

Mario Caccamo – Jon Wright Bioinformatics division The Genome Analysis Centre

wheatdcc.tgac.bbsrc.ac.uk











### **Bioinformatics Pipelines**

- BBSRC Genome
  Analysis Centre
  In partnership with EEDA Greater Norwich Berkership
- International
  Wheat Genome
  Sequencing
  Consortium

- De novo genome sequencing and associated analysis
- Re-sequencing for variation and population analysis

### Transcriptome analysis

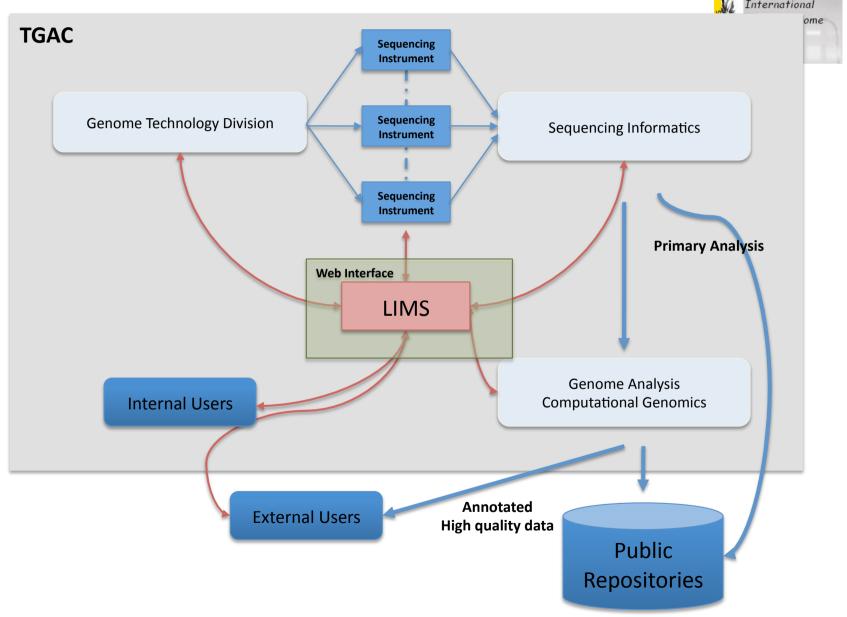
- Studying gene expression levels and patterns
- Regulatory changes
- Rare variants and associated expression changes
- Transcription regulation by epigenetic markers

### Metagenomics/Metatranscriptomics

- Analysis of environmental samples to identify new genes and pathways e.g. in soil or the human gut microbiome

## **Data Analysis Pipeline**





### **TGAC Computing Capacity**



**Phase 1** (Sep '08 - Mar'10)

100 TB storage capacity mirrored

Linux cluster with 120 computing nodes, ~400 GB RAM for data processing

**Phase 2** (Apr'10 - Mar'11)

New Data Centre in B26 (also houses training lab + computing training facility)

0.6 PB storage capacity mirrored

1000 computing nodes; 4 x 256GB RAM

Big memory machine: SGI Altix UV100 (6TB RAM, 576 CPU cores)

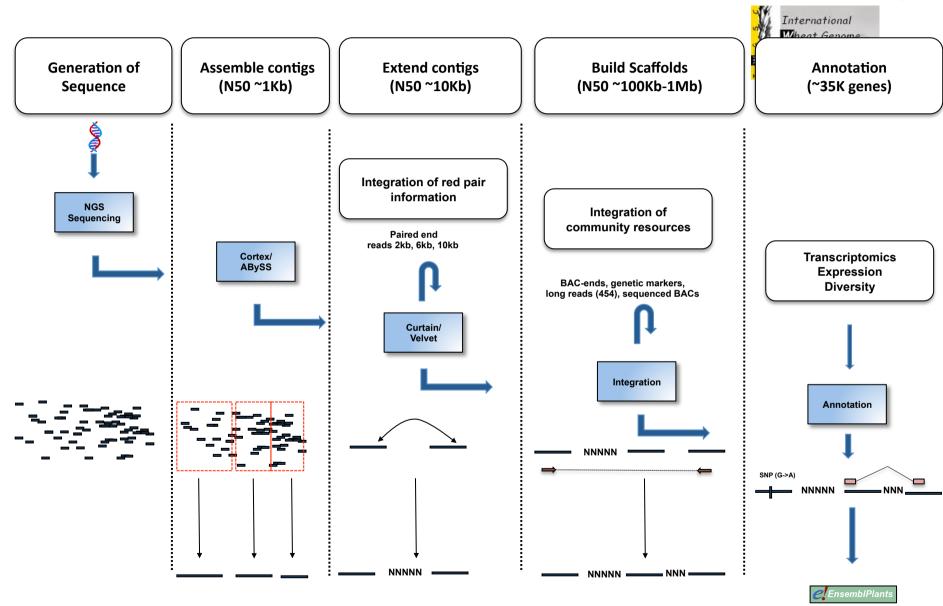
#### Phase 3

Future options - use of HTC facilities, cloud computing?

Big Data Challenge

## **Assembly Pipeline**





## **Agenda**





- Wheat Chromosome Sequencing Survey DCC
- Assemblies theory
- Assemblies practice

## **Agenda**





- Wheat Chromosome Sequencing Survey DCC
- Assemblies theory
- Assemblies practice

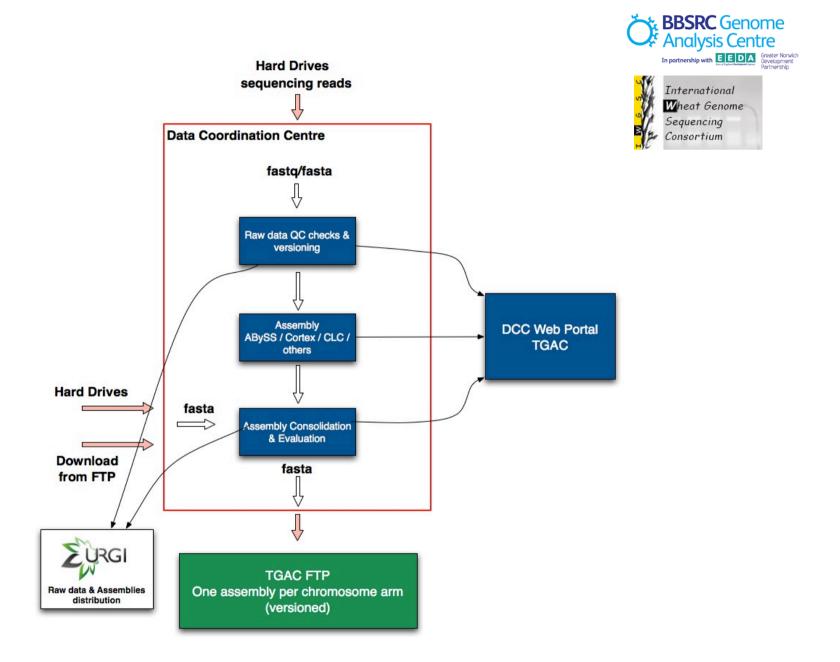
### **DCC** Role

- Analysis Centre

  In partnership with Fig. 1 Analysis Centre

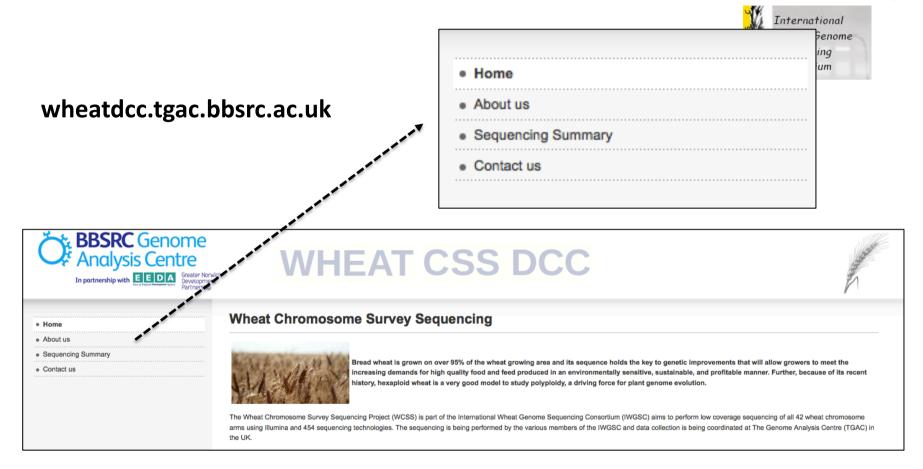
  Greater Norwich Partnership
- International
  Wheat Genome
  Sequencing
  Consortium

- Track progress for the submission of the WCSS datasets
- Run general QC checks
  - Base content / dinucleotide
  - Quality scores distribution
  - K-mer frequency
  - Contamination screening
- Run the assemblies
  - ABySS, Cortex, CLC, SGA, others
- Consolidate and version the assemblies
- Define the project data freeze(s).



### **DCC Web Portal**





## **Tracking & Versioning**

- BBSRC Genome
  Analysis Centre
  In partnership with FEEDIA Greater Norwich Development Develo
- International

  Wheat Genome

  Sequencing

  Consortium

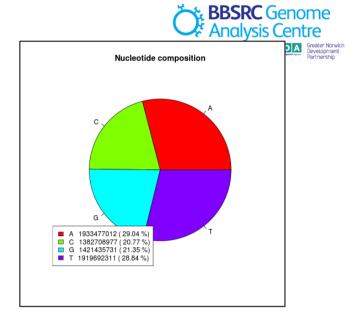
- Data delivery:
  - send data in hard drives as fastq sequence files but...
  - we are happy to assist with other formats and methods.

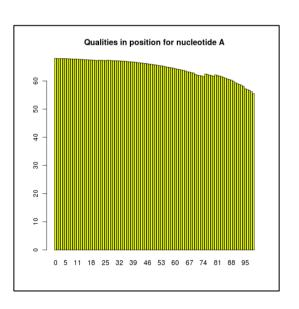
Report reception of data

Summary file download (coming up)

### **QC Checks**

#### **Wheat Chromosome Survey Sequencing** 7BS (Olson - Norway) - Illumina Type Insert size Average read length Sequence depth Paired-end 370 bp 100 bp 59x [view QC for lane1 read1] [view QC for lane1 read2] [view QC for lane2 read1] [view QC for lane2 read2] Type Insert size Average read length Sequence depth 8x Mate-pair 2 kb [view QC for lane1 read1] [view QC for lane1 read2] Type Insert size Average read length Sequence depth 4 kb 8x Mate-pair [view QC for lane1 read1] [view QC for lane1 read2]





## **Assembly Strategy**





### Assembly Tools

Newbler, Velvet, ABySS, Cortex, SGA, others

### Parameters

K-mer size, coverage criteria, pair-ends, etc

### Evaluation

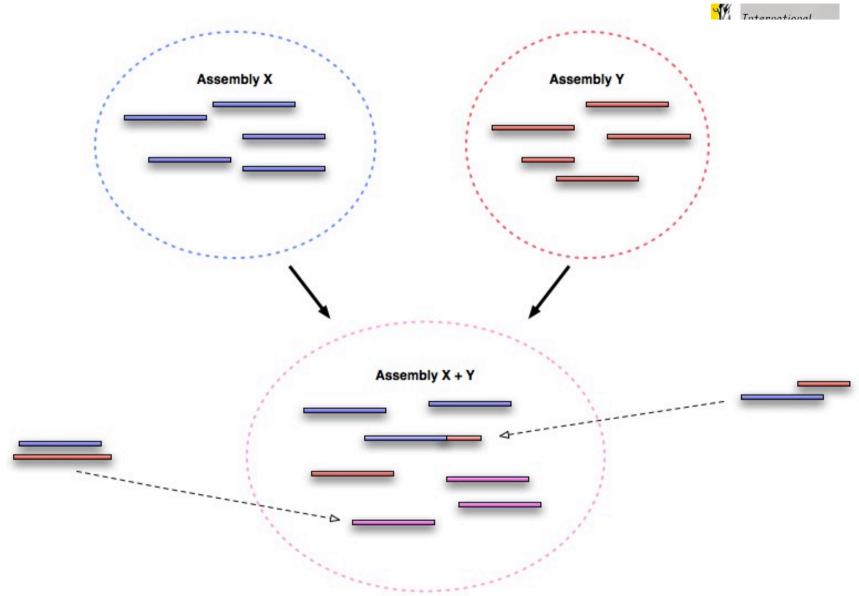
N50, number of contigs, screen for contamination

### Assembly Consolidation

Aim: "one assembly per chromosome arm" per data freeze.

## **Assemblies Consolidation**

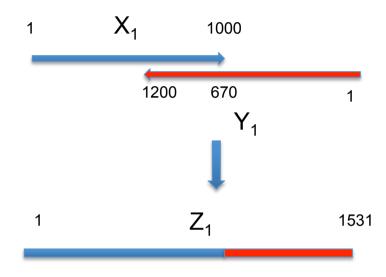




### **Assemblies Consolidation**





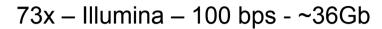


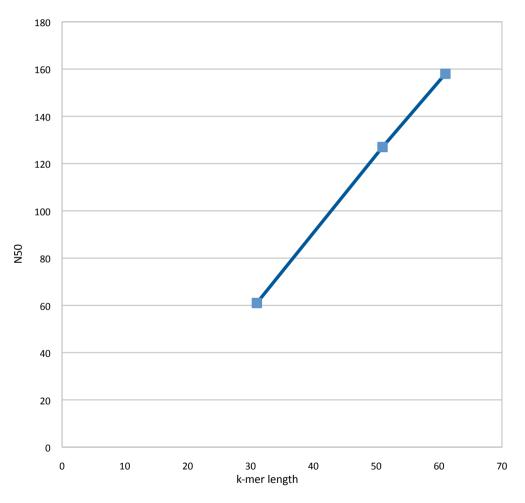
### **AGP**

$$Z_1$$
 1 1000 1 W  $X_1$  1 1000 +  $Z_1$  1000 1531 2 W  $Y_1$  1 670 -

www.ncbi.nlm.nih.gov/projects/genome/assembly/agp/AGP\_Specification.shtml

## **Preliminary Assemblies – 6BL**



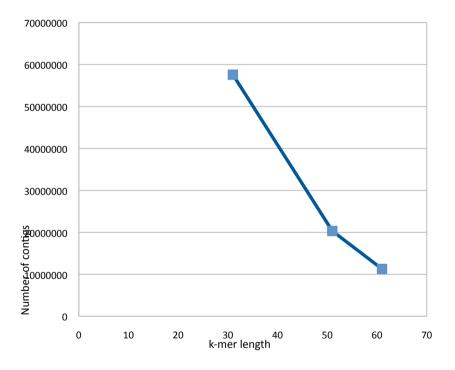






## **Preliminary Assemblies – 6BL**

73x - Illumina - 100 bps - ~36Gb



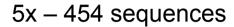


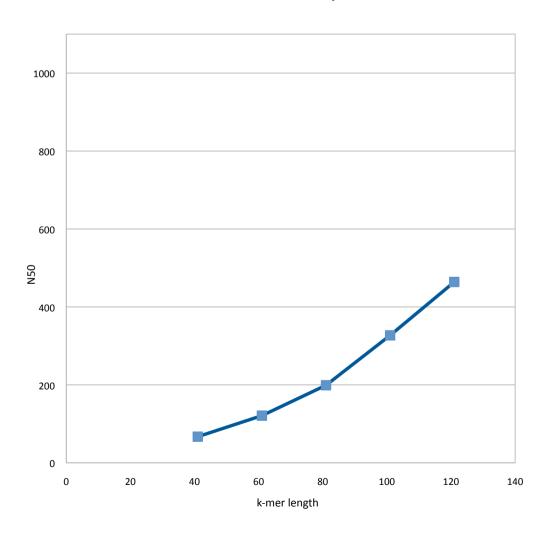


## **Preliminary Assemblies – 4DS**







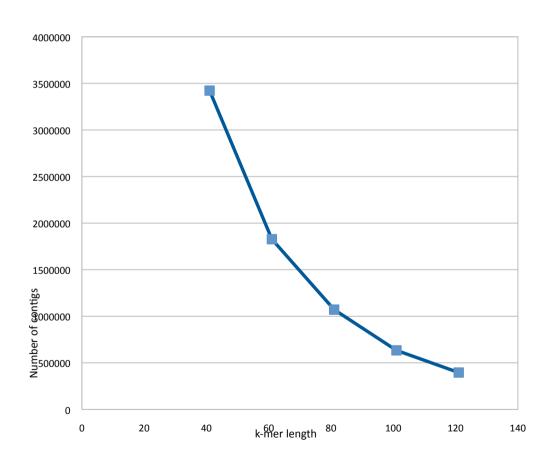


## **Preliminary Assemblies – 4DS**



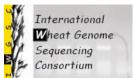






## What can we do with the Survey Sequences?





- Annotate genes within contigs (intron-exon structure)
- Link features to chromosomes (within subgenomes)
- Localised synteny studies
- Approximate some of the global figures
  - Gene counts
  - Pesudogenes
  - Linage specific genes
  - Comparative analysis of homoeologous genes

## What can't we do with the Survey Sequences?





- It is not a going to give us a complete & finished genome
- Order and orientation of contigs will be only partial
- Global synteny studies comprising long contigs
- Re-arrangements will be difficult to detect
- Long range regulatory elements
- LD blocks...
- CNVs, structual variants ....

### The Assemblathon – UC Santa Cruz







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News

Rules

Download data

Timetable

**Participants** 

Contact us

**Mailing list** 

#### Home

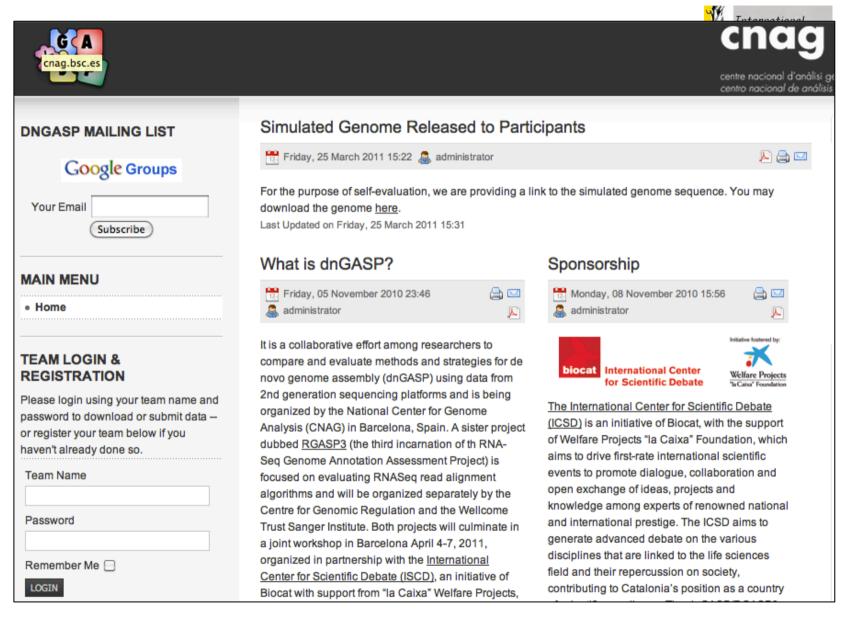
#### What is the Assemblathon?

The Assemblathon is a collaborative effort to help improve methods of genome assembly. Hopefully, it will be become an annual event that will spur improvements in this computationally intensive field. The goal is to have groups of people try to use their own software to each assemble one or more genomes that the organizers of the Assemblathon will make available (see the rules for more details). All participants will have the same amount of time to try to assemble the genomes, and then the organizers will evaluate each group's efforts. Early in 2011, there will be a workshop at UC Santa Cruz where participants and organizers will meet to discuss what they have learnt from the experiment. See the planned timetable for more information about when things are happening.

### assemblathon.org

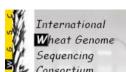
### **dnGASP**

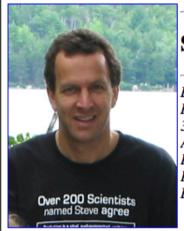




## Salzberg's bakeoff







### Steven Salzberg's home page

Director, <u>Center for B</u>
Horvitz Professor, <u>De</u>
3125 Biomolecular Sc
Affiliate Professor, <u>De</u>
Faculty member, <u>Bioe</u>
Phone: 301-405-5936
Blogs: genome.fieldof

My group's software: Glimmer, Bowtie, Courses, current, future, and past

### To Assess Genome Assemblers, Steven Salzberg Organizes a Bake-Off

March 2011 By Christie Rizk

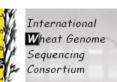
As sequencing technologies change, a whole host of software — genome assembly software, to name one category — has to change with them. To assemble a genome correctly, researchers have to have the right software, and the choice of which program to use often depends on the genome itself, as well as which technology was used to sequence it. "Sometimes the assembler that's the best for one genome isn't the best for another genome," says the University of Maryland's Steven Salzberg.

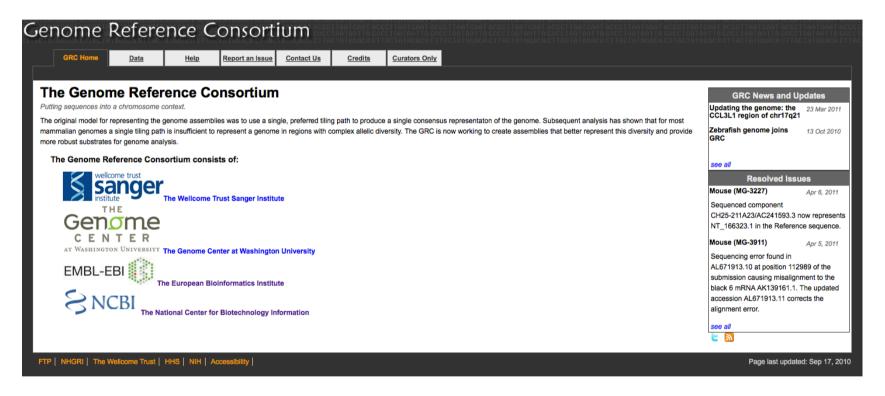


Salzberg's team is constantly evaluating genome assembly software and assembling different genomes. "We do it for various collaborators around the country and around the world, and we have contributed to the development of some assemblers," he says. "We try to use whichever one is best, so we don't really stick with just one favorite. We like to be agnostic about it and we like to be as expert as we can in how to run all of them."

### What is next?







## **Agenda**

BBSRC Genome
Analysis Centre
In partnership with Fractional Control of Contro



- Wheat Chromosome Sequencing Survey DCC
- Assemblies theory
- Assemblies practice

### **Assemblies**

### The problem

"Assembly for Large Genomes"

### The solutions

**Overlap Graphs** 

De Bruijn Graphs

**String Graphs** 

### The challenges

- 1. Far too many reads
- 2. Lack of coverage
- 3. Memory-hungry algorithms
- 4. Sequencing error profiles







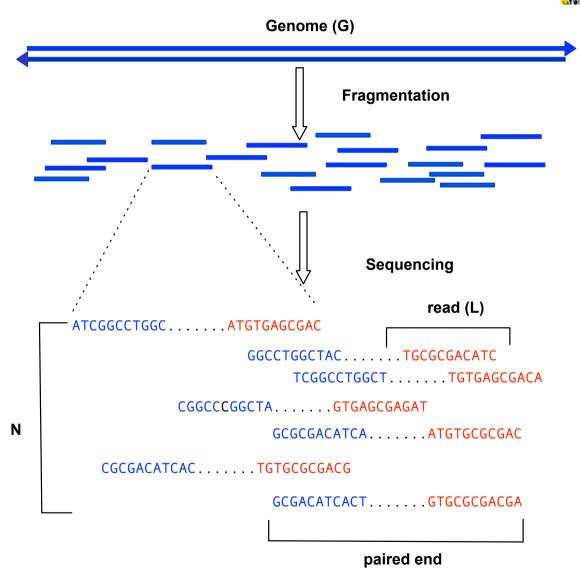
# **The Assembly Problem**

## **Sequencing a Genome**



International

Wheat Genome
Sequencing
Consortium





# **Graph Theory**

## **Leonhard Euler (1707-1783)**





## Seven Bridges of Königsberg



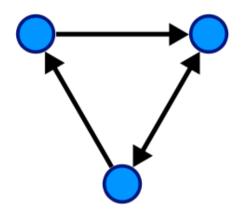


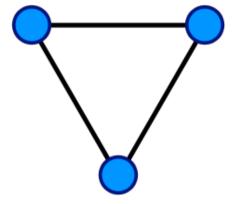
## **Graphs**

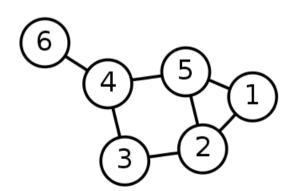


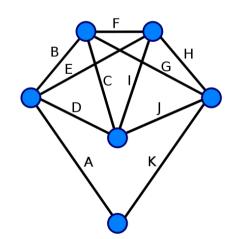


### nodes & edges







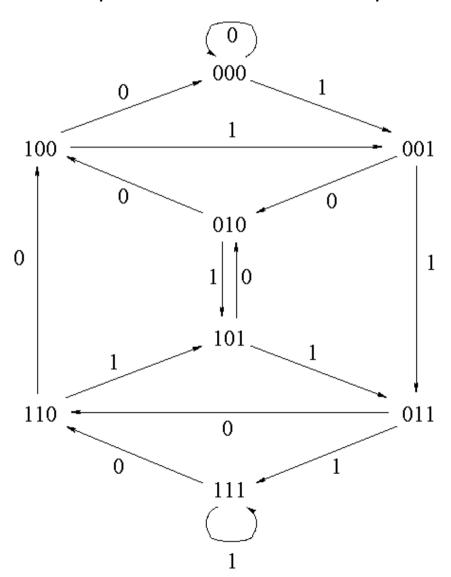


## Walk in the graph

# BBSRC Genome Analysis Centre In partnership with FEEDIA Greater Norwich Bertnership Greater Norwich Bertnership Greater Norwich Bertnership



### Eulerian paths versus Hamiltonian paths

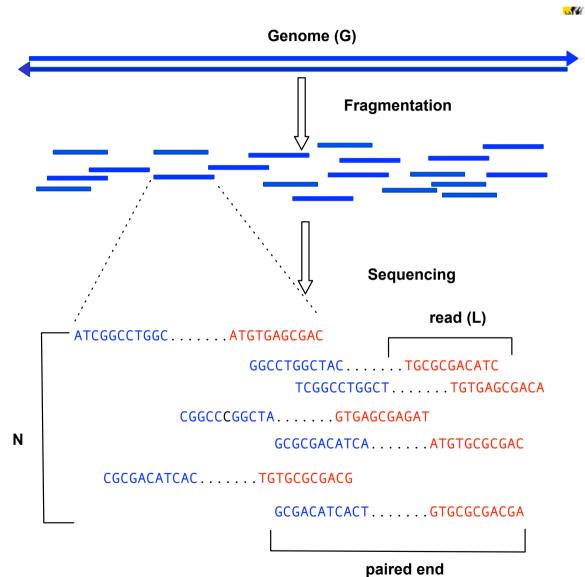


## **Sequencing a Genome**



International

Wheat Genome
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Consortium

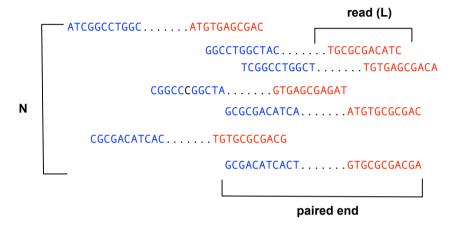


35

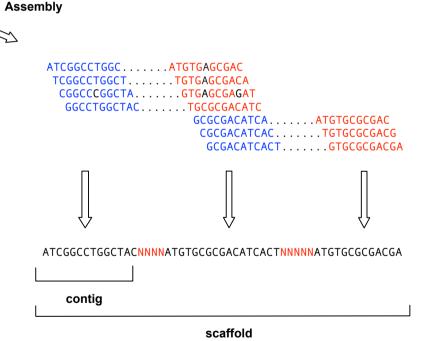
## **The Assembly Problem**







Coverage: (N \* L) /G





GENOME

AMERICAN ASSOCIATION

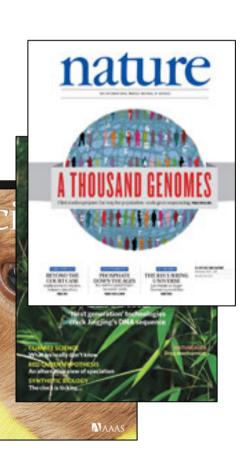
nature

THE GENETICS OF NONSENSE A cellular balancing act

IN PURSUIT OF PLEASURE Dopamine's role revisited

The chicken







**REPORTS** 

#### The B73 Maize Genome: Complexity.

long terminal repeat retrotransposons (LTR retrotransposons) (10).

# **ARTICLES**

# Genome sequencing and analysis of the model grass *Brachypodium distachyon*

The International Brachypodium Initiative\*

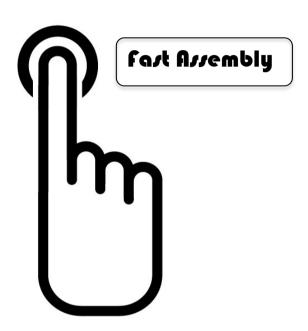
Three subfamilies of grasses, the Ehrhartoideae, Panicoideae and Pooideae, provide the bulk of human nutrition and are poised to become major sources of renewable energy. Here we describe the genome sequence of the wild grass *Brachypodium distachyon (Brachypodium)*, which is, to our knowledge, the first member of the Pooideae subfamily to be sequenced. Comparison of the *Brachypodium*, rice and sorghum genomes shows a precise history of genome evolution across a broad diversity of the grasses, and establishes a template for analysis of the large genomes of economically important pooid grasses such as wheat. The high-quality genome sequence, coupled with ease of cultivation and transformation, small size and rapid life cycle, will help *Brachypodium* reach its potential as an important model system for developing new energy and food crops.

Grasses provide the bulk of human nutrition, and highly productive grasses are promising sources of sustainable energy<sup>1</sup>. The grass family (Poaceae) comprises over 600 genera and more than 10,000 species that dominate many ecological and agricultural systems<sup>2,3</sup>. So far, genomic efforts have largely focused on two economically important grass subfamilies, the Ehrhartoideae (rice) and the Panicoideae (maize, sorghum, sugarcane and millets). The rice<sup>4</sup> and sorghum<sup>5</sup> genome sequences and a detailed physical map of maize<sup>6</sup> showed extensive conservation of gene order<sup>5,7</sup> and both ancient and relatively recent polyploidization.

Most cool season cereal, forage and turf grasses belong to the

(Supplementary Fig. 1) detected two false joins and created a further seven joins to produce five pseudomolecules that spanned 272 Mb (Supplementary Table 3), within the range measured by flow cytometry<sup>20,21</sup>. The assembly was confirmed by cytogenetic analysis (Supplementary Fig. 2) and alignment with two physical maps and sequenced BACs (Supplementary Data). More than 98% of expressed sequence tags (ESTs) mapped to the sequence assembly, consistent with a near-complete genome (Supplementary Table 4 and Supplementary Fig. 3). Compared to other grasses, the *Brachypodium* genome is very compact, with retrotransposons concentrated at the centromeres and syntenic breakpoints (Fig. 1). DNA transposons and





.... but we should approach an assembly as a lab experiment.

# What is a good assembly?





#### Contiguity

- longest contig vs number of contigs
- N50

#### Completeness

- gene count
- gene coverage

#### Accuracy

- misassemblies (chimeric contigs)
- base calls

# A good assembly?



**Largest contigs? Number of contigs?** 

# A good assembly?





## **Largest contigs**

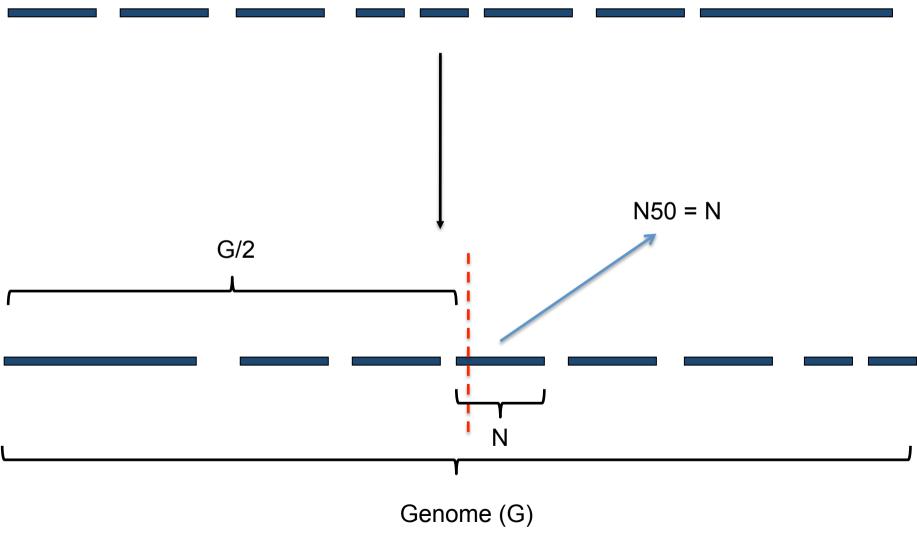
\_\_\_\_\_\_\_

## **Number of contigs**





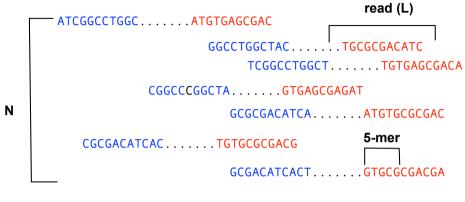




# **Overlap Graphs**



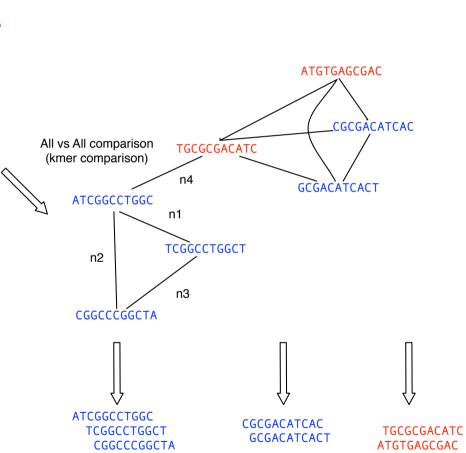




Overlap graph G=(V,E)

*V*={**reads** in dataset}

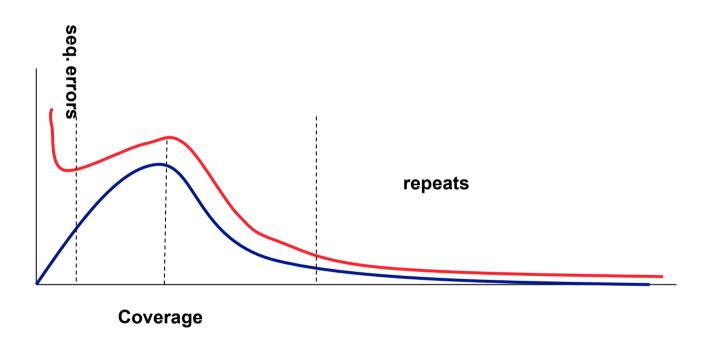
 $E=\{(r1,r2): \text{ if } r1 \text{ overlaps } r2\}$ 



## K-mer distribution







Mullikin J C, Ning Z Genome Res. 2003;13:81-90

# **Overlap Graphs Assembly Tools**





#### Methods:

#### The Phusion Assembler

James C. Mullikin<sup>1</sup> and Zemin Ning

Informatics Department, The Wellcome Trust Sanger Institute, Wellcome Trust Genome Campus, Hinxton, Cambridge CB10 1SA, UK

#### Methods:

# Whole-Genome Sequence Assembly for Mammalian Genomes: Arachne 2

David B. Jaffe,<sup>1,2</sup> Jonathan Butler,<sup>1</sup> Sante Gnerre,<sup>1</sup> Evan Mauceli,<sup>1</sup> Kerstin Lindblad-Toh,<sup>1</sup> Jill P. Mesirov,<sup>1</sup> Michael C. Zody,<sup>1</sup> and Eric S. Lander<sup>1,3</sup>

<sup>1</sup>Whitehead Institute/MIT Center for Genome Research, Cambridge, Massachusetts 02141, USA; <sup>3</sup>Department of Biology, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139, USA

#### Resource

## The Atlas Genome Assembly System

Paul Havlak,<sup>1</sup> Rui Chen,<sup>1</sup> K. James Durbin, Amy Egan, Yanru Ren, Xing-Zhi Song, George M. Weinstock, and Richard A. Gibbs<sup>2</sup>

Human Genome Sequencing Center, Baylor College of Medicine, Houston, Texas 77030, USA

# The Challenges

- BBSRC Genome
  Analysis Centre
  In partnership with EEDA Greater Norwich Development Partnership
- International
  Wheat Genome
  Sequencing
  Consortium

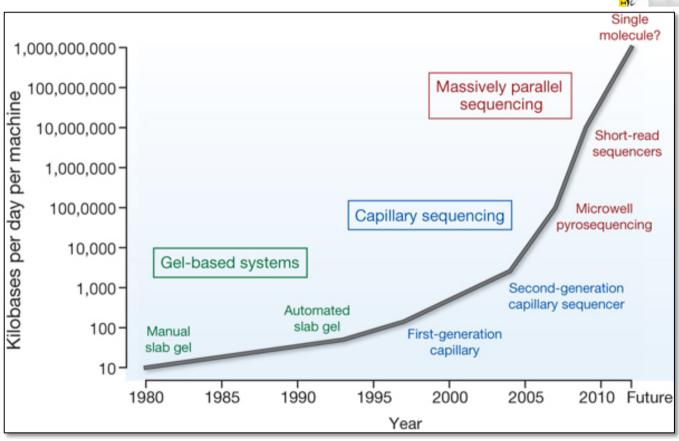
- Genome specific
  - base content (GC/AT)
  - repeat structure
  - homozygousity/heterozygousity
- Technology specific
  - number of reads
  - read length
  - sampling / sequencing bias / lack of coverage
  - memory-hungry algorithms
  - error profile
  - insert sizes
- bioinformatics, budget, quality of samples....

We should approach an assembly as a lab experiment.

# **Next Generation Technologies**







Michael R. Stratton, Peter J. Campbell & P. Andrew Futreal *Nature* **458**, **719-724(9 April 2009)** 

# **Challenge 1: far too many reads**



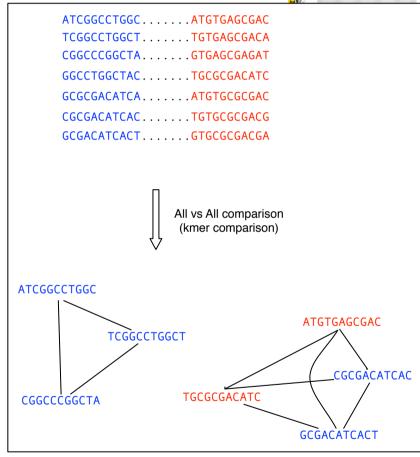






2 x 10<sup>9</sup> sequence reads

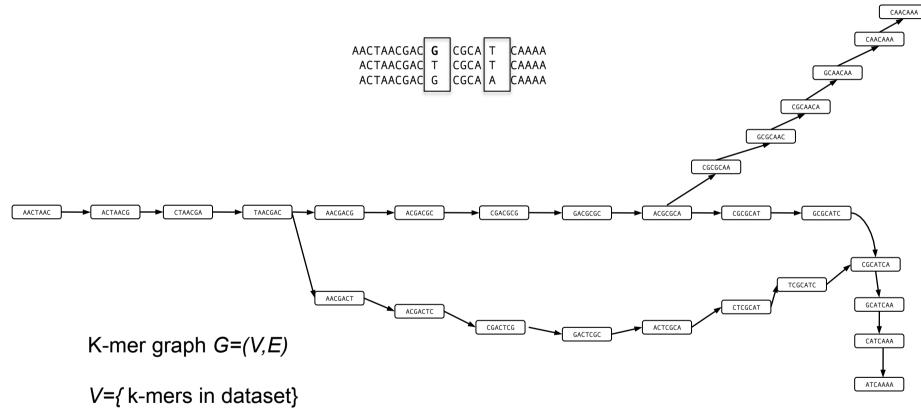
Overlap graphs don't scale



# De Bruijn Graphs







 $E=\{(k1,k2): \text{ if } k1 \text{ overlaps } k2\}$ 

# **Assembly tools for short-reads**





#### Resource

# Velvet: Algorithms for de novo short read assembly using de Bruijn graphs

Daniel R. Zerbino and Ewan Birney<sup>1</sup>

EMBL-European Bioinformatics Institute, Wellcome Trust Genome Campus, Hinxton, Cambridge CB10 1SD, United Kingdom

#### Resource

# ABySS: A parallel assembler for short read sequence data

Jared T. Simpson,<sup>1</sup> Kim Wong, Shaun D. Jackman, Jacqueline E. Schein, Steven J.M. Jones, and İnanç Birol<sup>2</sup>

Genome Sciences Centre, British Columbia Cancer Agency, Vancouver, British Columbia V5Z 4E6, Canada

#### Resource

# De novo assembly of human genomes with massively parallel short read sequencing

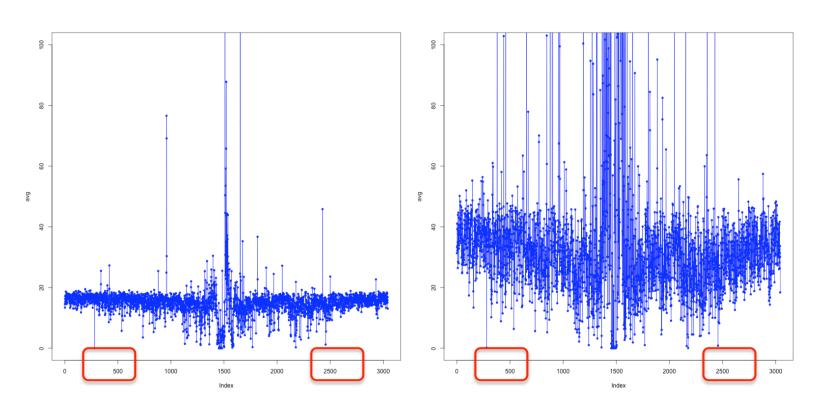
Ruiqiang Li,<sup>1,2,3</sup> Hongmei Zhu,<sup>1,3</sup> Jue Ruan,<sup>1,3</sup> Wubin Qian,<sup>1</sup> Xiaodong Fang,<sup>1</sup> Zhongbin Shi,<sup>1</sup> Yingrui Li,<sup>1</sup> Shengting Li,<sup>1</sup> Gao Shan,<sup>1</sup> Karsten Kristiansen,<sup>1,2</sup> Songgang Li,<sup>1</sup> Huanming Yang,<sup>1</sup> Jian Wang,<sup>1</sup> and Jun Wang<sup>1,2,4</sup>

Beijing Genomics Institute at Shenzhen, Shenzhen 518083, China; Department of Biology, University of Copenhagen, Copenhagen DK-2200, Denmark

# **Challenge 2: lack of coverage**



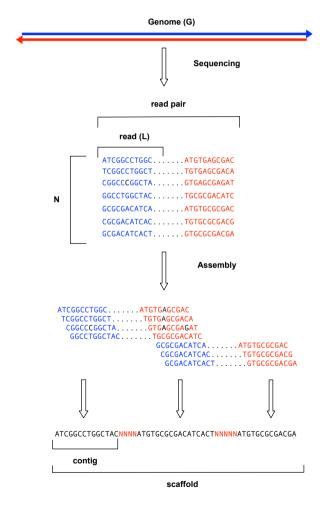
#### **Chromosome 1 - Arabidopsis**



Illumina - BWA

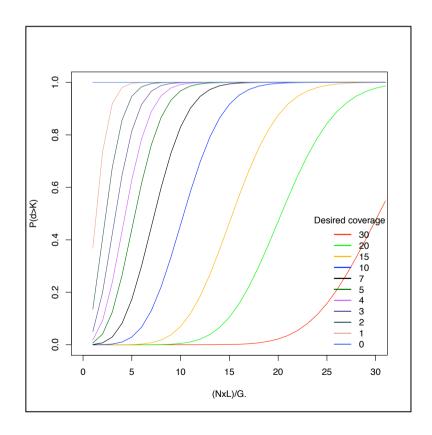
SOLiD – Corona Light
Nizar Drou (TGAC)

# **Lander-Waterman Theory**

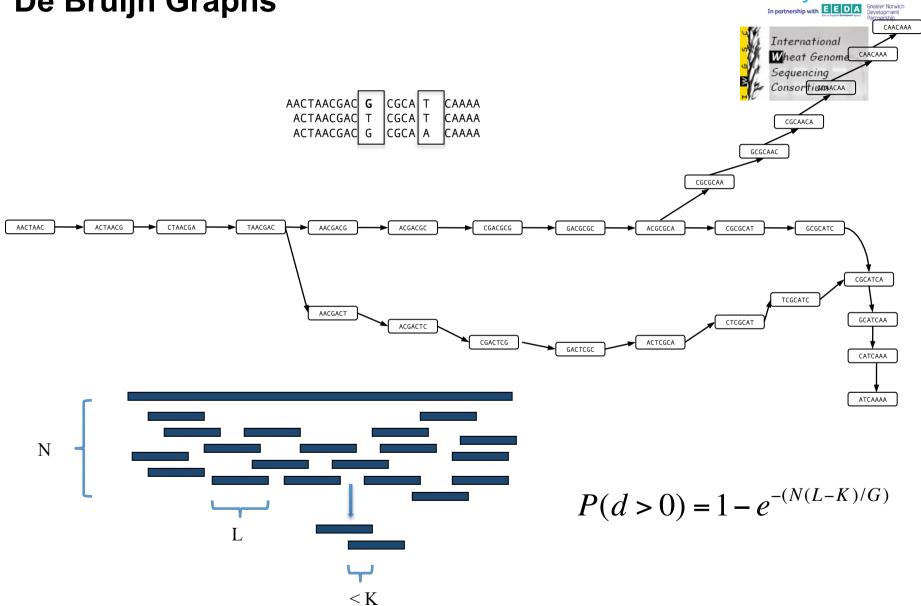




$$P(d > k) = 1 - e^{-(NL/G)} \sum_{k=0}^{k} \frac{(NL/G)^{k}}{k!}$$



# De Bruijn Graphs



**BBSRC** Genome Analysis Centre

# **Challenge 3: memory-hungry algorithms**

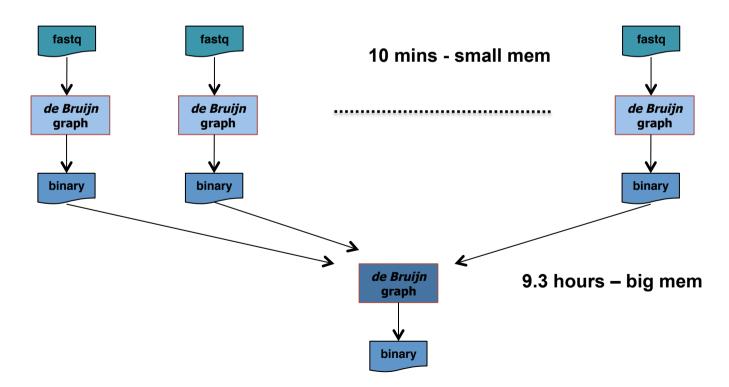


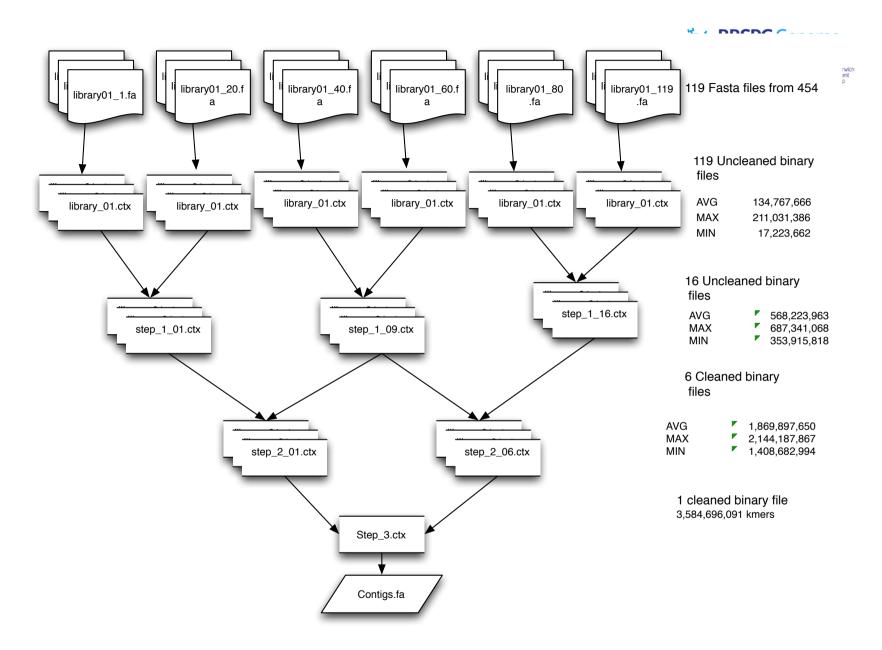


#### **Cortex**

An "efficient" de Bruijn graph implementation (with Zamin Iqbal – Oxford)

- de Novo assembly (with short-reads)
- SNP/SV analysis
- Scales with number of k-mers

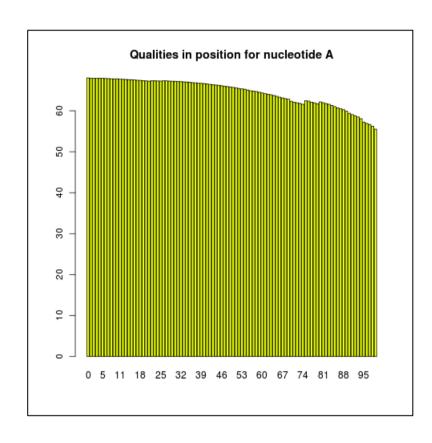




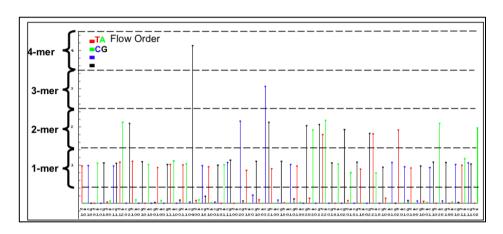
Ricardo Ramirez (TGAC)

# **Challenge 4: error profiles**

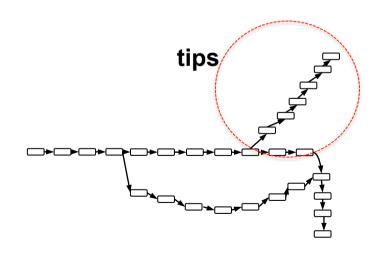




**Illumina GAII** 



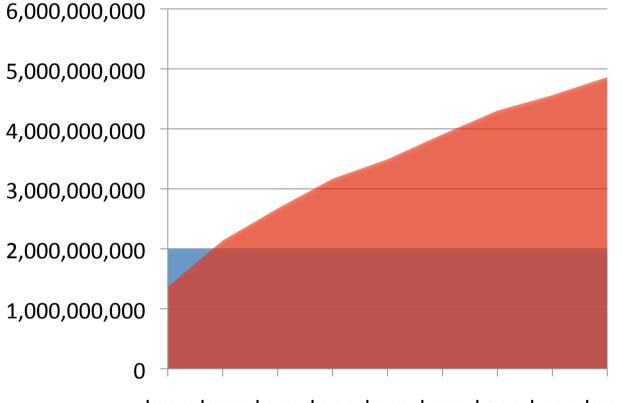
Roche 454



## **Observed K-mers vs. expected K-mers**







- Expected
- Observerd Kmers

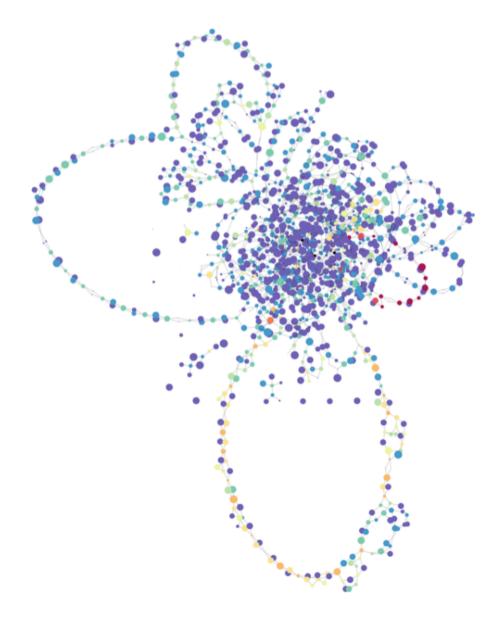
Naked mole rat
-2 Gigabases
expected genome
size

-Observed more than 4 Gigabases

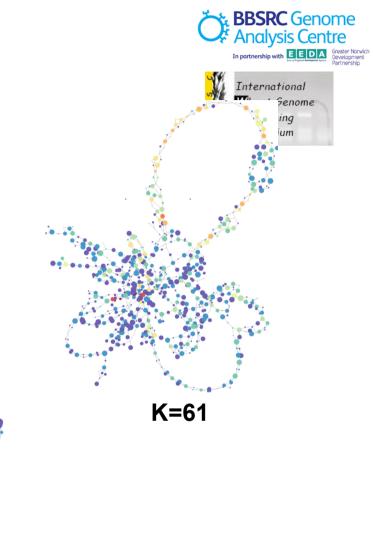
# **Understanding the graph**

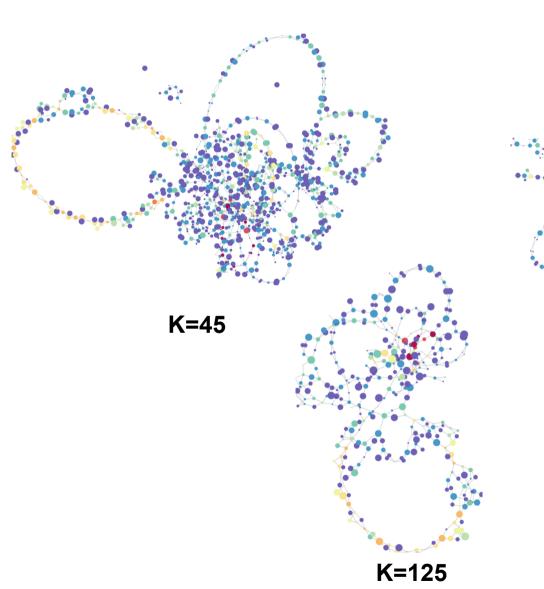






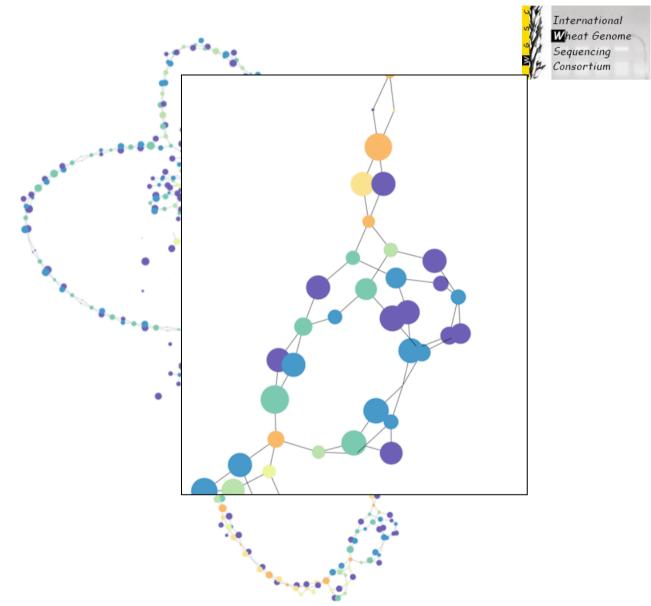
# E. coli reference





# E. coli reference

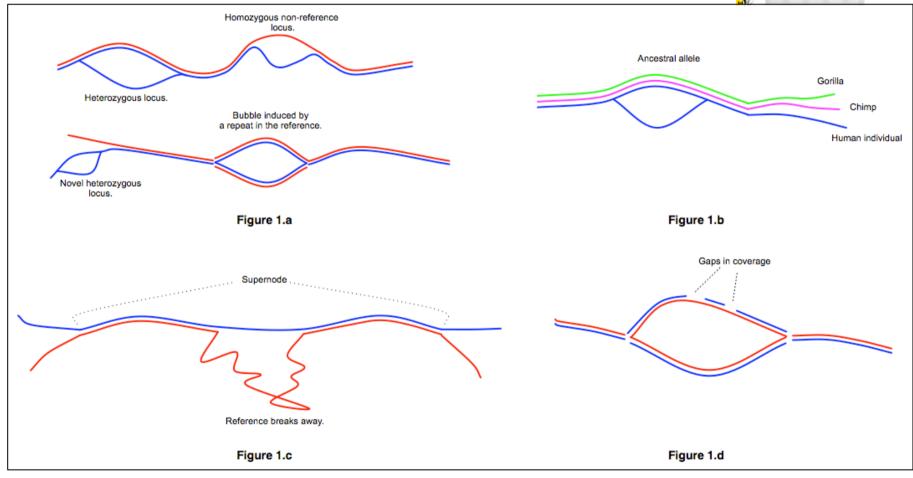




# **Variation Analysis**







# **Agenda**

- BBSRC Genome
  Analysis Centre
  In partnership with Freder Norwich Partnership

  Greater Norwich Partnership
- International
  Wheat Genome
  Sequencing
  Consortium

- Wheat Chromosome Sequencing Survey DCC
- Assemblies theory
- Assemblies practice

# Running computing jobs in a cluster

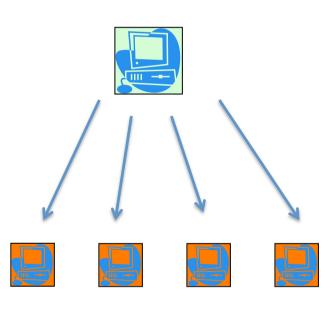




#### **Single Computer**



#### **Computer Cluster**



#### **Velvet**



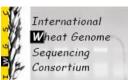


- de novo genomic assembler first released in 2007
- based on the de Bruijn graph approach
- developed by Daniel Zerbino and Ewan Birney at the European Bioinformatics Institute (EMBL-EBI)
- Uses 'Tour bus' algorithm for tip clipping and bubble removal
- Includes the 'Pebble' algorithm to resolve repeats using paired end information and the 'Rock band' algorithm to resolve repeats when using mixed length read data, eg. reads from different platforms
- Available from http://www.ebi.ac.uk/~zerbino/velvet/

Velvet: algorithms for *de novo* short read assembly using de Bruijn graphs . D.R. Zerbino and E. Birney. Genome Research **18**:821-829.

# Velvet (2)





First create a hashtable from a fastq file containing paired-end reads using a k-mer size of 27;

> velveth output\_directory 27 fastq shortPaired reads.fastq

Generates files 'Sequences' and 'Roadmaps' into output\_directory

Now build and manipulate the de Bruijn graph

> velvetg output\_directory/ -cov\_cutoff 4 -min\_contig\_lgth 100

Output is contigs.fa and stats.txt

#### Newbler

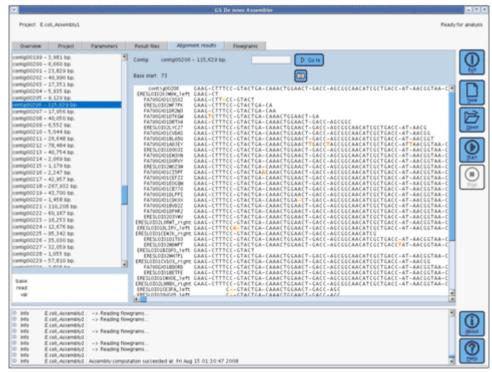


- International

  Wheat Genome

  Sequencing

  Consortium
- de novo assembler shipped with 454 sequencing machines consortium
- Useful for genomes up to 3Gb in size
- Uses .sff files (the native 454 read format) or fasta with quality files
- Can be run on the command-line (runAssembly) or using the GUI interface (GS De Novo Assembler)



# Newbler (2)

BBSRC Genome
Analysis Centre
In partnership with FEDA Greater Norwich Partnership



To run Newbler on a 454 read file; > runAssembly -o assembly1 reads.sff

Results found in directory 'assembly1'

454AllContigs.fna - FASTA file of contigs

454AllContigs.qual – Phred-based quality scores for each base in the contigs

454NewblerMetrics.txt – statistics from the assembly eg. number of reads and bases aligned, overlaps found, mean contig sizes

Use process\_contigs.pl script to get metrics on the raw reads or on the assembly output

Also has trimming and screening options at the assembly stage to trim off primer sequences and remove vector contamination prior to assembly

#### Cortex





- Developed by Mario Caccamo (TGAC) and Zamin Iqbal (Oxford)
- Uses a de Bruijn graph approach incorporating efficient data structures to reduce the memory footprint
- Scales well for larger genomes (eg. wheat)
- Uses a binary format for storing intermediate graph structures allowing large genomes to be assembled in smaller sub-assemblies then recombined

# Cortex (2)





Running cortex on a set of fastq files (listed in read\_files) using kmer length of 27

cortex\_con\_31 --input\_format fastq --input read\_files--kmer\_size 27 --output\_paths contigs.fa

Output is a set of contigs in file contigs.fa

Tip clipping and bubble removal is requested using the --tip\_clip and --remove\_bubbles parameters

# **ABySS**





- a de novo, parallel, paired-end sequence assembler that is designed for short reads.
- Developed at Michael Smith Genome Sciences Centre (Canada)
- single-processor version is useful for assembling genomes up to 100 Mb in size.
- parallel version is implemented using MPI (message passing interface) and is capable of assembling larger genomes.

ABySS: A parallel assembler for short read sequence data. Simpson JT, Wong K, Jackman SD, Schein JE, Jones SJ, Birol I. Genome Research, 2009-June.

# ABySS (2)



Assemble reads in reads.fq using a kmer length of 25, contigs are generated in contigs.fa:

> ABYSS -k25 reads.fq -o contigs.fa

#### For paired-end reads:

> abyss-pe k=25 n=10 in='reads1.fq reads2.fq' name=ecoli

#### Running on a cluster using LSF:

```
> bsub -a openmpi -R "rusage[mem=75000] span[ptile=8] " -n 8
"source abyss-1.2.3 ; source openmpi-1.3.3; abyss-pe k=61 n=10
np=8 name=Name-mpi-k61 mpirun=mpirun.lsf in='reads1 ... readsN'"
```

#### **CLC Genomics Workbench**



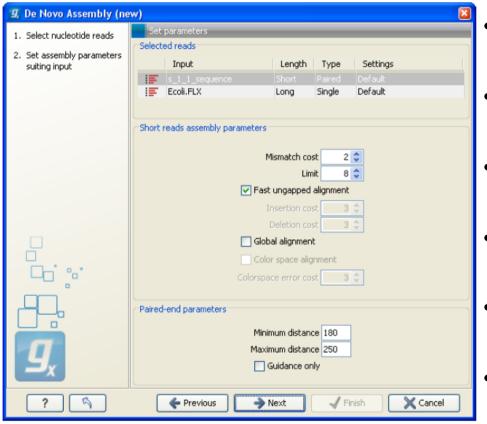


- Commercial solution for assembly of short read data
- Developed by CLCBio, Denmark (<a href="http://www.clcbio.com">http://www.clcbio.com</a>)
- NOT free
- Run as a graphical interface
- Supports analysis of data from Illumina, SOLiD and 454
- de Bruijn graph based approach

# **CLC Genomics Workbench (2)**



Consortium



- Make a table of the words seen in the reads.
- Build de Bruijn graph from the word table.
- Use the reads to resolve the repeats.
- Use the information from paired reads to resolve larger repeats.
- Output resulting contigs based on the paths.
- Contigs are available for downstream analysis through the GUI.

#### **ALLPATHS-LG**





- short read de novo genome assembler
- developed at the Computational Research and Development group at the Broad Institute by David Jaffe.
- Designed to assemble paired-end Illumina reads (will not assemble unpaired reads)

High-quality draft assemblies of mammalian genomes from massively parallel sequence data. Gnerre *et al.* Proc Natl Acad Sci U S A. 2011 Jan 25;108(4):1513-8.

# **ALLPATHS-LG (2)**





Requires reads in fastb format which are generated using a Perl script - PrepareAllPathsInputs.pl

Copy read files to a directory, eg. /allpaths/wheat/mydata/

Run the assembler;

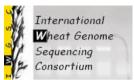
> RunAllPathsLG PRE=allpaths DATA\_SUBDIR=mydata RUN=myrun REFERENCE\_NAME=wheat TARGETS=standard K=96

This will create a directory under the data directory structure, eg. / allpaths/wheat/mydata/myrun/assemblies/subdir

The assembly files final.assembly.fasta and final.assembly.efasta are generated in subdir

# **Burrows-Wheeler Alignment Tool (BWA)**

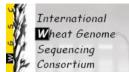




- Aligns relatively short sequences (queries) to a sequence database, eg. a reference genome
- Based on Burrows-Wheeler Transform (BWT).
- Developed by Heng Li at the Sanger Institute (who also developed MAQ)
- The algorithm is designed for short queries up to ~200bp with low error rate (<3%).</li>
- Performs gapped global alignment w.r.t. queries and supports paired-end reads
- One of the fastest short read alignment algorithms to date.
- Supports colorspace alignment (SOLiD reads)
- Supports the Sequence Alignment/Map (SAM) format

# **BWA (2)**





Index the database (fasta file)

> bwa index -a bwtsw database.fasta

Find the suffix array coordinates of the input reads

> bwa aln database.fasta short\_read.fastq > aln\_sa.sai

Generate alignments in SAM format (single reads)

> bwa samse database.fasta aln\_sa.sai short\_read.fastq > aln.sam

Generate alinments in SAM format (paired reads reads)
bwa sampe database.fasta aln\_sa1.sai aln\_sa2.sai read1.fq
read2.fq > aln.sam

Use SAMTools or BioPerl scripts to analyse alignment files

#### **Bowtie**





- An ultrafast, memory-efficient short read aligner
- Developed by Steven Salzberg at the University of Maryland Centre for Bioinformatics and Computational Biology
- Indexes the genome with a Burrows-Wheeler index to keep its memory footprint small
- Supports colorspace alignment (SOLiD reads)
- Supports the Sequence Alignment/Map (SAM) format

Langmead B, Trapnell C, Pop M, Salzberg SL. Ultrafast and memory-efficient alignment of short DNA sequences to the human genome. *Genome Biol* 10:R25.

# Bowtie (2)



Index the reference

> bowtie-build –f reference.fasta e\_coli

Align your paired-end reads and output alignments in SAM format

> bowtie -q -s e\_coli -1 reads1.fastq -2 reads2.fastq alignments.sam





# THE END