Analysing Genomic Data with **dartRverse**: Accessible Tools for Conservation













How is genotype data stored

Genlight Object {adegenet}

- Data structure
- Interrogation
- Subsetting
- Basic Filtering Tutorials

Selecting subsets of data

for analysis

Basic Filtering

Examining

contents

How to learn more











- Data structure
- Interrogation
- Subsetting
- Basic Filtering (refer Renee's sessions)
- Tutorials

		LOCI 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 30																												
	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	15	17	18	19	20	21	22	23	24	25	26	27	28	29	3(
AA010915	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0	0	1
UC_00126	2	-	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0
AA032760	0	0	-01	0	44.	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2
AA013214	0	2	0	0	0	2	2	0	0	0	1	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0
AA011723	0	2	2	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0
AA012411	2	0	2	2	0	2	-	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0
AA019237	2	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0
AA019238	0	0	0	2	2	2	0	2	0	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2
AA019239	0	2	0	0	0	-	0		2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0
AA019235	0	2	0	0	0	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0
AA019240	1	0		0	0	2	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0
AA019241	2	0	2	2	0	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	C
AA019242	0	0	0	2	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2
AA019243	0	1	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0
AA019251	0	0	2	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2
AA019252	2	0	0	0	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0
AA012405	2	-	0	1	0	0	2	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0
AA012406	0	0	0	2	2	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2
AA012409	0	0	2	0	2	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	.2
AA012499	0	2	2	2	2	0	0	0	2	2	0	0	0	1	+	+	2	0	0	0	2	2	0	0	0	1		2	+	2
AA012422	1	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0	0
AA012434	2	2	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0
AA012469	0	0	0	2	2	2	0	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0
AA012500	2	0	1	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0	0	1
AA032799	2	0	0	2	2	2	1	2	0	0	2	0	0	0	2	0	2	2	2	1	1	0	0	0	2	2	0	0	0	1

- O Homozygous reference allele
- 1 Heterozygous
- 2 Homozygous alternate allele
- Missing

- Data structure
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Dataframe INDIVIDUAL METADATA Latitude Longitude Maturity Sex

Dataframe

LOCUS METADATA

AlleleID, CloneID, AlleleSequence, SNP, SnpPosition, CallRate, OneRatioRef, OneRatioSnp, FreqHomRef, FreqHomSnp, FreqHets, PICRef, PICSnp, AvgPIC, AvgCountRef, AvgCountSnp, RepAvg

															LC	CI														
	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30
AA010915	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0	0	1
UC_00126	2	-	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0
AA032760	0	0	-	0	-	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2
AA013214	0	2	0	0	0	2	2	0	0	0	1	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0
AA011723	0	2	2	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0
AA012411	2	0	2	2	0	2	+	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0
AA019237	2	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0
AA019238	0	0	0	2	2	2	0	2	0	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2
AA019239	0	2	0	0	0	4	0	+	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0
AA019235	0	2	0	0	0	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0
AA019240	1	0		0	0	2	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0
AA019241	2	0	2	2	0	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0
AA019242	0	0	0	2	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2
AA019243	0	1	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0
AA019251	0	0	2	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2
AA019252	2	0	0	0	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0
AA012405	2		0	1	0	0	2	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0
AA012406	0	0	0	2	2	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2
AA012409	0	0	2	0	2	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2
AA012499	0	2	2	2	2	0	0	0	2	2	0	0	0	1	+	-	2	0	0	0	2	2	0	0	0	1	+	2	*	2
AA012422	1	2	0	0	2	-1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0	0
AA012434	2	2	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0
AA012469	0	0	0	2	2	2	0	0	2	0	0	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0
AA012500	2	0	1	2	1	2	2	2	0	0	2	0	0	0	2	1	1	2	2	2	2	0	0	0	2	2	0	0	0	1
AA032799	2	0	0	2	2	2	1	2	0	0	2	0	0	0	2	0	2	2	2	1	1	0	0	0	2	2	0	0	0	1

- O Homozygous reference allele
- 1 Heterozygous
- 2 Homozygous alternate allele
- Missing

gl@other\$loc.metrics

Dataframe

LOCUS METADATA

AlleleID, CloneID, AlleleSequence, SNP, SnpPosition, CallRate, OneRatioRef, OneRatioSnp, FreqHomRef, FreqHomSnp, FreqHets, PICRef, PICSnp, AvgPIC, AvgCountRef, AvgCountSnp, RepAvg

Data structure

- Interrogation
- Subsetting
- Basic Filtering (refer Renee's sessions)
- Tutorials

Flags History Verbosity Setting etc gl@other\$ind.metrics

Dataframe
INDIVIDUAL METADATA
Latitude Longitude
Maturity Sex

LOCI AA010915 UC 00126 AA032760 AA013214 AA011723 AA012411 AA019237 AA019238 AA019239 AA019235 AA019240 AA019241 AA019242 AA019243 AA019251 AA019252 AA012405 AA012406 AA012409 AA012499 AA012422 AA012434 AA012469 AA012500

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dartR Object

Homozygous reference allele

1 Heterozygous

2 Homozygous alternate allele

- Missing

NA

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Follow along if you like.

Maybe use your own
genlight object?

Quick and Nasty



testset.gl

/// GENLIGHT OBJECT ////////

// 250 genotypes, 255 binary SNPs, size: 752 Kb 7868 (12.34 %) missing data

// Basic content

@gen: list of 250 SNPbin

@ploidy: ploidy of each individual (range: 2-2)

// Optional content

@ind.names: 250 individual labels @loc.names: 255 locus labels

@loc.all: 255 alleles

@position: integer storing positions of the SNPs

@pop: population of each individual (group size range: 1-11) @other: a list containing: loc.metrics latlong ind.metrics history

loc.metrics.flags

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{adegenet} Accessors

AA012411 AA019237

```
gl <- testset.gl
nInd(gl)
[11250
nLoc(gl)
[11250
nPop(gl)
[1130
popNames(gl) or indNames(gl) or locNames(gl)
table(pop(gl))
EmmacBrisWive EmmacBurdMist EmmacBurnBara EmmacClarJack EmmacClarYate EmmacCoopAvin EmmacCoopCully
EmmacCoopEulb EmmacFitzAllig EmmacJohnWari EmmacMaclGeor EmmacMaryBoru EmmacMaryPetr EmmacMDBBowm
EmmacMDBCond EmmacMDBCudg EmmacMDBForb EmmacMDBGwyd EmmacMDBMaci EmmacMDBMurrMung EmmacMDBSanf
EmmacNormJack EmmacNormLeic EmmacNormSalt EmmacRichCasi EmmacRoss EmmacRussEube EmmacTweeUki
EmsubRopeMata EmvicVictJasp
as.matrix(gl)[1:7,1:5]
        100049687-12-C/T 100049698-16-G/A 100049728-23-A/G 100049805-56-T/A 100049816-51-A/G
AA010915
UC 00126
AA032760
AA013214
```

- Data structure
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gl.report functions



👠 gl <- testset.gl gl.set.verbosity(3) gl.report.callrate(gl)

[Starting gl.report.callrate

Processing genlight object with SNP da

Reporting Call Rate by Locus

No. of loci = 255

No. of individuals = 250

Minimum: 0.056 1st quartile: 0.912

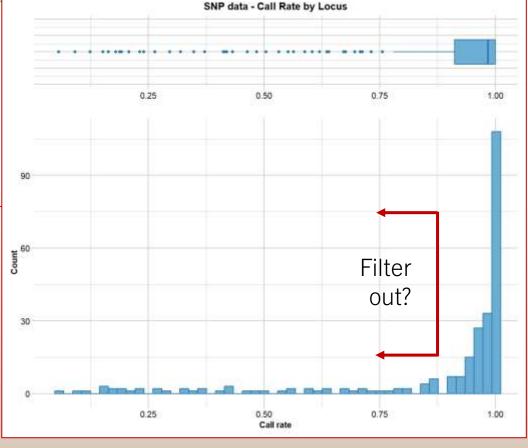
Median : 0.984

: 0.8765804

3r quartile: 1 Maximum: 1

Missing Rate Overall: 0.1234

Completed: gl.report.callrate



- Data structure
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- Subsetting
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- Tutorials

Who will be lost?

gl.report functions



gl <- testset.gl</p>
gl.set.verbosity(3)

gl.report.callrate(gl)

gl.report.callrate(gl,method="ind")

Starting gl.report.callrate
Processing genlight object with SNP da
Reporting Call Rate by Individual

Listing 30 populations and their average Monitor again after filtering Population CallRate N

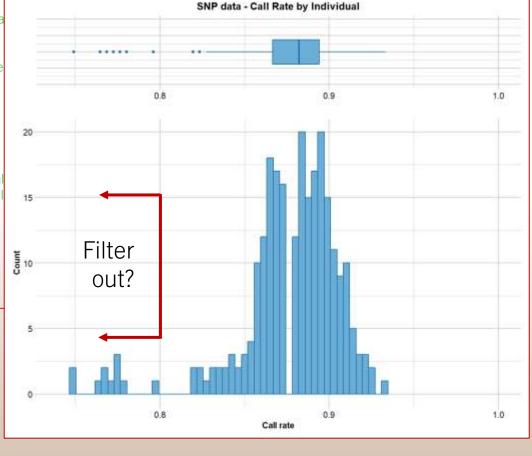
- 1 EmmacBrisWive 0.8839 10
- 2 EmmacBurdMist 0.8808 10
- 3 EmmacBurnBara 0.8859 11

Listing 20 individuals with the lowest Cal Use this list to see which individuals wil Individual CallRate

- 1 AA063722 0.7490196
- 2 AA063726 0.7490196
- 3 AA063732 0.7647059

.

Completed: gl.report.callrate



- Data structure
- Interrogation
- Subsetting
- Basic Filtering (refer Renee's sessions)
- Tutorials

gl.report functions



gl <- testset.gl

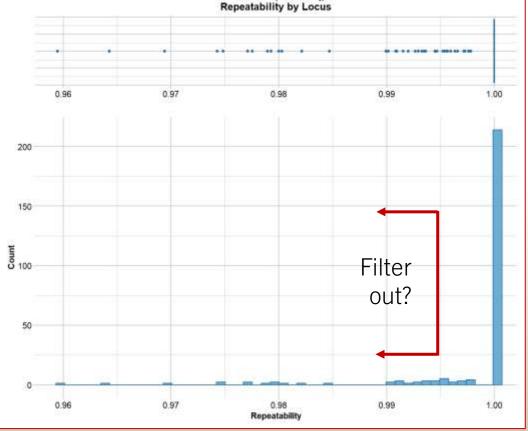
gl.set.verbosity(3)

gl.report.callrate(gl)

gl.report.callrate(gl,method="ind")

gl.report.reproducibility

```
gl.report.reproducibility(gl)
Starting gl.report.reproducib:
  Processing genlight object
  Reporting Repeatability by
 No. of loci = 255
 No. of individuals = 250
   Minimum
                 : 0.959459
   1st quartile: 1
   Median
                 : 0.9981525
   Mean
    3r quartile : 1
   Maximum
   Missing Rate Overall: 0.1
   Ouantile Threshold Retained
       100% 1.000000
        20% 1.000000
                           21
18
        15% 0.997674
                           230
19
                           243
20
```



SNP data (DArTSeq)

- Data structure
- Interrogation
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- Basic Filtering (refer Renee's sessions)
- Tutorials



Try some of these in your own time

You get the gist



- gl.report.callrate()
- gl.report.reproducibility()
- gl.report.secondaries()
- gl.report.rdepth()
- gl.report.monomorphs()
- gl.report.overhang()
- gl.report.hamming()
- gl.report.overshoot()
- gl.report.locmetric()

...... etc



testset.gl

gl <- testset.gl nInd(gl) nLoc(gl) nPop(gl) popNames(gl) indNames(gl) locNames(gl) table(pop(gl)) as.matrix(gl)[1:7,1:5]



- Data structure
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Try some of these in your own time

Subsetting your data

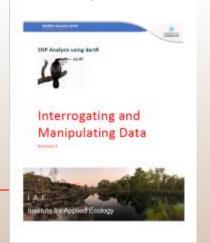
- gl.keep.ind()
- gl.drop.ind()
- gl.keep.loc()
- gl.drop.loc()
- gl.keep.pop()
- gl.drop.pop()
- gl.merge.pop()
- gl.subsample.ind()
- gl.subsample.loc()

..... etc



testset.gl

gl <- testset.gl nInd(gl) nLoc(gl) nPop(gl) popNames(gl) indNames(gl) locNames(gl) table(pop(gl)) as.matrix(gl)[1:7,1:5]

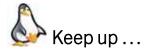


- Data structure
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Recall



- gl.report.callrate()
- gl.report.reproducibility()
- gl.report.secondaries()
- gl.report.rdepth()
- gl.report.monomorphs()
- gl.report.overhang()
- gl.report.hamming()
- gl.report.overshoot()
- gl.report.locmetric()



```
testset.gl
```

```
gl <- testset.gl
nInd(gl)
nLoc(gl)
nPop(gl)
popNames(gl)
indNames(gl)
locNames(gl)
table(pop(gl))
as.matrix(gl)[1:7,1:5]
```

- Data structure
- Interrogation
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- Basic Filtering (refer Renee's sessions)
- Tutorials

Basic Filtering



- gl <- gl.filter.callrate()</p>
- gl <- gl.filter.reproducibility()</p>
- gl <- gl.filter.secondaries()</p>
- gl <- gl.filter.rdepth()</p>
- gl <- gl.filter.monomorphs()</p>
- gl <- gl.filter.overhang()</p>
- gl <- gl.filter.hamming()</p>
- gl <- gl.filter.overshoot()</p>
- gl <- gl.report.locmetric()</p>

```
....etc
```



```
testset.gl
```

```
gl <- testset.gl
nInd(gl)
nLoc(gl)
nPop(gl)
popNames(gl)
indNames(gl)
locNames(gl)
table(pop(gl))
as.matrix(gl)[1:7,1:5]
```

- Data structure
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 (refer Renee's sessions)
- Tutorials

Who will be lost?

Recall



gl <- testset.gl gl.set.verbosity(3) gl.report.callrate(gl)

gl.report.callrate(gl,method="ind")

Starting gl.report.callrate
Processing genlight object with SNP da
Reporting Call Rate by Individual

Listing 30 populations and their average Monitor again after filtering Population CallRate N

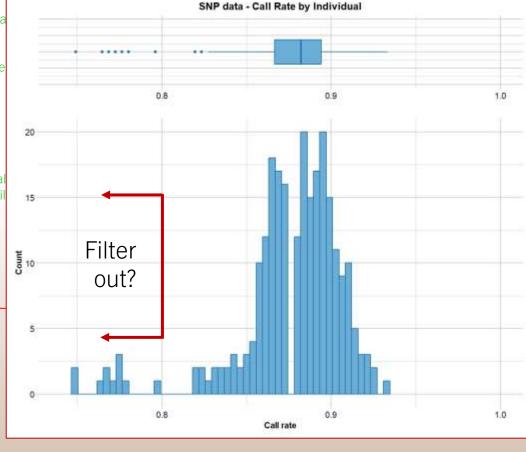
- 1 EmmacBrisWive 0.883910
- 2 EmmacBurdMist 0.8808 10
- 3 EmmacBurnBara 0.8859 11

Listing 20 individuals with the lowest Cal Use this list to see which individuals wil Individual CallRate

- 1 AA063722 0.7490196
- 2 AA063726 0.7490196
- 3 AA063732 0.7647059

.

Completed: gl.report.callrate



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Who has been discarded?

gl.filter functions



👠 gl <- testset.gl gl.set.verbosity(3) gl.report.callrate(gl)

gl.report.callrate(gl,method="ind")

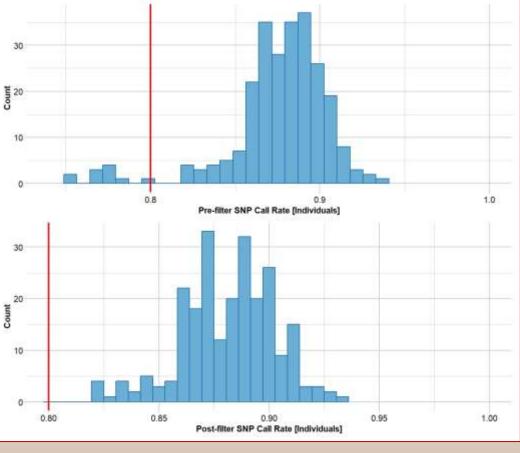
gl <- gl.filter.callrate(g

Starting gl.filter.callrate

Processing genlight object with SNP da Warning: Data may include monomorp calculations for filtering

Recalculating Call Rate

Removing individuals based on Call Ra Individuals deleted (CallRate <= 0.8) AA032760[EmmacMDBMaci], AA0637 AA063722[EmmacCoopAvin], AA0637 AA063708[EmmacCoopAvin], AA0637 AA063714[EmmacCoopAvin], AA0637 Note: Locus metrics not recalculated Note: Resultant monomorphic loci not Completed: gl.filter.callrate

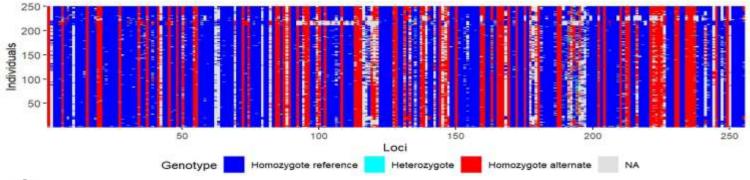


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Quick graphical evaluation

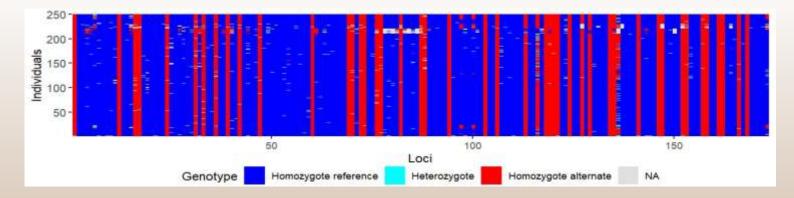


gl <- testset.gl gl.smearplot(gl)





gl <- gl.filter.callrate(gl,verbose=0) gl <- gl.filter.callrate(gl,method="ind",threshold=0.80,verbose=0) gl.smearplot(gl)



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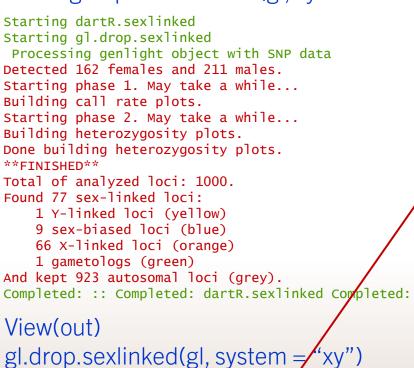
dartR.sexlinked



out <- gl.report.sexlinked(gl, system = "xy")

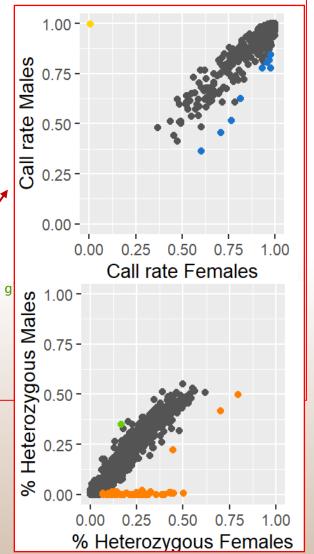
gl@other\$ind.metrics

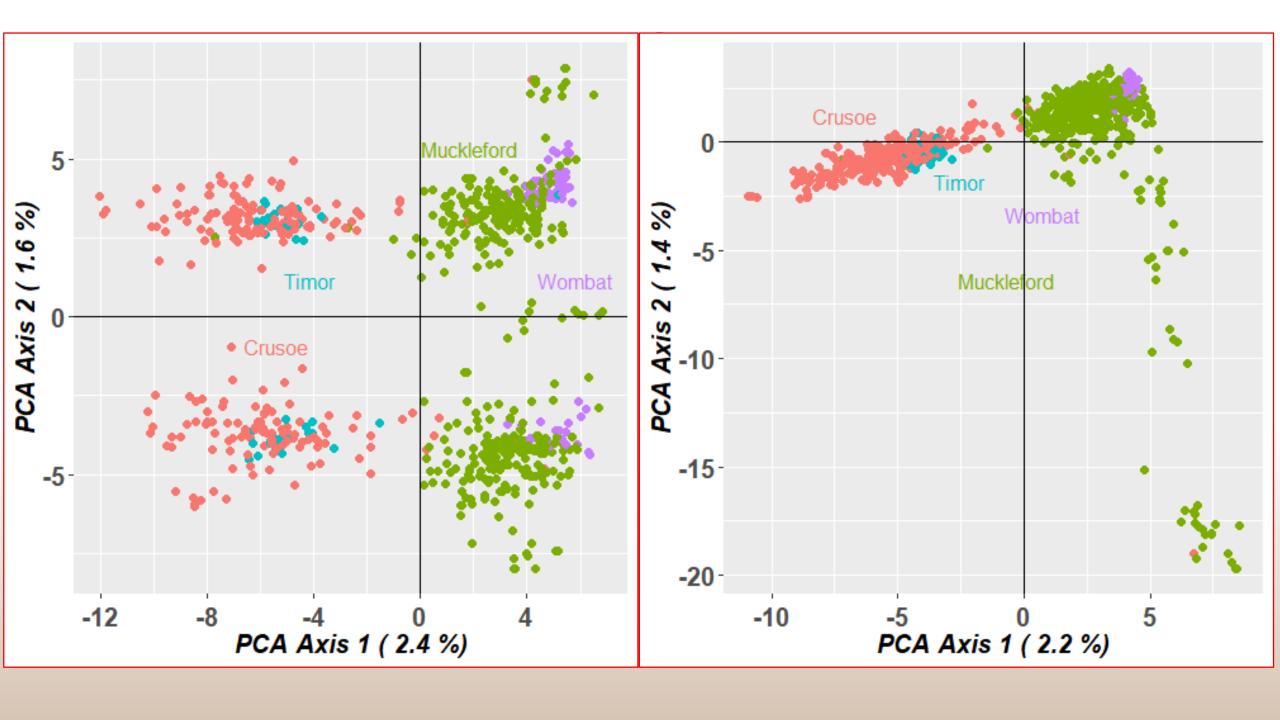
At least 15 males and 15 females



gl.keep.sexlinked(gl, system = "xy")

Before all other filters!





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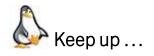
Try some of these in your own time

Basic Filtering



- gl <- gl.filter.callrate()</p>
- gl <- gl.filter.reproducibility()</p>
- gl <- gl.filter.secondaries()</p>
- gl <- gl.filter.rdepth()</p>
- gl <- gl.filter.monomorphs()</p>
- gl <- gl.filter.overhang()</p>
- gl <- gl.filter.hamming()</p>
- gl <- gl.filter.overshoot()</p>
- gl <- gl.report.locmetric()</p>

. etc



testset.gl

```
gl <- testset.gl
nInd(gl)
nLoc(gl)
nPop(gl)
popNames(gl)
indNames(gl)
locNames(gl)
table(pop(gl))
as.matrix(gl)[1:7,1:5]
```

gl <- testset.gl gl.set.verbosity(3) gl.report.callrate(gl) gl.report.callrate(gl,method="ind") gl.report.reproducibility(gl)

gl.report.callrate(gl,method="ind") gl <- gl.filter.callrate(gl, method="ind", threshold=0.80)

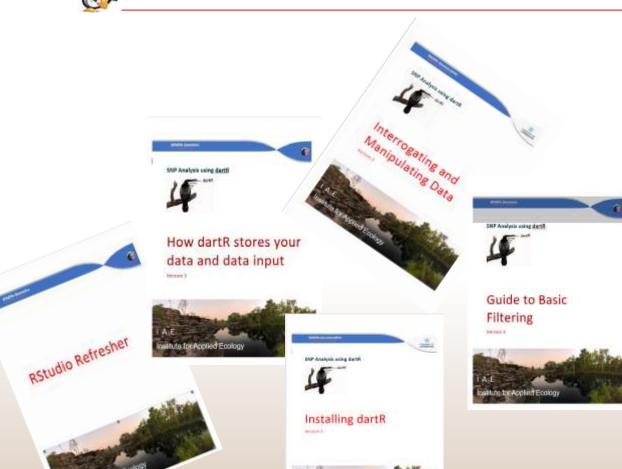
gl <- testset.gl gl.smearplot(gl) gl <- gl.filter.callrate(gl,verbose=0) gl <- gl.filter.callrate(gl, method="ind", threshold=0.80, verbose=0) gl.smearplot(gl)

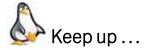


Tutorials



- Data structure
- Interrogation
- Subsetting
- Basic Filtering (refer Renee's sessions)
- Tutorials
 - inline help
 - ?function
 - CRAN documentation





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Discussion



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