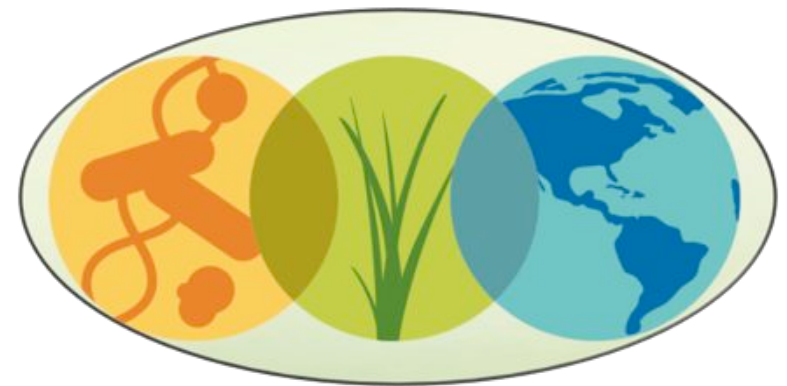


KBase Variation Services

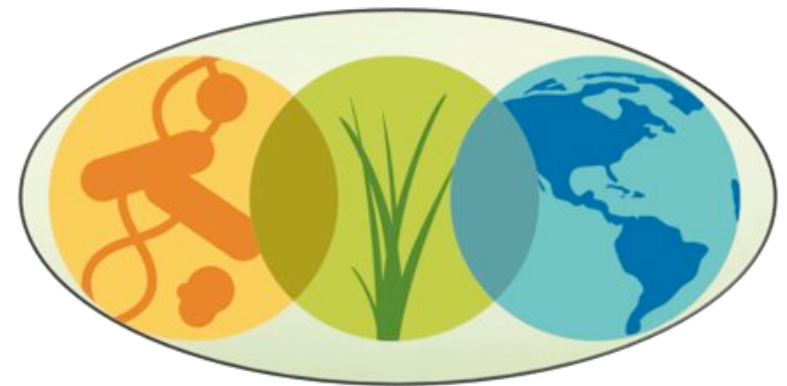
Overview and Demo

Michael Schatz, James Gurtowski
Cold Spring Harbor Laboratory

1. Introduction to KBase
2. Resequencing and variation calling theory
3. KBase services for variation calling
4. Live Demo
5. Additional Resources

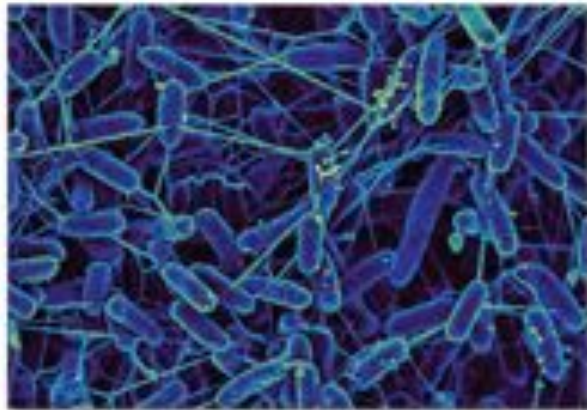


1. Introduction to KBase
2. Resequencing and variation calling theory
3. KBase services for variation calling
4. Live Demo
5. Additional Resources



Knowledgebase enabling ***predictive*** systems biology.

- Powerful ***modeling*** framework.
- ***Community-driven***, extensible and scalable ***open-source*** software and application system.
- Infrastructure for integration and reconciliation of ***algorithms*** and ***data sources***.
- Framework for standardization, search, and ***association*** of data
- Resources to enable ***experimental design*** and ***interpretation*** of results.



Microbes

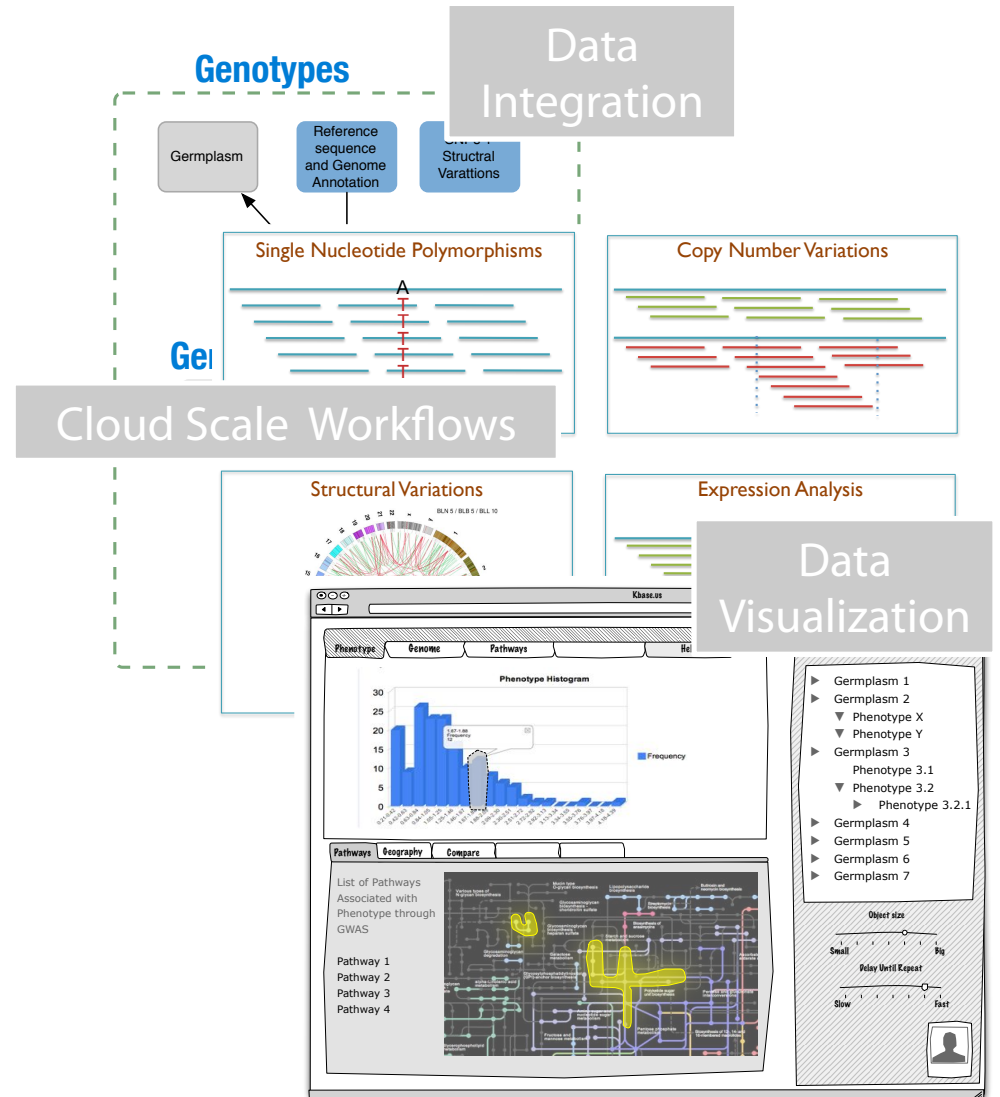
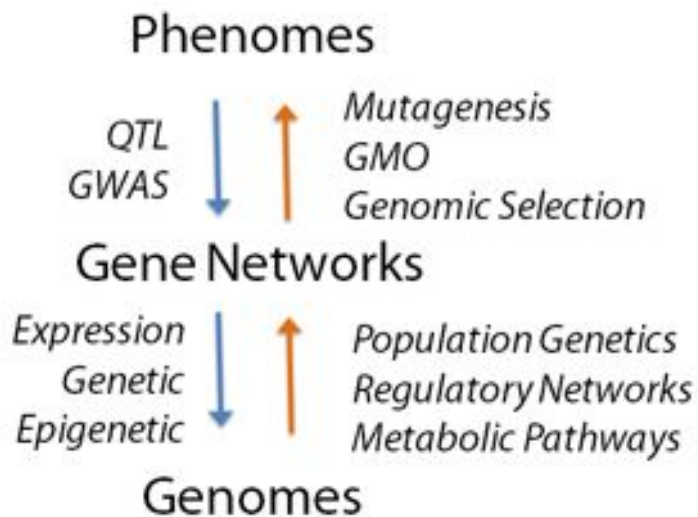


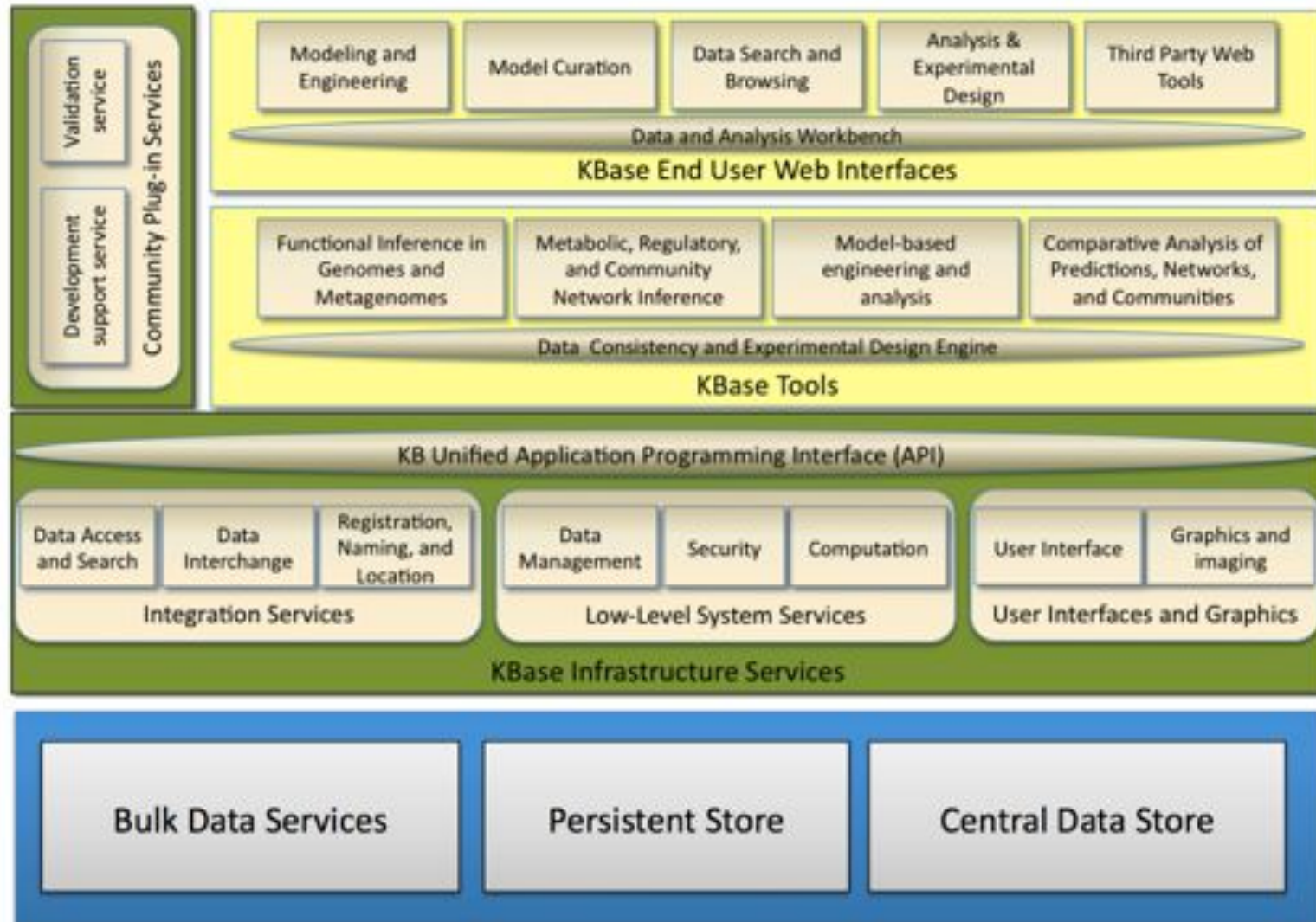
Communities



Plants

Model development
Hypothesis testing
Knowledge Synthesis



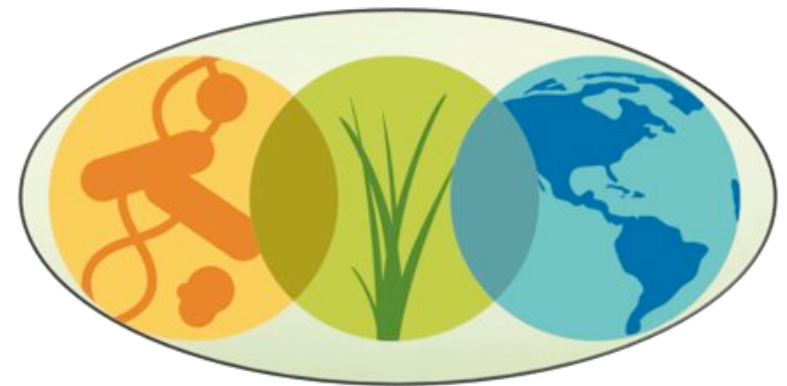


Variation Services: Samples to Discoveries

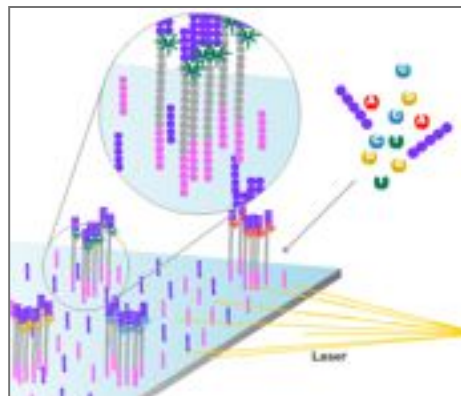
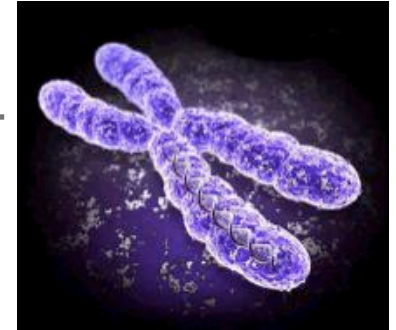
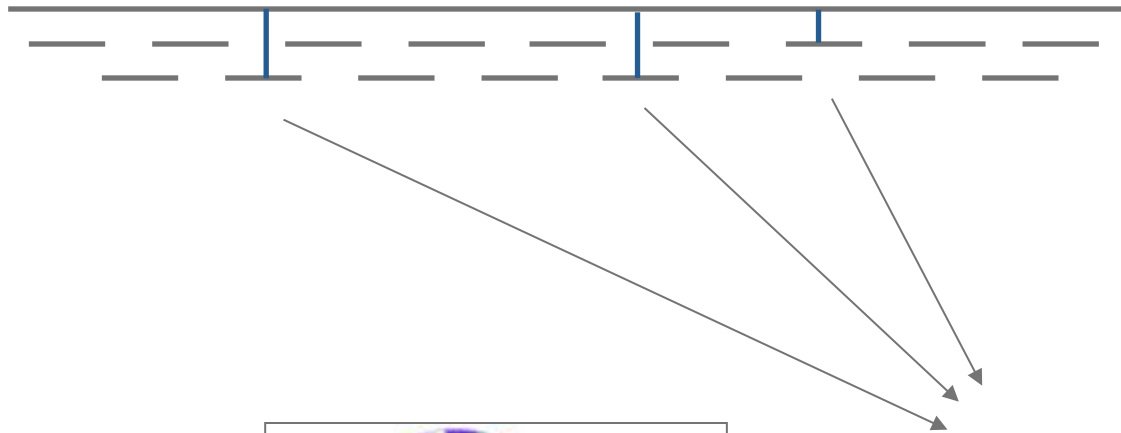


Powered by KBase

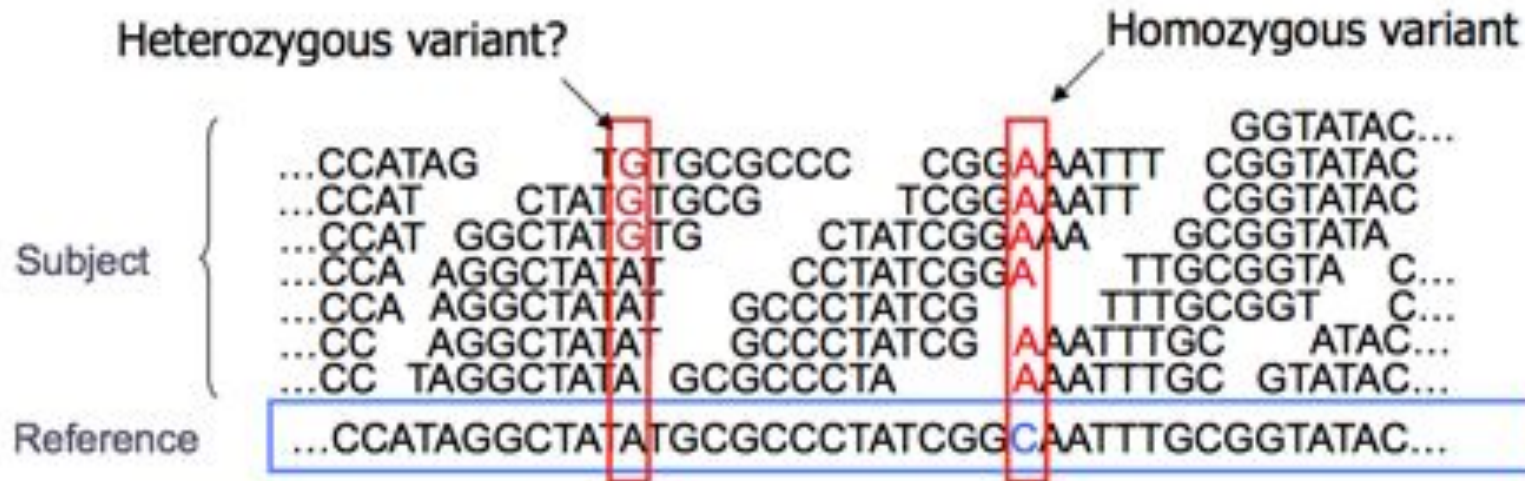
1. Introduction to KBase
2. Resequencing and variation calling theory
3. KBase services for variation calling
4. Live Demo
5. Additional Resources



How does your sample compare to the reference?



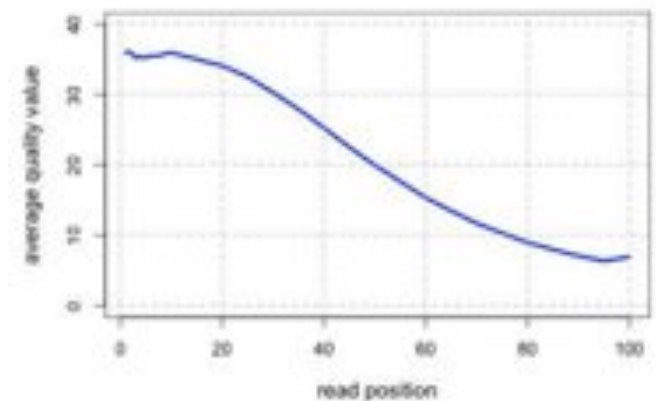
Plant Height —
 Drought Resistance —
 Biomass production —
 — — —
 — — —



- Sequencing instruments make mistakes
 - Quality of read decreases over the read length

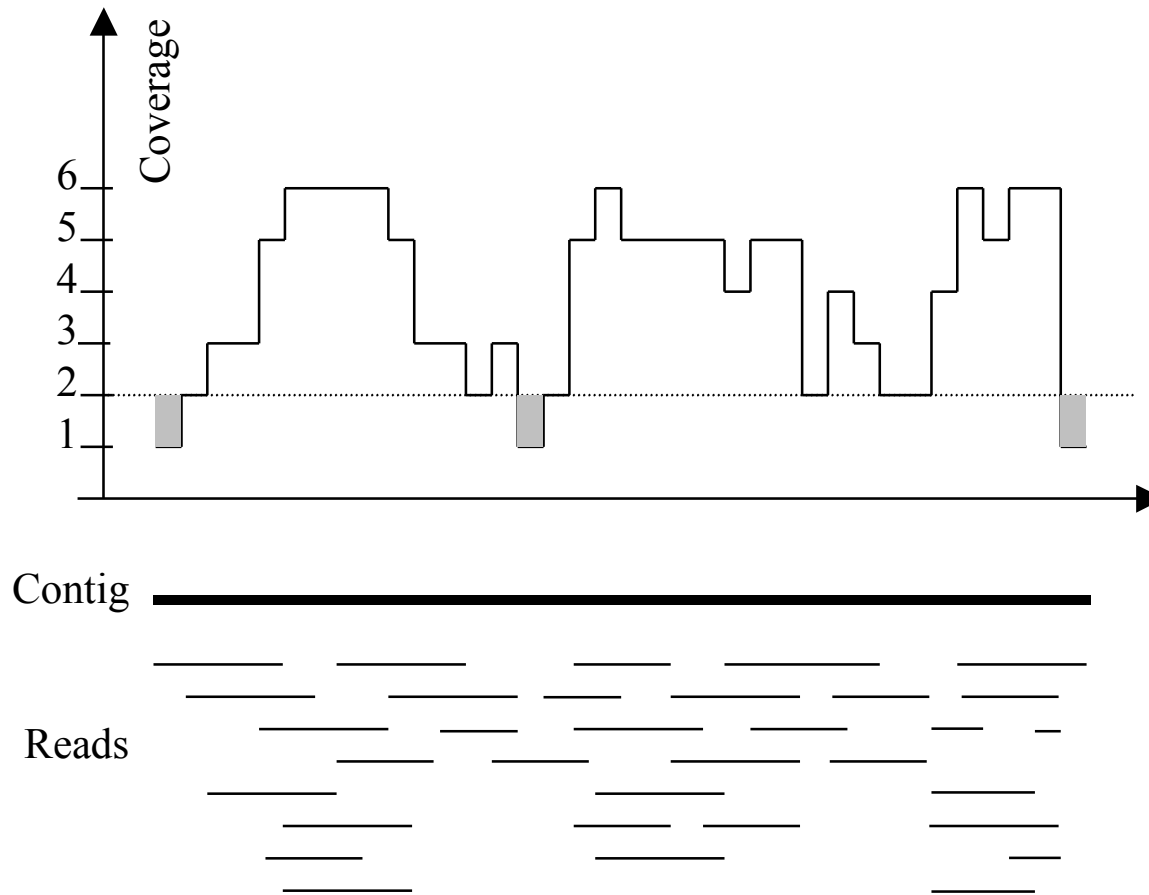
- A single read differing from the reference is probably just an error, but it becomes more likely to be real as we see it multiple times
 - Often framed as a Bayesian problem of more likely to be a real variant or chance occurrence of N errors
 - Accuracy improves with deeper coverage

$$Q_{\text{sanger}} = -10 \log_{10} p$$



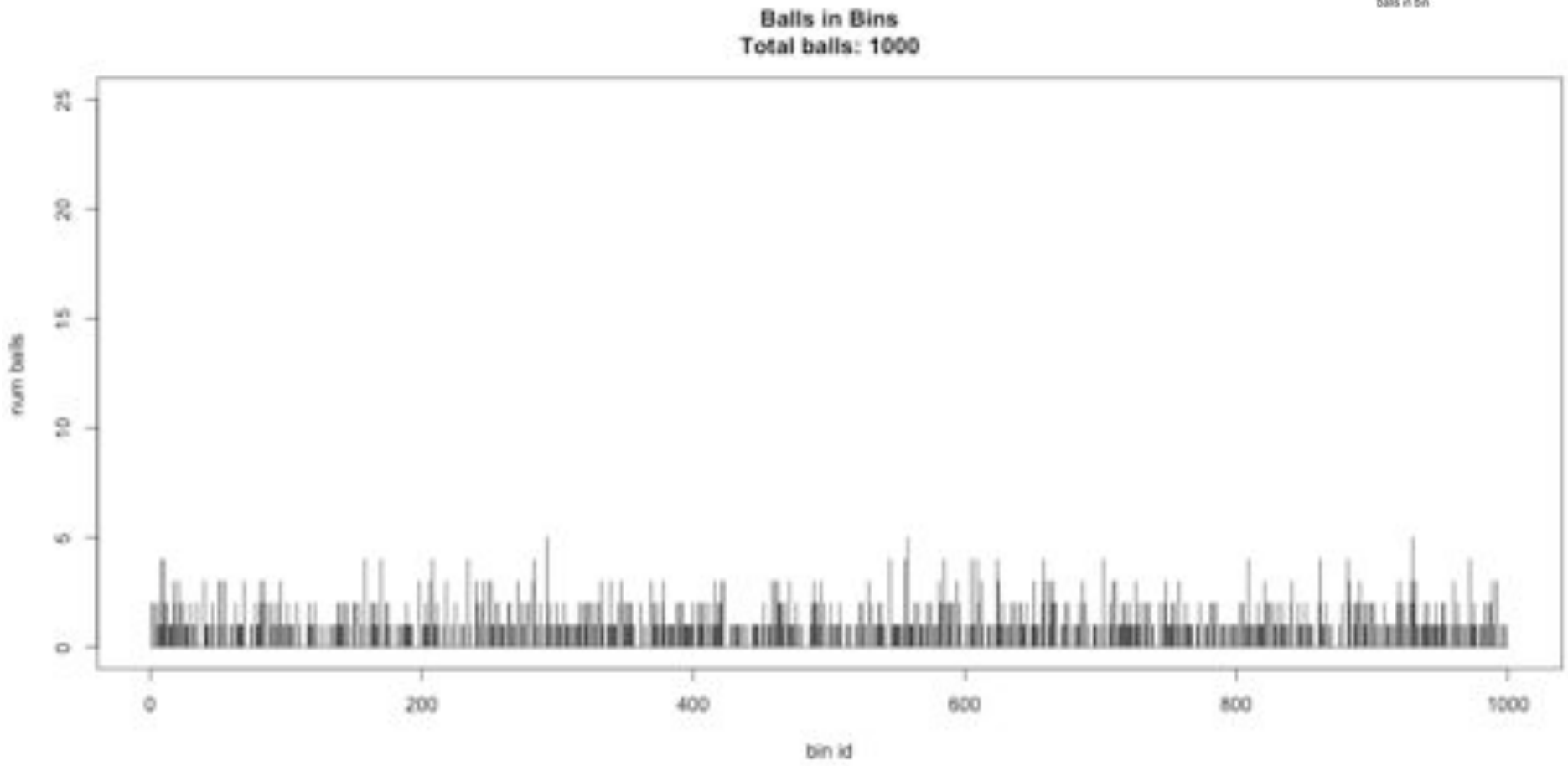
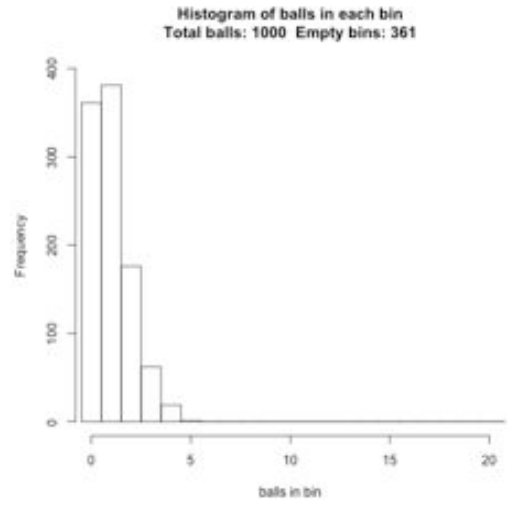
Coverage

Typical contig coverage

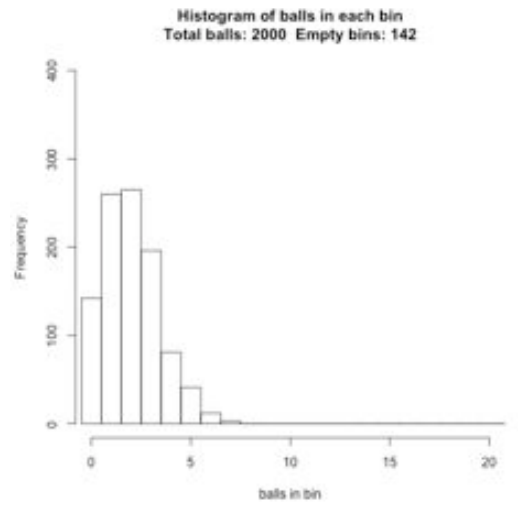


Imagine raindrops on a sidewalk

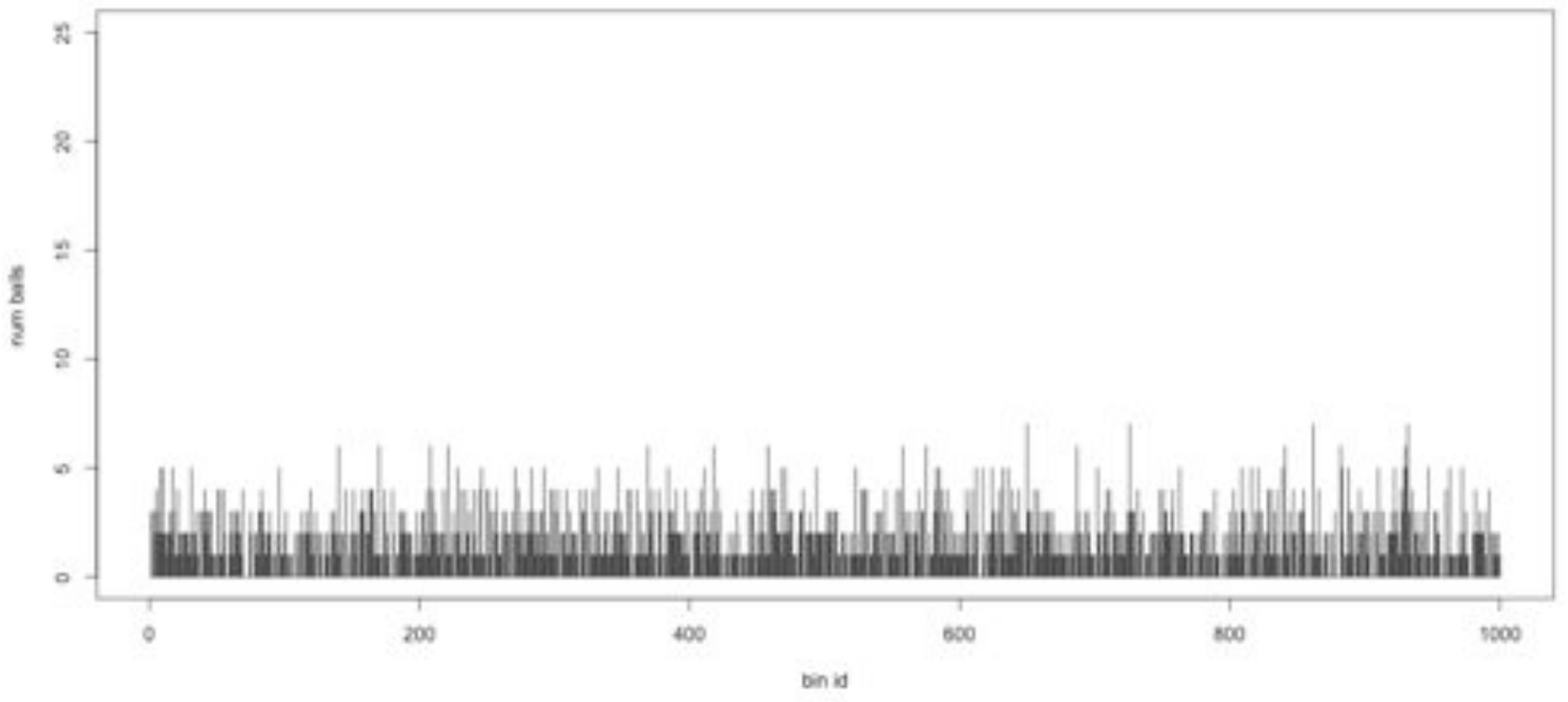
Ix Sequencing



2x Sequencing

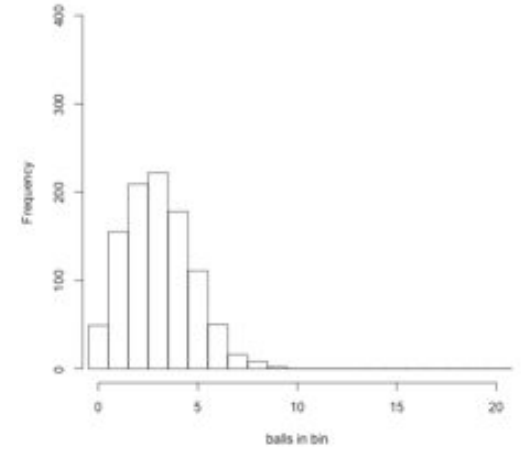


Balls in Bins
Total balls: 2000

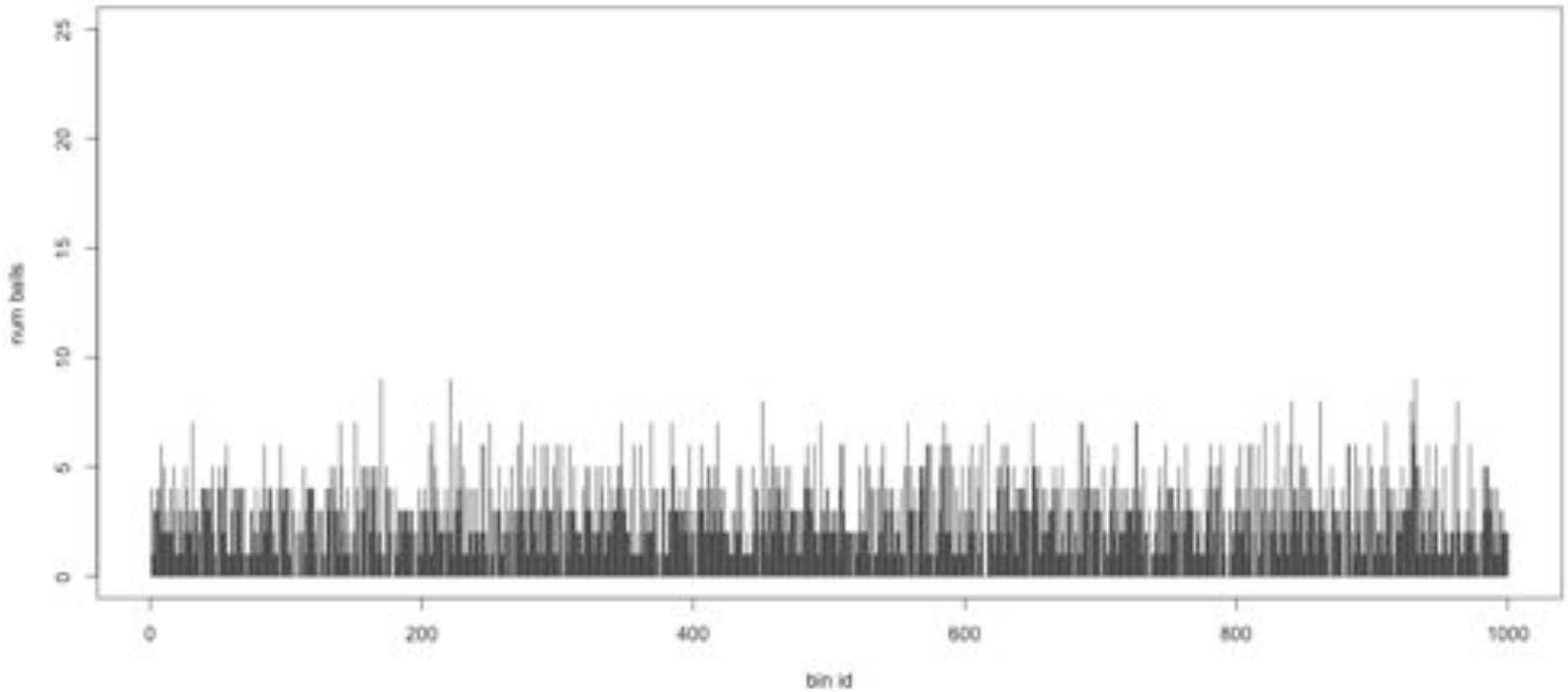


3x Sequencing

Histogram of balls in each bin
Total balls: 3000 Empty bins: 49

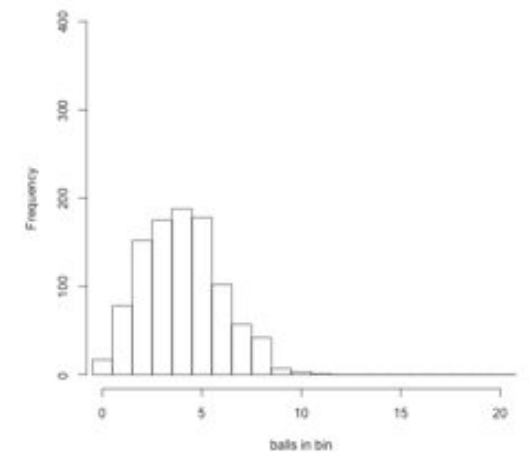


Balls in Bins
Total balls: 3000

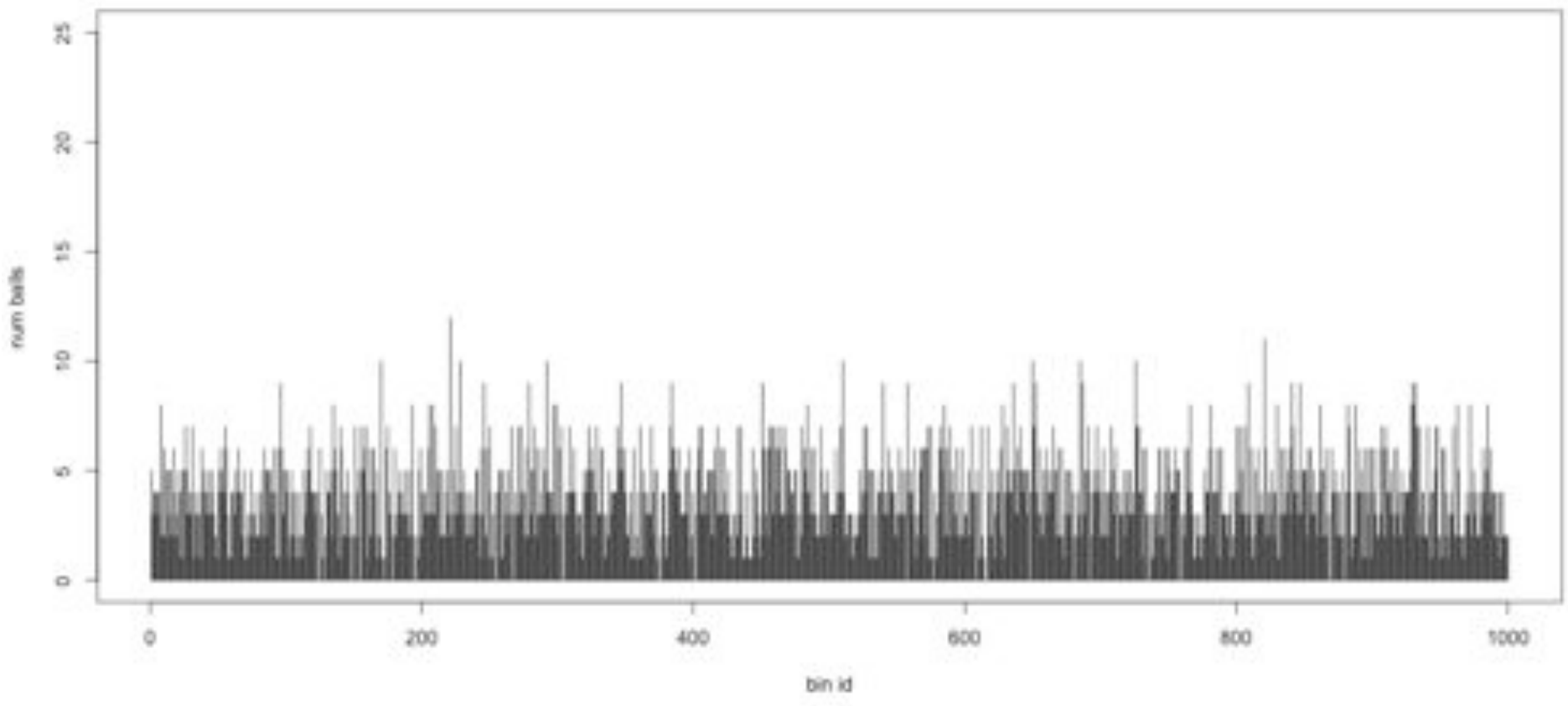


4x Sequencing

Histogram of balls in each bin
Total balls: 4000 Empty bins: 17

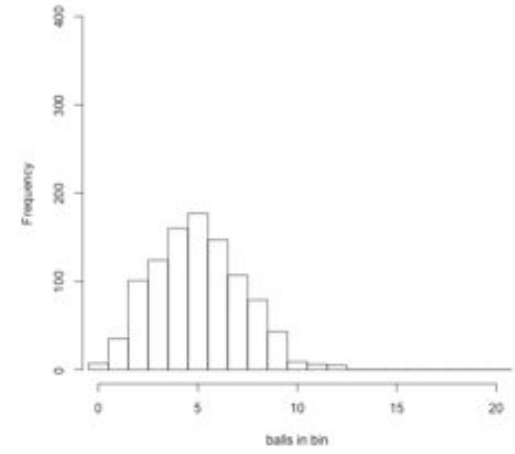


Balls in Bins
Total balls: 4000

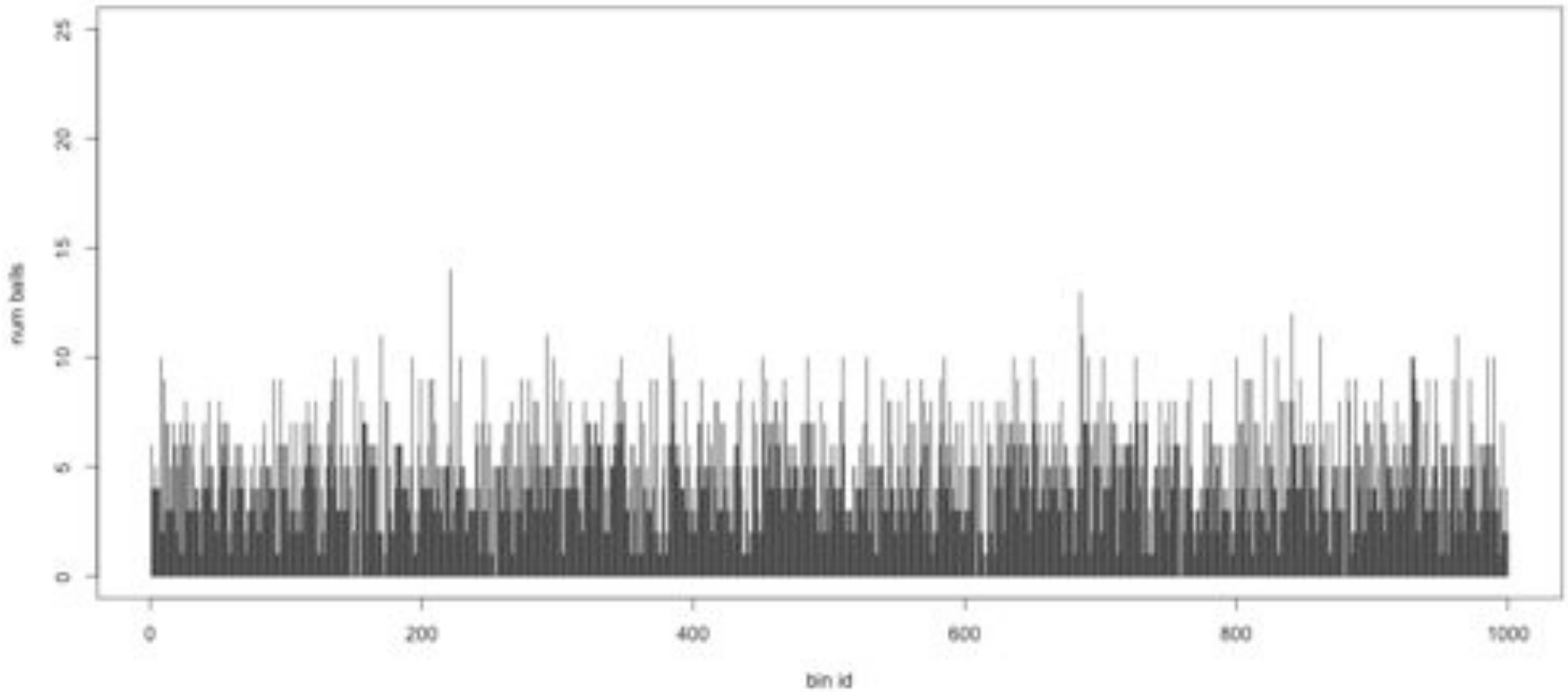


5x Sequencing

Histogram of balls in each bin
Total balls: 5000 Empty bins: 7

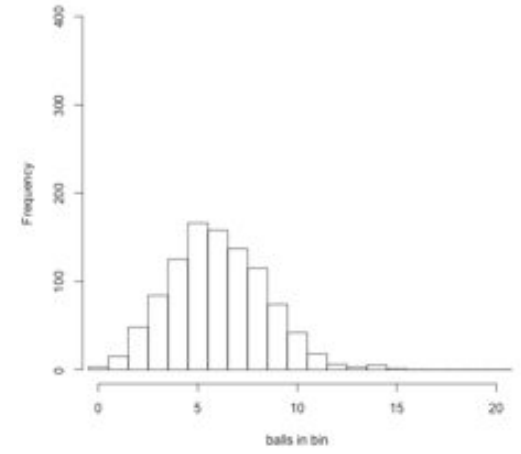


Balls in Bins
Total balls: 5000

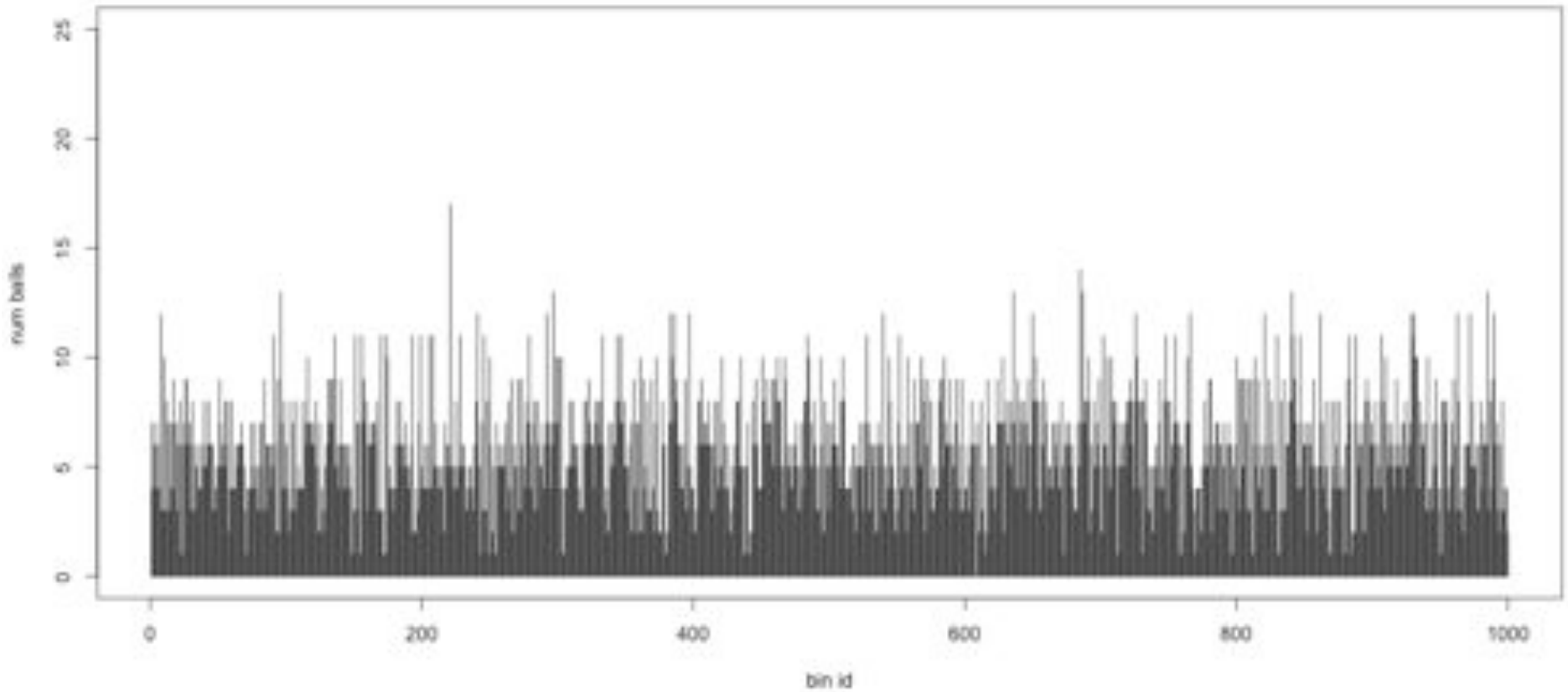


6x Sequencing

Histogram of balls in each bin
Total balls: 6000 Empty bins: 3

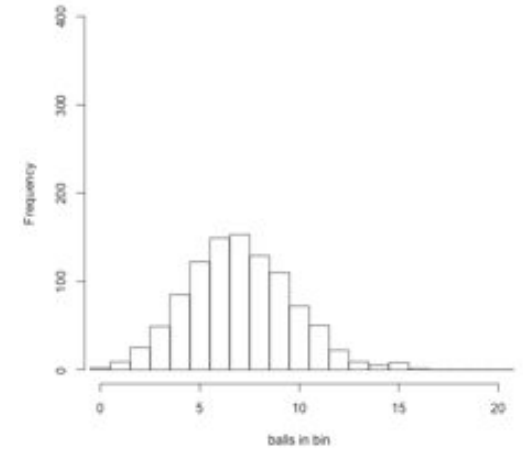


Balls in Bins
Total balls: 6000

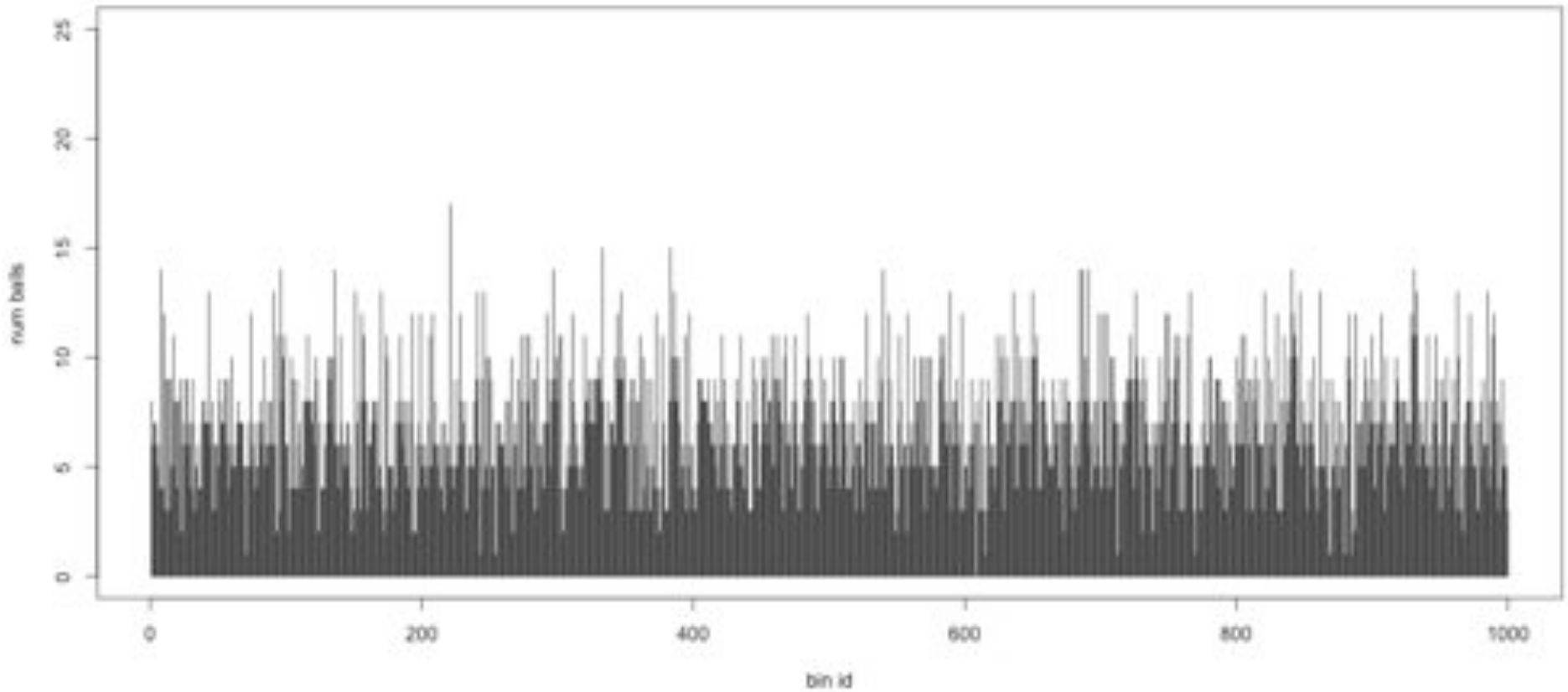


7x Sequencing

Histogram of balls in each bin
Total balls: 7000 Empty bins: 2

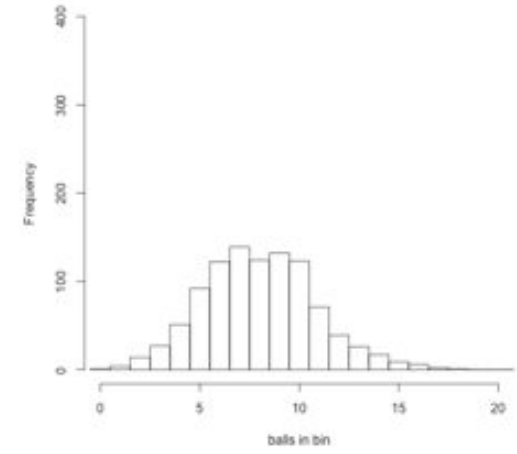


Balls in Bins
Total balls: 7000

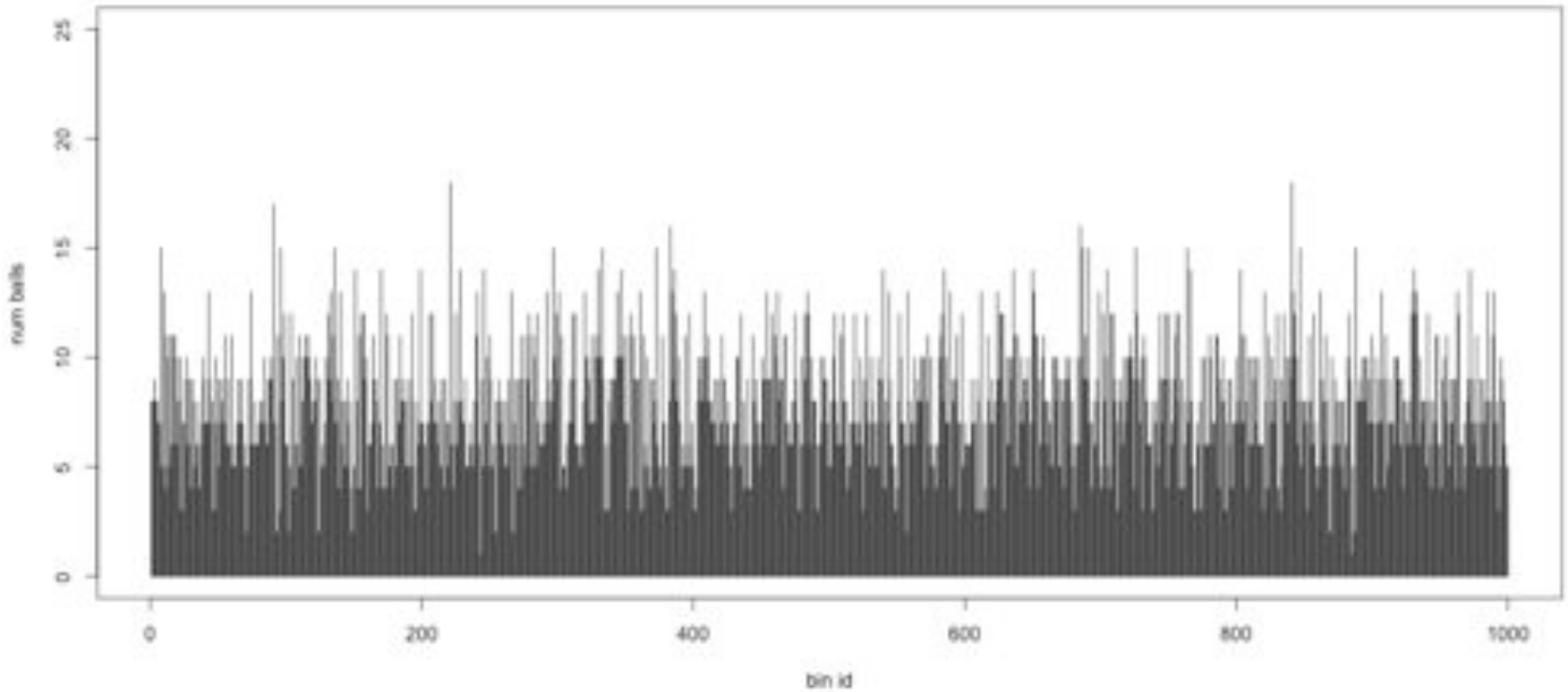


8x Sequencing

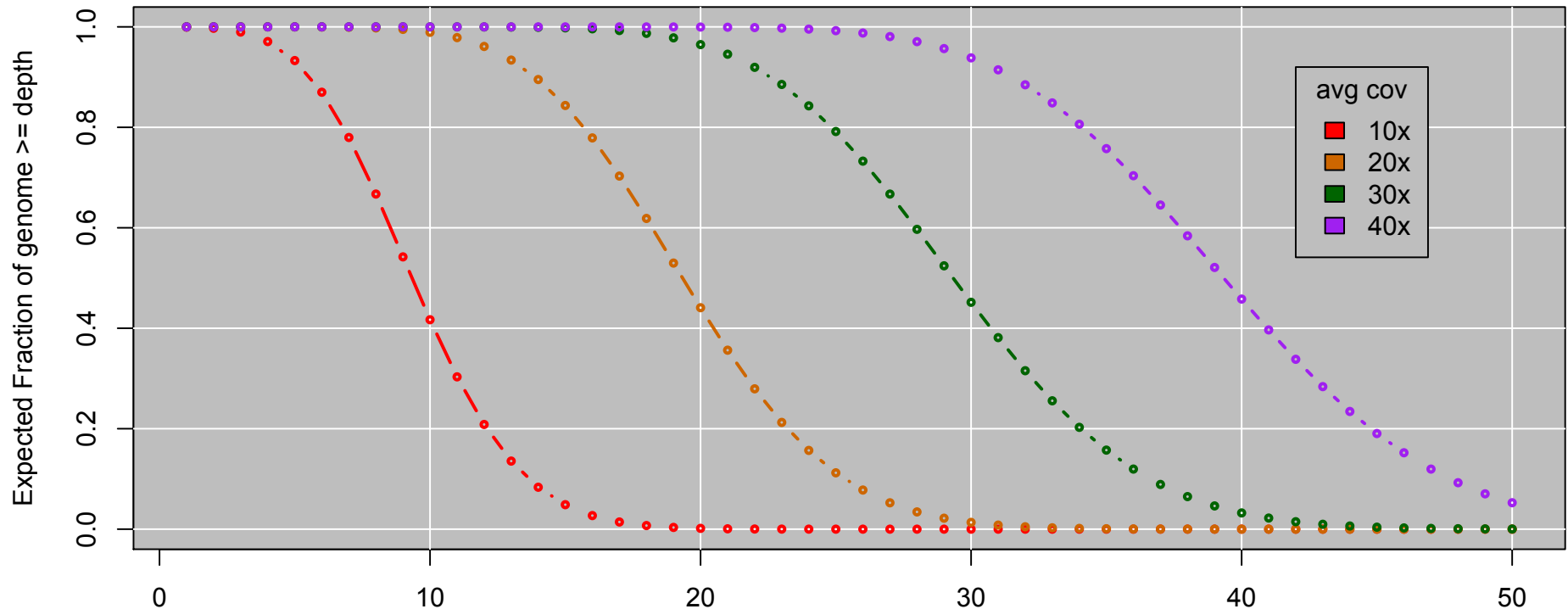
Histogram of balls in each bin
Total balls: 8000 Empty bins: 1



Balls in Bins
Total balls: 8000



Genome Coverage Distribution

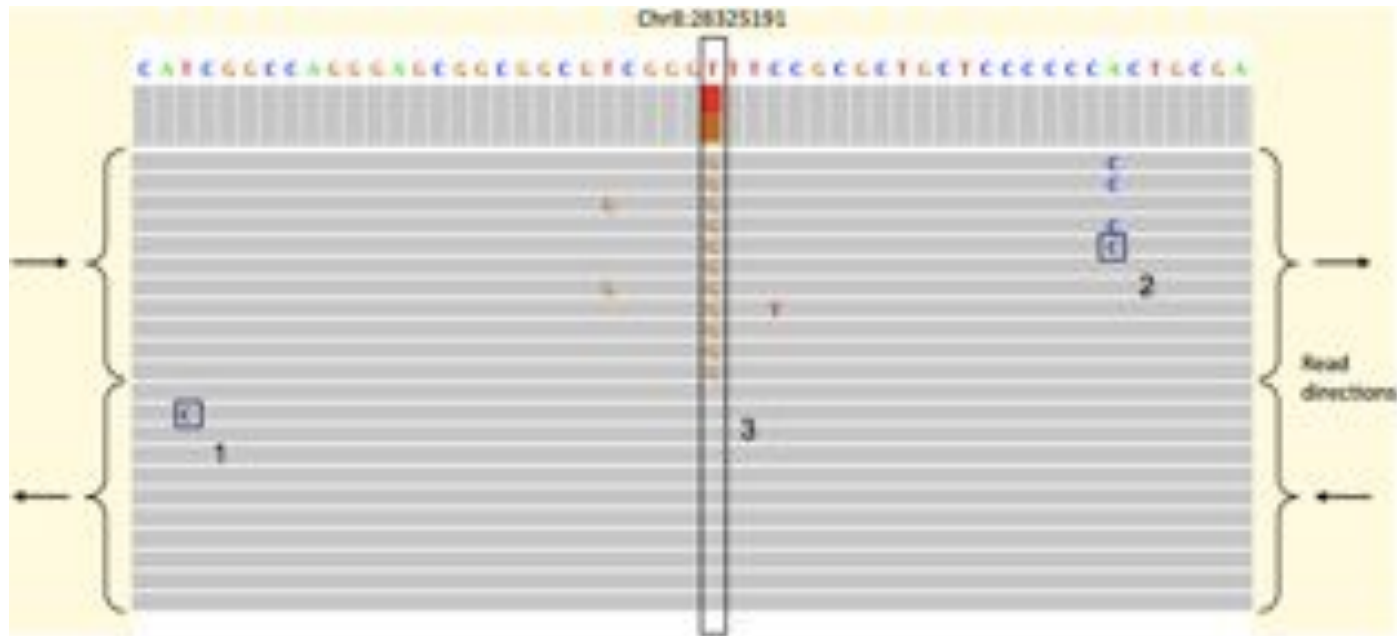


Expect Poisson distribution on depth
Standard Deviation = $\sqrt{\text{cov}}$

This is the mathematically model => reality may be much worse
Double your coverage for diploid genomes

SNP calling

Beware of (Systematic) Errors



- Distinguishing SNPs from sequencing error typically a likelihood test of the coverage
 - Probability of seeing the data from a heterozygous SNP versus from sequencing error
 - However, some sequencing errors are systematic!

Identification and correction of systematic error in high-throughput sequence data

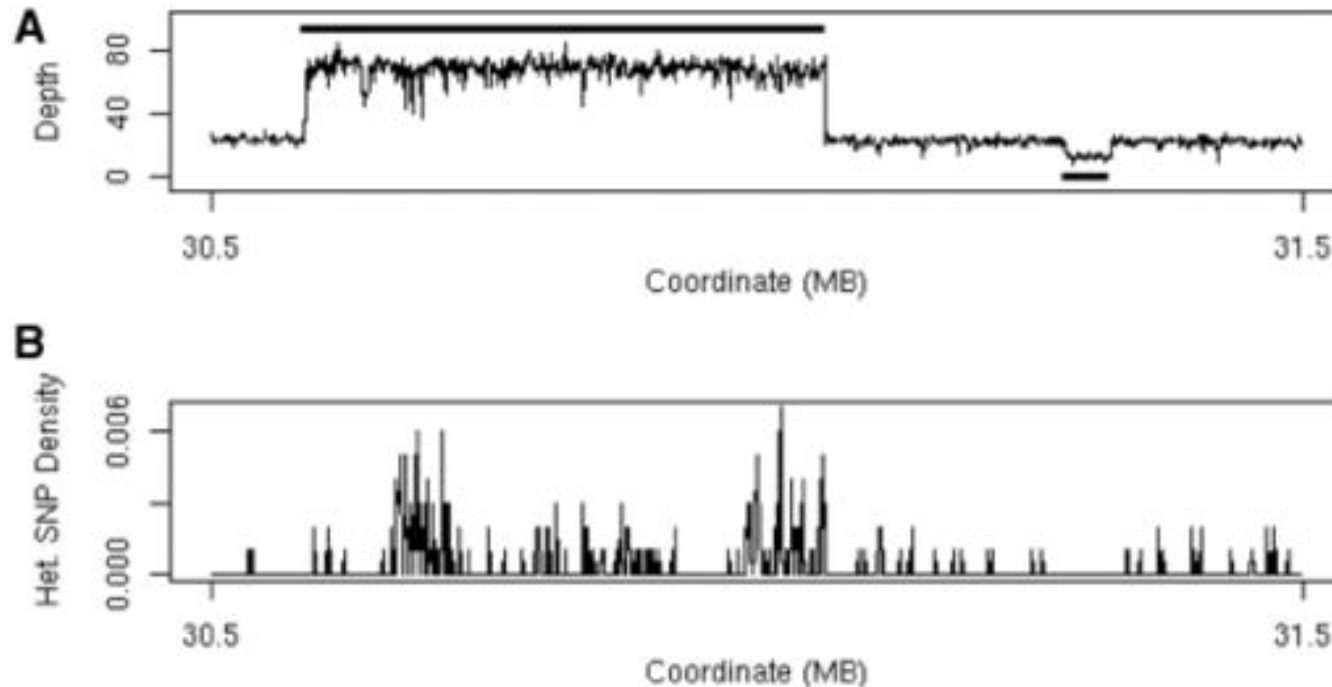
Meacham et al. (2011) *BMC Bioinformatics*. 12:451

A closer look at RNA editing.

Lior Pachter (2012) *Nature Biotechnology*. 30:246-247

CNV calling

Beware of (Systematic) Errors

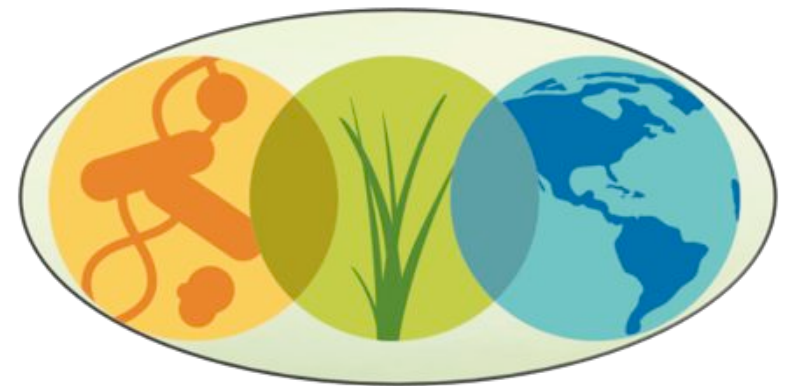


(A) Plot of sequencing depth across a one megabase region of A/J chromosome 17 clearly shows both a region of 3-fold increased copy number (30.6–31.1 Mb) and a region of decreased copy number (at 31.3 Mb).

Simpson J T et al. *Bioinformatics* 2010;26:565-567

- Identify CNVs through increased depth of coverage & increased heterozygosity
 - Segment coverage levels into discrete steps
 - Be careful of GC biases and mapping biases of repeats

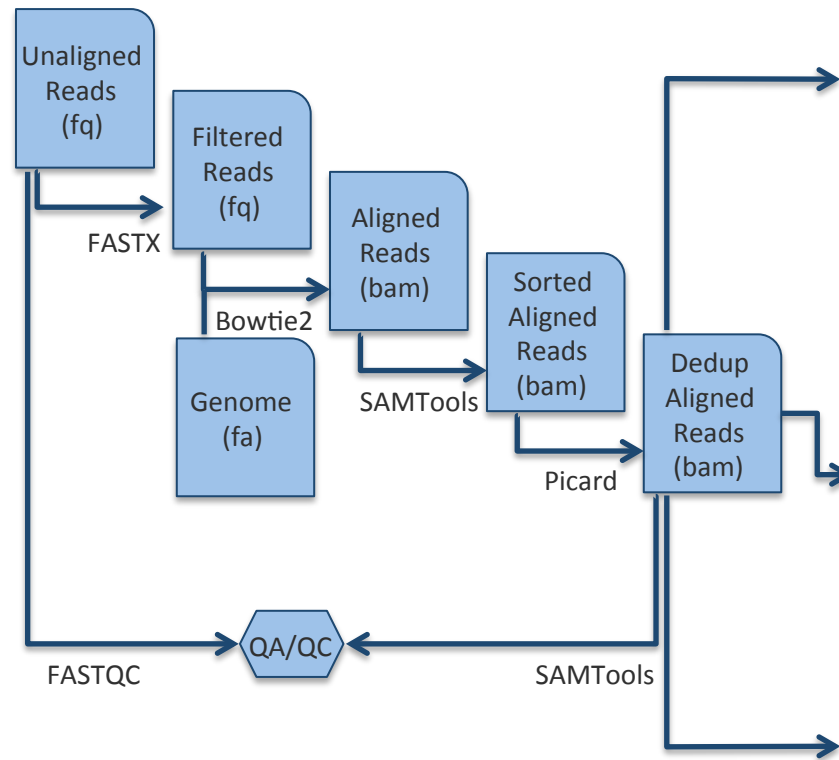
1. Introduction to KBase
2. Resequencing and variation calling theory
3. KBase services for variation calling
4. Live Demo
5. Additional Resources





Illumina HiSeq 2000
Sequencing by Synthesis

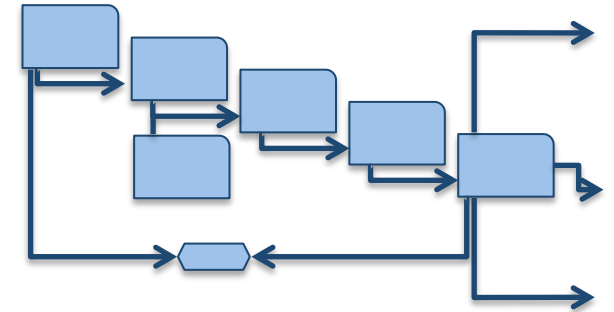
>60Gbp / day



- Assays**
- Read QA/QC
 - Mapping Stats
 - SNVs / Indels
 - CNVs / SVs
 - RNA-seq
 - ChIP-seq
 - DNase-seq
 - FAIRE-seq
 - Methyl-seq
 - ChIA-PET
 - Hi-C
 - ...

Genotyping API

- **Bowtie:** Launch alignment task with Bowtie
- **BWA:** Launch alignment task with BWA
- **SNPCalling:** Launch SNPcalling task with SAMTools
- **SortAlignments:** Launch task to sort by chromosome



Job API

- **ClusterStatus:** return basic status of cluster (jobs running, nodes available, etc)
- **JobStatus:** Given a JobID, returns current status
- **ListJobs:** List JobID running with a given username
- **KillJob:** Kills a given JobID

Data API

- **List:** List files in a directory
- **Fetch:** Fetch files from HDFS
- **Put:** Put files into HDFS
- **RM:** Delete files on HDFS
- **FetchBAM:** On-the-fly conversion to BAM
- **PutFastq:** Put reads into HDFS with conversion

Notes:

- All calls are authenticated with KBase username/password

1. Identify reference genome

```
$ all_entities_Genome -f scientific_name | grep -i 'Populus'
```

2. Upload Reads to KBase cloud

```
$ jk_fs_put_pe populus.1.fq.gz populus.2.fq.gz populus
```

3. Align Reads with Bowtie2

```
$ jk_compute_bowtie -in=populus.pe -org=populus -out=populus_align
```

4. Call SNPs with SAMTools

```
$ jk_compute_samtools_snp -in=populus_align -org=populus -out=populus_snps
```

5. Merge and Download VCF files

```
$ jk_compute_vcf_merge -in=populus_snps --alignments=populus_align -out=populus.vcf  
$ jk_fs_get populus.vcf
```

```
$ all_entities_Genome -f scientific_name | grep -i 'populus'  
kb|g.3907      Populus trichocarpa
```

```
$ all_entities_Genome -f scientific_name | grep -i 'saccharomyces'  
kb|g.10018     Schizosaccharomyces octosporus yfs286 2  
kb|g.10042     Zygosaccharomyces bisporus IF0 1730  
kb|g.10037     Schizosaccharomyces japonicus  
kb|g.21735     Zygosaccharomyces rouxii  
kb|g.10036     Schizosaccharomyces pombe  
kb|g.2311      Saccharomyces cerevisiae S288c  
kb|g.1800      Saccharomyces cerevisiae (baker's yeast)  
kb|g.20495     Saccharomyces cerevisiae virus L-A (L1)  
kb|g.9830      Saccharomyces cerevisiae virus L-BC (La)  
kb|g.10039     Schizosaccharomyces octosporus  
kb|g.21023     Saccharomyces castellii  
kb|g.20815     Saccharomyces 23S RNA narnavirus  
kb|g.9739      Schizosaccharomyces japonicus yFS275  
kb|g.9118      Schizosaccharomyces pombe 972h- 2  
kb|g.10046     Zygosaccharomyces bailii  
kb|g.10044     Saccharomyces cerevisiae  
kb|g.1789      Schizosaccharomyces pombe  
kb|g.9058      Saccharomyces servazzii  
kb|g.8715      Saccharomyces 20S RNA narnavirus  
kb|g.21062     Saccharomyces cerevisiae rm11-1a 1  
kb|g.10113     Saccharomyces pastorianus Weihenstephan 34/70  
kb|g.8353      Zygosaccharomyces bailii virus Z  
kb|g.8481      Saccharomyces cerevisiae killer virus M1
```

Select the proper KBase ID

Identify reference genome

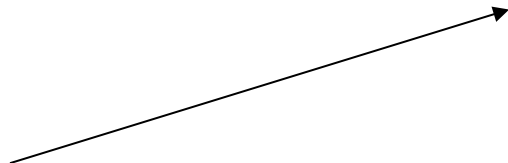
```
$ all_entities_Genome -f scientific_name | grep -i 'Populus'
```

```
@HWI-ST985:95:COKV6ACXX:1:1101:1232:2097 1:N:0:  
AATGACTGAAGGATAGCTGAAGGTCTAAATGAATGGCTGAAGGGTGAAGGTCTAAATGAATGGCTGAAGGATAG  
+  
CCCF#2ADPH##HJJJJJJJJJJFHEJJJJJJJJJJJJJJJJ?GHJIJIIIJCHJJJJJJJJJJJJH##F;BE  
@HWI-ST985:95:COKV6ACXX:1:1101:1242:2117 1:N:0:  
AGGGNGAGGGCCAGGCAGAGGAAGGGAGGGGGCCAGGCCAAAGGGAGGGCCACAGACAGAGGAAGGGAGGGCCAC  
+  
@@CF#2ADPH##HGIJGIIFGI AHHIIDHIIJHDDDDDD?AACB-BBDDDBDC??ABDCCBBBA?B?@B?B9->  
@HWI-ST985:95:COKV6ACXX:1:1101:1250:2145 1:N:0:  
GCCGNGACATTTAGTGACGTGGTCCAAAGGGACGCCTCCTCGGAGCGTTGGAAACGGCAATGTTTAAAGCGACAC  
+  
CCCF#2ADPH##HJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJ  
@HWI-ST985:95:COKV6ACXX:1:1101:1188:2151 1:N:0:  
CAACNCATGCTGTCAAGTTCAAAGGCCCTTAATGAGTAAATCCATGATGGCCCTGCCAGCTGGAATCCAAAATACTAA  
+  
CCCF#4ADH##HJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJ
```

KBase Cloud



User Workstation



Upload Reads to KBase cloud

```
$ jk_fs_put_pe populus.1.fq.gz populus.2.fq.gz populus
```


Alignments



Samtools Variant Detection

Called Variants (VCF)

SAMTools

SAMTools

SAMTools

```

ref|NC_001133| 17795 . T A 140
ref|NC_001133| 19449 . C G 82
|112.0.58.01| 20308 . C T,G 139
95.164.99 .
ref|NC_001133| 22454 . T G 83
|113.0.55.08| 22799 . C G 73
ref|NC_001133| 24089 . T A 78
|108.0.100.99| 25198 . G T 56
ref|NC_001133| 26922 . T G 7,8
|37.0.44.98| 30419 . T A 71
ref|NC_001133| 32203 . A T 141
|1/1:174.126.0.99| 32209 . G C 76
ref|NC_001133| 34061 . C G 77
|0/1:107.0.95.98| 35163 . T A 55
ref|NC_001133| 35796 . G C 55
|85.0.114.88| 35796 . G C 55
ref|NC_001133| 35757 . T TA 108
ref|NC_001133| 35881 . C T 62
  
```

```

ref|NC_001133| 17795 . T A 140
ref|NC_001133| 19449 . C G 82
|112.0.58.01| 20308 . C T,G 139
95.164.99 .
ref|NC_001133| 22454 . T G 83
|113.0.55.08| 22799 . C G 73
ref|NC_001133| 24089 . T A 78
|108.0.100.99| 25198 . G T 56
ref|NC_001133| 26922 . T G 7,8
|37.0.44.98| 30419 . T A 71
ref|NC_001133| 32203 . A T 141
|1/1:174.126.0.99| 32209 . G C 76
ref|NC_001133| 34061 . C G 77
|0/1:107.0.95.98| 35163 . T A 55
ref|NC_001133| 35796 . G C 55
|85.0.114.88| 35796 . G C 55
ref|NC_001133| 35757 . T TA 108
ref|NC_001133| 35881 . C T 62
  
```

```

ref|NC_001133| 17795 . T A 140
ref|NC_001133| 19449 . C G 82
|112.0.58.01| 20308 . C T,G 139
95.164.99 .
ref|NC_001133| 22454 . T G 83
|113.0.55.08| 22799 . C G 73
ref|NC_001133| 24089 . T A 78
|108.0.100.99| 25198 . G T 56
ref|NC_001133| 26922 . T G 7,8
|37.0.44.98| 30419 . T A 71
ref|NC_001133| 32203 . A T 141
|1/1:174.126.0.99| 32209 . G C 76
ref|NC_001133| 34061 . C G 77
|0/1:107.0.95.98| 35163 . T A 55
ref|NC_001133| 35796 . G C 55
|85.0.114.88| 35796 . G C 55
ref|NC_001133| 35757 . T TA 108
ref|NC_001133| 35881 . C T 62
  
```

Call SNPs with SAMTools

```
$ jk_compute_samtools_snp -in=populus_align -org='kb|g.3907' -out=populus_snps
```

ref[NC_001133] 17795	T	A	140	ref[NC_001133] 17795	T	A	140	ref[NC_001133] 17795	T	A	140
ref[NC_001133] 19449	C	G	82	ref[NC_001133] 19449	C	G	82	ref[NC_001133] 19449	C	G	82
112.0.58.61				112.0.58.61				112.0.58.61			
ref[NC_001133] 20308	C	T,G	139	ref[NC_001133] 20308	C	T,G	139	ref[NC_001133] 20308	C	T,G	139
95.164.99				95.164.99				95.164.99			
ref[NC_001133] 22454	T	G	83	ref[NC_001133] 22454	T	G	83	ref[NC_001133] 22454	T	G	83
113.0.55.98				113.0.55.98				113.0.55.98			
ref[NC_001133] 22799	C	G	73	ref[NC_001133] 22799	C	G	73	ref[NC_001133] 22799	C	G	73
100.0.98.99				100.0.98.99				100.0.98.99			
ref[NC_001133] 24089	T	A	78	ref[NC_001133] 24089	T	A	78	ref[NC_001133] 24089	T	A	78
108.0.100.89				108.0.100.89				108.0.100.89			
ref[NC_001133] 25138	G	T	56	ref[NC_001133] 25138	G	T	56	ref[NC_001133] 25138	G	T	56
86.0.108.89				86.0.108.89				86.0.108.89			
ref[NC_001133] 26922	T	G	7.8	ref[NC_001133] 26922	T	G	7.8	ref[NC_001133] 26922	T	G	7.8
107.0.44.38				107.0.44.38				107.0.44.38			
ref[NC_001133] 30419	T	A	71	ref[NC_001133] 30419	T	A	71	ref[NC_001133] 30419	T	A	71
101.0.99.99				101.0.99.99				101.0.99.99			
ref[NC_001133] 32203	A	T	141	ref[NC_001133] 32203	A	T	141	ref[NC_001133] 32203	A	T	141
111.174.126.0.99				111.174.126.0.99				111.174.126.0.99			
ref[NC_001133] 32229	G	C	76	ref[NC_001133] 32229	G	C	76	ref[NC_001133] 32229	G	C	76
106.0.104.89				106.0.104.89				106.0.104.89			
ref[NC_001133] 34061	C	G	77	ref[NC_001133] 34061	C	G	77	ref[NC_001133] 34061	C	G	77
011.107.0.99.98				011.107.0.99.98				011.107.0.99.98			
ref[NC_001133] 35163	T	A	55	ref[NC_001133] 35163	T	A	55	ref[NC_001133] 35163	T	A	55
85.0.114.88				85.0.114.88				85.0.114.88			
ref[NC_001133] 35736	G	C	55	ref[NC_001133] 35736	G	C	55	ref[NC_001133] 35736	G	C	55
011.85.0.104.88				011.85.0.104.88				011.85.0.104.88			
ref[NC_001133] 35756	T	TA	115	ref[NC_001133] 35756	T	TA	115	ref[NC_001133] 35756	T	TA	115
ref[NC_001133] 35757	T	TA	108	ref[NC_001133] 35757	T	TA	108	ref[NC_001133] 35757	T	TA	108
ref[NC_001133] 35881	C	T	62	ref[NC_001133] 35881	C	T	62	ref[NC_001133] 35881	C	T	62

Merge VCF Files

```
ref[NC_001133] 209471
ref[NC_001133] 209996
ref[NC_001133] 209997
ref[NC_001133] 209999
ref[NC_001133] 220369
ref[NC_001133] 22361.2
ref[NC_001133] 22361.3
ref[NC_001133] 229098
ref[NC_001133] 221485
ref[NC_001133] 222126
ref[NC_001133] 228030
ref[NC_001133] 228117
ref[NC_001133] 228278
ref[NC_001133] 229150
ref[NC_001133] 229902
ref[NC_001133] 229683
ref[NC_001133] 229786
ref[NC_001133] 230004
ref[NC_001134] 6731
ref[NC_001134] 7311
ref[NC_001134] 8053
ref[NC_001134] 9000
ref[NC_001134] 9884
ref[NC_001134] 9886
ref[NC_001134] 11462
ref[NC_001134] 13282
ref[NC_001134] 13558
ref[NC_001134] 13559
ref[NC_001134] 14012
ref[NC_001134] 14345
ref[NC_001134] 14766
ref[NC_001134] 15333
ref[NC_001134] 15230
ref[NC_001134] 19347
ref[NC_001134] 21729
ref[NC_001134] 24192
ref[NC_001134] 24266
ref[NC_001134] 24354
ref[NC_001134] 24680
ref[NC_001134] 25023
ref[NC_001134] 26651
ref[NC_001134] 26959
ref[NC_001134] 29384
ref[NC_001134] 29433
ref[NC_001134] 30326
ref[NC_001134] 35003
ref[NC_001134] 35672
ref[NC_001134] 35674
ref[NC_001134] 37025
ref[NC_001134] 37060
ref[NC_001134] 37659
ref[NC_001134] 39418
```

Download to Local Workstation



Merge and Download

```
$ jk_compute_vcf_merge -in=populus_snps -alignments=populus_align -out=populus.vcf
$ jk_fs_get populus.vcf
```

1. Identify reference genome

```
$ all_entities_Genome -f scientific_name | grep -i 'Populus'
```

2. Upload Reads to KBase cloud

```
$ jk_fs_put_pe populus.1.fq.gz populus.2.fq.gz populus
```

3. Align Reads with Bowtie2

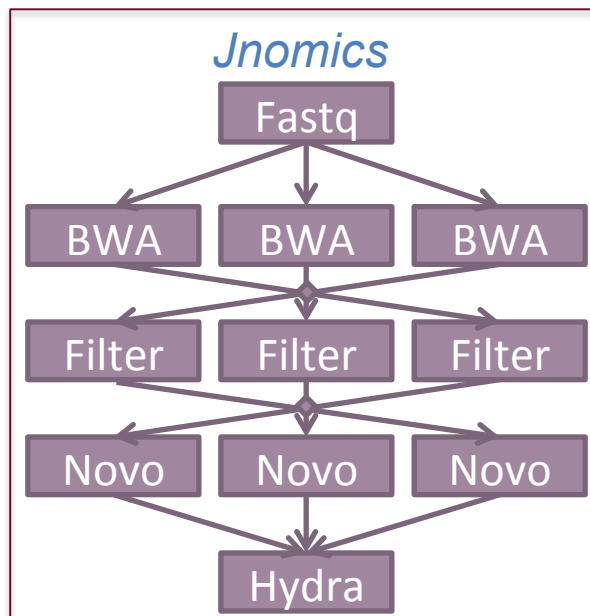
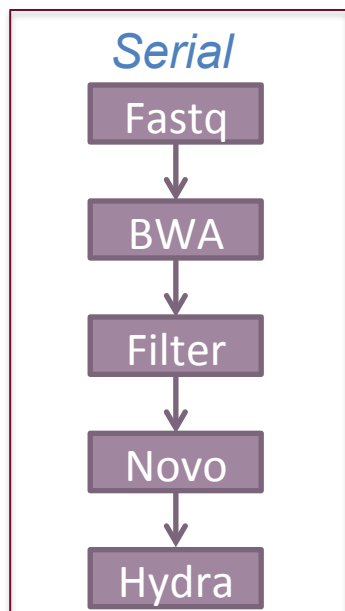
```
$ jk_compute_bowtie -in=populus.pe -org=populus -out=populus_align
```

4. Call SNPs with SAMTools

```
$ jk_compute_samtools_snp -in=populus_align -org=populus -out=populus_snps
```

5. Merge and Download VCF files

```
$ jk_compute_vcf_merge -in=populus_snps --alignments=populus_align -out=populus.vcf  
$ jk_fs_get populus.vcf
```

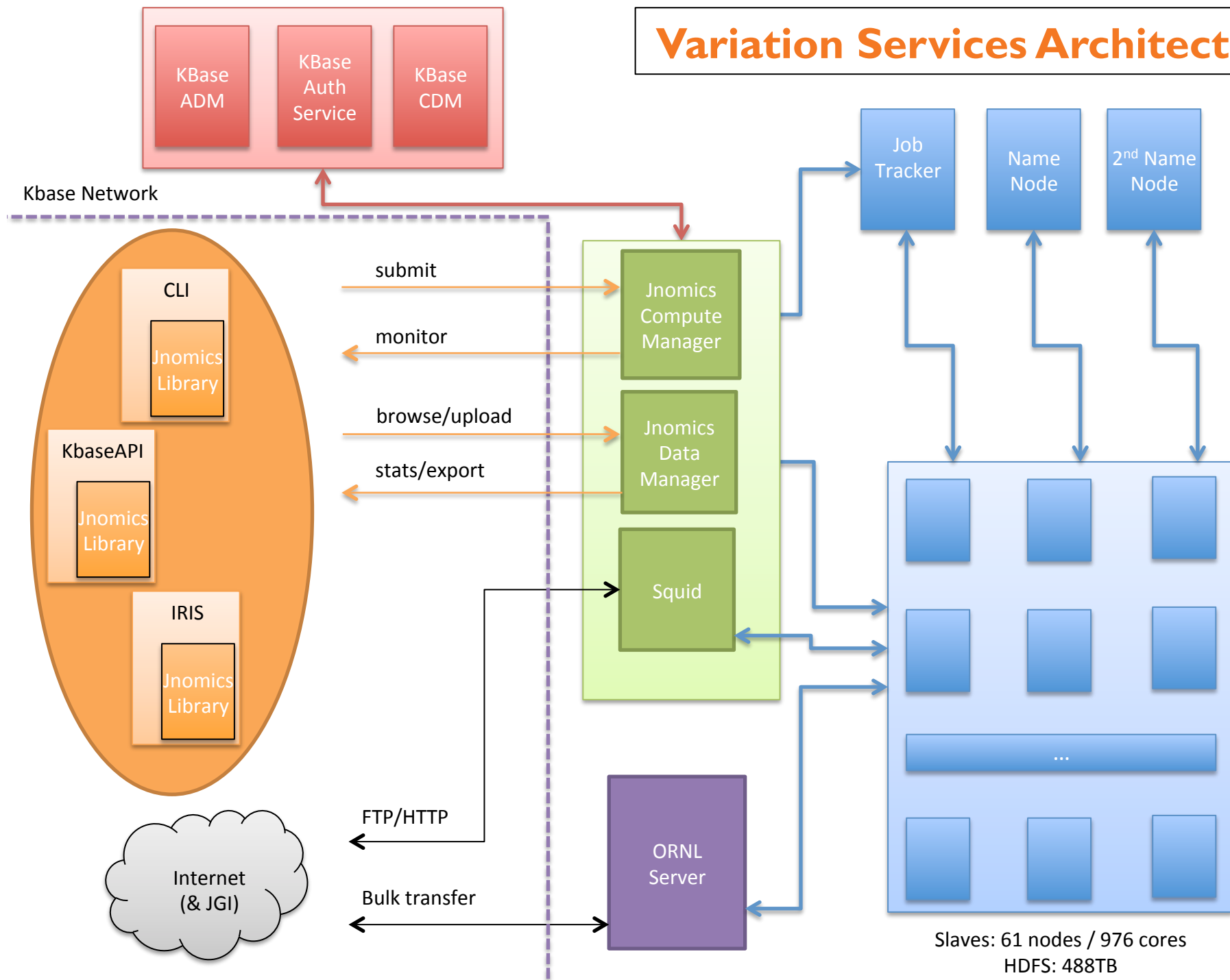


- Rapid parallel execution of data-intensive analysis
 - FASTX, BWA, Bowtie2, Novoalign, SAMTools, Hydra
 - Sorting, merging, filtering, selection, clustering, correlating
 - Supports BAM, SAM, BED, fastq

Answering the demands of digital genomics

Titmus, MA, Gurtowski, J, Schatz, MC (2012) *Concurrency & Computation*

Variation Services Architecture



Align & call SNPs from 35M 80bp (14Gbp) reads with maize genome (zmb73v2)
Identified 372k high confidence SNPs

	Serial	Multicore	KBase Cloud
Config	1 core (1 node)	44 core (1 node)	118 cores (15 nodes)
Bowtie2	45 h*	1h 10m	23 m
Sort	2 hr	2 hr	N/A
Samtools	2 hr	2 hr	12 m
End-to-End	50h*	5h 10m	35 m
Speedup	1x	9.6x	86x

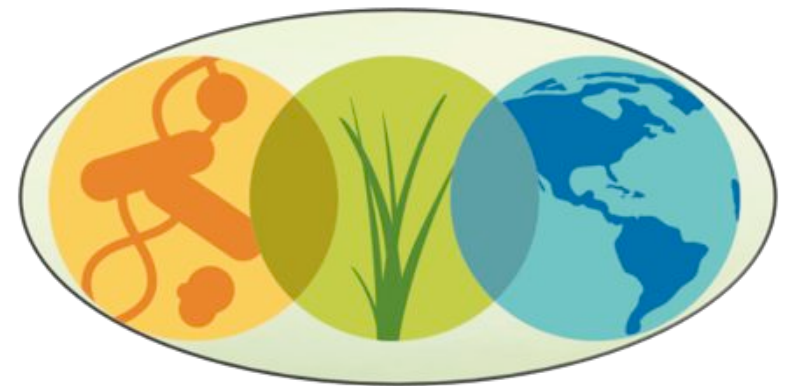
*estimated time

Align & call SNPs from 131 maize samples
1 TB fastq / 408Gbp input data

	Serial	KBase cloud (small)	KBase Cloud (large)
Config	1 core (1 node)	210 cores (15 nodes)	854 cores (61 nodes)
Bowtie2	1311 hr*	19.5 hr	5 hr
Sort	58 hr*	N/A	N/A
Samtools	58 hr*	3.5 hr	1.5 hr
End-to-End	1427 hr*	23 hr	6.5 hr
Speedup	1x	62x	219x

*estimated time

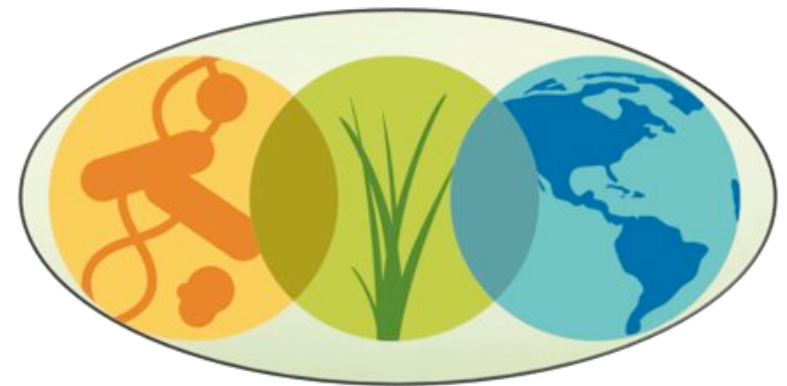
1. Introduction to KBase
2. Resequencing and variation calling theory
3. KBase services for variation calling
4. Live Demo
5. Additional Resources



Online Demo

1. Browse to KBase website: <http://kbase.us/>
2. Sign up for KBase account: <https://gologin.kbase.us/SignUp>
3. Download KBase DMG: <http://kbase.us/for-users/get-started/>
Or use IRIS: <http://kbase.us/services/docs/invocation/Iris/>
4. Variation Services Tutorial:
<http://kbase.us/for-users/tutorials/analyzing-data/variation-service/>
5. Summarize mutations:
\$ cat yeast.vcf
\$ grep -v '^#' yeast.vcf | cut -f1 | sort | uniq -c
\$ grep -v '^#' yeast.vcf | cut -f 4,5 | sort | uniq -c | sort -nrk1 | head

1. Introduction to KBase
2. Resequencing and variation calling theory
3. KBase services for variation calling
4. Live Demo
5. Additional Resources



Resource	URL
KBase	http://kbase.us/
Getting Started	http://kbase.us/for-users/user-home/
Variation Services	http://kbase.us/for-users/tutorials/analyzing-data/variation-service/
Bowtie2	http://bowtie-bio.sourceforge.net/bowtie2/index.shtml
BWA	http://bio-bwa.sourceforge.net/
SAMTools	http://samtools.sourceforge.net/
VCF Spec	http://www.1000genomes.org/wiki/Analysis/Variant%20Call%20Format/vcf-variant-call-format-version-40
SNPeff	http://snpeff.sourceforge.net/
KBase Contact	http://kbase.us/contact-us/
Survey	https://www.surveymonkey.com/s/KB-user-info

Thank You!

<http://schatzlab.cshl.edu>
@mike_schatz / @DOEKBase

