

Let's explore the 40 variables (column names) of our analyzed data

Our **analysis** has the dimension

Data	
Analysis	35 obs. of 40 variables

And these are the column names

```
> colnames(Analysis)
[1] "Out.SubInd"      "SubPrName"      "Observations"   "Studies"        "Sites"          "RR.Shapiro.Sig"
[7] "RR"              "RR.median"      "RR.var"         "RR.se"          "RR.Quantiles0.25" "PC.Shapiro.Sig"
[13] "PC"              "PC.median"      "PC.se"          "PC.var"         "PC.Quantiles0.25" "Units"
[19] "Model"           "MeanT.Obs"      "MeanT"          "MeanT.se"       "MeanC.Obs"      "MeanC"
[25] "MeanC.se"        "RR.t.value"     "RR.Pr(>|t|)"    "RR.Sigma2"      "PC.t.value"     "PC.Pr(>|t|)"
[31] "PC.Sigma2"       "RR.pc.se.low"   "RR.pc"          "RR.pc.se.high"  "RR.pc.jen.low"   "RR.pc.jen"
[37] "RR.pc.jen.high" "PC.pc.se.low"   "PC.pc"          "PC.pc.se.high"
```

Out.SubInd

Since our data is already subset on **Land Equivalent Ratio**, we do not have many information here. This is our target output.

```
> Analysis$Out.SubInd
[1] "Land Equivalent Ratio" "Land Equivalent Ratio" "Land Equivalent Ratio" "Land Equivalent Ratio" "Land Equivalent Ratio"
[6] "Land Equivalent Ratio" "Land Equivalent Ratio" "Land Equivalent Ratio" "Land Equivalent Ratio" "Land Equivalent Ratio"
[11] "Land Equivalent Ratio" "Land Equivalent Ratio" "Land Equivalent Ratio" "Land Equivalent Ratio" "Land Equivalent Ratio"
```

SubPrName

We then have **35** unique subPractice for our selected outcome subindicator. Here are the first 5

```
> unique(Analysis$SubPrName)
[1] "AgFor Alley (Nfix)-AgFor Prune (Unknown)-AgFor Prune Mulch (Nfix)"
[2] "AgFor Alley (nonNfix)"
[3] "AgFor Alley (Nfix)-Inputs N-Seed Improv"
[4] "AgFor Alley (Nfix)-Inputs K-Inputs N-Inputs P-Irrigation Sprinklers"
[5] "AgFor Alley (Nfix)-Inputs N"
```

So, our overall objective here is to compile the statistics for each combination of these LER and every subPractice variables.

Observations

We can clearly see that we have 35 rows so, and each row has a number of **observations**.

```
> Analysis$Observations
[1] 36 9 8 10 2 6 330 9 82 13 20 31 7 14 40 23 2 2 2 2 4 4 4 4 3 6 6 27 16 4 4
[32] 16 8 15 32
```

Studies

This represents the number of studies or publications used. For most of them, only **one** publication has been used

```
> Analysis$Studies  
[1] 1 1 1 1 1 1 25 1 9 2 2 3 1 1 2 2 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1
```

Sites

This just represents the number of geographic locations

```
> Analysis$Sites
[1] 1 1 1 1 1 1 31 1 10 3 3 4 2 2 3 3 1 1 1 1 1 1 1 1 1 1 1 3 1 1 1 1 1 1 1
```

Response Ratio (RR)

A common effect size metric used to quantify the outcome of experiments for ecological meta-analysis is the response ratio (**RR**): the log proportional change in the means of a treatment and control group.

$$RR = \log\left(\frac{\text{experimental outcome}}{\text{control outcome}}\right)$$

If $RR > 0 \Rightarrow$ the experimental treatment is better than the control treatment.

In our study, **RR** could either mean **weighted mean** of Response Ration or **weighted median** of Response Ratio

RR.Shapiro.Sig

After applying a Shapiro test to our RRs, the data for the row **Intercrop (nonNfix)** and **Inputs N-Intercrop (Mixed)** are statistically non-normal (*RR.Shapiro.Sig* field is <0.05)

```
> Analysis[,list(SubPrName, Observations, Studies, Sites, RR.Shapiro.Sig)]
```

	SubPrName	Observations	Studies	Sites	RR.Shapiro.Sig
1:	AgFor Alley (Nfix)-AgFor Prune (Unknown)-AgFor Prune Mulch (Nfix)	36	1	1	0.09467
2:	AgFor Alley (nonNfix)	9	1	1	0.00958
3:	AgFor Alley (Nfix)-Inputs N-Seed Improv	8	1	1	0.39344
4:	AgFor Alley (Nfix)-Inputs K-Inputs N-Inputs P-Irrigation Sprinklers	10	1	1	0.84730
5:	AgFor Alley (Nfix)-Inputs N	2	1	1	NA
6:	AgFor Alley (Nfix)	6	1	1	0.02266
7:	Intercrop (Mixed)	330	25	31	0.00000
8:	Inputs Urea-Intercrop (Mixed)	9	1	1	0.16208
9:	Intercrop (nonNfix)	82	9	10	0.00008
10:	Inputs P	13	2	3	0.67977
11:	Inputs N-Inputs P	20	2	3	0.68067
12:	Inputs N	31	3	4	0.92929
13:	Inputs P-Intercrop (Mixed)	7	1	2	0.88215
14:	Inputs N-Inputs P-Intercrop (Mixed)	14	1	2	0.11101
15:	Inputs N-Intercrop (Mixed)	40	2	3	0.00004
16:	Intercrop (Mixed)-Seed Improv	23	2	3	0.23716
17:	MinTill	2	1	1	NA
18:	NoTill	2	1	1	NA
19:	Inputs K-Inputs N	2	1	1	NA
20:	Inputs K-Inputs P	2	1	1	NA

Proportional change

```
> Analysis[,list(RR.pc.se.low, RR, RR.pc, RR.pc.se.high, RR.pc.jen.low, RR.pc.jen.high, PC)]
```

	RR.pc.se.low	RR	RR.pc	RR.pc.se.high	RR.pc.jen.low	RR.pc.jen.high	PC
1:	14.22614	0.15838	17.16113	20.17154	14.28156	20.22983	1.18444
2:	2.52946	0.13334	14.26384	27.34121	3.74025	28.84501	1.18889
3:	0.38072	0.07232	7.49993	15.12404	0.85312	15.66582	1.09250
4:	76.17542	0.74091	109.78437	149.80489	81.62883	157.53746	2.38200
5:	56.93889	0.51205	66.87121	77.43212	NA	NA	1.67500
6:	249.63515	1.27909	259.33683	269.30771	249.89748	269.58479	3.60000
7:	1.04947	0.07966	8.29188	16.05337	1.43875	16.50046	1.18266
8:	20.40369	0.25860	29.51157	39.30840	21.04595	40.05150	1.32222
9:	16.49405	0.34574	41.30352	71.39660	16.75879	71.78612	1.65001
10:	-9.28069	-0.05451	-5.30510	-1.15527	-8.96490	-0.81119	0.95715
11:	-0.61609	0.12252	13.03417	28.55929	-0.45546	28.76708	1.15741
12:	1.86518	0.08012	8.34171	15.23001	1.91562	15.28706	1.09154
13:	39.55799	0.44344	55.80577	73.94518	41.01626	75.76277	1.61667
14:	47.17321	0.45551	57.69774	68.97490	47.77638	69.66742	1.62500
15:	53.85340	0.52782	69.52327	86.78910	54.10053	87.08914	1.73210
16:	22.78197	0.25560	29.12361	35.79280	22.93063	35.95721	1.30119
17:	-1.02312	-0.00602	-0.60061	-0.17629	NA	NA	0.99401
18:	-3.42256	-0.03057	-3.01029	-2.59626	NA	NA	0.96991
19:	48.76350	0.40561	50.02126	51.28966	NA	NA	1.50032
20:	12.99826	0.13758	14.74957	16.52802	NA	NA	1.14777

Investigate distributions: adding percentage results based on median

```
> Analysis[,list(Observations,RR.pc.jen,RR.pc.median,PC.pc,PC.pc.median)]
```

	Observations	RR.pc.jen	RR.pc.median	PC.pc	PC.pc.median
1:	36	17.21797	-82.60467	18.44400	19.000000
2:	9	15.61321	-84.73618	18.88900	16.500000
3:	8	8.00583	-87.77824	9.25000	13.000000
4:	10	116.27812	-22.52728	138.20000	117.000000
5:	2	78.77350	-57.47323	67.50000	53.000000
6:	6	259.60643	30.83328	260.00000	270.000000

Test of normality of the data

After applying the Shapiro test, we realize that we have many issues with data as (*RR.Shapiro.Sig* or *PC.Shapiro.Sig* <0.05)

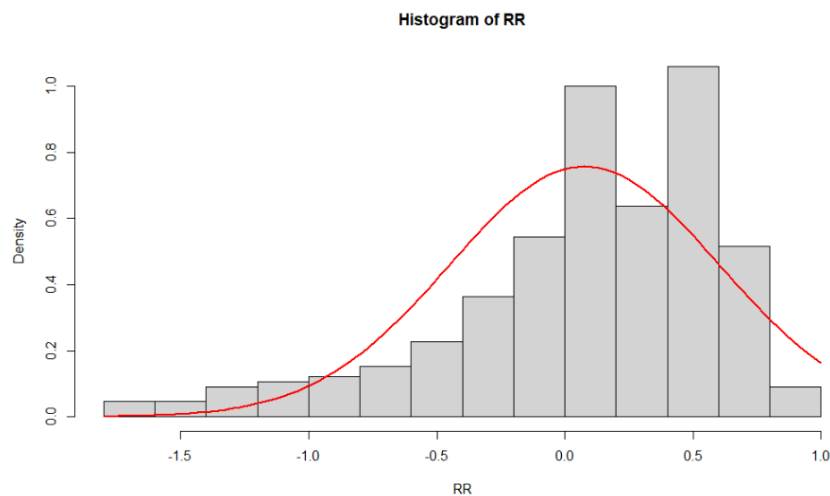
```
> Analysis[,list(Out.SubInd,SubPrName, RR.Shapiro.Sig, PC.Shapiro.Sig)]
```

	Out.SubInd	SubPrName	RR.Shapiro.Sig	PC.Shapiro.Sig
1: Land Equivalent Ratio	AgFor Alley (Nfix)-AgFor Prune (Unknown)-AgFor Prune Mulch (Nfix)		0.09467	0.41575
2: Land Equivalent Ratio	AgFor Alley (nonNfix)		0.00958	0.14736
3: Land Equivalent Ratio	AgFor Alley (Nfix)-Inputs N-Seed Improv		0.39344	0.45550
4: Land Equivalent Ratio	AgFor Alley (Nfix)-Inputs K-Inputs N-Inputs P-Irrigation Sprinklers		0.84730	0.78108
5: Land Equivalent Ratio	AgFor Alley (Nfix)-Inputs N		NA	NA
6: Land Equivalent Ratio	AgFor Alley (Nfix)		0.02266	0.02591

Data distribution (with Yields)

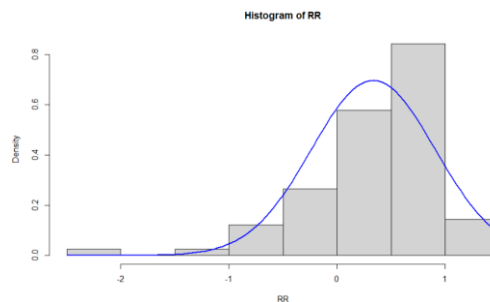
If we take the combination of **Land Equivalent Ratio** and **intercrop (Mixed)** plotting the outcome response ratio and ratio vs a normal curve it shows:

- 1) The skew in the ratio data is not corrected by the natural log transformation;
- 2) The response ratio distribution is not normal, it might not probably be good for our study.

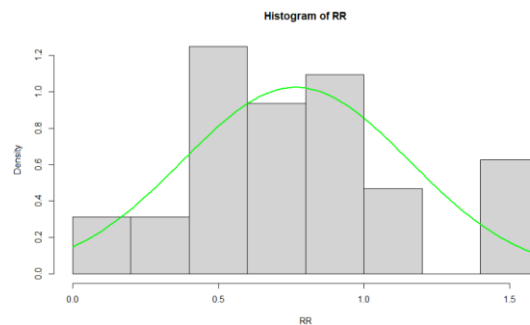


Other combination

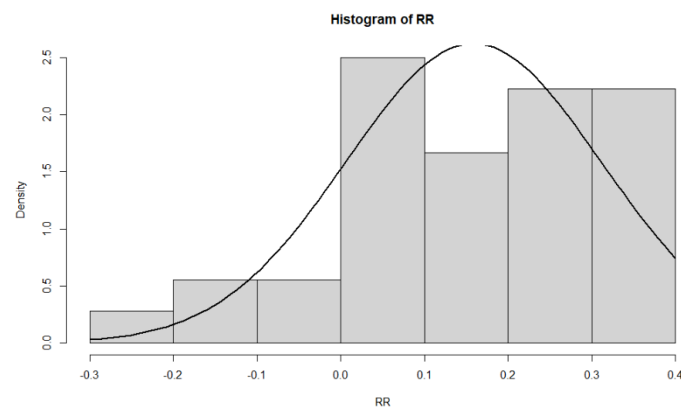
The combination of **Land Equivalent Ratio** and **Intercrop (nonNfix)**



The combination of **Land Equivalent Ratio** and **AgFor Alley (Mixed)**



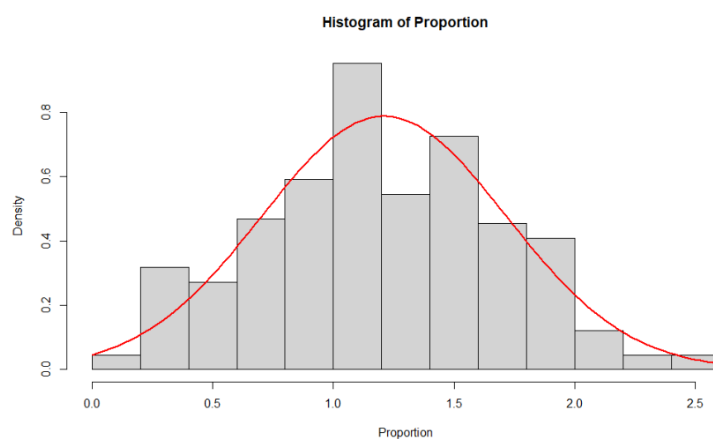
The combination of **LER** and **AgFor Alley (Nfix)-AgFor Prune (Unknown)-AgFor Prune Mulch (Nfix)**



We noticed that **intercrop (Mixed)** has more observations than the others that's why its response ratio distribution curve tends to Normality

Data distribution (with MeanT/MeanC)

The proportion distribution is not quite normal, but it looks corrected



Issue when ordering numerator and denominator

Let's see how results change when numerator and denominator are swapped

Experimental/control outcome is numerator

Mean

Change estimated from mean of ratios

Change estimated from mean of response ratios

Intercropping VS intercropping rotation

After subsetting our Data_LER on practice names "Intercropping", after on "Crop Rotation-Intercropping", we have the following dimension

Data_LER_inter	413 obs. of 141 variables
Data_LER_Rot_inter	27 obs. of 141 variables

And the ERAAnalyse function gives us the following information

```
> Analysis_1[,list(Out.SubInd,SubPrName, RR, RR.se, RR.pc.se.low, RR.pc, RR.pc.se.high, RR.pc.jen.low, RR.pc.jen.high)] %>% head
      Out.SubInd      SubPrName      RR  RR.se RR.pc.se.low  RR.pc RR.pc.se.high
1: Land Equivalent Ratio  Intercrop (Mixed) 0.07966 0.06922    1.04947  8.29188    16.05337
2: Land Equivalent Ratio  Intercrop (nonNfix) 0.34574 0.19307    16.49405  41.30352    71.39660
      RR.pc.jen.low RR.pc.jen.high
1:      1.43875      16.50046
2:      16.75879      71.78612

> Analysis_2[,list(Out.SubInd,SubPrName, RR, RR.se, RR.pc.se.low, RR.pc, RR.pc.se.high, RR.pc.jen.low, RR.pc.jen.high)] %>% head
      Out.SubInd      SubPrName      RR  RR.se RR.pc.se.low  RR.pc
1: Land Equivalent Ratio  Intercrop (Mixed)-Rotation (Mixed) 0.63988 0.09929    71.70196  89.62533
      RR.pc.se.high RR.pc.jen.low RR.pc.jen.high
1:      109.4197      71.87117      109.626
```

MeanT VS no value in MeanT

We don't have any NA value in the MeanT column

```
> Mean_T <- Data_LER$MeanT
> Mean_C <- Data_LER$MeanC
> Mean_T/Mean_C
 [1] 1.0600000 0.8200000 1.0600000 1.0000000 1.1000000 1.2200000 1.2000000 1.0800000 1.2300000 1.4900000
[11] 1.4400000 1.3500000 1.0300000 1.2700000 1.2600000 1.0200000 1.2700000 1.3000000 0.8900000 1.0400000
[21] 1.0000000 1.3200000 1.1900000 1.3800000 0.8100000 1.0900000 1.2900000 1.3300000 1.3700000 1.3800000
[31] 1.0900000 1.1900000 1.1800000 1.1200000 1.3600000 1.4100000 1.1500000 1.3200000 1.4200000 0.5200000
[41] 1.4900000 1.0400000 1.5000000 1.1800000 1.0800000 0.8100000 0.8200000 0.8900000 0.9000000 1.0600000
[51] 1.1300000 1.1400000 1.1800000 1.3200000 1.3700000 1.3800000 1.5300000 1.8200000 1.8200000 2.1700000
```

Comparing intercropping vs monoculture

Since we are able to get the **ratios**, **response ratios** and finally **yields**, this is a way to compare the two practices

Comparing the LER from two different diversification system

Looking at the diversity from the LER outcome, we have

```
> table(Data_LER$Diversity)
```

	20	Acacia-Roselle	2
Acacia-Sesame	2	Acacia-Sorghum	2
Barley-Fava Bean	2	Black Pepper-Cardamom-Gliricidia sepium	3
Black Pepper-Cardamom-Grevillea robusta	3	Black Pepper-Gliricidia sepium	2
Black Pepper-Grevillea robusta	2	Butter Bean-Maize	4
Calabash-Sorghum	8	Cassava-Cowpea	8
Cassava-Maize	36	Cassava-Maize-African Yam Bean	6
Cassava-Maize-Cowpea	4	Cassava-Maize-Groundnut	4