# Genotyping By Sequencing (GBS) Method Overview

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#### **Topics Presented**

- Background/Goals
- •GBS lab protocol
- Illumina sequencing review
- •GBS adapter system
- •How GBS differs from RAD
- •Modifying GBS for different species
- GBS Workflow

## Background

Genotyping by sequencing (GBS) in any large genome species requires reduction of genome complexity.

#### I. Target enrichment

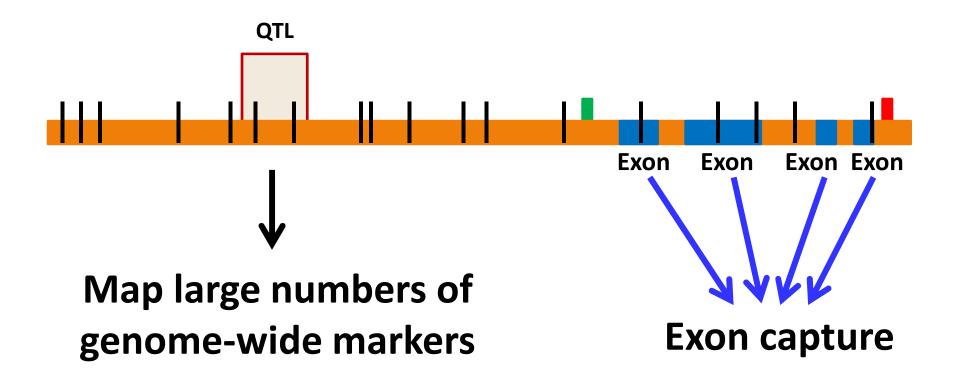
- •Long range PCR of specific genes or genomic subsets
- Molecular inversion probes
- •Sequence capture approaches hybridization-based (microarrays)

#### II. Restriction Enzymes (REs)

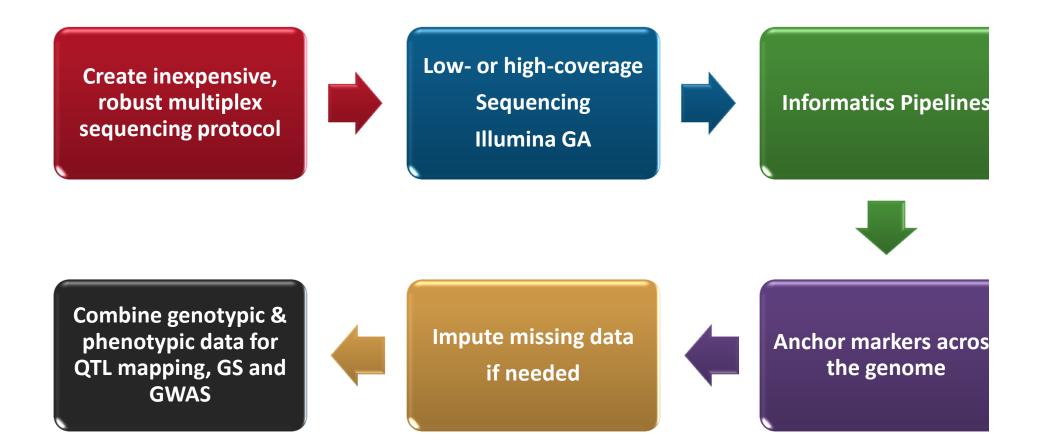
#### \*Technically less challenging\*

 Methylation sensitive REs filter out repetitive genomic fraction

# QTL are often located in non-coding regions *Vgt1, Tb, B* regulatory regions 60-150kb from gene



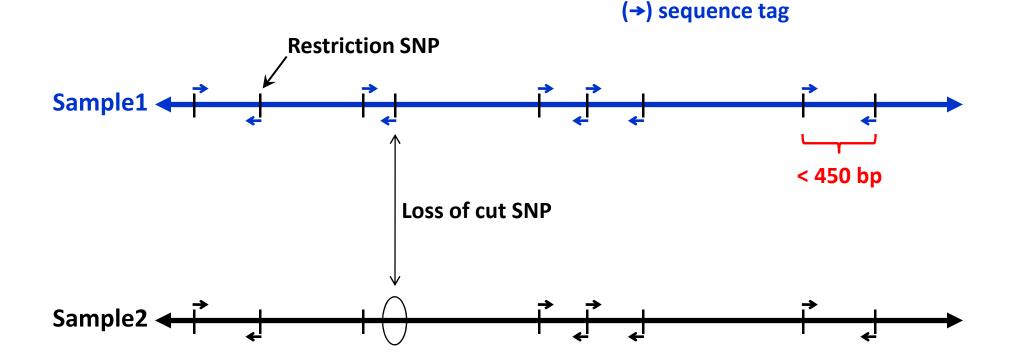
# We have created a public genotyping/informatics platform based on next-generation sequencing



# **Open Source**

- Method available for anyone to use / modify.
- Analysis pipeline details and code are public.
- Promote dataset compatibility.
- Method published in *PLoS ONE* to promote accessibility.
- Genotype calls available for public projects.

## **Overview of Genotyping by Sequencing (GBS)**



- Focuses NextGen sequencing power to ends of restriction fragments
- Both SNPs and presence/absence markers can be scored
- Small indels are identified but are not scored

# GBS is a simple, highly multiplexed system for constructing libraries for next-gen sequencing

- Reduced sample handling
- Few PCR & purification steps
- No DNA size fractionation
- Efficient barcoding system
- Simultaneous marker discovery & genotyping
- Scales very well

GBS 96- or 384-plex Protocol

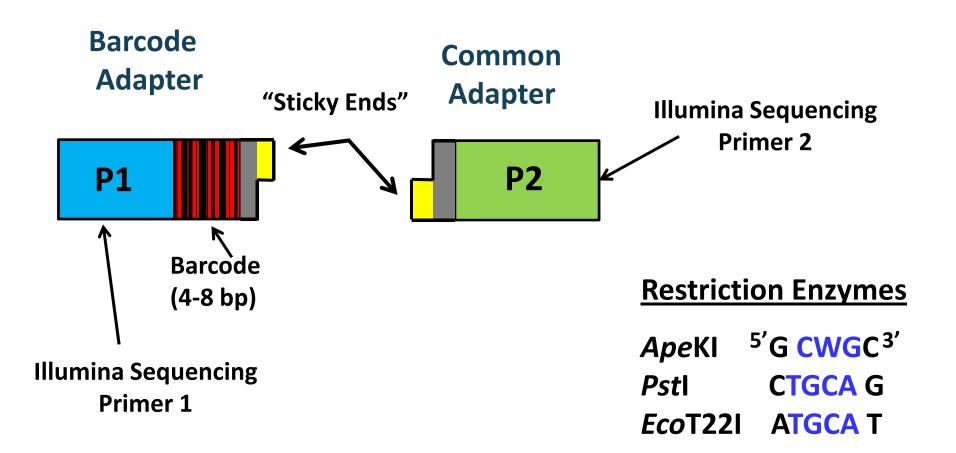
(http://www.maizegenetics.net/gbs-overview)

1. Plate DNA & adapter pair



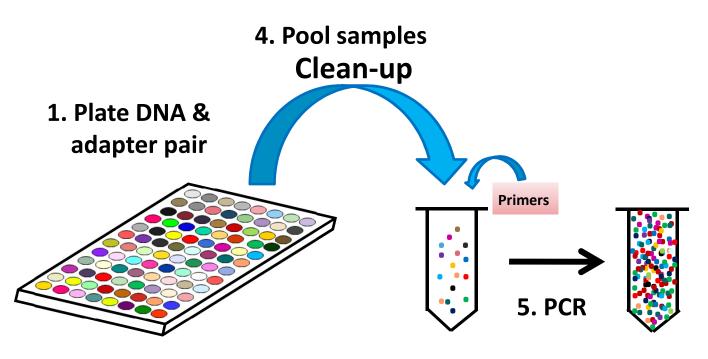
- 2. Digest DNA with RE
- 3. Ligate adapters

#### **GBS Adapters and Enzymes**

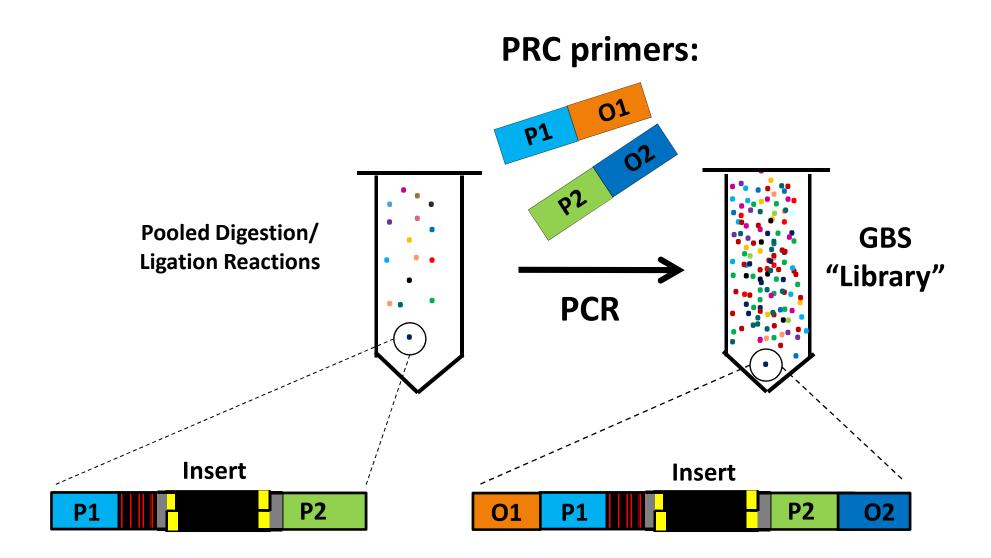


#### **GBS 96- or 384-plex Protocol**

(http://www.maizegenetics.net/gbs-overview)

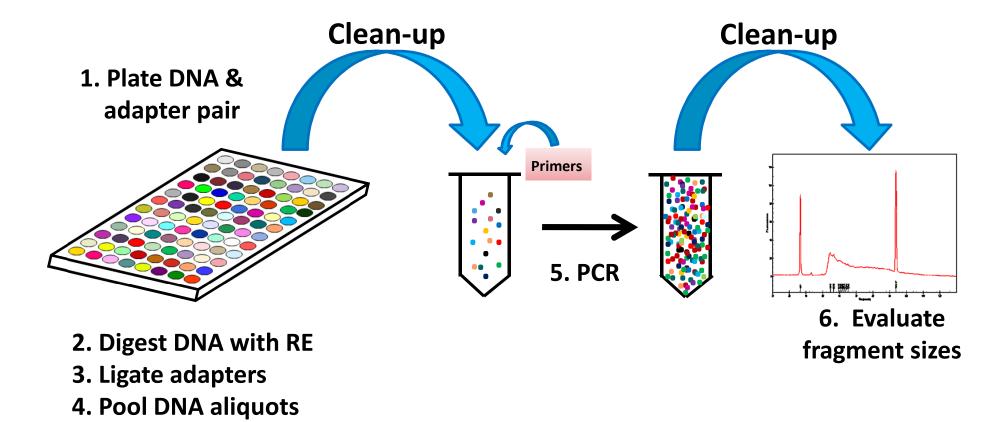


- 2. Digest DNA with RE
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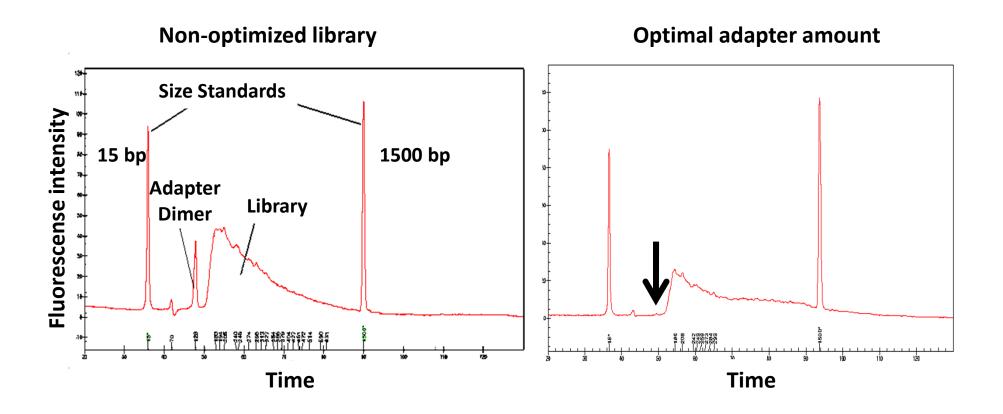
#### GBS 96- or 384-plex Protocol

#### (http://www.maizegenetics.net/gbs-overview)



## Perform Titration to Minimize Adapter Dimers Before Sequencing

NOTE: Done once with a small number of samples. Adapter dimers constitute only 0.05% of raw sequence reads



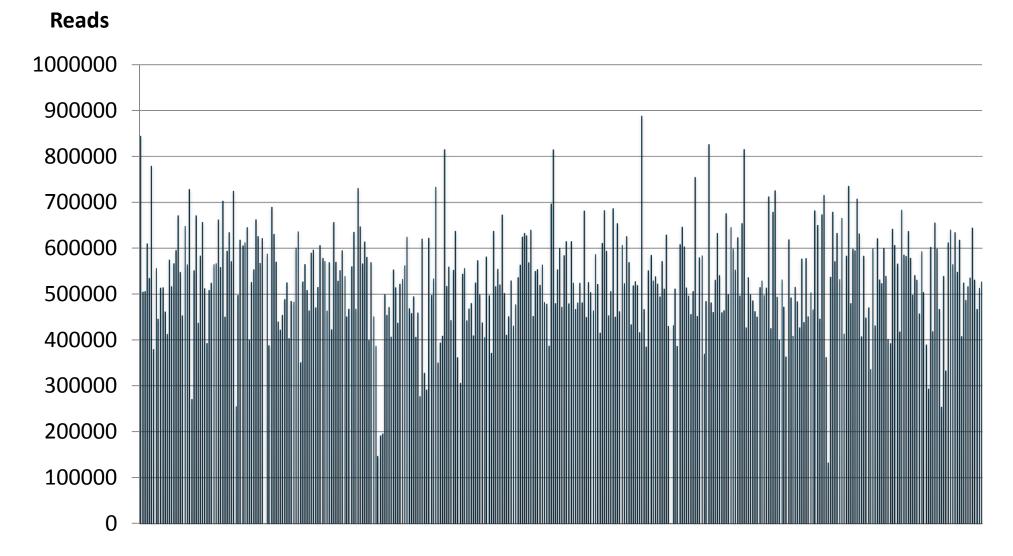
#### 40% 35% B73 RefGen v1 30% IBM (B73 X Mo17) RILs **Total Fragments** 25% 20% 15% 10% 5% 0% 100 150 200 250 300 400 450 5500 550 600 650 700 750 800 50 350 006 950 1000 850 >10000

**Small Fragments are Enriched in GBS Libraries** 

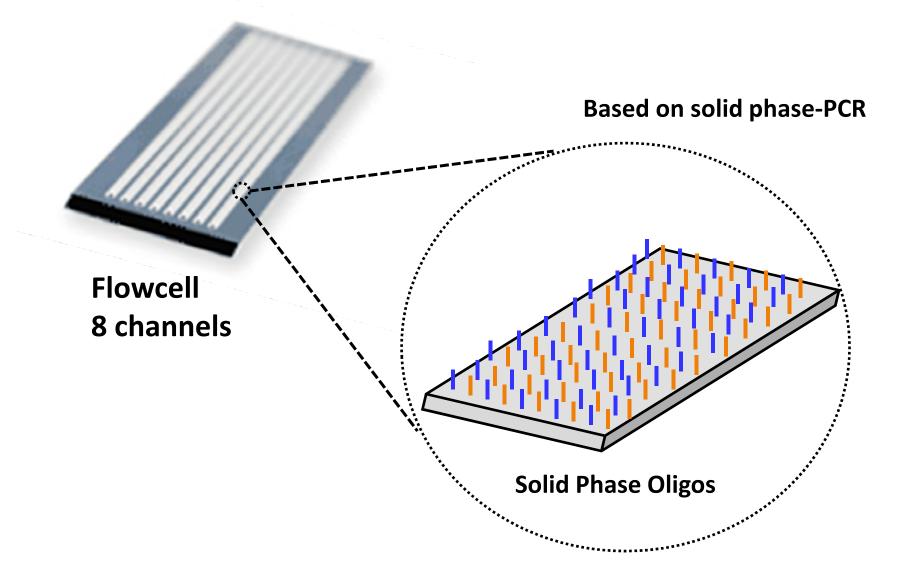
ApeKI fragment size (bp)

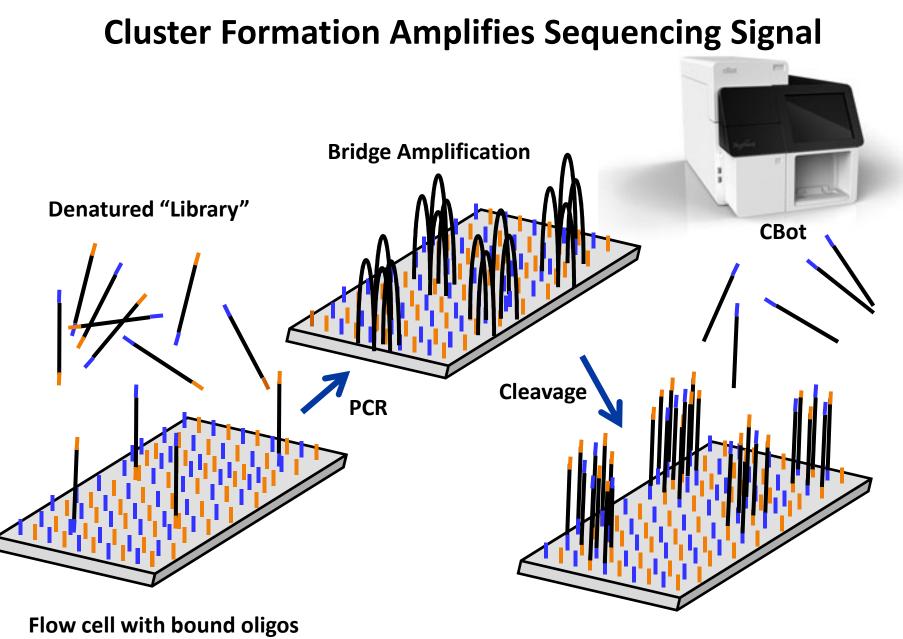
#### **384-plex GBS Results for Maize**

Mean read count per line = 528,000 c.v. = 0.22



#### Illumina Sequencing by Synthesis Review

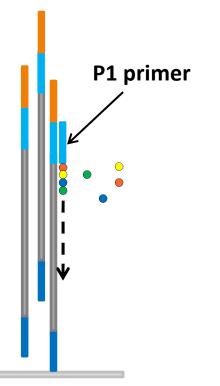




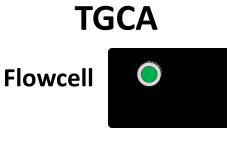
Linearization



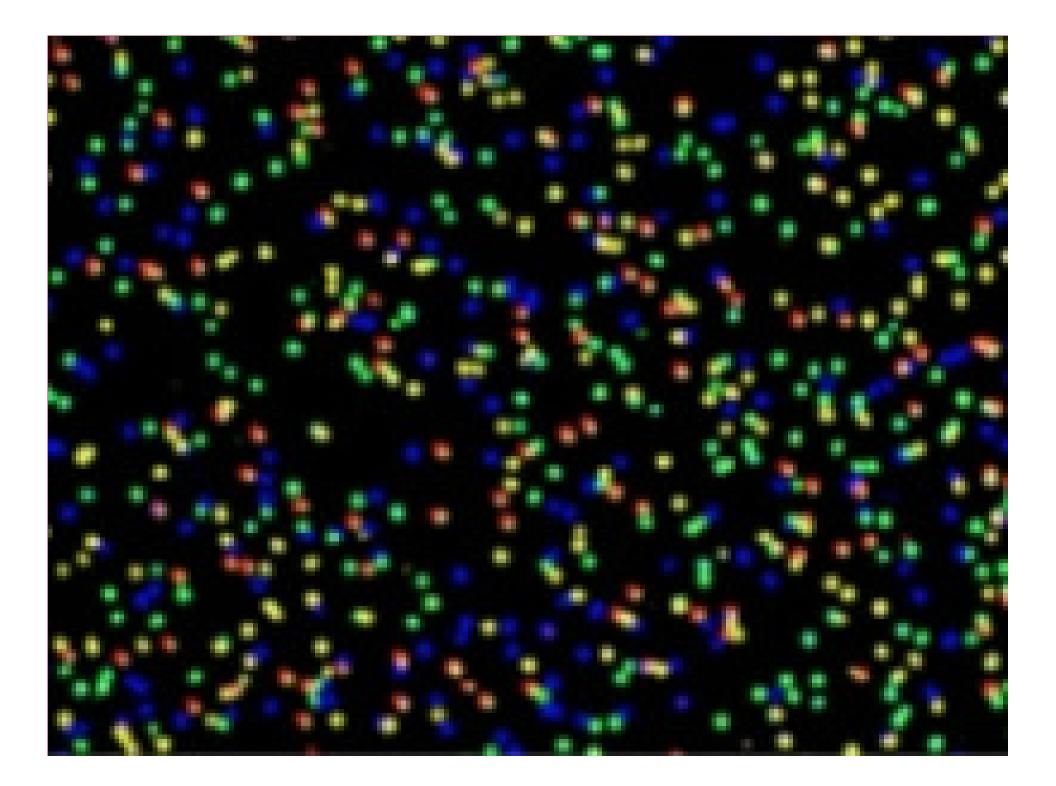
HiSeq 2000

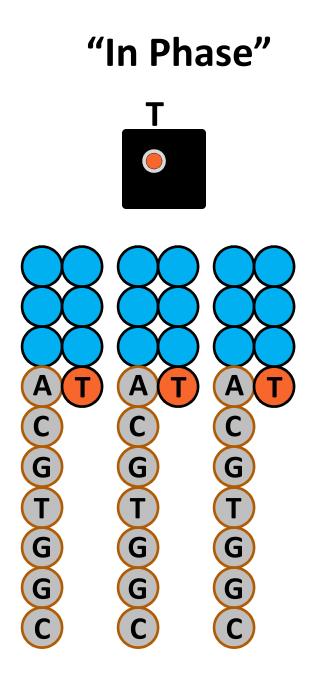


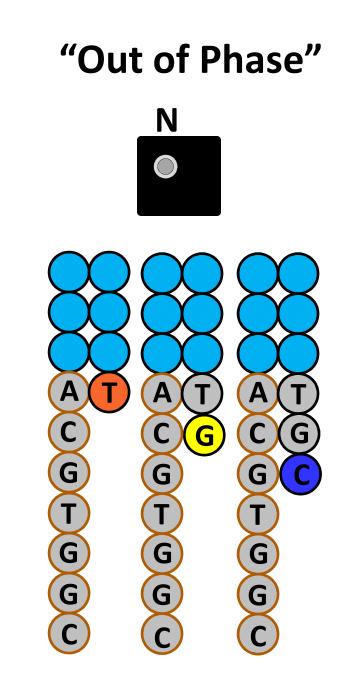
## **Sequencing by Synthesis**



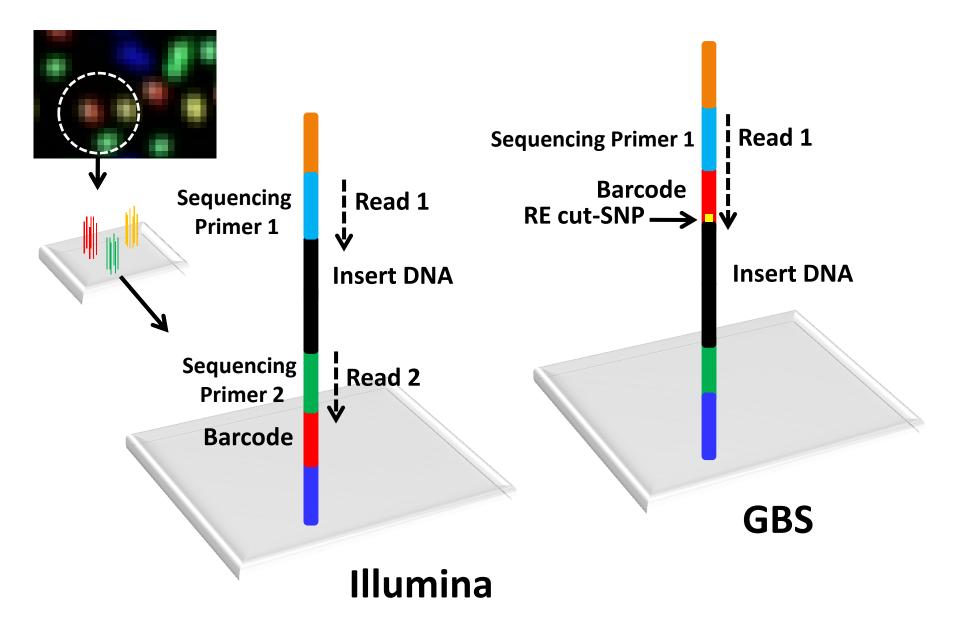








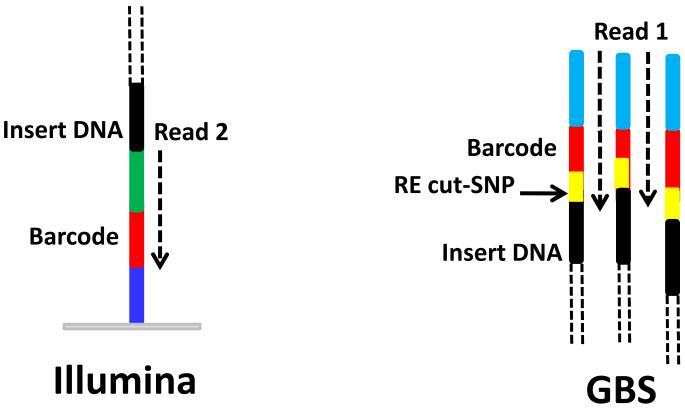
#### GBS captures barcode and insert DNA sequence in single read

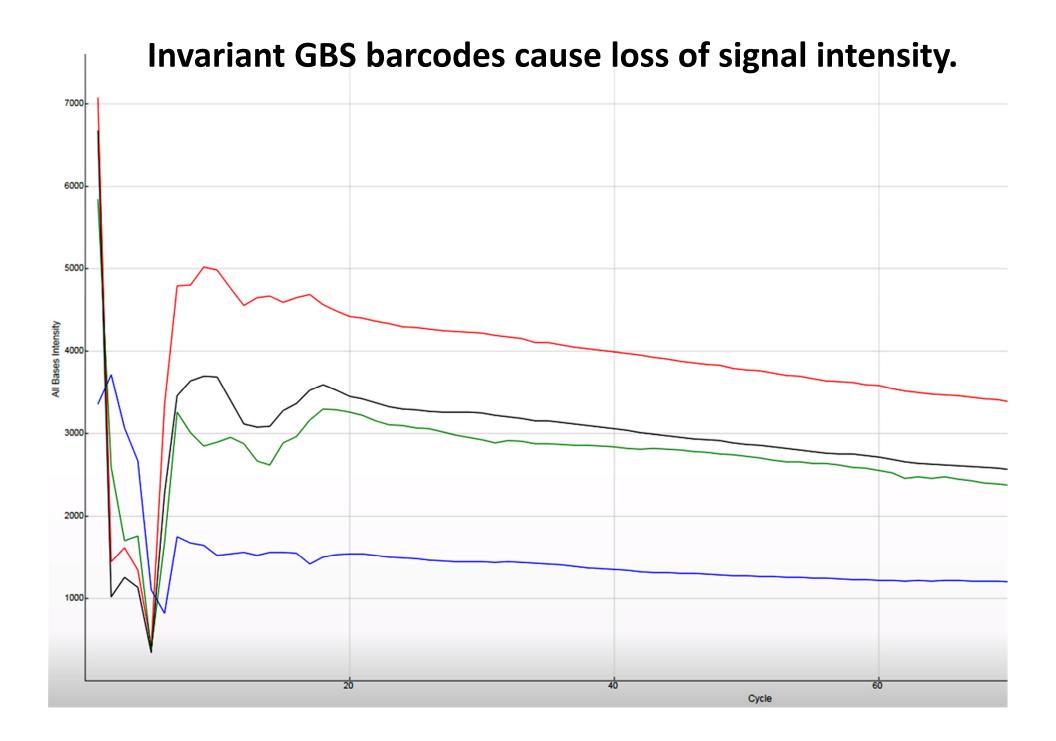


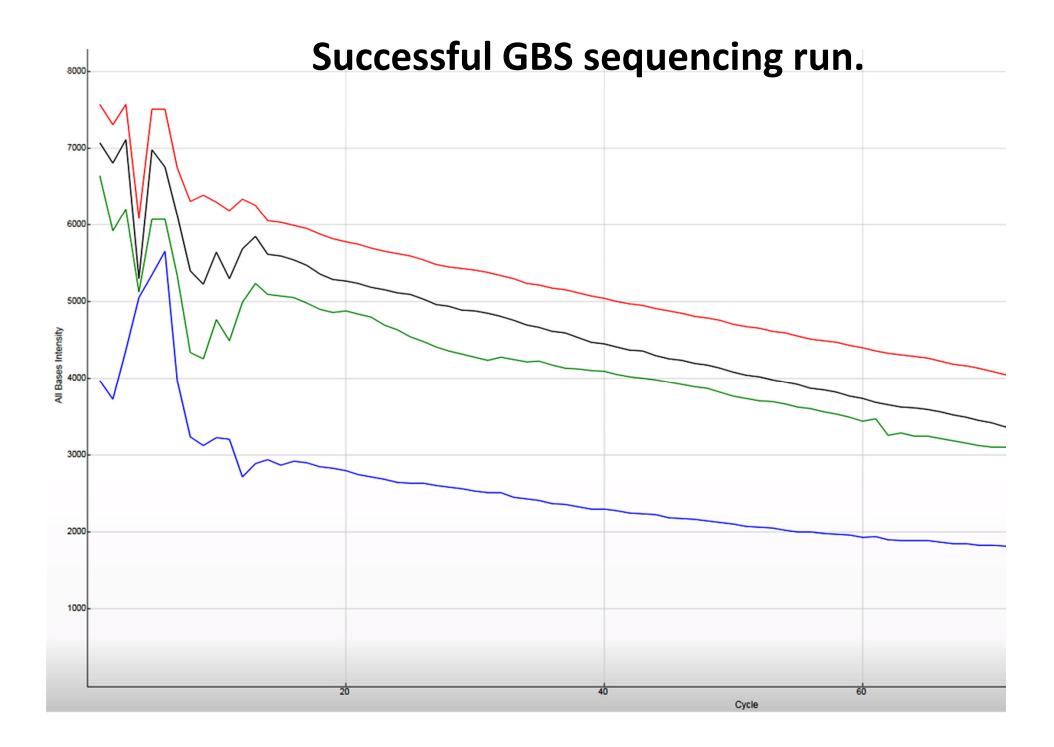
## Variable Length GBS Barcodes Solves Sequence Phasing Issues

First 12 nt used to calculate phasing.
Algorithm assumes random nt distribution.
Incorrect phasing causes incorrect base calls.

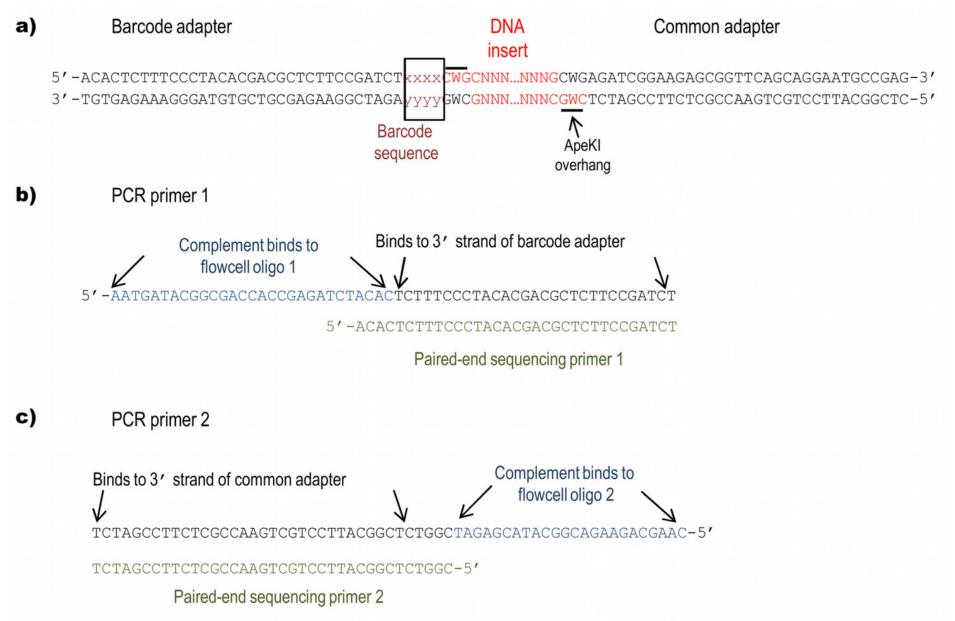
•Good design and modulating the RE cut SNP position with variable length barcodes produces even nt distribution.







# **GBS Adapter Design**



### **Barcode Design Considerations**

- Barcode sets are enzyme specific
  - Must not recreate the enzyme recognition SNP
  - Must have complementary overhangs
- Sets must be of variable length
- Bases must be well balanced at each position
- Must different enough from each other to avoid confusion if there is a sequencing error.
  - At least 3 bp differences among barcodes.
- Must not nest within other barcodes
- No mononucleotide runs of 3 or more bases

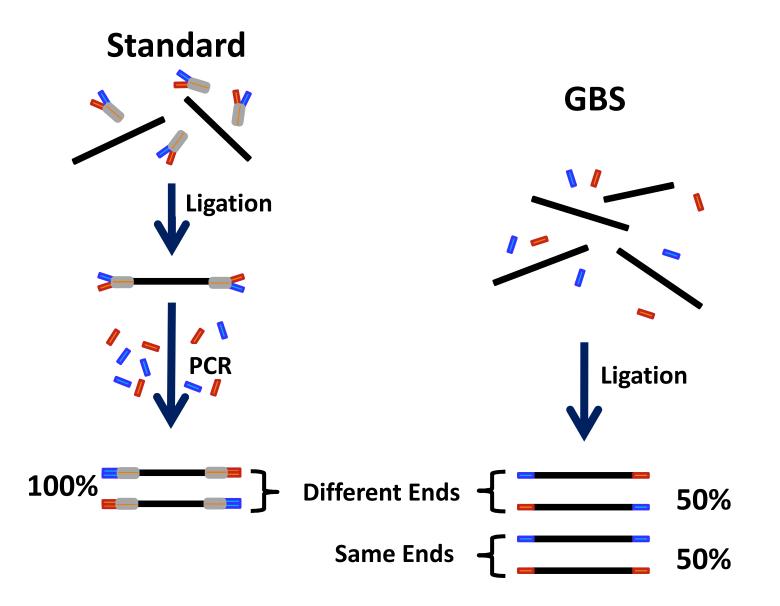
http://www.deenabio.com

# Most significant GBS technical issues?

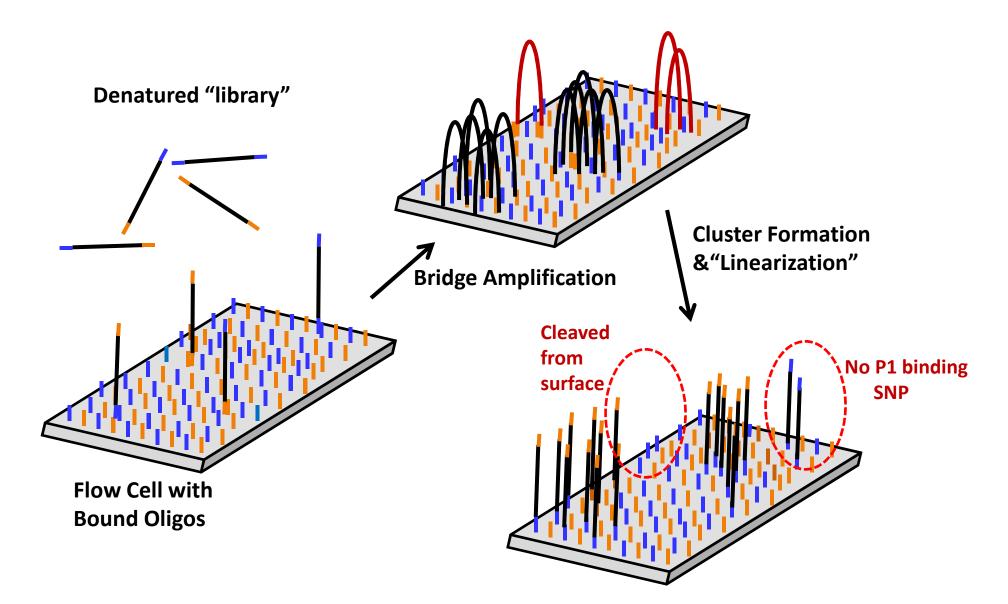
# • DNA quality

• DNA quantification

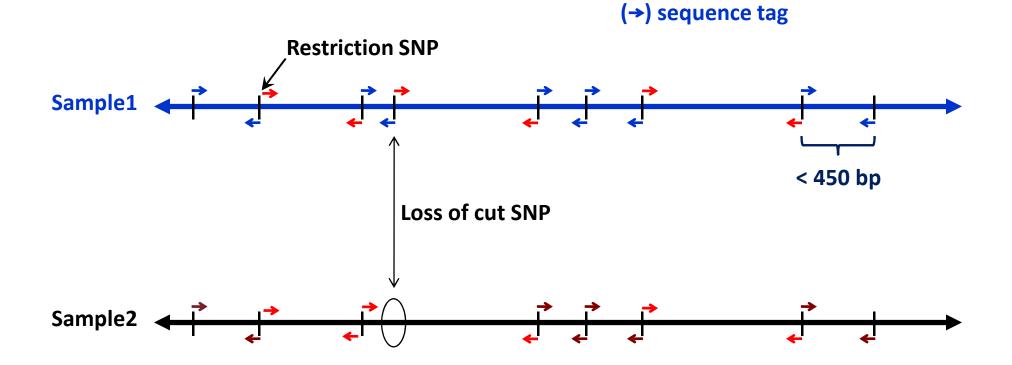
#### **GBS** does not use standard "Y" adapters



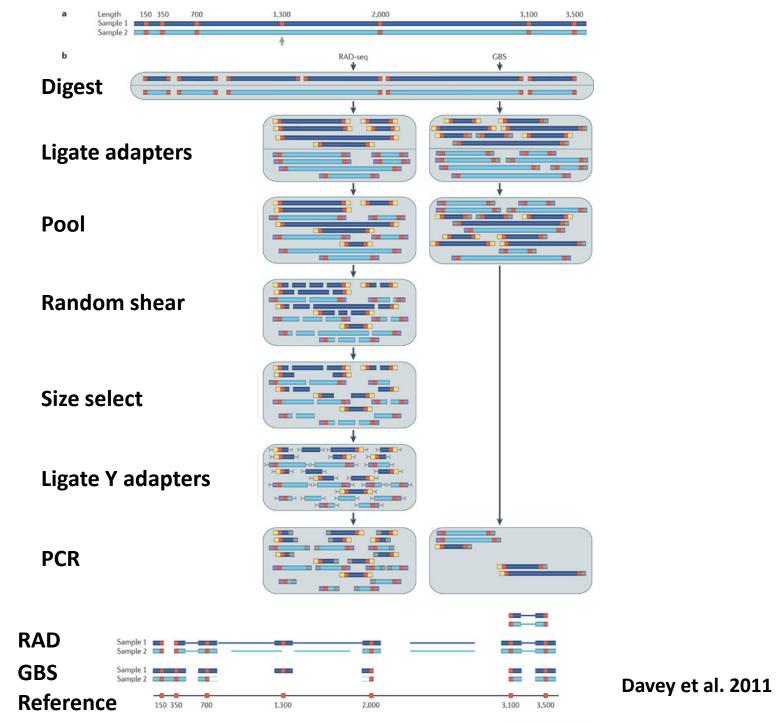
#### Same-ended Fragments Do Not Form Clusters



#### **GBS vs. RAD**



- Focuses NextGen sequencing power to ends of restriction fragments
- Scores both SNPs and presence/absence markers



Nature Reviews | Genetics

# **Modifying GBS**

Considerations for using GBS with new species and / or different enzymes.

#### Why Modify the GBS Protocol?

- More markers
- Fewer markers (deeper sequence coverage per locus)
- Increase multiplexing
- More genome appropriate (avoid more repetitive DNA classes)
- Other novel applications (i.e., bisulfite sequencing)

### **Genome Sampling Strategies Vary by Species**

**Dependent on Factors that Affect Diversity:** 

•Mating System influences heterozygosity (Outcrosser, inbreeder, clonal?)

•Ploidy (Haploid, diploid, auto- or allopolyploid?)

•Geographical Distribution (Island population, cosmopolitan?)

# **Other Factors**

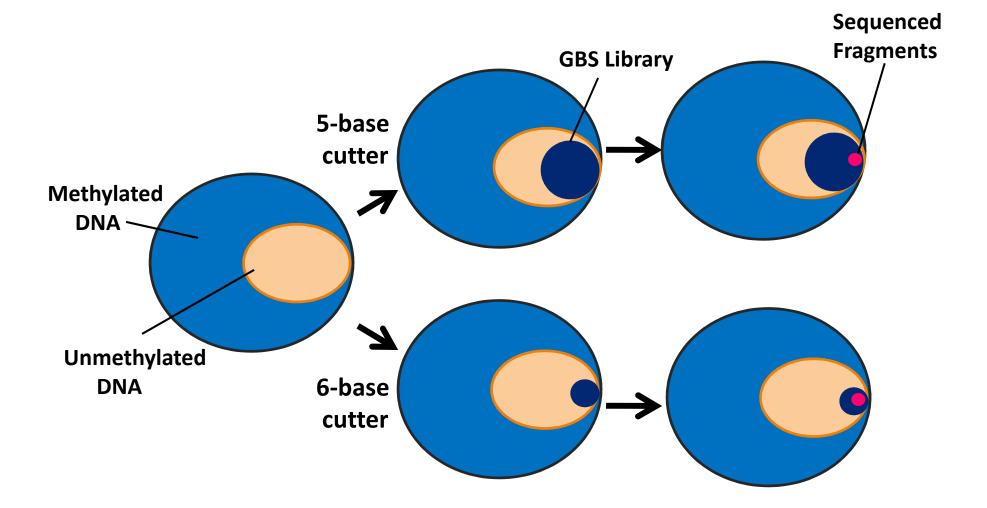
#### Genome size

- The size of the genome has some bearing on the number of fragments in the sequencing pool.
- Amount of repetitive DNA directly correlated with genome size.

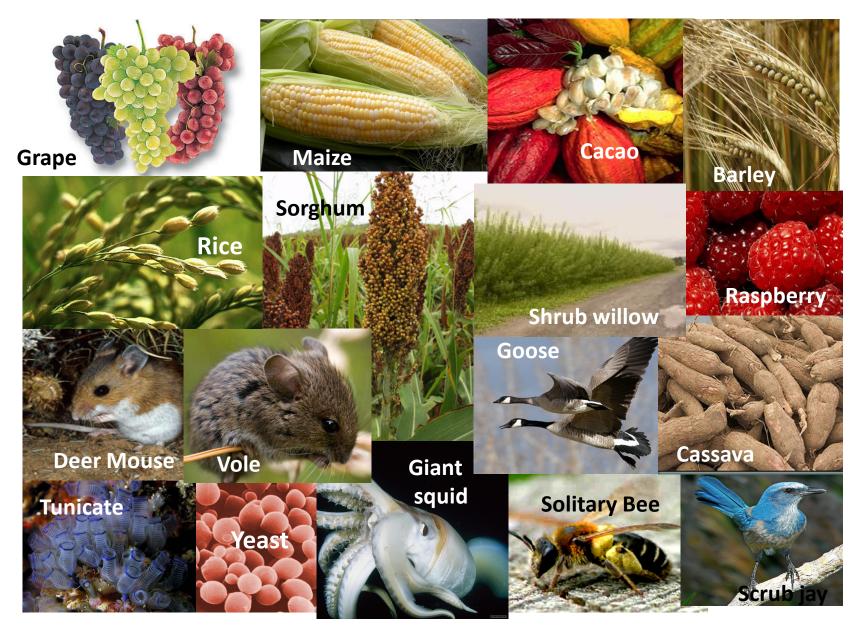
#### Genome composition

- The base composition of the genome can affect the frequency and distribution of the cut SNP s.
- How repetitive DNA is organized in the genome affects library profiles.

## Sampling large genomes with methylationsensitive restriction enzymes.



#### **Optimizing GBS in New Species**





Pine Spruce



Maize Sorghum Rice Barley Switchgrass Bracypodium **Pearl Millet Teosinte** Lily Andropogon Fonio **Finger Millet** 



Strawberry Ragweed Silene Sunflower Safflower Soybean Goldenberry Jatropha



Cassava Pepper Cucumber Watermelon Squash Pea Gourd Arabidopsis Willow Tea Potato Cherry Flax

#### **Flowering Plants**

Cacao

Apple

Нор



Killifish

Neurospora Verticillium

**Solitary Bee** Mexican Tetra Corn Ear Worm Plant Bug

**Deer Mouse** Scrub Jay Vole Goose Chickadee



**Killer Whale** 



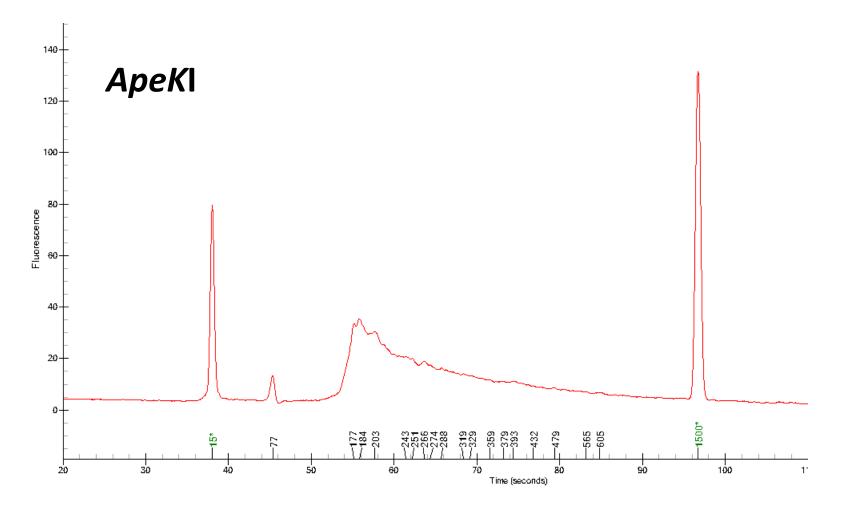
Fox

### Choosing Appropriate Restriction Enzymes: Generalizations from the Bench



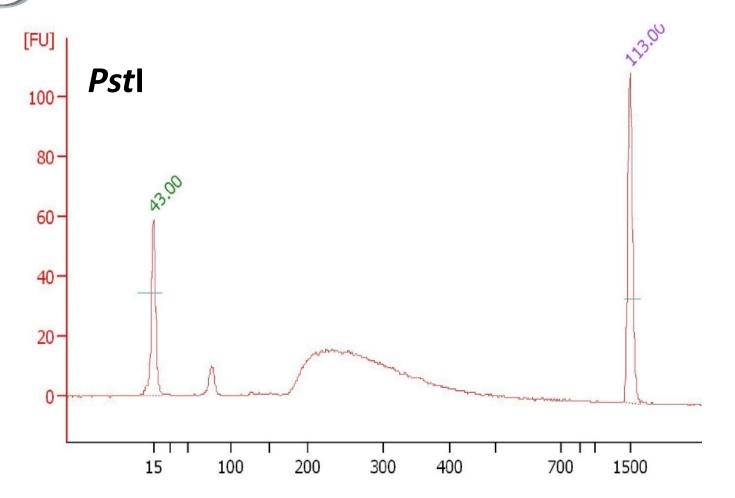
# ApeKI works well for grasses.

Maize, sorghum, teosinte, rice, barley, millet, switchgrass, brachypodium.



## PstI works well for most mammals.

Deer mouse, vole, cow, pig.



#### Most frequently asked question for new species:

## How many SNPs will I get?

## Answer: It depends.....

- Genome size and expected heterozygosity affects size of fragment pool for desired amount of sequence coverage (enzyme choice and multiplex level).
- Amount of extant diversity and how well your sample reflects that diversity.
- Reference genome sequence? 3-4X more SNPs attained by aligning to a reference sequence.

#### How many SNPs will I get?

Species	Genome Size (Mb)	Enzyme	Sample Size	No. SNPs
Maize	2,600	ApeKI	33,000	1,200K
Grape	500	ApeKI	1000	200K
Cow	3,000	Pstl	48	64K
Rice	400	ApeKI	850	60K
Pine*	16,000	ApeKI	12	63K
Vole*	3,400	Pstl	283	53K
Willow*	460	ApeKI	459	23K
Fox*	2,400	EcoT22I	48	16K
<i>Verticilliflorum</i> (fungus isolates)	40	ApeKI	2	10K

\*No reference genome. UNEAK analysis pipeline used for analysis. To avoid homology/paralogy issues this pipeline calls SNPs very conservatively.

#### SNP calls in *Sorghum bicolor*- Lots of Missing Data

	alleles	Taxa1	Taxa2	Таха3	Taxa4	Taxa5	Тахаб	Taxa7	Taxa8	Таха9	Taxa10	Taxa11	Taxa12	Taxa13	Taxa14	Taxa15	Taxa16	Taxa17	Taxa18	Taxa19
SNP 1	C/A	Α	Ν	Α	С	Α	Ν	Ν	С	с	N	N	N	N	N	N	N	N	c	N
SNP 2	A/C	С	Ν	С	Α	С	Ν	Ν	Α	Α	Ν	Ν	Ν	Ν	Ν	Ν	Ν	Ν	Α	N
SNP 3	T/C	С	Ν	С	т	С	Ν	Ν	т	т	Ν	Ν	Ν	Ν	Ν	Ν	Ν	Ν	т	N
SNP 4	C/G	Ν	Ν	С	Ν	G	Ν	Ν	Ν	Ν	Ν	Ν	Ν	Ν	Ν	С	Ν	Ν	Ν	N
SNP 5	T/C	Т	Т	Ν	Ν	т	Ν	Т	Ν	Ν	Ν	Ν	С	Ν	Ν	Ν	Ν	Ν	Ν	N
SNP 6	C/T	С	С	Ν	Ν	С	Ν	С	Ν	Ν	Ν	Ν	т	Ν	Ν	Ν	Ν	Ν	Ν	Ν
SNP 7	G/A	G	Α	G	Α	G	Ν	G	G	Ν	Ν	G	G	G	R	Ν	Α	Ν	R	G
SNP 8	G/A	G	Ν	Ν	Α	G	Α	G	Ν	N	G	G	G	Ν	Ν	Α	Ν	G	G	G
SNP 9	T/C	т	С	т	С	т	С	Т	Ν	N	т	Т	Ν	Ν	Ν	С	Ν	Ν	т	т
<b>SNP 10</b>	T/C	т	С	Ν	Ν	Ν	Ν	Ν	Т	т	Ν	Ν	Ν	Ν	Ν	Ν	Ν	Ν	Ν	N
<b>SNP 11</b>	G/A	G	Ν	Ν	Α	G	Ν	Ν	Ν	Ν	Ν	Ν	Ν	G	Α	Α	Ν	G	G	N
SNP 12	G/A	G	Α	Ν	Α	G	Α	Ν	Ν	Ν	G	Ν	G	Ν	Ν	Ν	Ν	G	G	N
SNP 13	G/A	G	Α	Ν	Α	Ν	Ν	Ν	G	N	N	G	Ν	Ν	Ν	Ν	Ν	G	Ν	G
SNP 14	T/G	G	т	N	т	G	Ν	G	Ν	N	G	G	N	G	т	т	т	Ν	G	N
SNP 15	C/T	т	С	Ν	С	т	Ν	Т	Ν	N	т	т	Ν	т	С	С	С	Ν	т	N
SNP 16	G/A	G	Α	G	Ν	G	Α	G	G	G	N	G	N	G	Α	Α	N	G	G	G
SNP 17	C/G	N	G	С	S	С	G	С	С	С	N	С	С	N	С	G	G	Ν	С	N
SNP 18	G/A	N	Α	G	A	G	Α	G	G	N	N	G	G	G	N	Α	Α	G	G	N
SNP 19	C/T	C	N	N	Т	N	N	N	N	C	N	C	N	N	N	N	N	N	C	C _
SNP 20	T/G	T	N	T	N	T	G	Т	N	T	T -	T -	T	T	N	N	G	T	N	T
SNP 21	T/G	Т	G	Т	G	Т	G	N	Т	T	т	T	Т	Т	N	G	G	Т	Т	Т
SNP 22	G/A	N	A	N	A	N	N	G	G	G	N	G	N	N	N	A	N	N	N	N
SNP 23	G/T	G	T T	G	T T	G	N	N	G	G	G	N	N	N	N	N	T T	G	G	G
SNP 24 SNP 25	С/Т Т/С	C T	Т	С Т	Т	C T	N C	N	C	С Т	C T	N	N	N T	N	N	T	C T	C	C
SNP 25 SNP 26	C/A	T N	C N	N	C N	A	N	N A	N N	N	N	N N	N N	N	N N	N N	N N	N	N N	N N
SNP 20	G/A	N	N	N	N	A	N	A	N	N	N	N	N	N	N	N	N	N	N	N
SNP 28	C/T	N	N	C	N	N	N	N	C	Т	C	N	N	C	т	N	N	C	N	C
SNP 29	T/C	Т	N	т	N	N	N	N	N	N	N	N	N	N	N	N	N	N	т	т
SNP 30	G/T	G	N	G	N	N	N	N	G	G	G	N	N	N	N	N	N	N	N	N
SNP 31	A/T	A	т	N	N	A	N	N	Ā	A	A	N	A	A	N	т	т	A	A	A
SNP 32	A/T	A	Ť	A	т	N	N	N	A	N	A	N	A	N	N	т	Ť	A	N	A
SNP 33	C/T	N	N	C	N	C	N	С	C	C	N	N	N	С	т	N	N	C	N	C
SNP 34	С/Т	C	т	c	Т	c	N	N	c	N	C	C	N	c	T	т	N	c	C	N
SNP 35	A/C	A	Ċ	A	N	A	N	Α	A	Α	A	A	Α	A	Ċ	c	N	A	A	Α
SNP 36	T/C	Т	C	т	С	т	С	N	Т	Т	Т	Т	N	Т	N	c	N	Т	Т	Т
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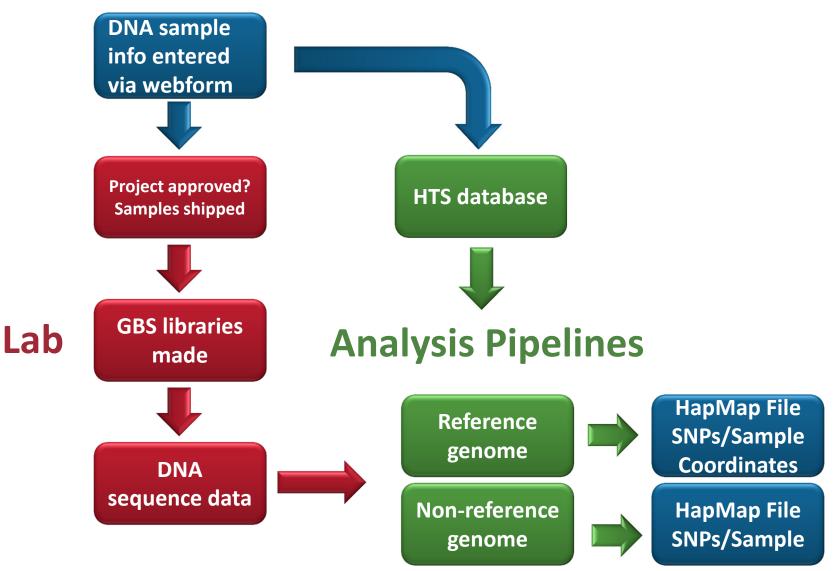
#### Filtering SNPs to remove most of the missing data.

Will be covered later in discussion of TASSEL (http://www.maizegenetics.net/)

## **Missing Data Strategies**

- Impute Missing SNPs.
  - Many algorithms for doing this.
- Technical Options
  - Reduce the multiplexing level
  - Sequence the same library multiple times
- Molecular Options
  - Choose less frequently cutting enzymes

## **GBS workflow at IGD**



http://www.igd.cornell.edu/index.cfm/page/projects/GBS.htm

## **GBS** Team

Method Development Rob Elshire Ed Buckler Sharon Mitchell

> Bioinformatics Jeff Glaubitz Qi Sun Katie Hyma Fei Lu

Laboratory/Production Charlotte Acharya Wenyan Zhu Lisa Blanchard Shane Cieri

#### Workshop Coordinator Theresa Fulton