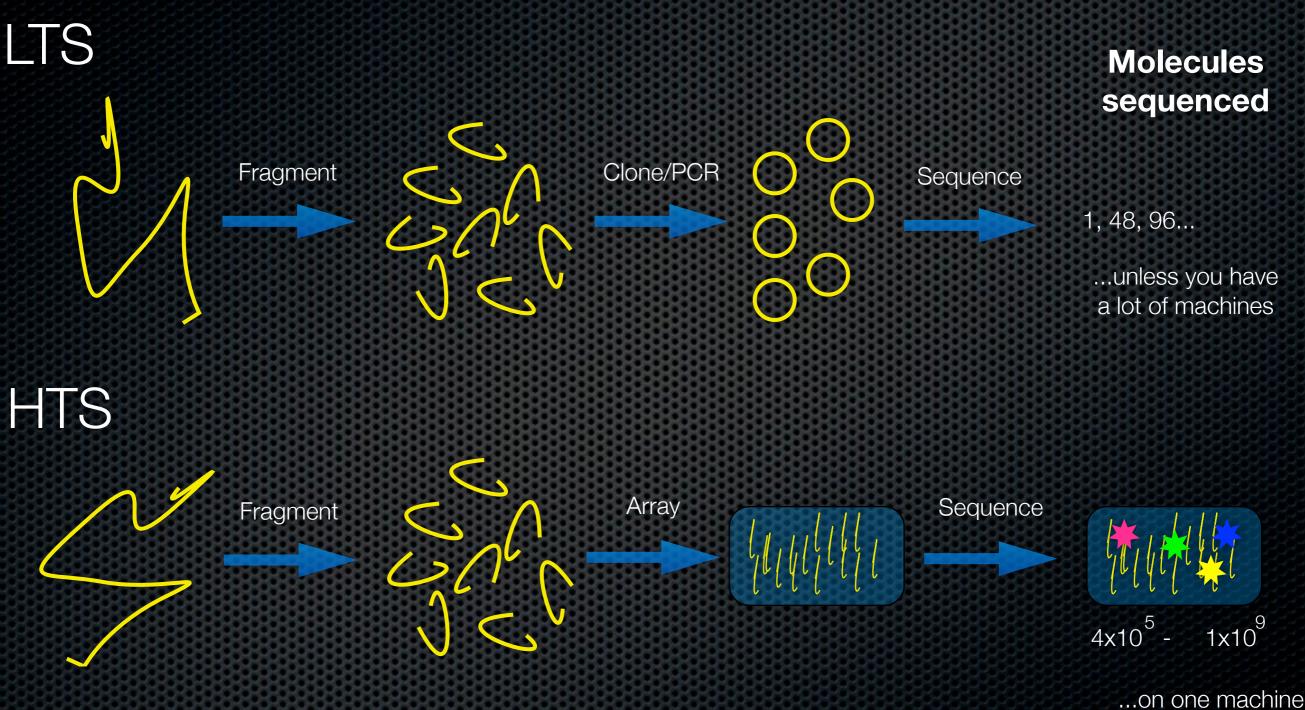
Overview

- Technology
- Data and analysis
- Applications

Technology

Sequencing past, present and future

Sequencing: old and next



Massively parallel

HTS systems available

Solexa SOLID HeliScope

Formation of the state of the sta

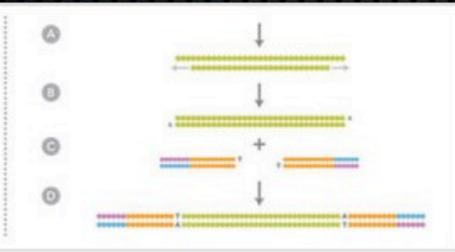
Others in 2011 (Pacific BioSciences, Ion Torrent)

Illumina sequencing technology

1. Library preparation

6 hours 3 hours hands-on time





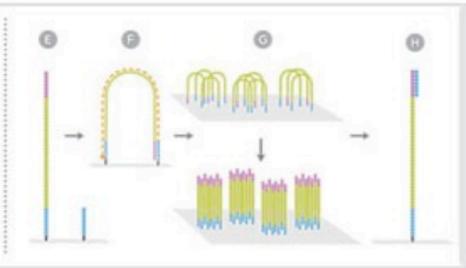
Fragment DNA Repair ends Add A overhang Ligate adapters

Select ligated DNA

2. Cluster generation

30 minutes hands-on time



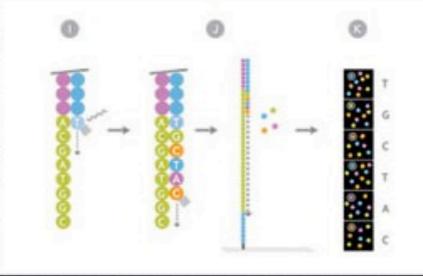


- Attach DNA to flow cell Perform bridge amplification
- G Generate clusters
- Anneal sequencing primer

3. Sequencing

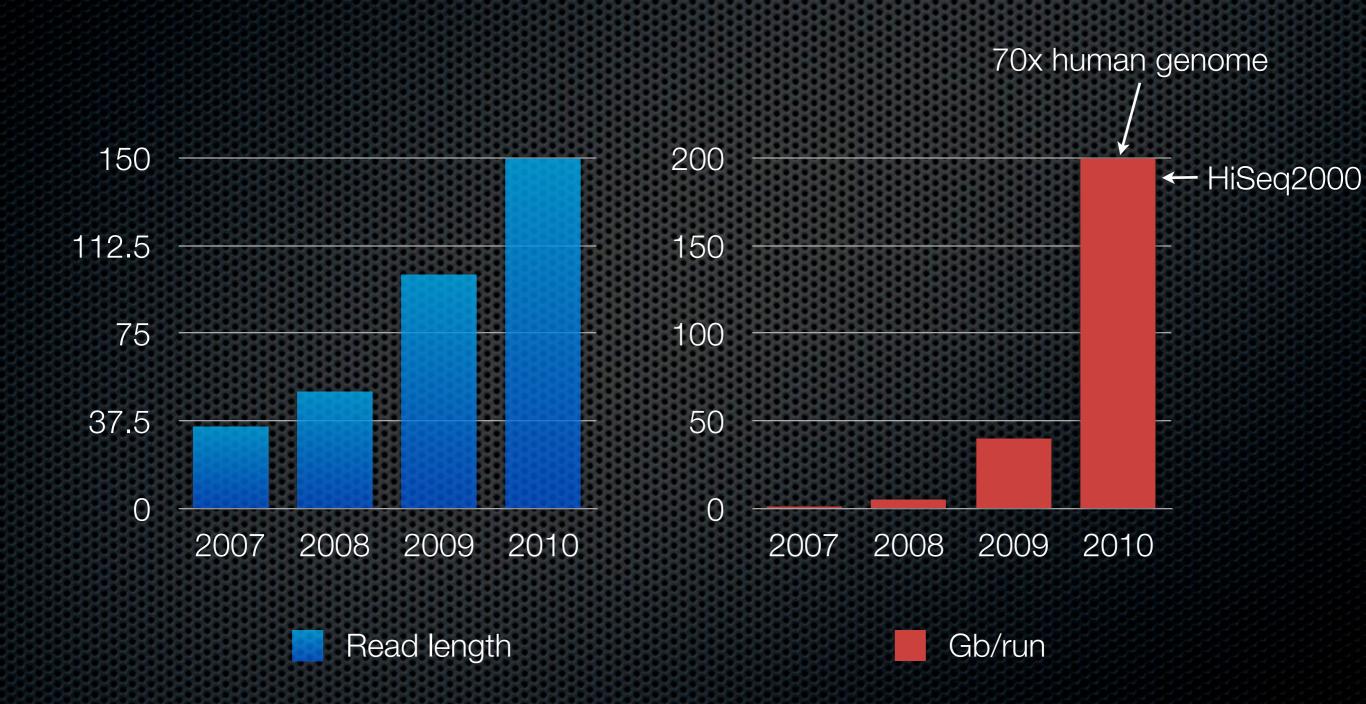
1-3 days single-read run 3-7 days paired-end run 30 minutes hands-on time 1-96 samples





- Extend first base, read, and deblock Repeat step above to extend strand
- Generate base calls

Illumina throughput



NSC

Norwegian High-throughput Sequencing Centre

Scientific Advisory Board

Pierre Taberlet (Grenoble)
Ulf Gyllensten (Uppsala)
Emmanouil Dermitzakis (Geneva)

Steering Group

Odd Stokke Gabrielsen (UiO)
Camilla Stoltenberg (NIPH)
Frode Vartdal (OUSU)
Kari Kværner (OUSU)
Berit Johansen (NTNU)
Daniel Chourrot (UiB)
Inge Jonassen (UiB)
Øivind Nilsen (UiT)
Stig W. Omholt (CIGENE)

NSC

454 node

Illumina node

Group leaders

Kjetill Jakobsen

Dag Undlien

Daily leaders

Lex Nederbragt

Robert Lyle

Project Coordinator Sissel Jentoft

Ethical Review Board

Berge Solberg (NTNU) Arvid Heiberg (OUSU) Jennifer Harris (NIPH) Projects/Users

Analysis

Centre for Information Technology

UiO (USIT)

Data storage/backup CPUs

User contact

http://www.sequencing.uio.no

Services

454 Illumina

Sample delivery form FAQ

post@sequencing.uio.no

6 Qr Coogle Log in The Norwegian High-Throughput Sequencing Centre Norwegian Sequencing Centre News The Norwegian High-Throughput Sequencing Centre (NSC) is a consolidation of the Illumina Genome Analyzer II (GAII) and CEES NSC seminar June 11th, 2010; Highthe 454 (Roche) sequencing platforms at Institute of Medical Genetics (IMG) and Centre for Ecological and Evolutionary throughput Sequencing - Applica and Analyses Jun 3, 2010 12:00 AM Synthesis (CEES), University of Oslo (UoO). The two partners have complementary strengths and research interests. While the 454 GS FLX node has a particular focus on New assembly program available on Stan: Celera 6.1 de novo sequencing (including cDNA/ESTe), amplicon sequencing and metagenomics, the Illumina GAII node has a particular focus on (targeted) resequencing and functional NSC present at the 2010 Contact Meeting of the NSB genomics applications like transcriptomics and epigenetics. Together, the NSC is therefore well positioned to provide Jan 4, 2010 12:00 AM services to the Norwegian research communities in the wide variety of possible high-throughput sequencing applications. The main goals of the NSC is to be able to provide high **Publications** throughput sequencing services for resequencing, transcriptomics, metagenomics and de novo sequencing for the Norwegian research community and provide customized bioinformatic analysis of the sequence data. Genome Analyzer II (GAII). Sequencing - Applications and Further information on sequencing services using the 454 (Roche) GS FLX. Jun 11, 2010 10:00 AM Email Follow us on twitter Year contact inform Powered by: Vortex Manage folder

National conferences NSB: talks, booth NSHG, seminars etc.

Contact



Illumina platform

Instruments

Illumina GAIIx (2) (HiSeq2000)

People

1 Daily leader1 PostDoc2 Technicians

2 Bioinformaticians

Data storage

~60 TB local NorStore Secure storage...





Platform services

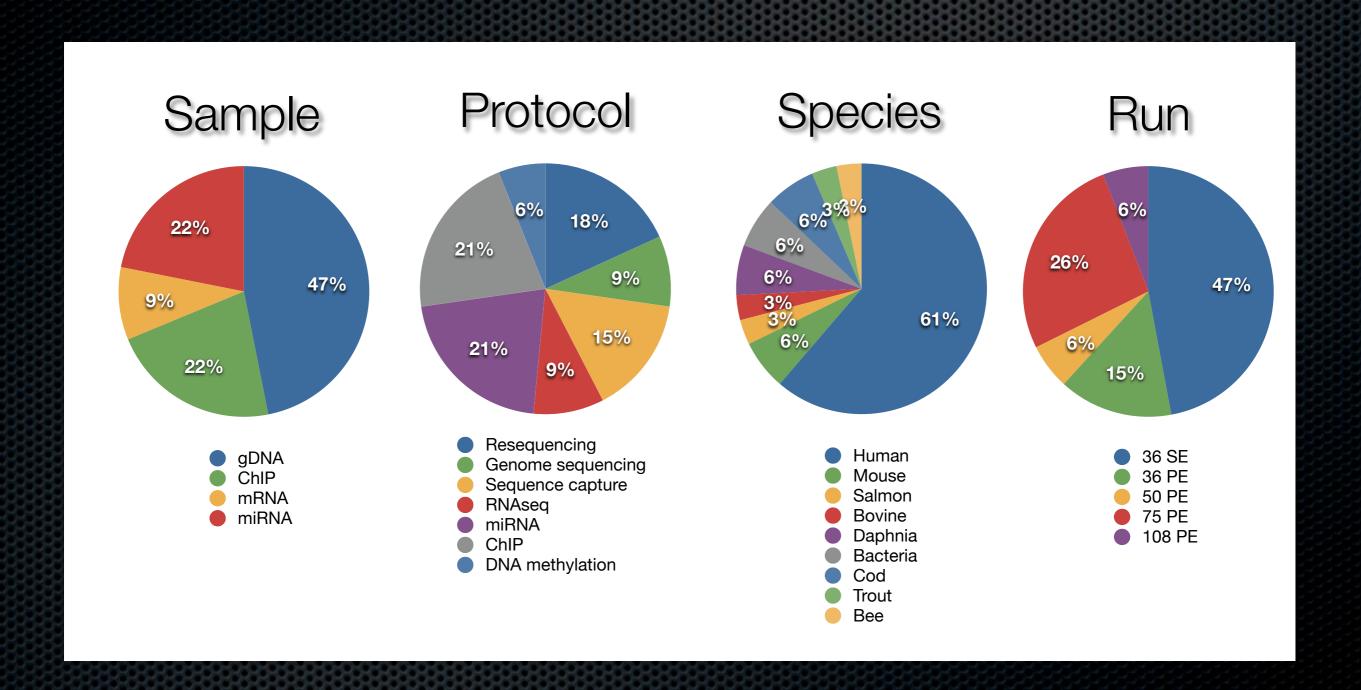
User	Sample	DNA, RNA
Platform	Sequencing	QC library preparation sequencing
	Costs	Illumina reagents QC reagents 20% platform fee (No staff/platform costs)
	Bioinformatics	Basic run information, QC Alignment to reference genome ?

Applications run on Illumina node

Application	Project	Sample	Protocol
Resequencing	whole genome linkage/association mutation detection	Genomic DNA	sequence capture, exome sequencing
<i>de novo</i> sequencing	metagenomics new species	Genomic DNA	SE, PE, mate-pair
Expression	transcriptome miRNA	mRNA, miRNA	RNAseq, miRNA
Epigenetics	DNA methylation chromatin structure	Genomic DNA	Bisulphite sequencing (RRBS), ChIP, MeDIP

1x36 bp -> 2x108 bp

Runs overview



Nationwide users University of Tromsø, Run Tromsø Scheduled Contacted Institute of Food, Fisheries and Aquaculture Research (NOFIMA), Tromsø Oslo University Hospital Norwegian University of Science and Technology (NTNU), Trondheim National Institute of Nutrition University of Oslo and Seafood Research (NIFES), Bergen Norwegian School of Veterinary Science University of Bergen, Bergen Institute for Forestry and Landscape Telemark Hospital, Skien CIGENE, Norwegian University of Life Sciences

Data and analysis

Illumina sequence data

- Random DNA library of short fragments ~300 bp
- ~100-300 million DNA sequences
- 18, 36, 50, 75, 125 bp long
- Single-end reads
- Paired-end reads

- Run time: 1-10 days
- Data volume: 300 GB.....8 TB

Data issues

■ Up to 4 TB/week

- Data storage and backup
- Network speed
- Security (human data)

- Data law 'return of results'
- Bioinformatics

Users

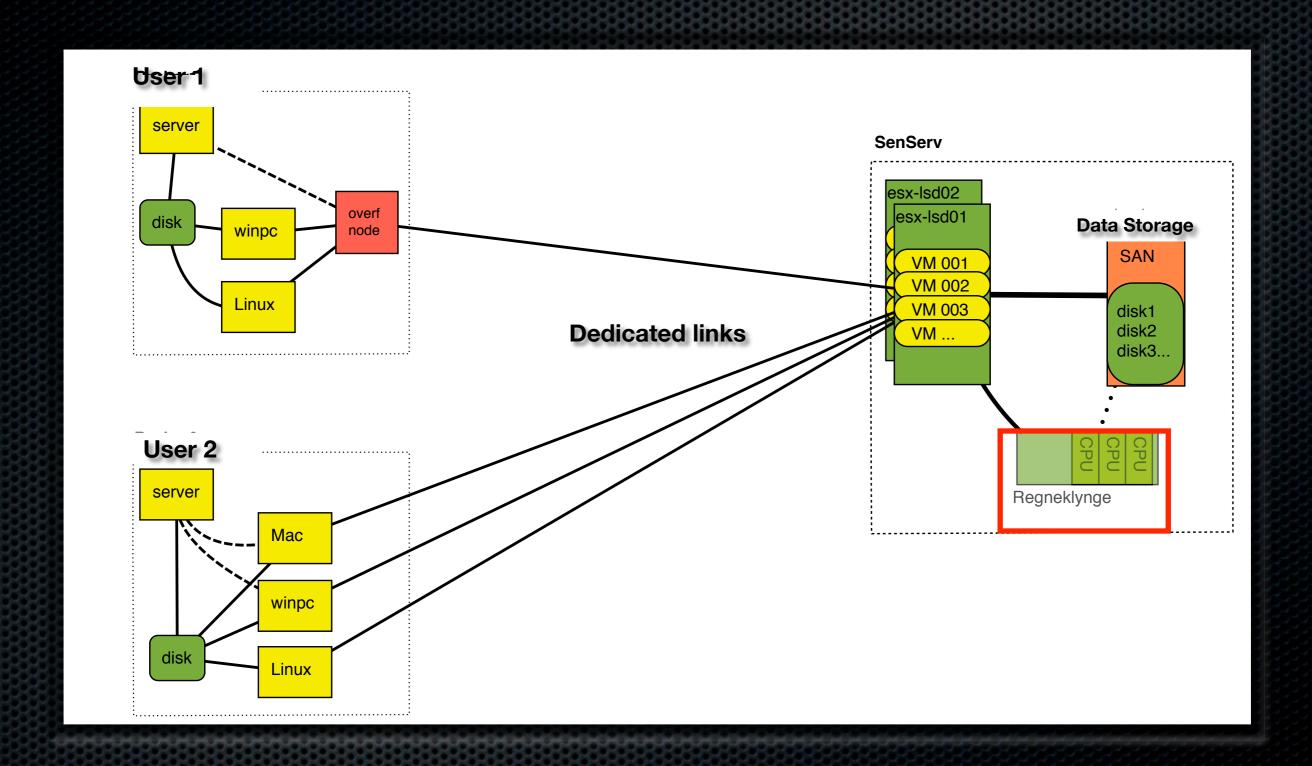
- Many users
- Many institutes
- Many applications

Bioinformatic challenge

User data storage - Phases

Phase	Provision	Timeline
0	Storage/backup of non-sensitive data from NSC (NorStore)	Complete 12.2009
1	High capacity secure storage of coded but indirectly identifiable data at local level (OUS, UiO) Establish routines for backup	Complete 6.2010
2	Robust secure solution for HTS data at the national level Exchange of data collaborators Infrastructure for analysis through the Bioinformatics platform	Start 11.2010
3	Clinical usage, secure handling of person-identifiable data being part of patient journals	?

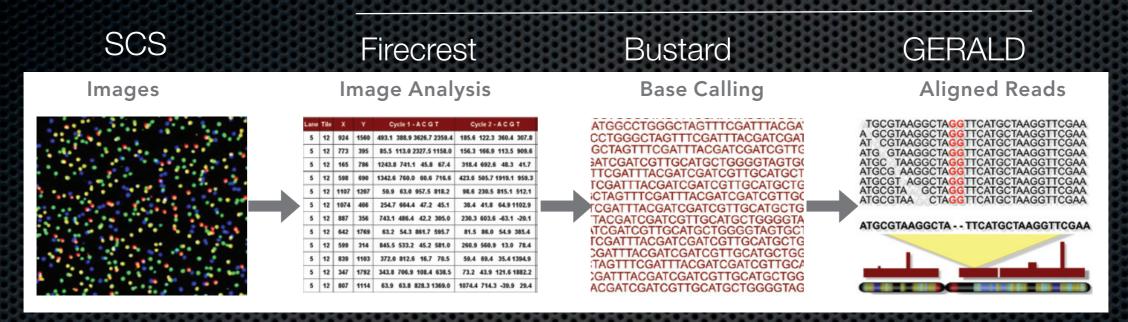
User data storage - Phase 1



Secure storage/backup for sensitive data

Illumina analysis pipeline

Illumina Pipeline 1.4



@EAS54_6_R1_2_1_413_324 CCCTTCTTGTCTTCAGCGTTTCTCC

;;3;;;;;;;;;;7;;;;;88 @EAS54_6_R1_2_1_540_792 TTGGCAGGCCAAGGCCGATGGATCA

FASTQ format

Other software/ analyses

Run size	Images	Intensity files	Sequence files	Analysis output	Total
Minimum	700 GB	100 GB	100 GB	100 GB	1 TB
Average	1.4 TB	200 GB	200 GB	200 GB	2 TB
Maximum	3.5 TB	500 GB	500 GB	500 GB	5 TB

Integrated solutions

- * CLCbio Genomics Workbench de novo and reference assembly of Sanger, Roche FLX, Illumina, Helicos, and SOLiD data. Commercial next-gen-seg software that extends the CLCbio Main Workbench software. Includes SNP detection, CHiP-seq, browser and other features. Commercial. Windows, Mac OS X and Linux.
- * Galaxy Galaxy = interactive an reproducible genomics. A job webportal.

SNP detection, CHiP-seq, browser and other features. Commercial. Win or MacOS

- * Genomatix Integrated Solution for N
- * JMP Genomics Next gen visualization * NextGENe - de novo and reference ass into mini-contigs before assembly. Includes
- * SegMan Genome Analyser Software for Next Generation sequence assembly of Illumina, Roche FLX and Sanger data integrating with Lasergene Sequence Analysis software for additional analysis and visualization capabilities. Can use a hybrid templated/de novo approach. Commercial. Win or Mac OS X.
- * SHORE SHORE, for Short Read, is a mapping and analysis pipeline for short DNA sequences produced on a Illumina Genome Analyzer. A suite created by the 1001 Genomes project. Source for POSIX.
- * SlimSearch Fledgling commercial product.

Align/Assemble to a reference

- * BFAST Blat-like Fast Accurate Search Tool. Written by Nils Homer, Stanley F. Nelson and Barry Merriman at UCLA.
- * Bowtie Ultrafast, memory-efficient short read aligner. It aligns short DNA sequences (reads) to the human genome at a rate of 25 million reads per l workstation with 2 gigabytes of memory. Uses a Burrows-Wheeler-Transformed (BWT) index. Link to discussion thread here. Written by Ben Langmead and Cole Trapnell. Linux, Windows, and Mac OS X
- * BWA Heng Lee's BWT Alignment program a progression from Mag. BWA is a fast light-weighted tool that aligns short seguences to a seguence database, such as the human reference genome. By default, BWA finds an alignment within edit distance 2 to the guery sequence. C++ source.
- ox of the Solexa 1G machine.
- man-Gotoh) of DNA/protein against a reference. Authors are Guy St C Slater and Ewan Birney from EMBL. C for POSIX.
- * ELAND Efficient Large-Scale Alignment of Nycleotide Databases. Whole genome alignments to a reference genome. Written by Illumina author Anthor Exonerate Various forms of pairwise alignment (product and Extended for accurate read alignments. It quickly aligns millions of reads either with ungapped for accurate read alignments. It quickly aligns millions of reads either with ungapped for accurate read alignments. apped or gapped alignments. A tool created by the 1001 Genomes project. Source for POSIX.
- st $_{
 m GMAP}$ $_{
 m GMAP}$ (Genomic Mapping and Alignment Program) for mRNA and EST Sequences. Developed by Thomas Wu and Colin Watanabe at Genente
- * gnumap The Genomic Next-generation Universal MAPper (gnumap) is a program designed to accurately map sequence data obtained from next-generation sequencing machines (specifically that of Solexa/Illumina) back to a genome of any size. It seeks to align reads from nonunique repeats using statistics. From authors at Brigham Young University. C source/Unix.
- Write by Heng Li from the Sanger Centre. Features * MAQ - Mapping and Assembly with Qualities (renamed from MAPASS2). Particularly designed for Illumina with preliminary functions to handle ABI SOLIN extensive supporting tools for DIP/SNP detection, etc. C++ source
- * MOSAIK MOSAIK produces gapped alignments using the Smith-Waterman algorithm. Features a number of support tools. Support for Roche FLX, Illumina, SOLiD, and Helicos. Written by Michael Strömberg at Boston College. Win/Linux/MacOSX
- * MrFAST and MrsFAST mrFAST & mrsFAST are designed to map short reads generated with the Illumina platform to reference genome assemblies; in a fag mory-efficient manner. Robust to INDELs and MrsFAST has a bisulphite mode. Authors are from the University of Washington. C as source.
- * MUMmer MUMmer is a modular system for the rapid whole genome alignment of finished or draft sequence. Released as a package providing an efficient set elibrary, seed-and-extend alignment, SNP detection, repeat detection, and visualization tools. Version 3.0 was developed by Stefan Kurtz, Adam Phillippy, Arthur L Delcher, Michael Smoot, Martin Shumway, Coring Antonescu and Steven L Salzberg - most of whom are at The Institute for Genomic Research in Maryland, USA. POSIX OS required. TOIDE for evaluation, educational use and for use on
- open not-for-profit projects. Requires Linux or Mac OS X. * PASS - It supports Illumina, SOLiD and Roche-FLX data formats and allows the user to modulate very finely the sensitivity of the alignments. S filter, then NW dynamic algorithm to a SW(like) local alignment. Authors are from CRIBI in Italy. Win/Linux.

* Novocraft - Tools for reference alignment of paired-end and single-end Illumina reads. Uses a Needleman-Wunsch algorithm. Can support Bis-

- * RMAP Assembles 20 64 bp Illumina reads to a FASTA reference genome. By Andrew D. Smith and Zhenyu Xuan at CSHL. (published in BMC bloinforma * SeqMap Supports up to 5 or more bp mismatches INDEE Hip by trable. Written by Hui Jiang from the Wong lab at Stanford. Builds available for most * SHRIMP Assembles to a reference sequence. Developed with Applied Biosystem's colourspace genomic representation in mind. Authors are Michael Biody. ole at the University of Toronto, POSIX.
- * Slider- An application for the Illumina Sequence Analyzer output that uses the probability files instead of the sequence files as an input for alighm element a set of reference sequences. Authors are from BCGSC. Paper is here.
- * SOAP SOAP (Short Oligonucleotide Alignment Program). A program for efficient gapped and ungapped alignment of short oligonucleotides onto referent es. The updated version uses a BWT. Can call SNPs and INDELs. Author is Ruigiang Li at the Beijing Genomics Institute. C++, POSIX. * SSAHA - SSAHA (Sequence Search and Alignment by Hashing Algorithm) is a tool for rapidly finding near exact matches in DNA or protein databases using a hash table. Developed at the Sanger Centre by Zemin Ning,
- Anthony Cox and James Mullikin. C++ for Linux/Alpha.
- * SOCS Aligns SOLID data. SOCS is built on an iterative variation of the Rabin-Karp string search algorithm, which uses hashing to reduce the ble search speed. Authors are Ondov B, Varadarajan A, Passalacqua KD and Bergman NH.
- * SWIFT The SWIFT suit is a software collection for fast index-based sequence comparison. It contains: SWIFT fast local alignment search, quaranteeing to find epsilon-matches between two sequences. SWIFT BALSAM a very fast program to find semiglobal non-gapped alignments based on k-mer seeds. Authors are Kim Rasmussen (SWIFT) and Wolfgang Gerlach (SWIFT BALSAM)
- * SXOligoSearch SXOligoSearch is a commercial platform offered by the Malaysian based Synamatix. Will align Illumina reads against a range of Refseq RNA or NCBI genome builds for a number of organisms. Web Portal. OS independent.
- * Vmatch A versatile software tool for efficiently solving large scale sequence matching tasks. Vmatch subsumes the software tool REPuter, but is much more general, with a very flexible user interface, and improved space and time requirements. Essentially a large
- * Zoom ZOOM (Zillions Of Oligos Mapped) is destructed in the high f short reads, emerged by next-generation sequencing t to be highly accurate, flexible, and user-friendly with speed being a critical priority. Commercial. Supports Illumina and SOLiD data.

De novo Align/Assemble

- * ABYSS Assembly By Short Sequences. ABYSS is a de novo sequence assembler that is designed for very short reads. The single-processor version is useful for assembling genomes up to 40-50 Mbases in size. The parallel version is implemented using MPI and is capable of assembling larger genomes. By Simpson JT and others at the Canada's Michael Smith Genome Sciences Centre. C++ as source.
- * ALLPATHS ALLPATHS: De novo assembly of whole-genome shotgun migroreads. ALLPATHS is a whole genome shotgun migroreads. All PATHS is a whole genome shotgun migroreads. All PATHS is a whole genome shotgun migroreads. a graph form that retains ambiguities, such as those arising from polymorphism, thereby providing information that as be genome assemblies. Broad Institute. nt from previou
- rocess he illions * Eden Trong / Secolary Stweet Sarcomper dedicated to ads p nor e Analyzer. Edena is based on the traditional overlap layout paradigm. By chrenzel. Linux Vin.
- * <u>EULER-SR</u> Short read *de novo* assembly. By Mark J. Chaisson and Paver A. revzner from CCSD (published in Genome Research). Uses a de bruijn graph approach.
- * MIRA2 MIRA (Mimicking Intelligent Read Assembly) is able to perform true hybrid de-novo assemblies using reads gathered through 454 sequencing technology (GS20 or GS FLX). Compatible with 454, Solexa and Sanger data. Linux OS required.

Analysis hardware

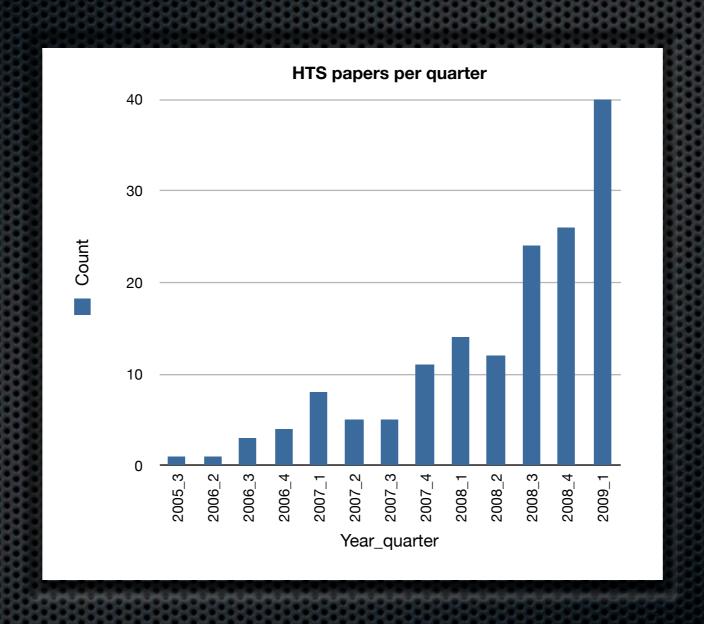
System	Specifications	
Pipeline server		
Processor	HP Proliant dl580 g5 rack server (4 quad-core 2.93GHz 64-bit Intel Xeon)	
Memory	32 GB	
Storage	21 TB (HP 60 MSA)	
Operating system	Linux	
iPAR		
Processor	HP DL 380 (2 × 5460 3.16 GHz)	
Memory	16 GB	
Storage	3.2 TB (HP SmartArray P800)	
Operating system	Linux/XP	
Mac Pro (x2)		
Processor	2 quad-core 2.66 GHz 64-bit Intel Nehalem	
Memory	16 GB	
Storage	4 TB	
Operating system	OS X	

NorStore, Titan.....

Break?

Applications

Research publications



Applications

Application	Project
Resequencing	whole genome linkage/association mutation detection
de novo sequencing	metagenomics new species
Expression	transcriptome SAGE miRNA
Epigenetics	DNA methylation ChIP
Variation	SNPs CNVs

Resequencing

- Compare test sequence to a reference sequence
 - Mendelian (linkage)
 - Association studies
 - Exome sequencing
- Identify genetic variation
- Single-nucleotide polymorphisms (SNPs)
- Insertions/deletions
- Copy-number variation (CNVs)

Resequencing: mutation detection

Genomic region known

Linkage peak

Sequence capture - region of interest

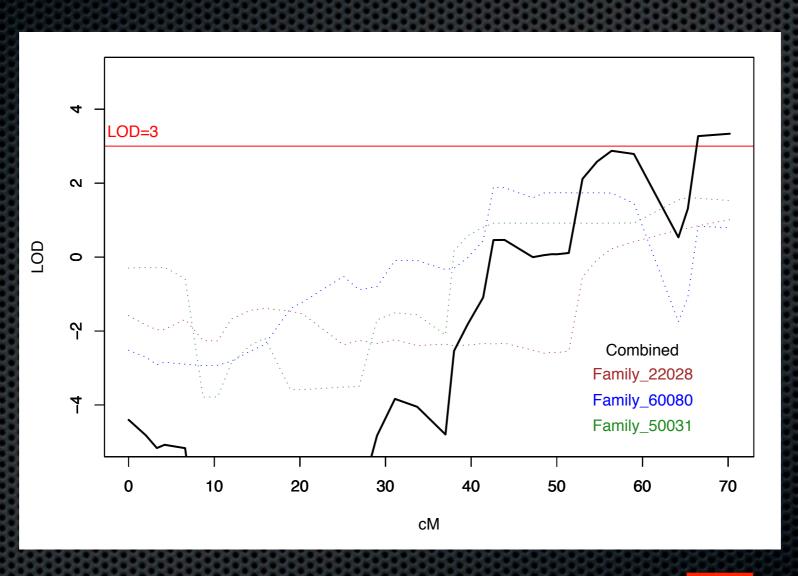
Genomic region unknown

Rare Mendelian disorders

- Sequence capture exome
- RNAseq

Region known

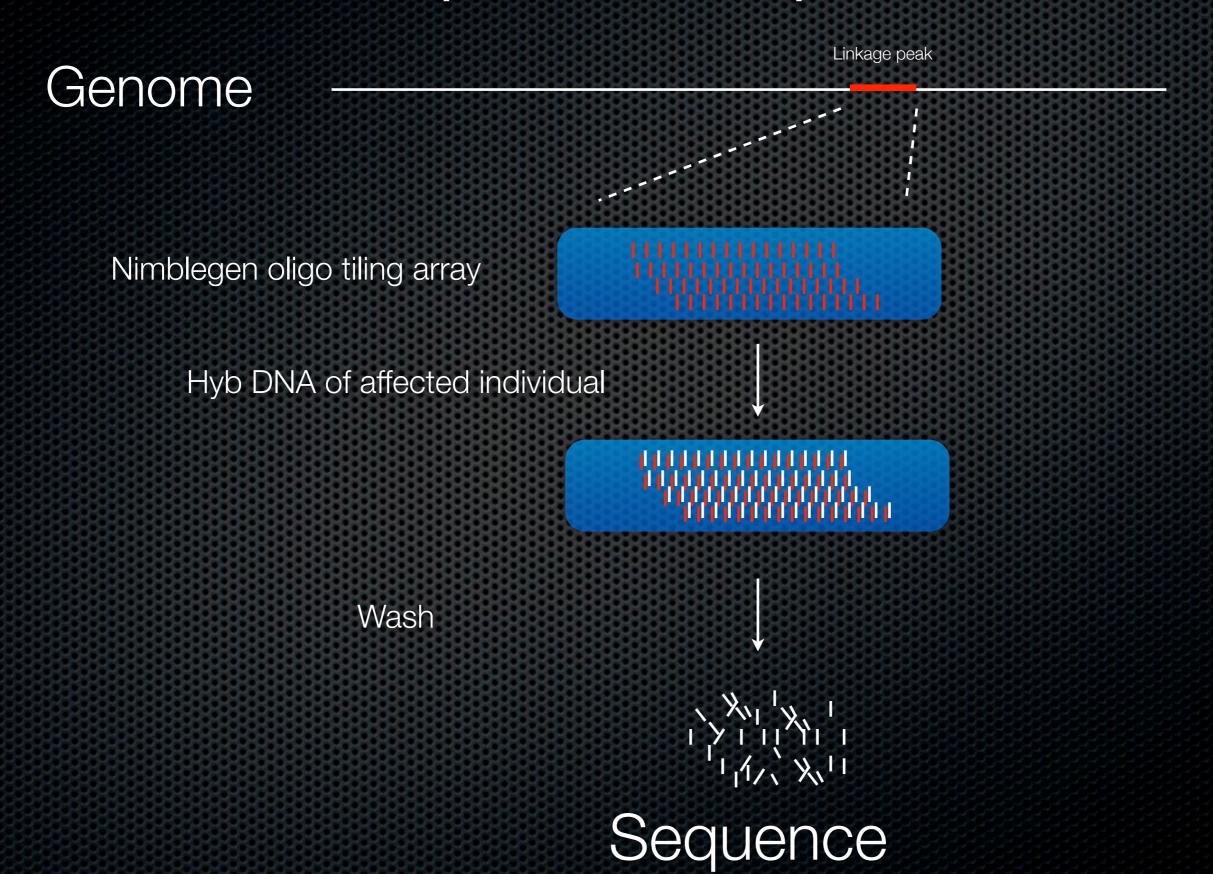
Linkage



1-10 Mb?

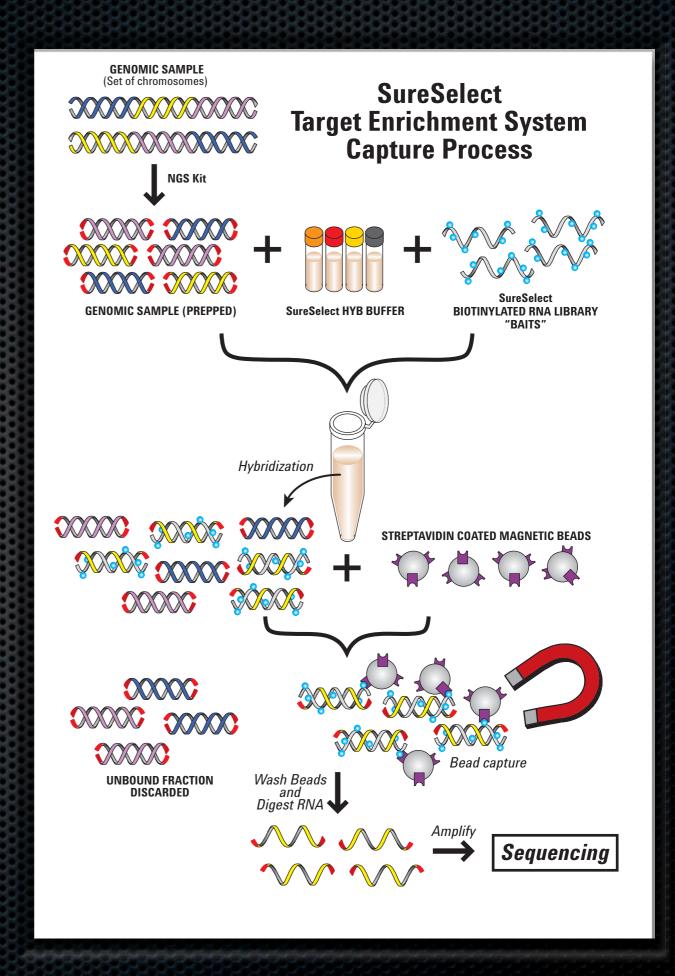
How can we capture this region to sequence?

Sequence capture



Agilent SureSelect

- RNA oligonucleotides
- >100 bp
- custom design



www.agilent.com

Analyzing resequencing data

- Capture DNA and sequence
- Prepare sequence files (Perl...)
- Align to reference (MAQ, BWA etc.)
- Format/filter output files (Perl...)
 - .bed, .gtf
 - View on genome browser
 - identify variants

Analysis pipeline

Illumina Pipeline 1.4





@EAS54_6_R1_2_1_413_324
CCCTTCTTGTCTTCAGCGTTTCTCC

;;3;;;;;;;;;7;;;;88 @EAS54_6_R1_2_1_540_792 TTGGCAGGCCAAGGCCGATGGATCA

;;;;;;;;;;;7;;;;-;;;3;83
@EAS54_6_R1_2_1_443_348
GTTGCTTCTGGCGTGGGTGGGGGGGGG+EAS54_6_R1_2_1_443_348
;;;;;;;;;;;;9;7;;.7;39333



Other software/analyses

Aim



R|G

Compare to reference

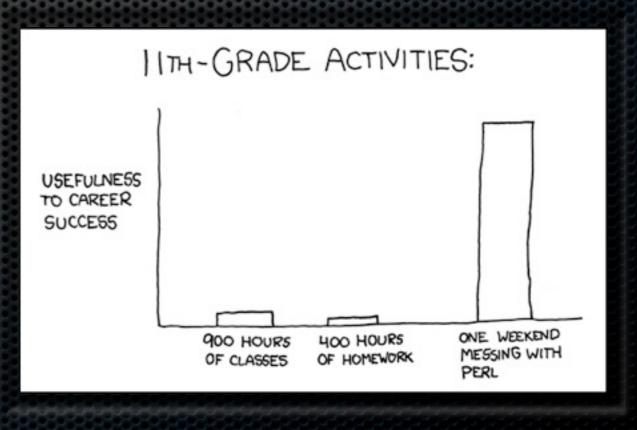
FASTQ format

Sequence

Mutation

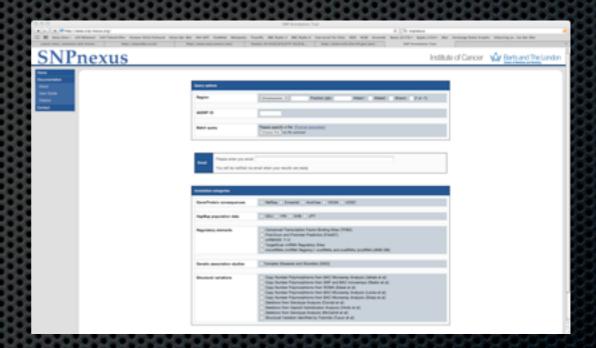
Tools for HTS

- Alignment MAQ, BWA
- Filtering, sorting etc. SAMTools, BEDTools
- Viewing BED, GFF, UCSC browser
- Perl, unix scripts



Finding mutations?

- Which variants are deleterious?
- Novel? (dbSNP, 1000genomes, HGMD)
- Synonymous/non-synonymous?
- Conserved?
- Alter protein structure?



PolyPhen2
MutationTaster
ANNOVAR
SeattleSeq Annotation

1000 genomes project

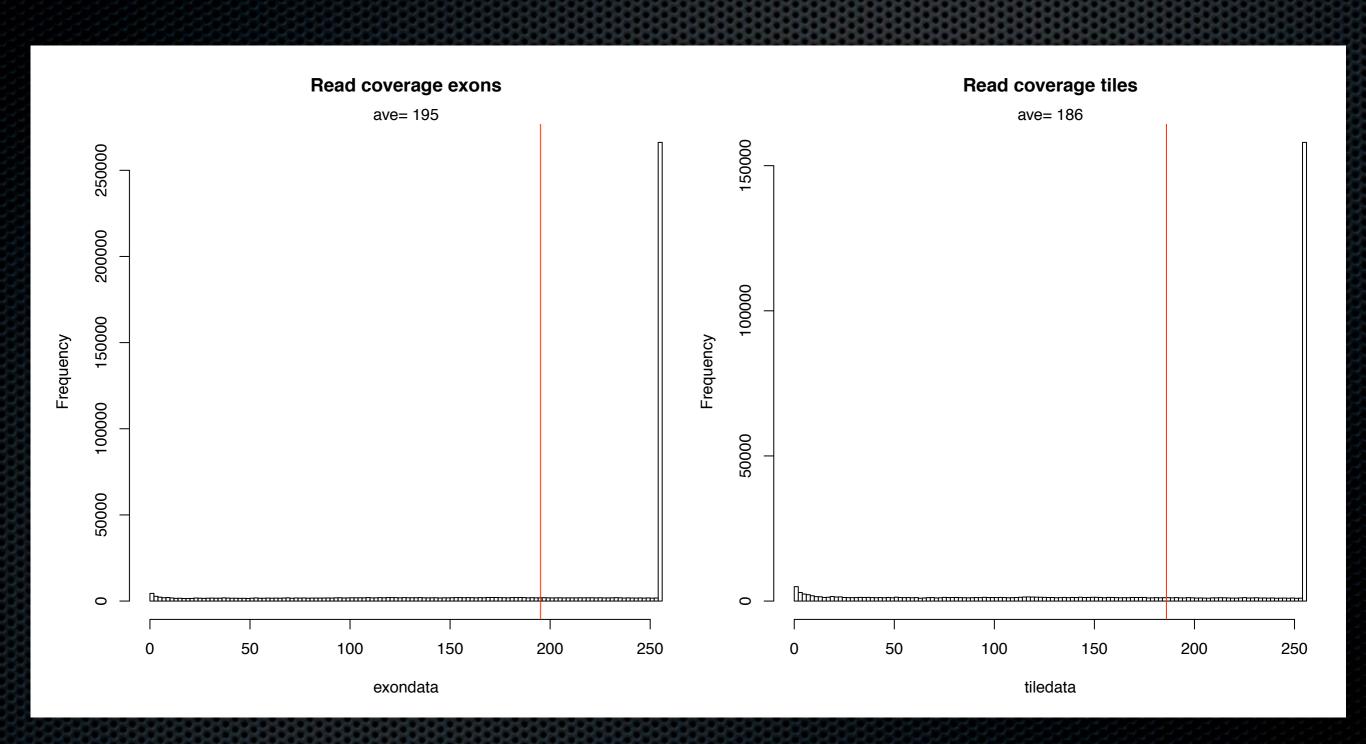
- International consortium
- Sequence 1200 genomes
- Produce a nearly complete catalog of common human genetic variants (defined as frequency 1% or higher; SNPs, CNVs)
 - mutation detection in Mendelian disease
 - accelerate fine-mapping efforts association studies
 - enabling design of next-generation genotyping arrays improve the power of future genetic association studies
 - improve our ability to "impute" or "predict" untyped genetic variants

Frequent public data releases

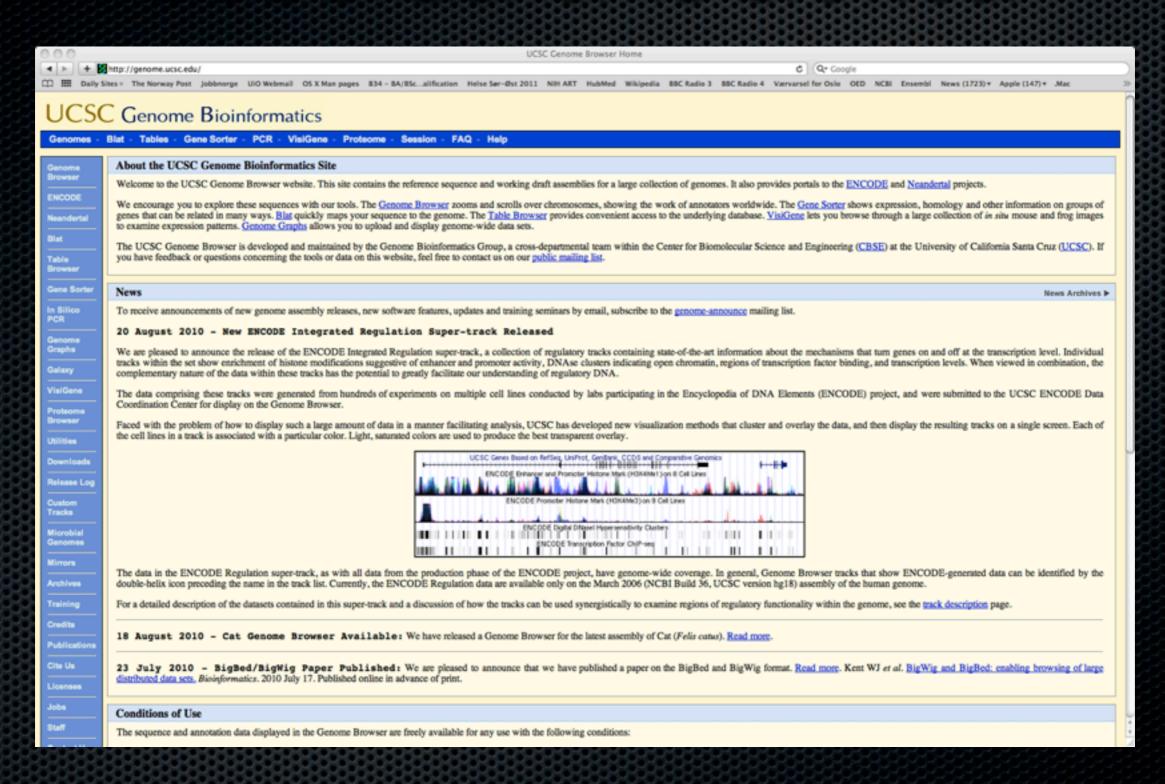
Crude analysis pipeline

Program/script	Description	Output
maq fasta2bfa	Prepare ref sequences	bfa
maq fastq2bfq	Convert FASTQ reads to BFQ format	bfq
maq map	Align	MAQ aln
maq assemble	Assemble	MAQ cns
maq cns2snp	Call SNPs	MAQ SNP
awk '\$2>=29621176 && \$2<=39095041'	Filter for ROI	MAQ SNP
maq.pl SNPfilter	Q filter SNPs	MAQ SNP
maq cns2view	MAQ file for ROI	MAQ SNP
maqview2bed.pl	bed file for ROI	bed
maqsnp2bed.pl	bed file for SNPs	bed
maqsnp2snpnexus.pl	Input for SNPnexus	SNPnexus input
parseSNPnexus.pl	Parse SNPnexus output	SNPnexus output
bases2nexus.pl	Variants file	bases file
maqCoverageSummary.pl	Sequence coverage	bed, pdf
coverage_v4.pl	Sequence coverage	bed
lowCoverageSummary.pl	Sequence coverage	bed

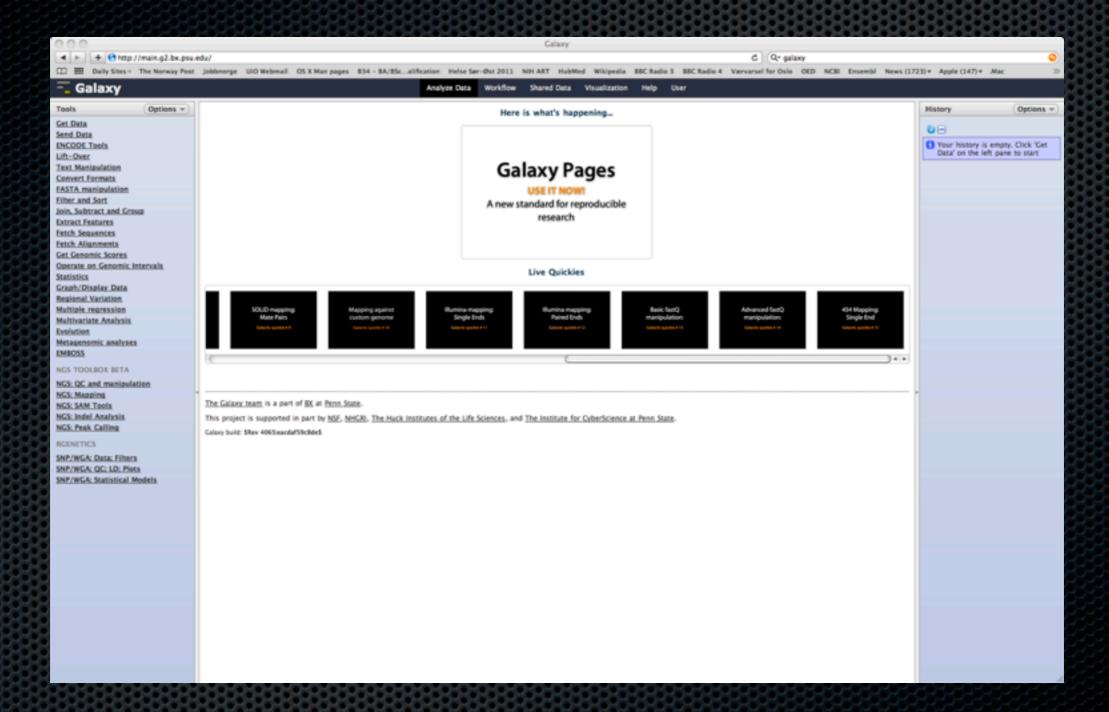
Read depth statistics



UCSC Genome browser

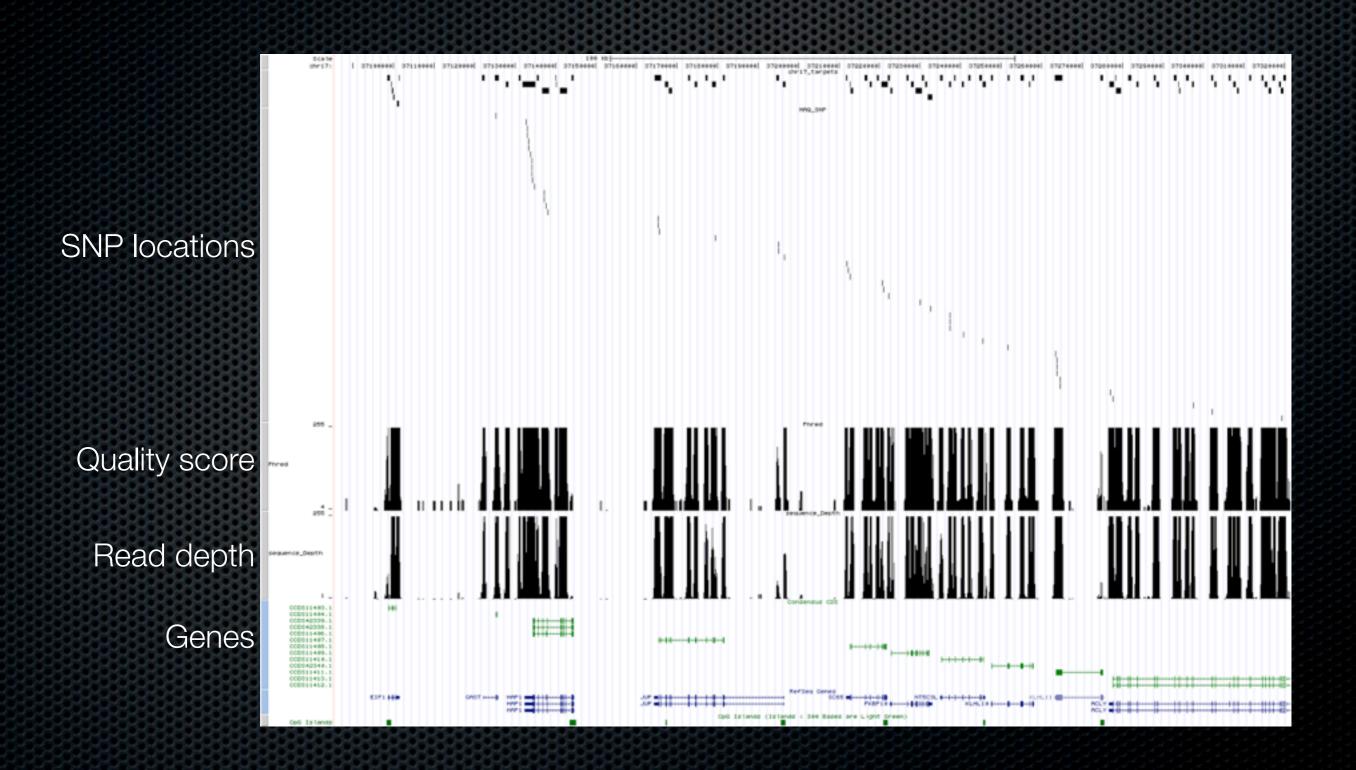


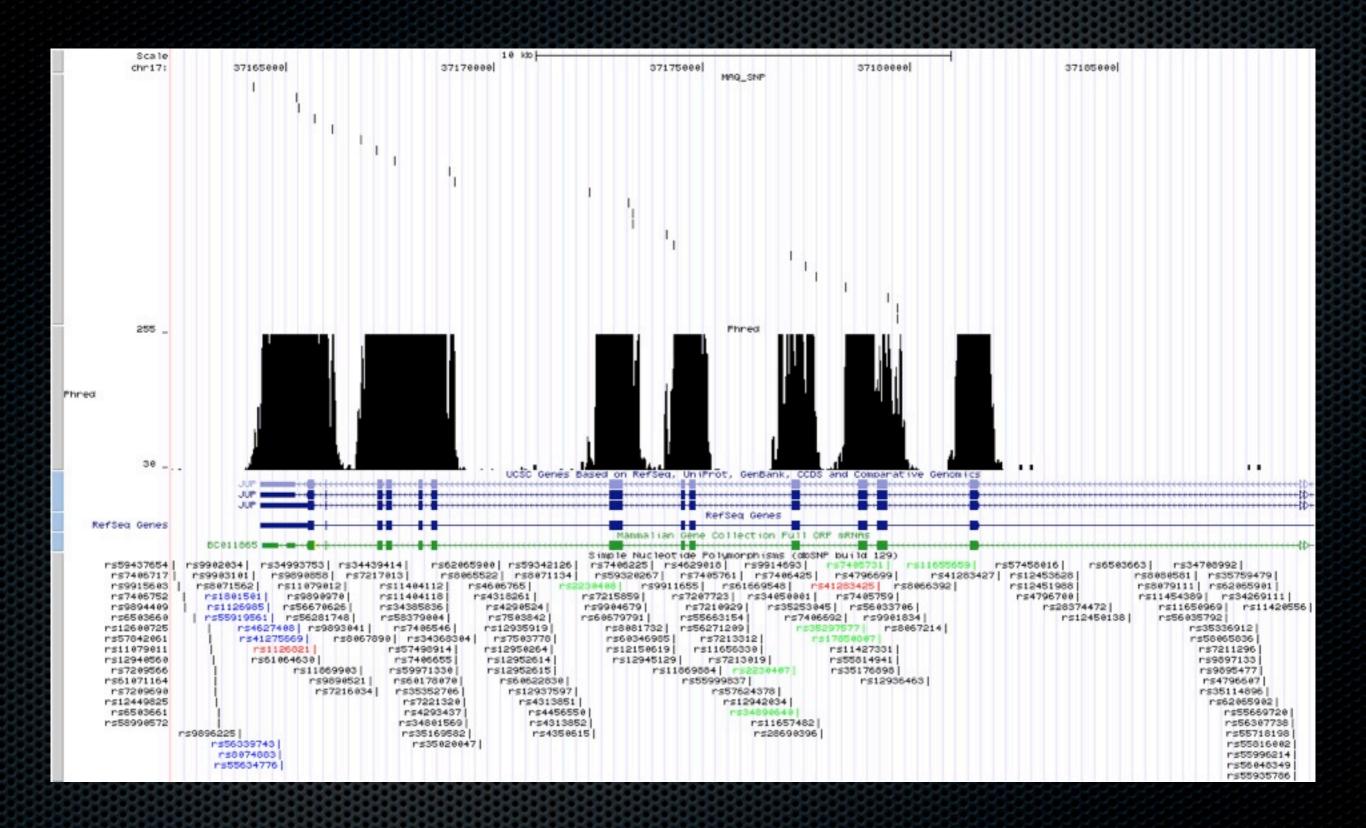
Galaxy



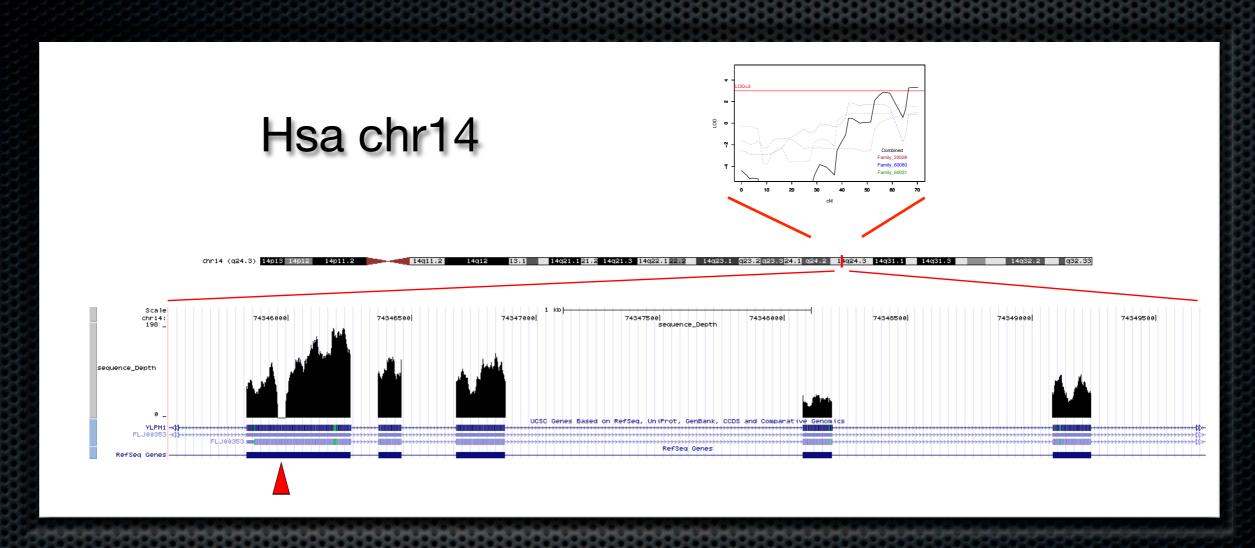
http://main.g2.bx.psu.edu/

Viewing data



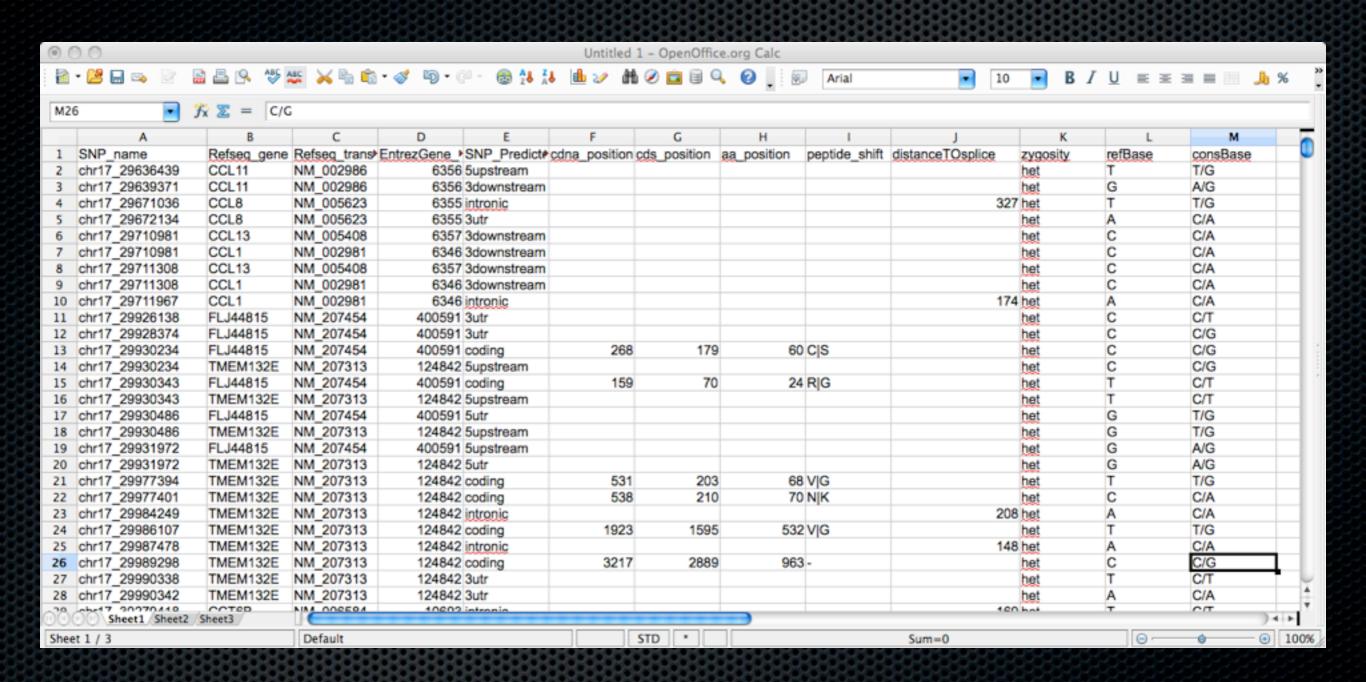


Analyzing resequencing data



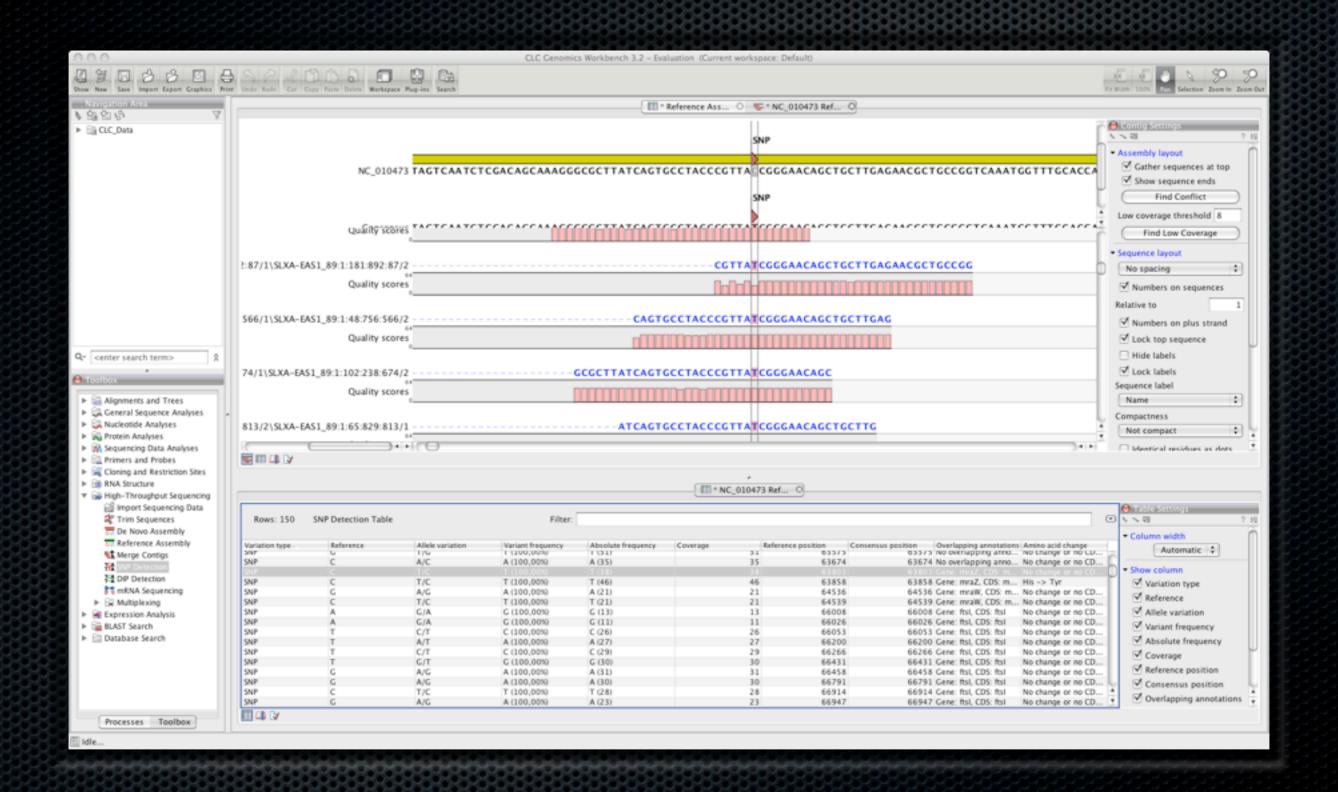
13 bp insertion

Variants file



Identifying relevant variants is the hard part

CLC genomics workbench



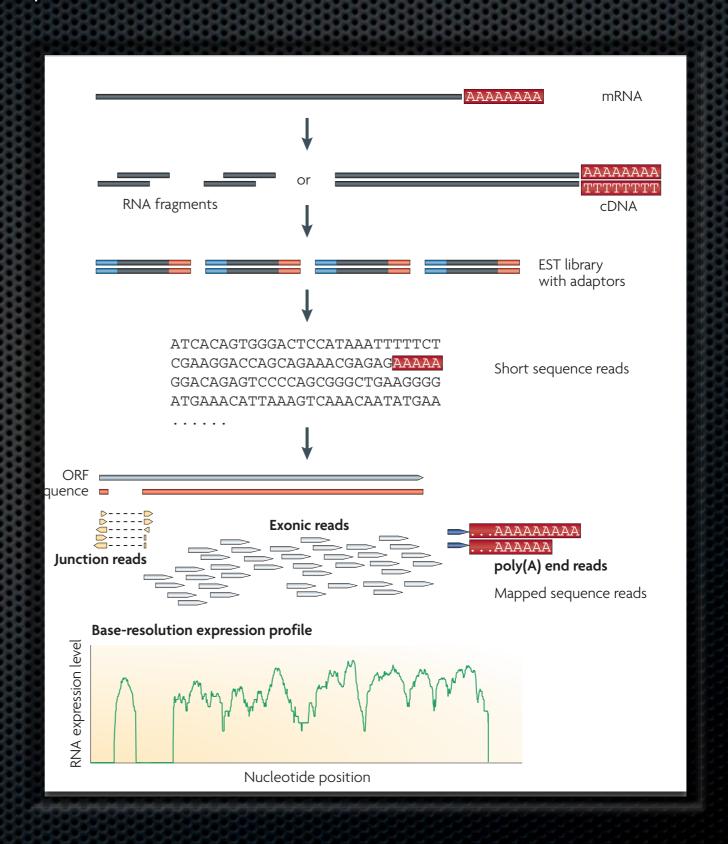
Detecting all variants

VARIANT	SINGLE READ	SHORT INSERT PAIRED-ENDS (200–500 bp)	LONG INSERT MATE PAIRS (2–5 kb)	PAIRED-END AND MATE PAIR COMBINED
SNP	++	++++	++	++++
Small indels	++	++++	++	++++
Insertion	+	+++	+++	++++
Amplification	++	+++	+++	++++
Deletion	+	+++	++	++++
Inversion	+	+++	++	++++
Complex rearrangement	+	+++	++	++++
Large rearrangement	+	++	+++	++++

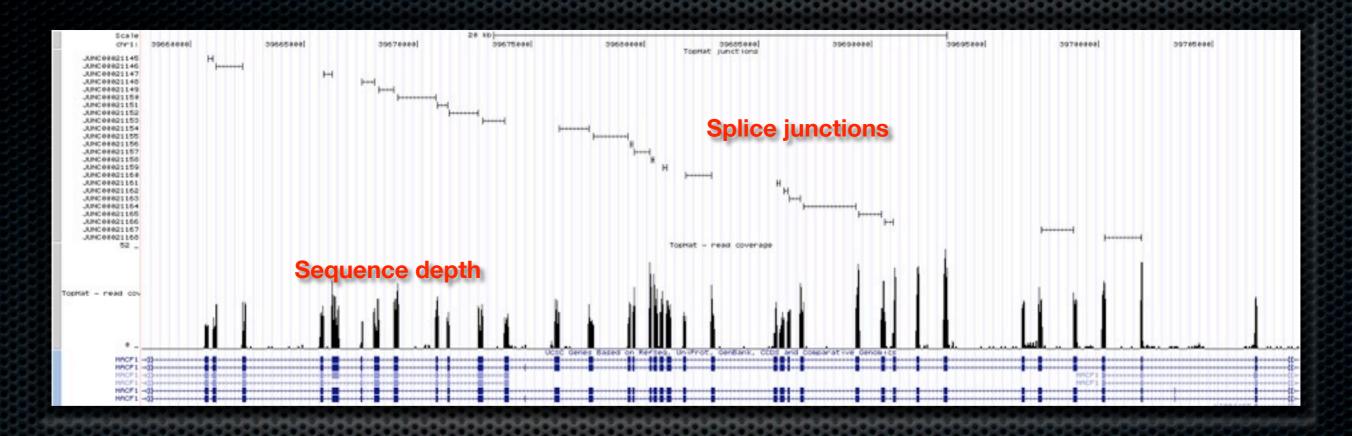
Region unknown

Sequence capture - exome: sequence all exons

- RNAseq
- Sequence total polyA RNA
- Map reads to reference
- Identify mutations/variants



RNAseq data



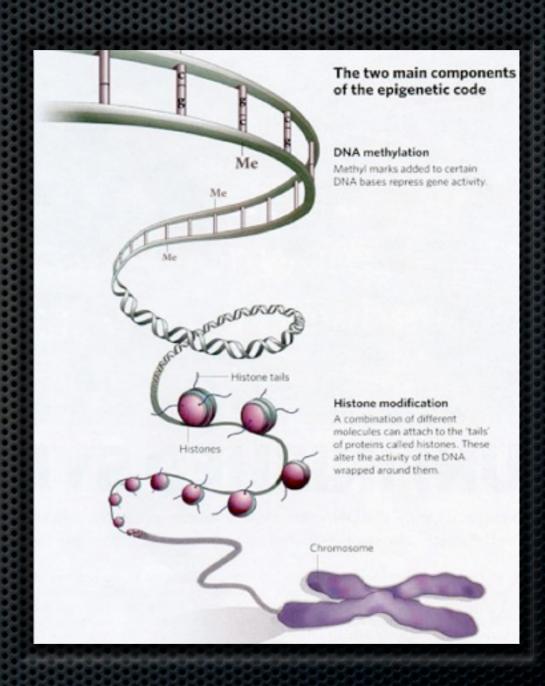
Position along Hsa chr1

Identifying relevant variants is the hard part

Epigenetics

- DNA methylation
 - CpG dinucleotides

- Histone modifications
 - acetylation
 - phosphorylation
 - methylation
 - ubiquitination





Epigenetics II

- DNA methylation
 - Long-term epigenetic silencing of specific sequences
 - transposons, imprinted genes, pluripotency genes

- Histone modifications
 - Short term, flexible epigenetic control

Control of gene expression

HTS and epigenetics

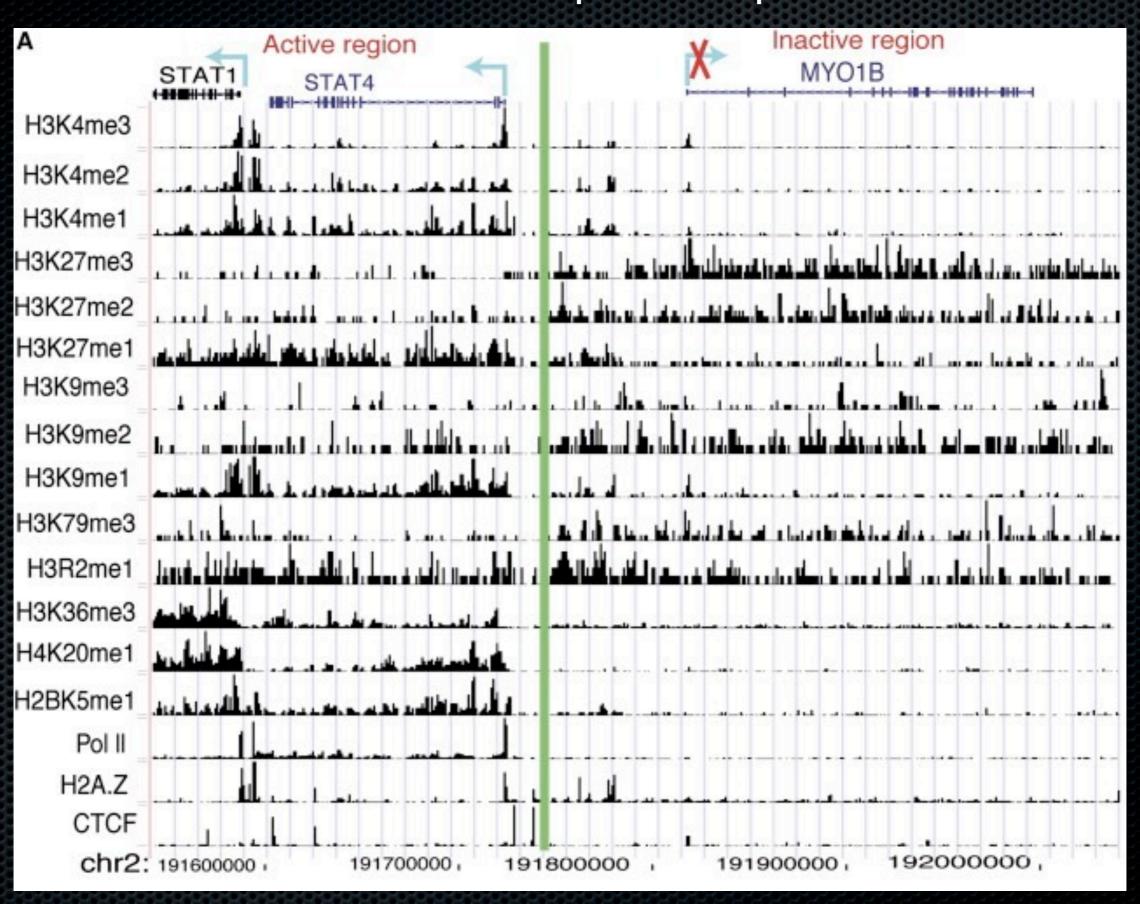
ChIP chromatin immunoprecipitation

Cross-link Chromatin nication to Shear Chromatin mmunoprecipitate Anti-Histone Anti-Transcription Factor Reverse Cross-links Quantitative PCR Promoter Microarray

Quantifying DNA methylation Bisulphite sequencing (BiS) AGCTGT**CG**ATTAGCCG **AGTTGTCGATTAGTTG** methylated 1. bisulphite treat 2. PCR region of interest 3. sequence AGCTGT**CG**ATTAGCCG **AGTTGTTGATTAGTTG** unmethylated

HTS to identify genome-wide status/variation

ChIP-seq example



Summary

- High-throughput sequencing
 - Dramatic increase in sequence production
 - Many applications on one platform
 - Field new and moving very quickly

- Bioinformatics challenges/opportunities
 - Data storage
 - Data analysis

Visit?

Robert.Lyle@medisin.uio.no

