



Hosted by Indiana University June 28–29, 2016

RADSeq Data Analysis

Through STACKS on Galaxy

Yvan Le Bras
Anthony Bretaudeau
Cyril Monjeaud
Gildas Le Corguillé



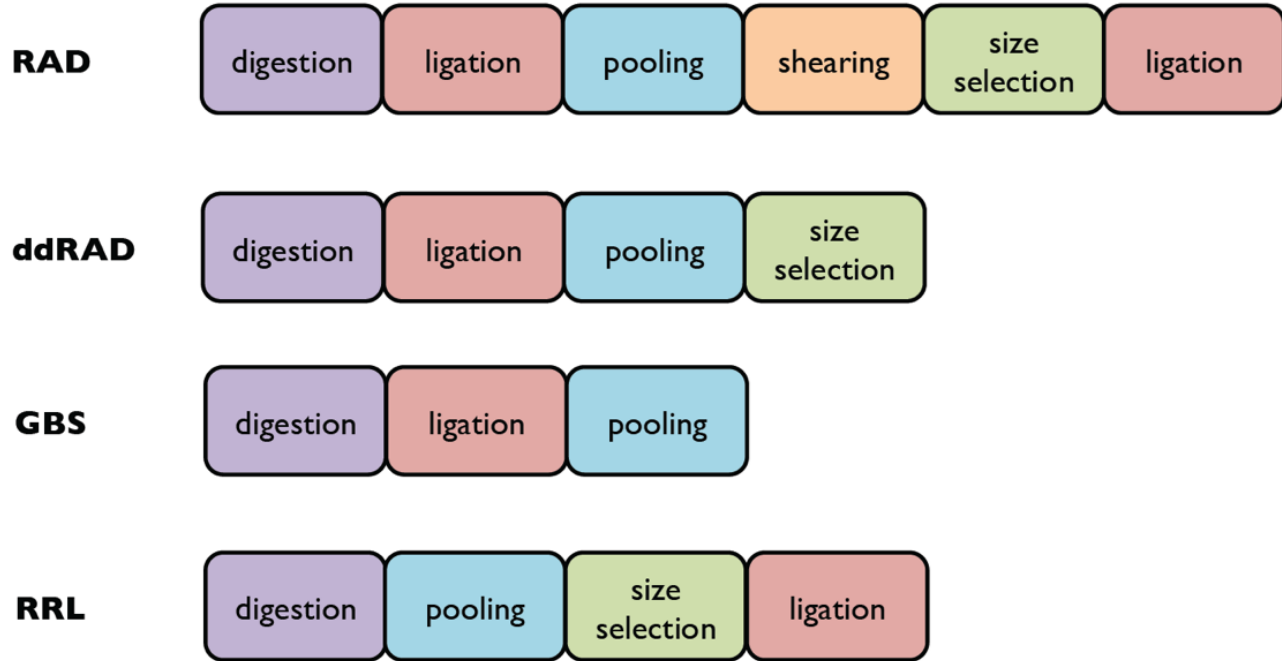
RAD sequencing: next-generation tools for an old problem

INTRODUCTION

The NGS revolution in the GBS world

- Alloenzymes, RAPD, AFLP, Microsatellites, SNP array, [...], **NGS**
- **NGS:** Low cost sequencing ...
 - But it's **still expensive** to get enough markers on enough samples
 - Solution: sampling the genome
- **BEWARE:** the analysis is not cheap!

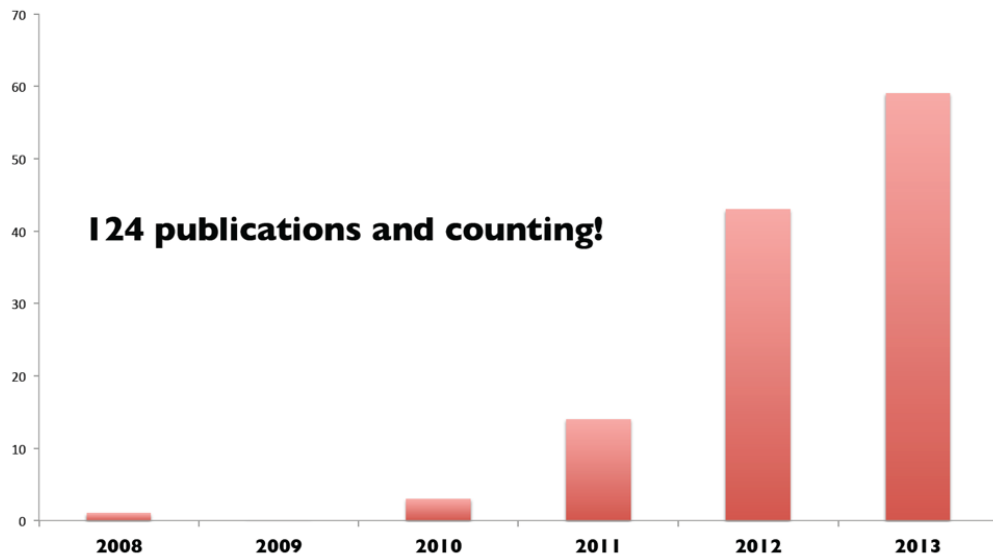
Sampling the genome



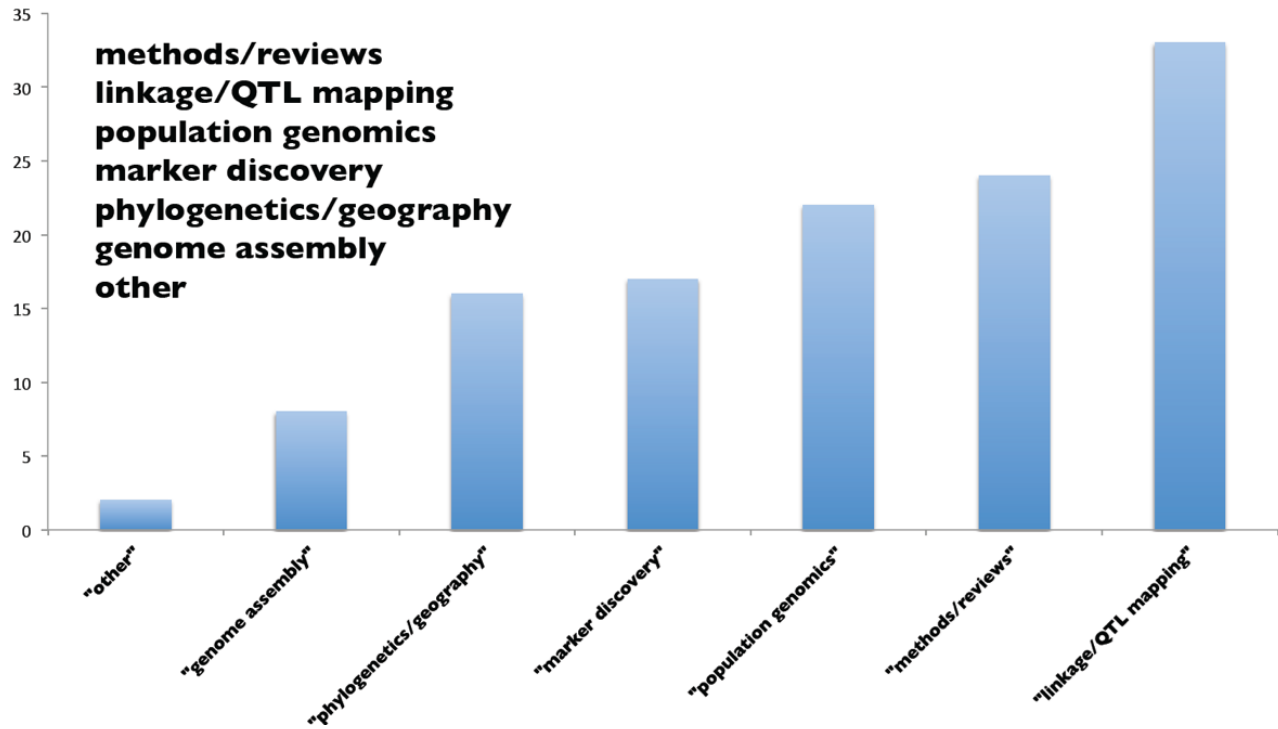
Used by the Roslin institute for their SNP arrays

Sampling the genome

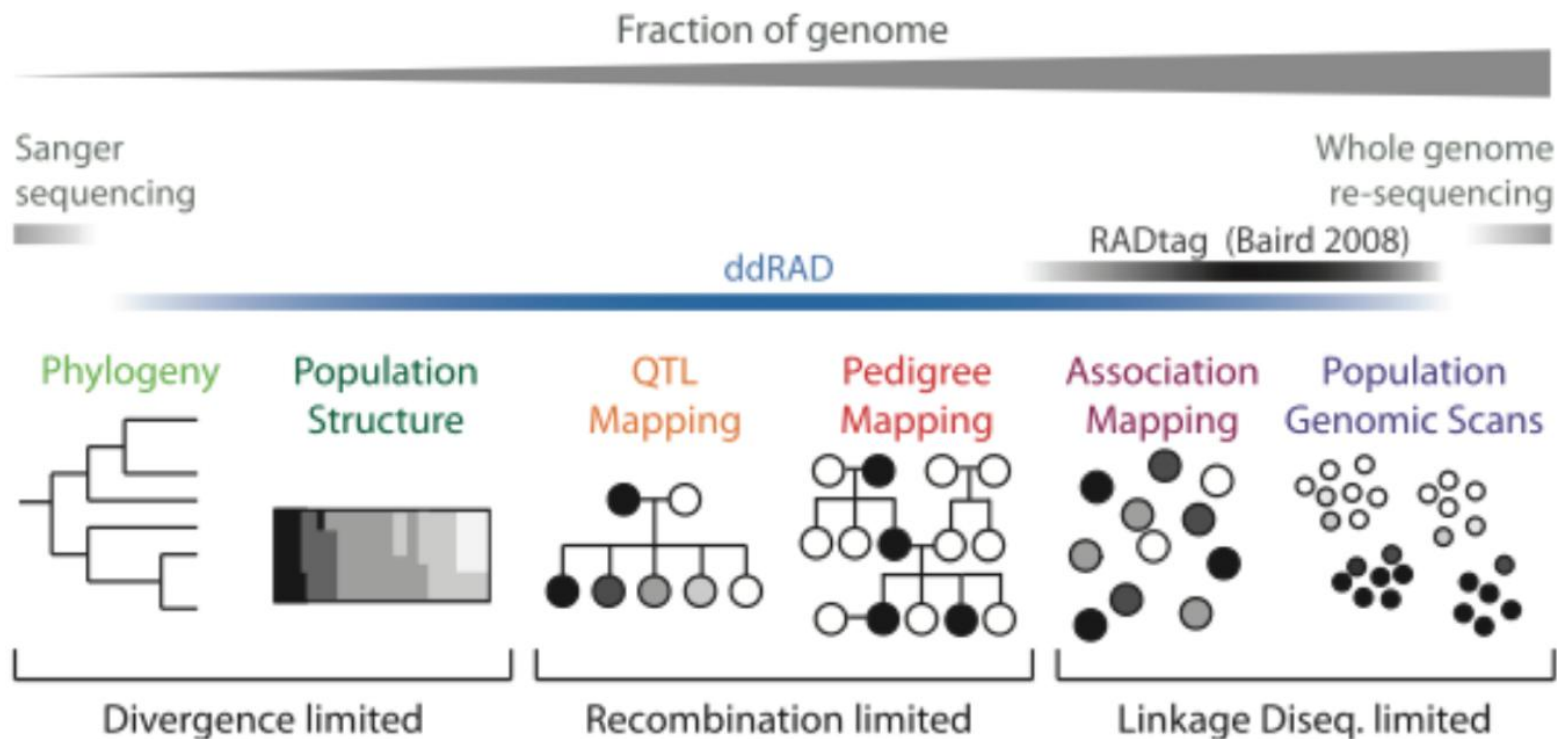
- Original paper: Eric Johnsson, 2008
- Hohenlohe is in the authorship of the first five



Applications



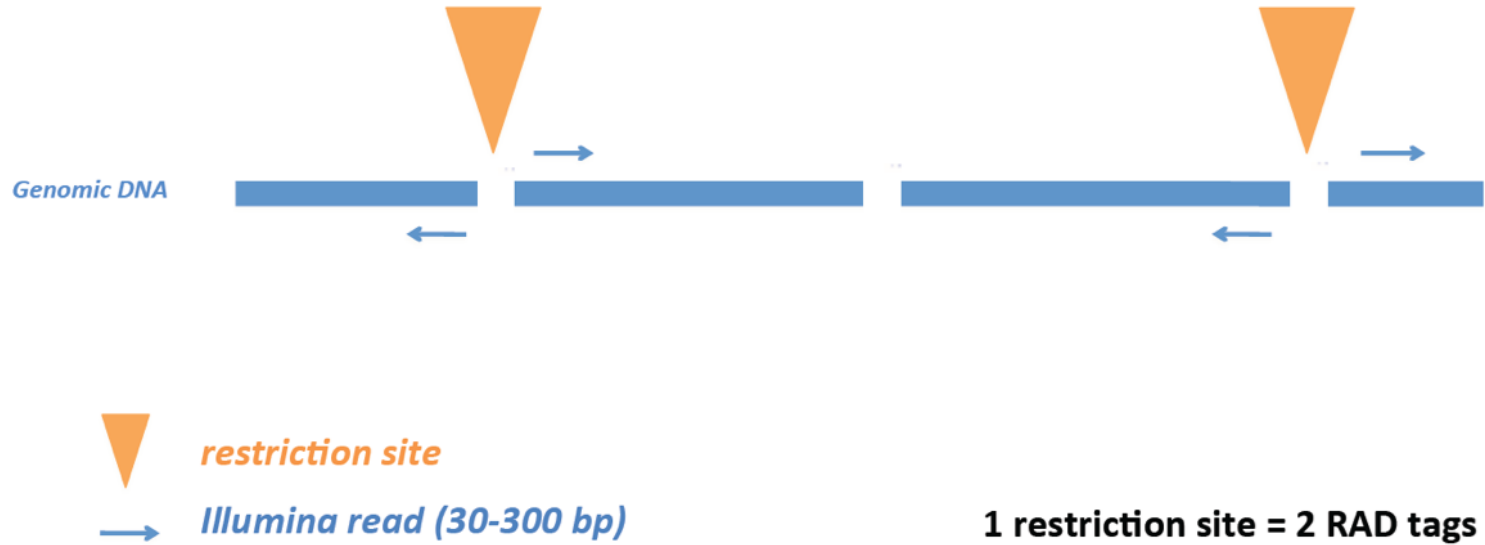
Applications



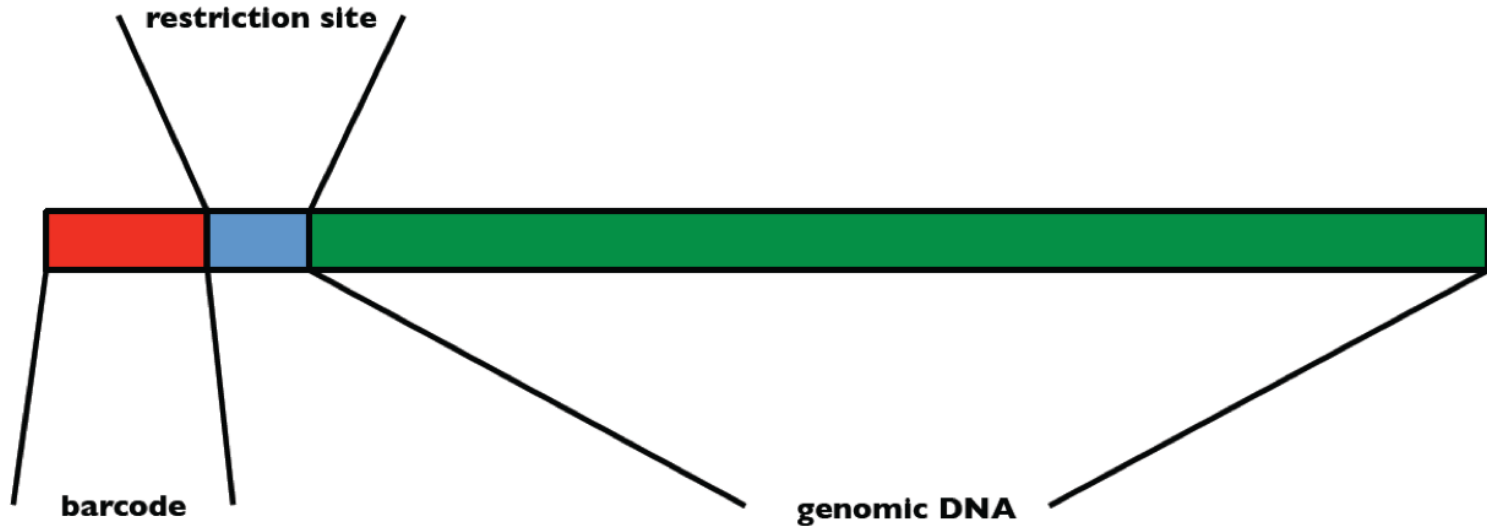
Classic RAD

Protocols

Single-end RAD



Single-end RAD



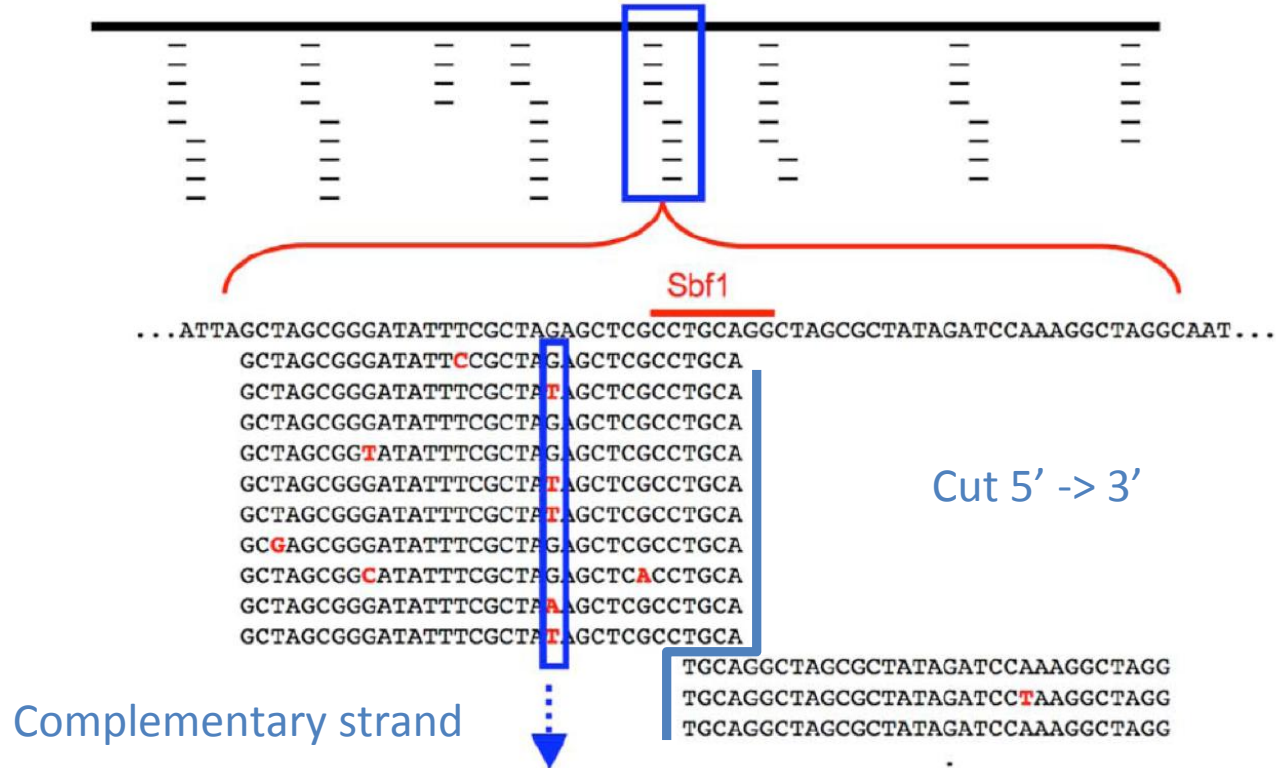
@M00689:44:000000000-A1N97:1:1101:11642:2590 1:N:0:1

CTGATGCTTGCAGGACGCACCTCCCCGCGGTGCGGCTAATGTCCTCGCAGC

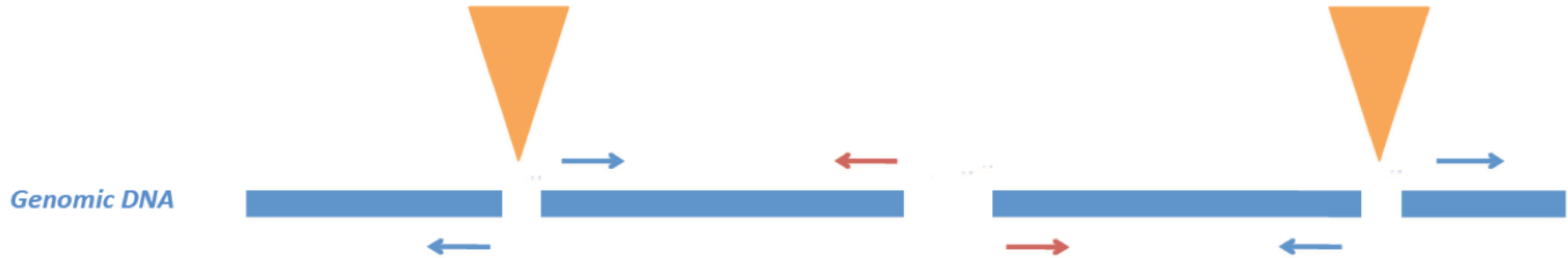
+

AAAAABBBDDDDDDDDGGGGGGGIIHHHHHEHHHHHBHHIIIIIIHHH@E

Single-end RAD



Paired-end RAD



restriction site

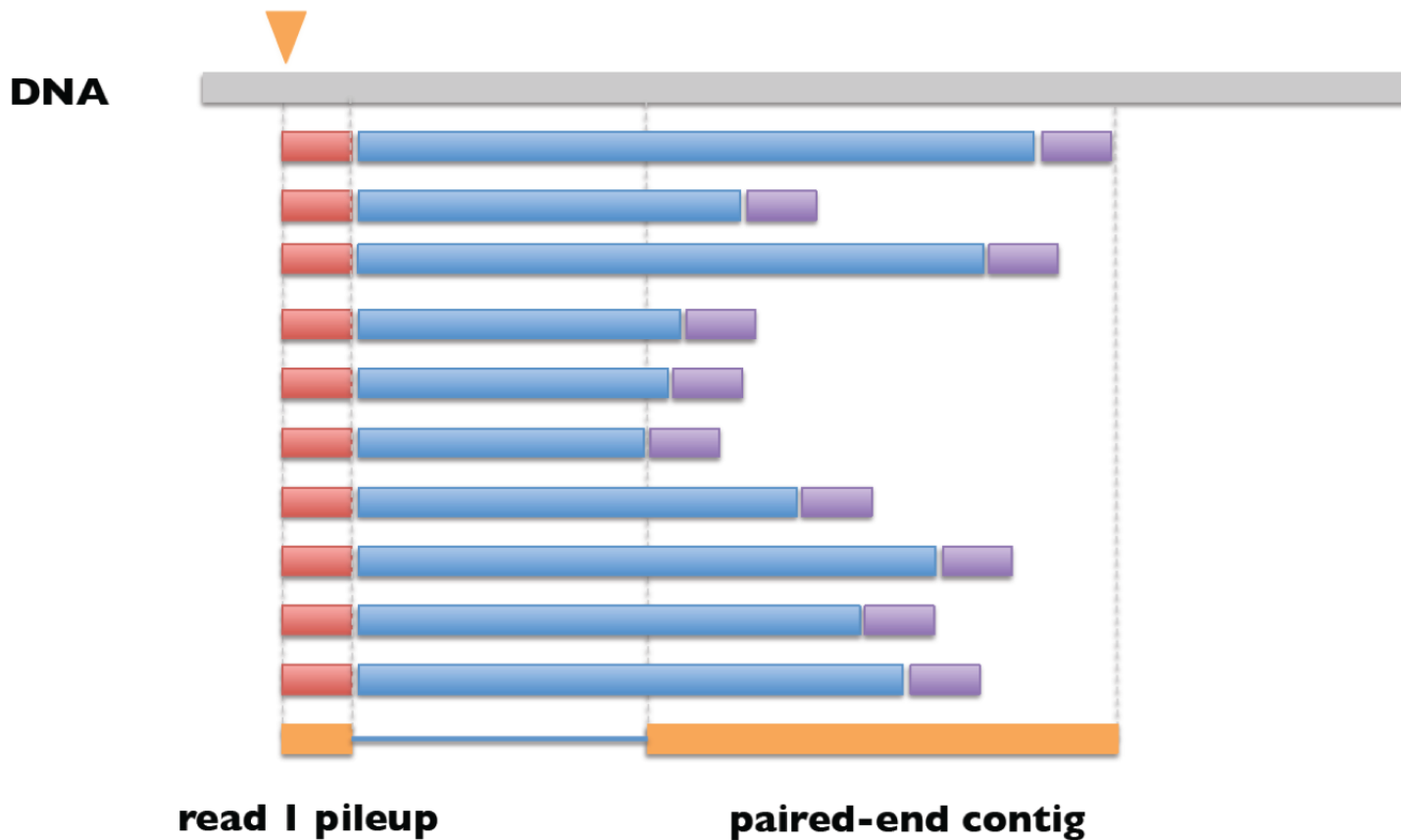


Illumina read 1 (30-300 bp)

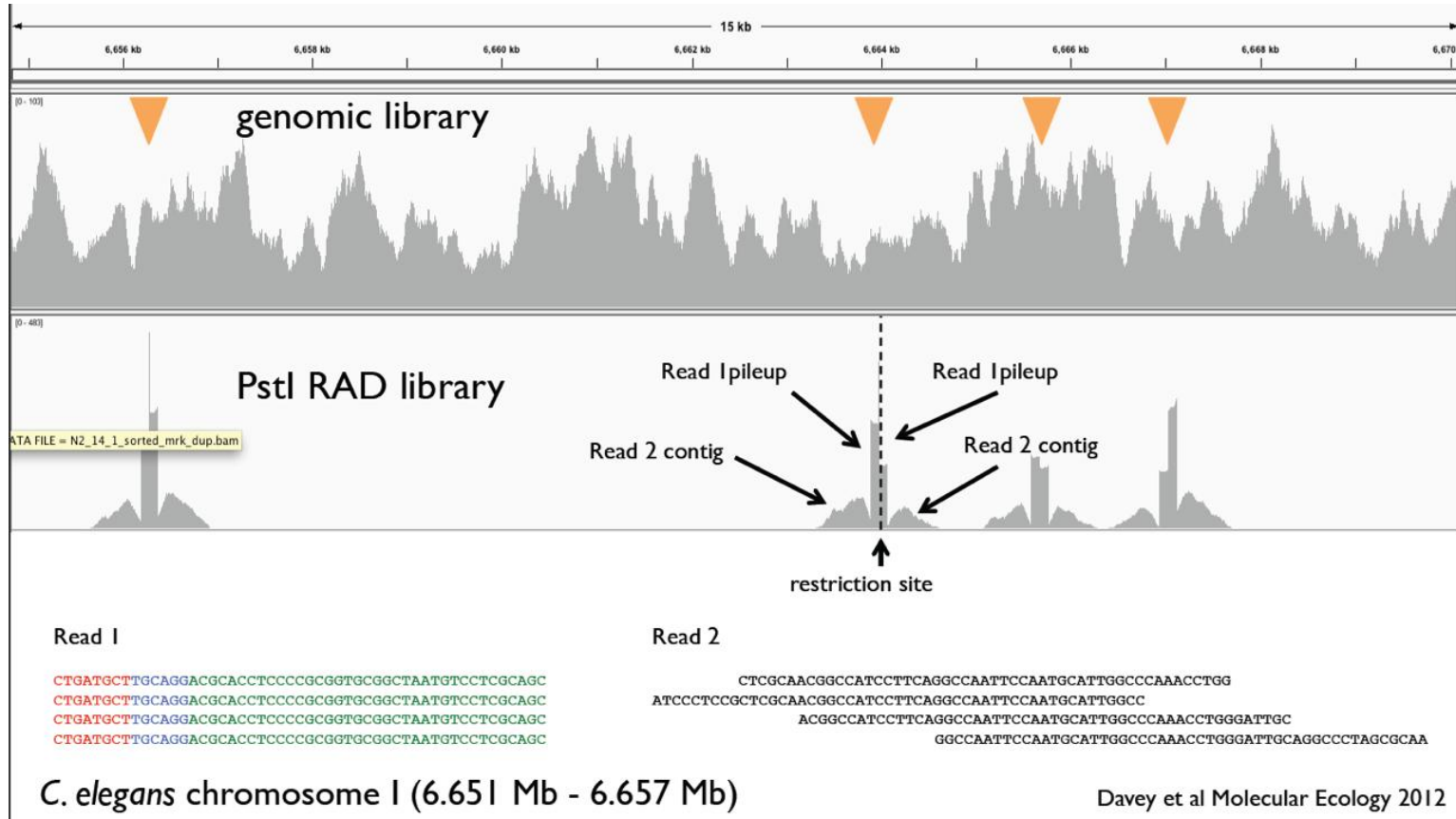


Illumina read 2 (30-300 bp)

Paired-end RAD



Paired-end RAD



Single vs Paired-end RAD



	single-end	paired-end
Library preparation	=	=
Costs	+	++
Bioinformatics	+	++
Bases per tag	up to 300	up to 300-500
Design of genotyping assays	limited	good
Filtering of duplicate reads	no	yes
Paralog resolution	+	++

ddRAD

Protocols

ddRAD



restriction site

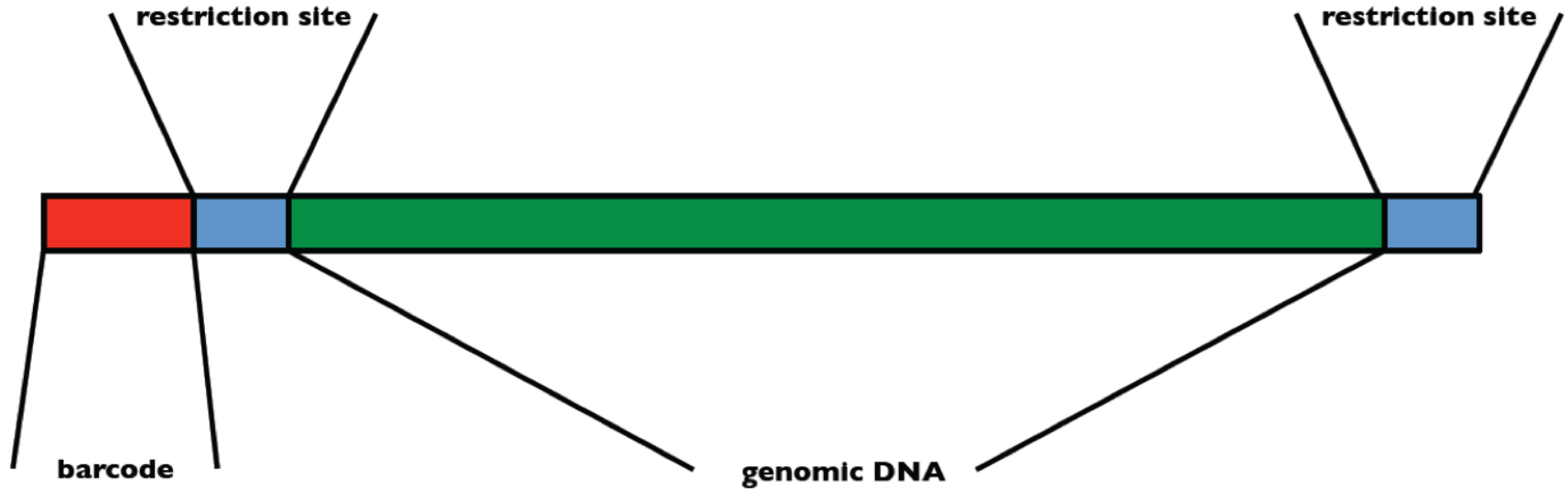


Illumina read 1 (30-250 bp)



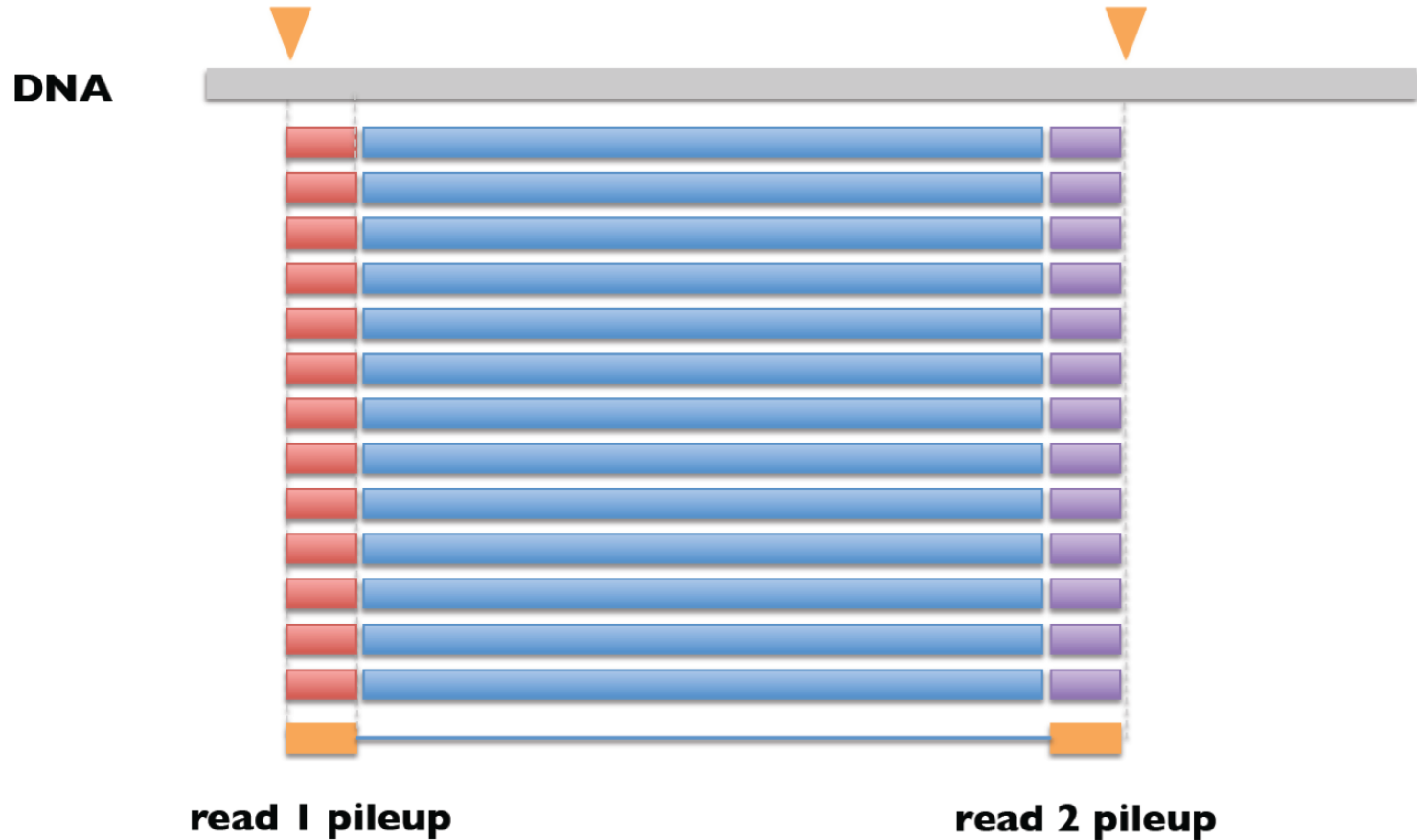
Illumina read 2 (30-250 bp)

ddRAD



~ 500 pb

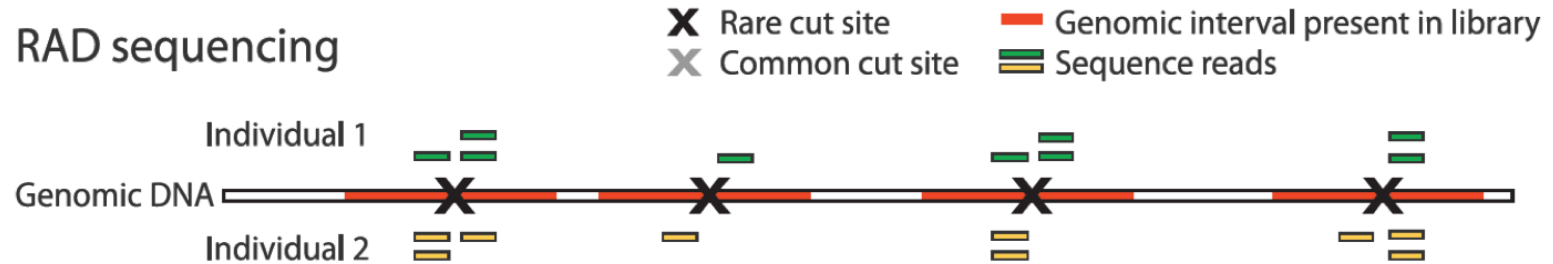
Paired-end ddRAD



RAD vs ddRAD

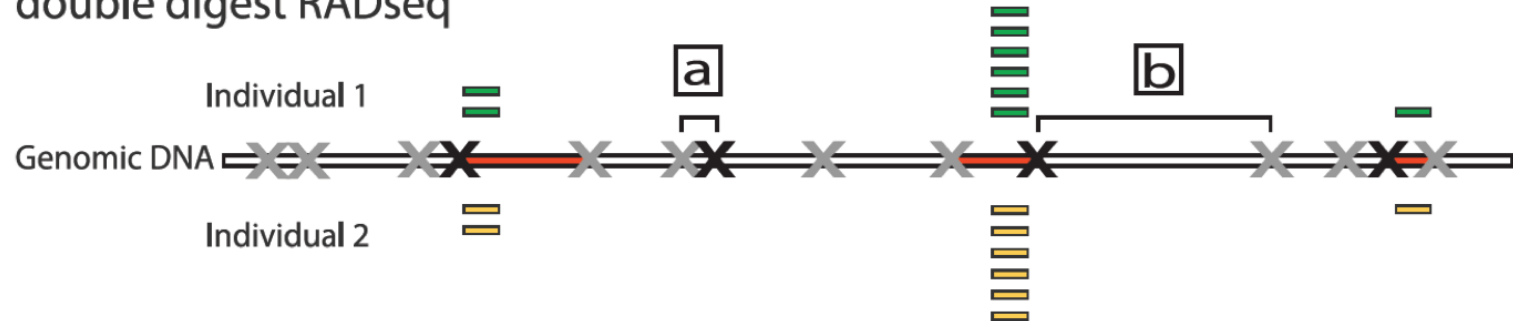
A

RAD sequencing



B

double digest RADseq



RAD vs ddRAD

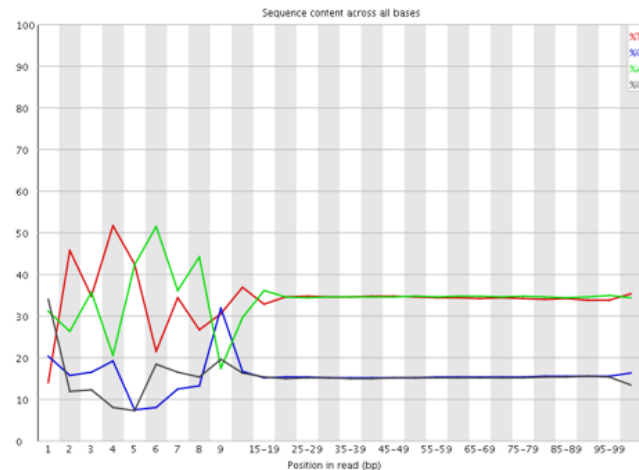
- **classic RAD:** reads between the restriction site and a random site (shearing/sonication)
- **ddRAD:** reads between the 2 restriction sites. So more flexibility on the balance coverage / depth of coverage

Common biases

Biases

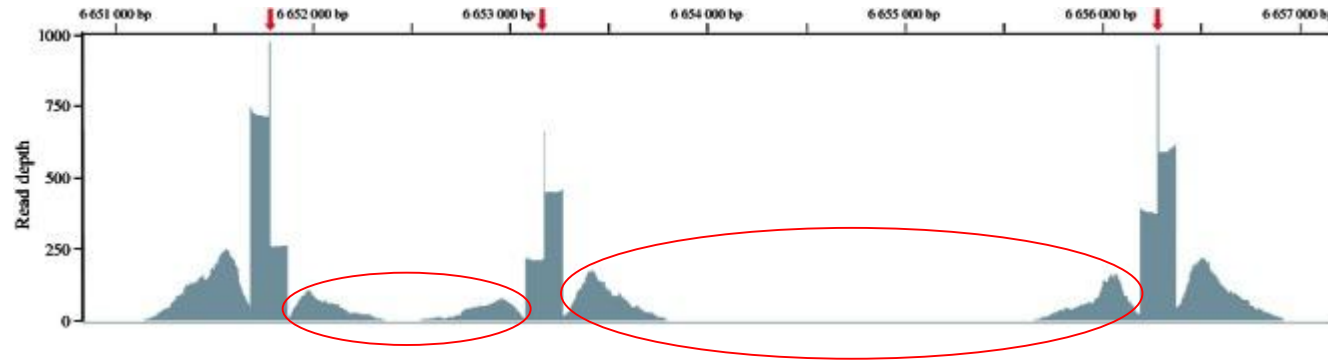
Because all reads begin with [half of] the restriction site

- Consequence:
 - The Illumina sequencer have difficulty separating colonies/clusters during the first cycles imaging step
- Solution:
 - use a set barcodes with different sizes
 - mix different experiences which use different restriction enzymes



Biases

Restriction fragment length biases read depth



source: Special features of RAD Sequencing data: implications for genotyping (2013)

Biases

Mutations within the recognition sequence of the restriction enzyme

- Consequence:
 - Allele dropout (ADO)
 - → overestimates genetic variation both within and between populations
- Solution:
 - Filter any loci that are not represented in all genotyped individuals

Advice/Information from the



- 250 ng of DNA is needed, 1 μ g is asked by the Edinburgh genomics
- High quality DNA if not from 30 to 40% of data can be useless
- PCR: 12 to 14 cycles to reduce the PCR duplicates
- Warning: QiaGen Licence / Patent

PROS / CONS

THE RAD FAMILY

BATTLE

MOLECULAR ECOLOGY

Molecular Ecology (2014) 23, 1661–1667

NEWS AND VIEWS

MEETING REVIEW

Recent novel approaches for population genomics data analysis

KIMBERLY R. ANDREWS* and
GORDON LUIKART†

**School of Biological & Biomedical Sciences, Durham University, South Road, Durham DH1 3LE, UK; †Flathead Lake Biological Station, Fish and Wildlife Genomics Group, University of Montana, Polson, MT 59860, USA*



MOLECULAR ECOLOGY

Molecular Ecology (2014) 23, 5937–5942

NEWS AND VIEWS

COMMENT

Demystifying the RAD fad

JONATHAN B. PURITZ,* MIKHAIL V. MATZ,† ROBERT J. TOONEN,‡ JESSE N. WEBER,§ DANIEL I. BOLNICK§ and CHRISTOPHER E. BIRD¶

**Marine Genomics Laboratory, Harte Research Institute, Texas A&M University-Corpus Christi, 6300 Ocean Drive, Corpus Christi, TX 78412-5869, USA; †Department of Integrative Biology, University of Texas at Austin, 205 W 24th ST C0990, Austin, TX 78712, USA; ‡Hawaii Institute of Marine Biology, School of Ocean and Earth Science and Technology, University of Hawaii 'i at Manoa, PO Box 1346, Kane'ohe, HI 96744, USA; §Department of Integrative Biology, Howard Hughes Medical Institute, University of Texas at Austin, Austin, TX 78712, USA; ¶Department of Life Sciences, Texas A&M University-Corpus Christi, 6300 Ocean Drive, Corpus Christi, TX 78412-5869, USA*

PROS | CONS



mbRAD

- Original RAD (mbRAD Miller *et al.* 2007 and Baird *et al.* 2008)
 - Genomic DNA digestion by 1 restriction enzyme (low frequency cutter)
 - Ligation of barcode containing adapters onto digested 5' ends
 - Ligated genomic DNA sonication
 - Ligation of a 3' adapter to the sonicated end
 - Pooling of the samples
 - Size-selection of the library
 - RAD fragments PCR enrichment



mbRAD - PROS

- Random shearing of the 3' end helps to identify putative PCR duplicates
 - If identical starting position of the paired-end read: duplicate
- Random shearing improves the distribution of coverage
- Random shearing + larger insert size ranges: *de novo* assembled RAD loci are of greater length
 - Critical for identifying function & Gene ontology
- Coverage and quality are fundamental!!!
 - Distinguishing true SNP from sequencing error: if coverage is low, your statistical test will not yield significant results!

mbRAD - CONS

- The most technically challenging and complex protocol!
- Requires non standard lab equipment: sonicator
- Restriction fragment length bias (due to the shearing)
 - Sequencing at different depth
- Strand bias
 - Different genotypes from forward & reverse reads
 - **Solution:** Filter any loci in this case... only possible in 2bRAD

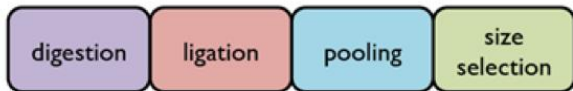
ddRAD

- Double digest RAD protocol (Peterson *et al.* 2012)
 - Genomic DNA digestion by 2 restriction enzymes (low + high frequency cutter)
 - Ligation of barcode P1 adapters (matching the first restriction site) and P2 adapters (matching second restriction site)
 - Pooling of the samples
 - Size-selection of the library
 - RAD fragments PCR enrichment + second barcode introduction to increase multiplexing potential

- Extremely similar

- Pros & cons associated

ddRAD



Tseq (Stolle & Moritz 2013)

ddRAD - PROS

- Greatest degree of customization
 - Depending on the chosen enzymes & the selected range of fragment sizes
 - Allow to have hundreds of SNPs per individual at very low cost or thousands for QTL mapping experiments at moderate cost
 - Flexibility on the balance coverage / depth of coverage
- Examine histograms of digested samples early
 - Identify / exclude excessively frequent fragments (i.e. transposons)

ddRAD - CONS

- Using fragment size selection to tune the quantity of loci can lead to variable representation of some loci
 - This can be minimized using precise selection tool (i.e. Pippin Prep)
- Particularly susceptible to ADO (Arnold *et al.* 2013)
 - To be considered when performing sensitive population genetic analyses
- Requires the highest quality genomic DNA of all RAD methods
 - Proper fragment ligation relies on completely intact 5' & 3' overhangs!
- PCR duplicates cannot be detected

ezRAD

- ezRAD protocol (Toonen *et al.* 2013)
- Genomic DNA digestion by 2 restriction enzymes (high frequency cutter on the same cut site)
- Commercially available Illumina TruSeq library preparation kit
 - DNA end reparation
 - Ligation of single or dual indexing adapters onto genomic fragments
 - Pooling of samples
 - Size selection of the library
- RAD fragments PCR enrichment, or not, depending on the Illumina kit

ezRAD - PROS

- Illumina TruSeq kit
 - Extensive manual, customer support & guarantee
 - Probably the simplest path to obtain RAD data for small lab without experience / equipment / resources to develop in-house RAD capability
- Combined with an Illumina PCR-Free TruSeq kit, ezRAD is the only RAD protocol that can bypass all potential PCR bias

ezRAD - CONS

- Illumina TruSeq kit
 - Simplicity & uniformity but expensive
 - However can be used with $\frac{1}{2}$ & $\frac{1}{3}$ reaction volumes
- All ezRAD reads start with the same four GATC bases
 - The first 4-5 nucleotides of Read 1 are used to discriminate between adjacent clusters
 - If always the same 4 first bases, difficulty to discriminate the different samples

2bRAD

- 2bRAD protocol (Wang *et al.* 2012)
 - Genomic DNA digestion by 1 restriction enzyme (36-bp fragments excision recognition site + adjacent 5' & 3' base pairs)
 - Ligation of dual barcode adapters
 - Agarose gel target band excision after PCR enrichment
 - No intermediate purification stages
 - No size-selection

2bRAD - PROS

- Extreme protocol simplicity & cost-efficiency
 - No intermediate purification stages
 - No need for special instrumentation (only PCR + standard agarose gel)
- Lack of biases due to fragment size selection
 - All endonuclease recognition sites can be sampled

2bRAD - CONS

- Difficulties to map 36 bp tags in a unambiguously way
 - But works well in no or moderately duplicated genomes (i.e. Wang *et al* 2012 on *Arabidopsis*)
- 2bRAD fragments cannot be used to build genome contigs
- 2bRAD fragments are less likely to be cross-mappable across large genetic distances, such as across different species

Conclusions

- Most important considerations when selecting a particular RAD protocol are
 - The facilities & the molecular experience of the researcher applying the approach
 - The biology of the organisms
 - The hypotheses being tested
- All RAD protocols are powerful tools for SNP discovery & genotyping of nonmodel species
- It is important to learn about pitfalls inherent to each method & how to address them

SOFTWARES

Main Bioinformatics pipelines

- STACKS

- Website: <http://catchenlab.life.illinois.edu/stacks/>
- mbRAD, ddRAD, ezRAD & 2bRAD?
- ~~• STACKS does not handle INDELS, so any loci near an INDEL is lost~~
- STACKS does not call SNPs from paired end reads natively, and does especially poorly with paired end fragments that are not of a random length (e.g., ddRAD and ezRAD)

- dDocent

- Website: <https://ddocent.wordpress.com/ddocent-pipeline-user-guide/>
- ddRAD & ezRAD

- PyRAD

- Website: <http://dereneaton.com/software/pyrad/>
- mbRAD, ddRAD, PE-ddRAD, GBS, PE-GBS, EzRAD, PE-EzRAD, 2B-RAD
- use of an alignment-clustering method (*vsearch*)

- 2bRAD (Wang *et al* 2012)

- *de novo*: https://github.com/z0on/2bRAD_denovo
- With reference genome: https://github.com/z0on/2bRAD_GATK



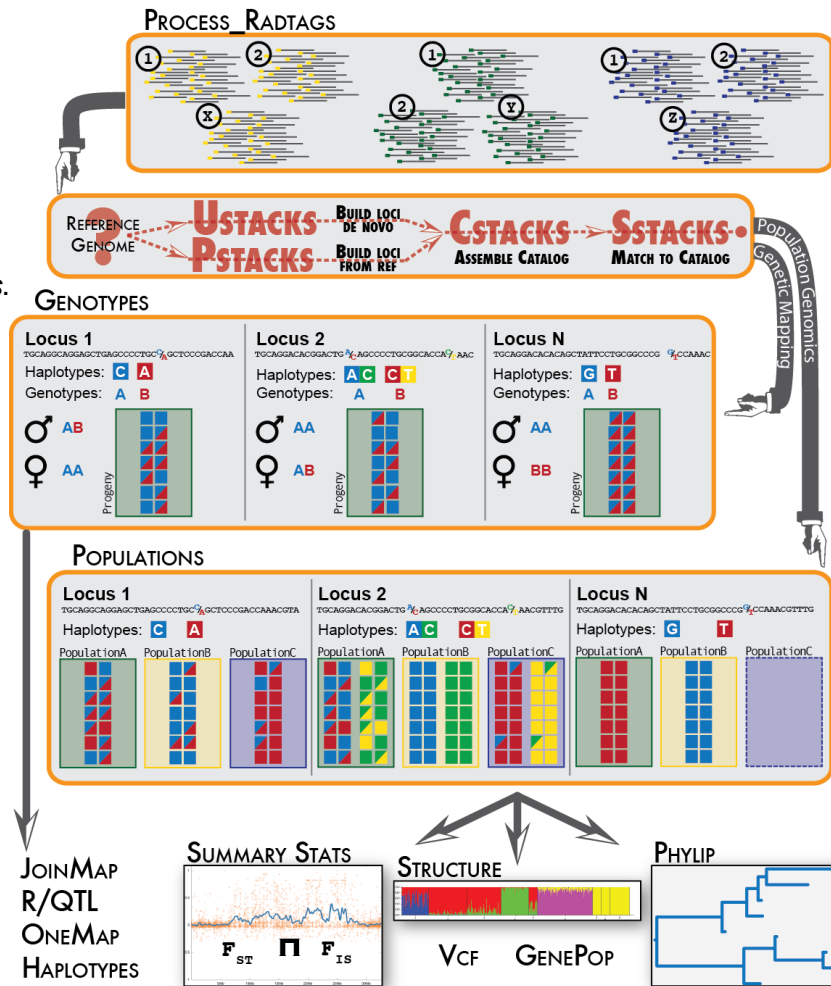
Stacks

SOFTWARES

Stacks

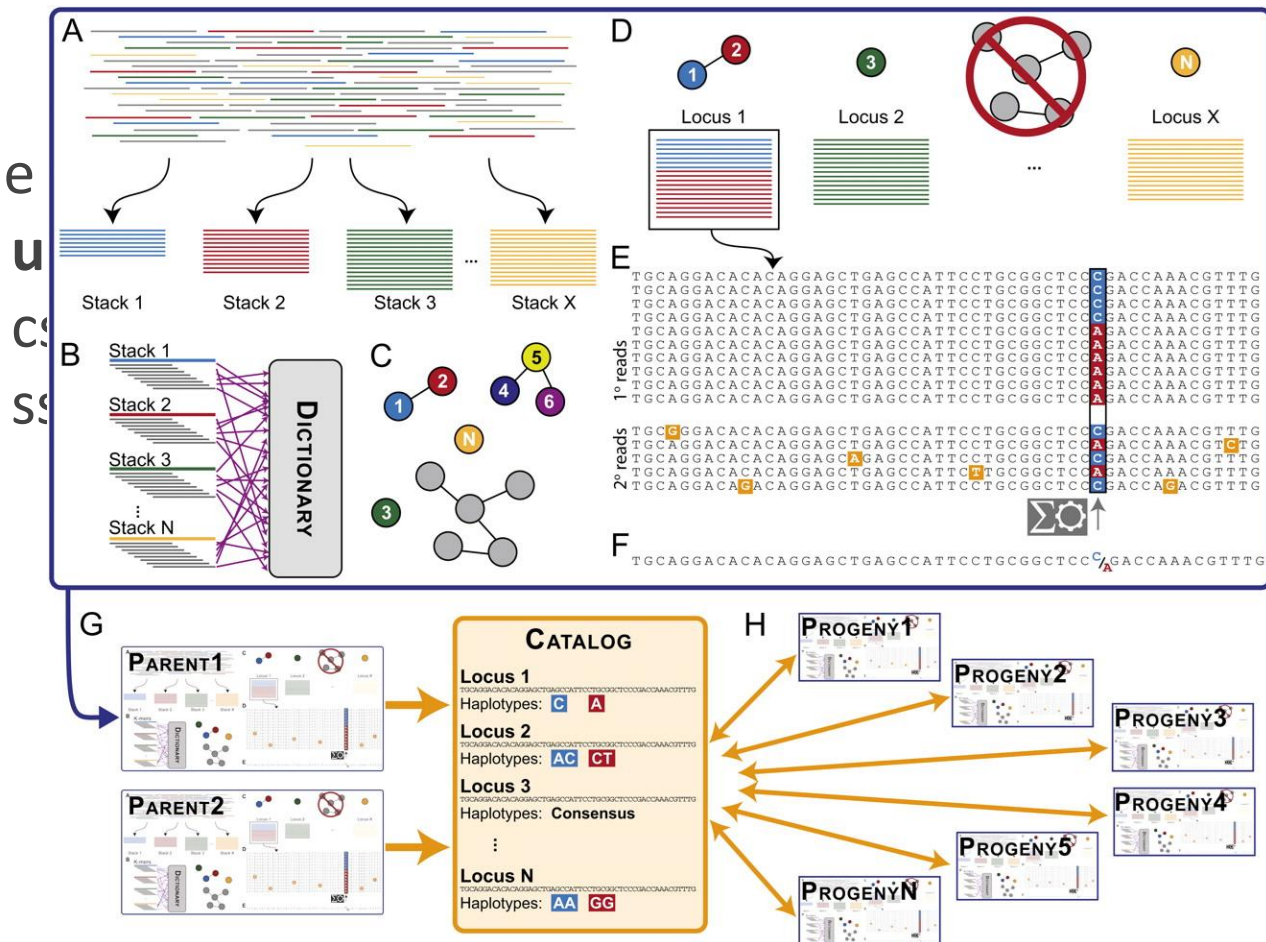
<http://catchenlab.life.illinois.edu/stacks>

J. Catchen, A. Amores, P. Hohenlohe, W. Cresko, and J. Postlethwait.
Stacks: building and genotyping loci de novo from short-read sequences.
G3: Genes, Genomes, Genetics, 1:171-182, 2011.



Stacks

denovo_map pipeline

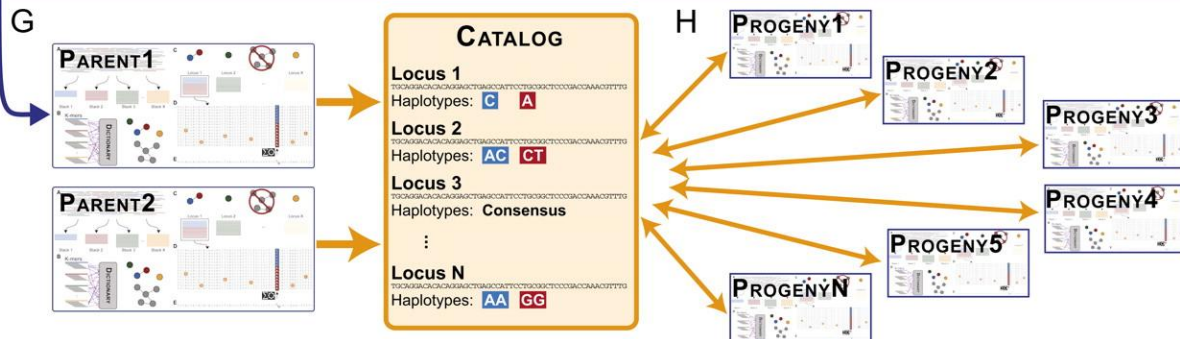
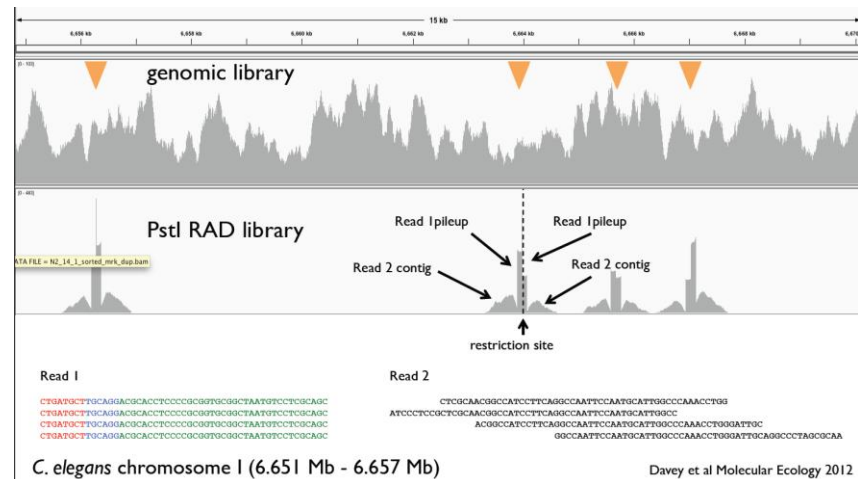


Stacks

ref_map pipeline

p
c
s

.bam
.bam
.bam





Stacks

SOFTWARES



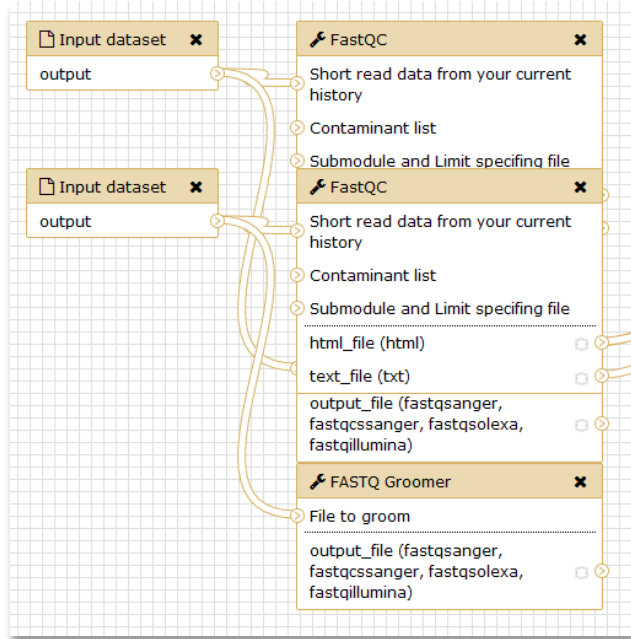
Galaxy
PROJECT

Today: hands on

- SNP detection
 - On 2 parents of a family
- Genetic map
 - On a family with 93 offsprings
- Mini-contig assembly
 - Paired end data
- Population genomics
 - Without reference genome
 - With reference genome

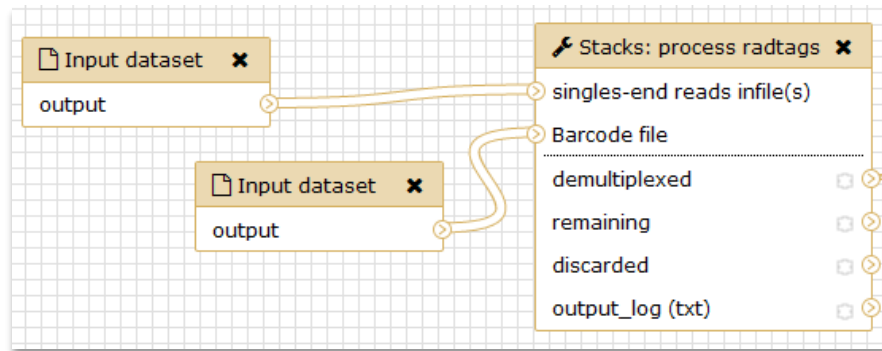
Today: hands on

- SNP detection
 - On 2 parents of a family
- Genetic map
 - On a family with 93 offsprings
- **Mini-contig assembly**
 - **Paired end data**
- Population genomics
 - Without reference genome
 - With reference genome



Today: hands on

- SNP detection
 - On 2 parents of a family
- Genetic map
 - On a family with 93 offsprings
- Mini-contig assembly
 - Paired end data
- **Population genomics**
 - **Without reference genome**
 - With reference genome



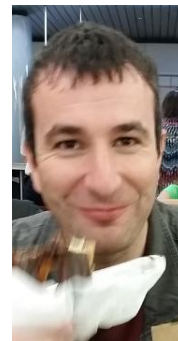
Goals

- Learning to analyse NGS data from Reduce-Representation Libraries (RRL)
- Learning to use
 - Galaxy
 - The STACKS pipeline
- Learning
 - Raw Illumina RAD preparation
 - Use a reference genome
 - Assembly of RAD loci
 - Detection of SNPs, genotypes and haplotypes determination
 - Population genetics statistics

Datasets and tools

- Datasets used during Julian Catchen training sessions
- Stickleback dataset from *Hohenlohe et al. 2010*
- Data cleaning and analyses with Galaxy, the Stacks pipeline and BWA.
- All data produced with Illumina GAll or HiSeq2000.
- Open Source software

Merci de votre attention



RADseqGCC2016 page

<http://tinyurl.com/radseqgcc2016>

AWS Galaxy server

<http://54.197.189.163/>

GenOuest Galaxy instance

galaxy.genouest.org