



INTERNACIONAL  
CENTRO DE LA PAPA  
CIP

R

Pontificia Universidad Católica del Perú

24 Abril 2008

## Presentación de la librería “agricolae” de R para la investigación agrícola

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<http://www.cipotato.org>



Centro Internacional de la Papa

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**NEWS CIP**

Strengthening our assets enhancing our impact

**Welcome to the International Potato Center**

**Peruvian potato project wins global contest**

LIMA - The Peruvian potato project 'Tikapapa' has been chosen as the winner of The World Challenge 2007, a global competition promoted by the BBC and Newweek magazine, in association with Shell.

See Award Ceremony Video (MMV 50 MB)

See video Potato Coldzone (MMV 34 MB)

Read more Versión en Español

**Special announcements**

**HIDDEN TREASURE**

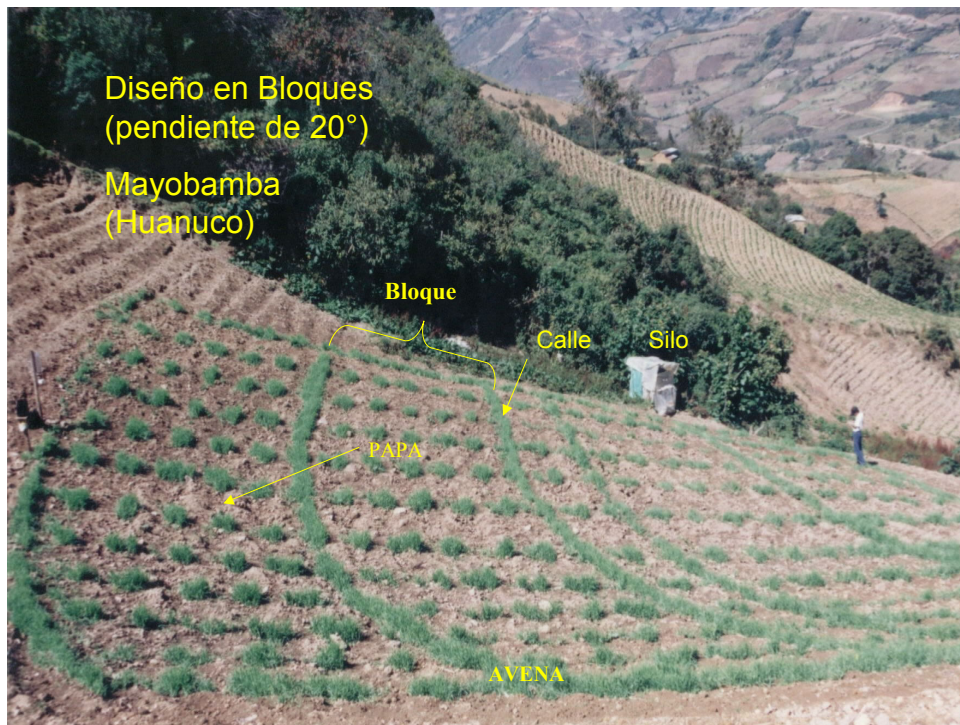
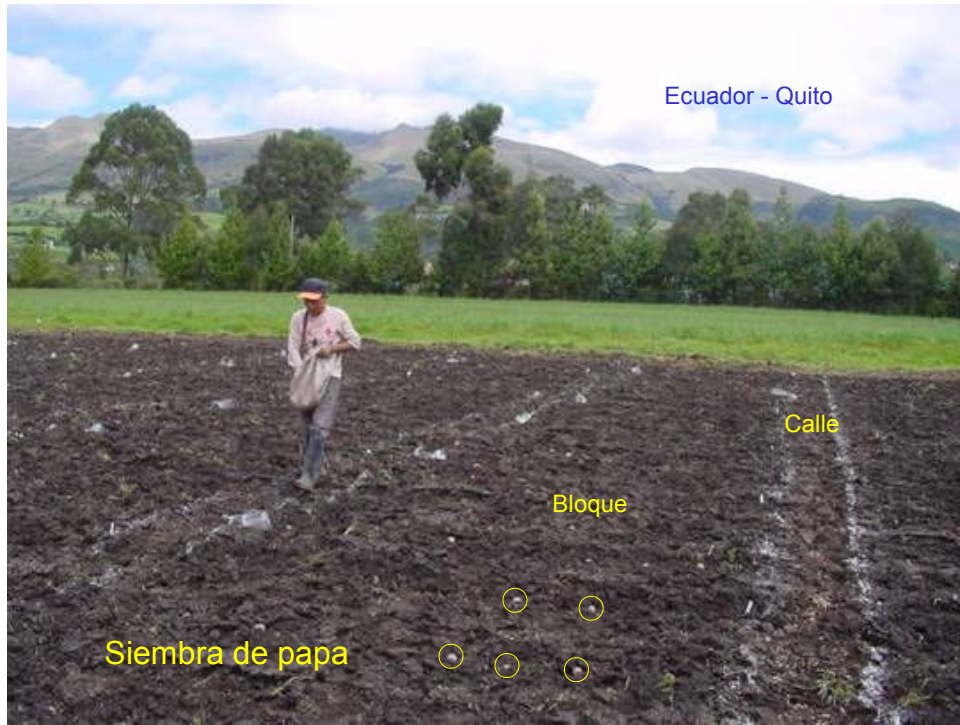
International Conference:  
Potato Science for the Poor

Latest publication  
Potato, Treasure of the Andes  
CIPAR 2007  
Versión en Español

El CIP es un centro de investigación con orientación a cultivos de raíces y tubérculos como la papa, el camote y otros cultivos andinos.

Los estudios usan mayormente los diseños de experimentos para análisis comparativo,

Son muchas las áreas que realizan estas actividades y usan los diseños y análisis estadístico: Recursos Genéticos, Entomología, Virología, Patología, Biodiversidad, Mejoramiento genético de plantas y otras. Áreas importantes que motivaron la creación de una librería de apoyo a los investigadores del CIP.



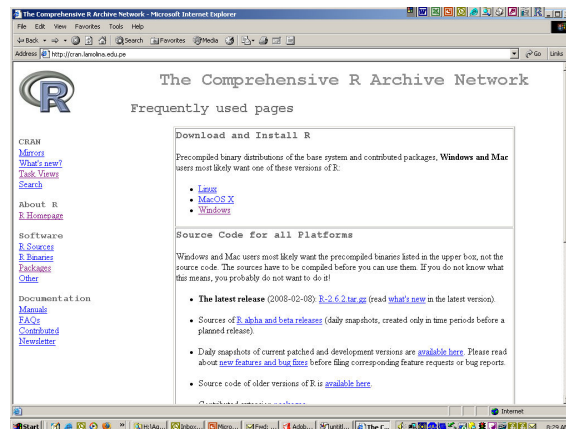






## R en PERU

<http://cran.lamolina.edu.pe>



## agricolae: Statistical Procedures for Agricultural Research

These functions are currently utilized by the International Potato Center Research (CIP), the Statistics and Informatics Instructors and the Students of the Universidad Nacional Agraria La Molina Peru, and the Specialized Master in "Bosques y Gestion de Recursos Forestales" (Forest Resource Management). This package contains functionality for the statistical analysis of experimental designs applied specially for field experiments in agriculture and plant breeding. Planning of field experiments: Lattice, factorial, RCBD, CRD, Latin Square, Greaco, BIB, PBIB, Alpha design. Comparison of multi-location trials: AMMI (biplot and triplot), Stability. Comparison between treatments: LSD, Bonferroni, HSD, Waller, Kruskal, Friedman, Durbin, Van Der Waerden. Resampling and simulation: resampling model, simulation model, analysis Mother and baby trials, Ecology: Indices Biodiversity, path analysis, consensus cluster, Uniformity Soil: Index Smith's.

**Version:** 1.0-4  
**Suggests:** akima, klaR, SuppDists, corpcor  
**Date:** 2007-09-11  
**Author:** Felipe de Mendiburu  
**Maintainer:** Felipe de Mendiburu  
**License:** GPL  
**URL:** <http://tarwi.lamolina.edu.pe/~fmendiburu>

Downloads:

Package source: [agricolae\\_1.0-4.tar.gz](#)  
MacOS X binary: [agricolae\\_1.0-4.tgz](#)  
Windows binary: [agricolae\\_1.0-4.zip](#)  
Reference manual: [agricolae.pdf](#)

### Características de Agricolae

- |  |
|--|
| <ol style="list-style-type: none"><li>1. Version 1.0 - Diciembre 10, del 2006</li><li>2. Version 1.0.4 Setiembre 11, del 2007 tiene un tamaño de 550 kb</li><li>3. Version 1.0.5 en actualización, 33 dataset y 69 funciones</li></ol> |
|--|

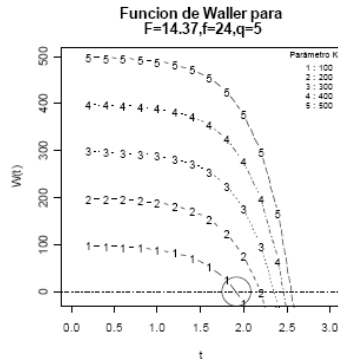
### Aplicaciones

1. Manipulación de datos
2. Estadística descriptiva
3. Diseño de experimentos
4. Comparación múltiple de tratamientos
5. Pruebas no paramétricas
6. Diseños Genéticos
7. Análisis de Estabilidad, biodiversidad
8. Pruebas de uniformidad para tamaño y forma de parcela
9. Consensus en cluster

### Funcion de Waller-Duncan

$$W(t) = k \frac{\int_1^{\infty} \sqrt{x-1} g(x) h(tb(x)) dx}{\int_1^{\infty} \sqrt{x-1} g(x) h(-tb(x)) dx}$$

$$g(x) = x^{-(q+3)/2} (f+q*F/x)^{-(f+q-1)/2} \quad b(x) = \sqrt{\frac{(q+f)(x-1)}{f*x+q*F}} \quad b(x) = \sqrt{\frac{(q+f)(x-1)}{f*x+q*F}}$$



Ecuación a resolver es:

$$W(t) = 0$$

> waller(K=100, q=5, f=24, Fc=14.37)

[1] 1.919

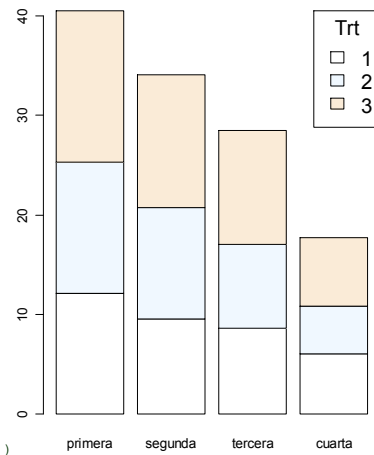
> TAPPLY.STAT(.....)

```
tapply.stat(papa[,2], papa[,3:6], mean)
tapply.stat(papa[,2], papa[,3:6], function(x) sd(x)*100/mean(x))
```

```
> papa[,3:6] <-round(papa[,3:6],1)
> papa
  bloque tratamiento primera segunda tercera cuarta
1      1           1    10.0    11.2    11.3    8.3
2      2           1    13.0    12.1    8.8    7.7
3      3           1    17.6    10.7    10.5    5.1
4      4           1     9.3     7.9     6.6    5.1
5      5           1    10.7     5.9     6.0    4.1
6      1           2    12.4    13.3    11.6    7.5
7      2           2    20.3    14.1     9.6    4.7
8      3           2    19.0    12.6     8.2    3.9
9      4           2     6.5     7.2     6.6    3.8
10     5           2     7.7     8.6     5.9    4.1
11     1           3    12.1     9.8    11.5    9.8
12     2           3    15.0    15.5    13.0    7.7
13     3           3    18.4    13.4     9.4    6.4
14     4           3    15.4    13.0    11.2    6.3
15     5           3    15.1    15.2    12.0    4.2
```

```
> tapply.stat(papa[,2], papa[,3:6], mean)
papa[, 2] primera segunda tercera cuarta
1      1    12.12    9.56    8.64    6.06
2      2    13.18    11.16    8.38    4.80
3      3    15.20    13.38    11.42    6.88
```

```
> barplot(as.matrix(medias[,-1]), col=colors()[1:3])
> legend("topright", as.character(medias[,1]), fill=colors()[1:3], cex=1.5, title="Trt")
```

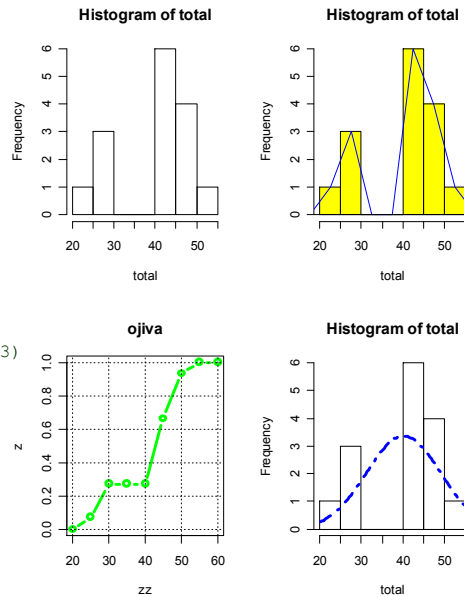


## Estadística descriptiva

```
X<-cbind(c(1,1,1,1))
total <- as.matrix(papa[,3:6])%*%X
par(mfrow=c(2,2))
h<-hist(total)
plot(h,col="yellow")
polygon.freq(h,col="blue")

ojiva.freq(h,type="b",col="green",
main="ojiva",lwd=3)
stat.freq(h)
plot(h)
normal.freq(h,col="blue",lty=4,lwd=3)

> round(table.freq(h),2)
  Inf Sup  MC  fi  fri  Fi  Fri
20 25 22.5  1 0.07  1 0.07
25 30 27.5  3 0.20  4 0.27
30 35 32.5  0 0.00  4 0.27
35 40 37.5  0 0.00  4 0.27
40 45 42.5  6 0.40 10 0.67
45 50 47.5  4 0.27 14 0.93
50 55 52.5  1 0.07 15 1.00
```



## Diseño de experimentos aleatorización y libro de campo

Alpha design, Graeco, latin square, CRD, RCBD, BIB.

La planificación de experimentos de campo es una de las principales tareas de la librería Agricolae.

- ▶ Soporta un diseño de lattice simple ([lattice.simple](#)),
- ▶ Factorial en un diseño de bloques ([design.ab](#)),
- ▶ Diseño alfa ([alpha.design](#)),
- ▶ Bloques incompleto balanceado ([design.bib](#)),
- ▶ Bloques completos al azar ([design.rcbd](#)),
- ▶ Completamente al azar ([design.crd](#)),
- ▶ Greco latino ([design.graeco](#)),
- ▶ Cuadrado latino ([design.lsd](#)).

## Diseño Greco Latino

```
> T1<-c("a","b","c","d");
> T2<-c("v","w","x","y");
> Plan <- design.greco(T1,T2,number=101)
> t(matrix(paste(Plan$T1,Plan$T2),c(4,4)))
```

args: trt1, trt2, number = 1, seed = 0, kinds = "Super-Duper"

Parcelas	Tratamientos
[ ,1] [ ,2] [ ,3] [ ,4]	[ ,1] [ ,2] [ ,3] [ ,4]
[1,] 101 102 103 104	[1,] "d w" "b v" "a x" "c y"
[2,] 105 106 107 108	[2,] "b y" "d x" "c v" "a w"
[3,] 109 110 111 112	[3,] "a v" "c w" "d y" "b x"
[4,] 113 114 115 116	[4,] "c x" "a y" "b w" "d v"

No es posible para: 6,10 y pares >= 14

## Diseño Alfa (01)

( trt, k, r, number = 1, seed = 0, kinds = "Super-Duper")

```
> trt <- letters[1:12]
> plan<-design.alpha(trt,k=3, r=3, number=101, seed=55)
```

```
alpha design (0,1) - Serie I
Parameters Alpha design
=====
treatmeans : 12
Block size : 3
Blocks      : 4
Replication: 3

Efficiency factor
(E ) 0.7096774
<<< Book >>>
```

Libro de campo

```
> plan
  plots cols block trt replication
1     1   1   1   1   c           1
2     2   2   2   1   a           1
3     3   3   3   1   d           1
4     4   4   1   2   j           1
...
35    35  2   12  g           3
36    36  3   12  d           3
```

### Diseño alfa con semilla = 55

```
> fields<-plan[,4]
> dim(fields)<-c(k,s,r)
> for (i in 1:r) print(t(fields[,i]))
> plan$design # ver 1.0-5
```

I	II																														
<table style="width: 100%; border-collapse: collapse;"> <thead> <tr> <th style="text-align: left;">[,1]</th> <th style="text-align: left;">[,2]</th> <th style="text-align: left;">[,3]</th> </tr> </thead> <tbody> <tr><td>[1,] c</td><td>a</td><td>d</td></tr> <tr><td>[2,] j</td><td>f</td><td>k</td></tr> <tr><td>[3,] i</td><td>l</td><td>g</td></tr> <tr><td>[4,] b</td><td>h</td><td>e</td></tr> </tbody> </table>	[,1]	[,2]	[,3]	[1,] c	a	d	[2,] j	f	k	[3,] i	l	g	[4,] b	h	e	<table style="width: 100%; border-collapse: collapse;"> <thead> <tr> <th style="text-align: left;">[,1]</th> <th style="text-align: left;">[,2]</th> <th style="text-align: left;">[,3]</th> </tr> </thead> <tbody> <tr><td>[1,] j</td><td>c</td><td>b</td></tr> <tr><td>[2,] k</td><td>g</td><td>h</td></tr> <tr><td>[3,] a</td><td>i</td><td>f</td></tr> <tr><td>[4,] l</td><td>d</td><td>e</td></tr> </tbody> </table>	[,1]	[,2]	[,3]	[1,] j	c	b	[2,] k	g	h	[3,] a	i	f	[4,] l	d	e
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[1,] c	a	d																													
[2,] j	f	k																													
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[4,] b	h	e																													
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[2,] k	g	h																													
[3,] a	i	f																													
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[,1]	[,2]	[,3]																													
[1,] j	a	e																													
[2,] l	f	h																													
[3,] c	k	i																													
[4,] b	g	d																													

### Diseño de bloques incompleto balanceado

```
> trt<-c("A","B","C","D","E")
> k<-3
> bib <-design.bib(trt,k,number=101,kinds ="Super-Duper")
```

```
Parameters BIB
=====
Lambda      : 3
treatmeans  : 5
Block size  : 3
Blocks      : 10
Replication: 6
Efficiency factor
0.8333333
<<< Book >>>
```

```
> field <-as.character(bib[,3])
> t(matrix(field,c(3,5)))

      [,1] [,2] [,3]
[1,] "C"  "D"  "E"
[2,] "E"  "B"  "D"
[3,] "E"  "C"  "B"
[4,] "B"  "A"  "D"
[5,] "A"  "E"  "C"
[6,] "B"  "C"  "D"
[7,] "A"  "C"  "B"
[8,] "C"  "A"  "D"
[9,] "B"  "E"  "A"
[10,] "D"  "E"  "A"
```

## Diseño de bloques completos y cuadrado latino

```
> trt<-c("A", "B", "C", "D")
```

```
> rcbd <-design.rcbd(trt,5,45, kinds= "Super-Duper")
> plan <-as.character(rcbd[,3])
> dim(plan) <-c(4,5)
> print(t(plan))
```

Bloques  
→

	[,1]	[,2]	[,3]	[,4]
[1,]	"C"	"B"	"D"	"A"
[2,]	"B"	"D"	"C"	"A"
[3,]	"A"	"B"	"C"	"D"
[4,]	"B"	"A"	"D"	"C"
[5,]	"D"	"C"	"A"	"B"

```
> lsd <-design.lsd(trt,45,kinds="Super-Duper")
> plan <-as.character(lsd[,4])
> dim(plan) <-c(4,4)
> print(t(plan))
```

Latino { - Filas  
          - Columnas

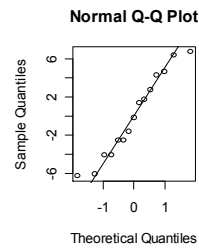
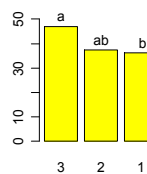
	[,1]	[,2]	[,3]	[,4]
[1,]	"C"	"A"	"B"	"D"
[2,]	"D"	"B"	"C"	"A"
[3,]	"A"	"C"	"D"	"B"
[4,]	"B"	"D"	"A"	"C"

## Comparación múltiple

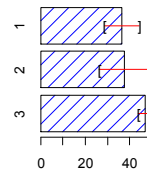
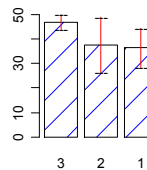
```
> modelo <- aov(primerasegunda+tercera+cuarta ~ bloque + tratamiento,papa)
> anova(modelo)
> cv.model(modelo)
```

```
> attach(papa)
```

```
> comparacion<- HSD.test(primerasegunda +
segunda + tercera +
cuarta,tratamiento, 8, 33.08)
```



```
> bar.group(comparacion, ylim=c(0,55), col="yellow")
> error<-residuals(modelo)
> shapiro.test(error)
> qqnorm(error)
> qqline(error)
```



```
> bar.err(comparacion,
ylim=c(0,55),col="blue",density=4)
```

```
> bar.err(comparacion, xlim=c(0,55),col="blue",density=8,horiz=T)
```

## AMMI : Estabilidad

```
> model <- AMMI(Localidad, Cip_Number,Rep, Fe,xlim=c(-3,3),ylim=c(-3,3),
,number=F, main="Hierro ppm")
```

ANALYSIS AMMI: Fe

Number of observations: 120

model Y: Fe ~ ENV + REP%in%ENV + GEN + ENV:GEN  
Random effect REP%in%ENV

Analysis of Variance Table

Response: Y

	Df	Sum Sq	Mean Sq	F value	Pr(>F)
ENV	2	1273.82	636.91	169.3027	0.000823 ***
REP(ENV)	3	11.29	3.76	1.6092	0.197280
GEN	19	703.11	37.01	15.8293	3.143e-16 ***
ENV:GEN	38	490.51	12.91	5.5215	4.463e-09 ***
Residuals	57	133.26	2.34		

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Coeff var	Mean Fe
9.914176	15.42227

Analysis

	percent	acum	Df	Sum.Sq	Mean.Sq	F.value	Pr.F
CP1	66.3	66.3	20	325.4555	16.272773	6.96	0
CP2	33.7	100.0	18	165.0577	9.169872	3.92	0
CP3	0.0	100.0	16	0.0000	0.000000	0.00	1

```
> AMMI.contour(model,distance=0.3,shape=20,col="red",lwd=2,lty=5)
```

Limit, radio: 0.8026402

Genotype in: 11

Genotype out: 9

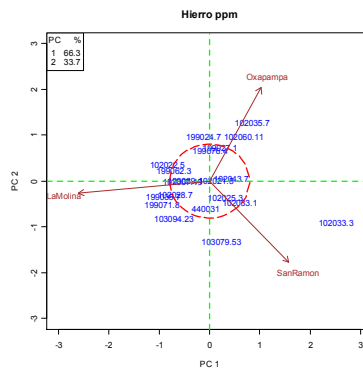
\$`GENOTYPE IN`

```
[1] "102007.19" "102021.5" "102025.3" "102028.7" "102033.1" "102043.7"
[7] "199027.1" "199062.3" "199069.1" "199076.4" "440031"
```

\$`GENOTYPE OUT`

```
[1] "102022.5" "102033.3" "102035.7" "102060.11" "103079.53" "103094.23"
"199024.7" "199035.7" "199071.8"
```

	distance
102007.19	0.5363391
102021.5	0.1360669
102022.5	0.9136192
102025.3	0.4729085
102028.7	0.7337491
.....	
199069.1	0.4897033
199071.8	1.0525786
199076.4	0.6850364
440031	0.5925231



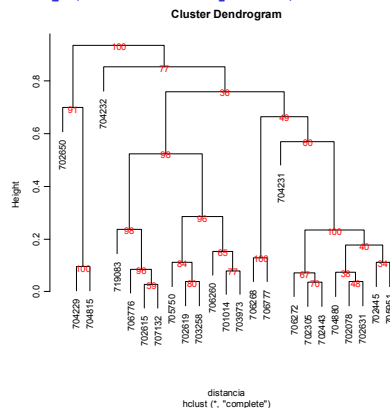
## Consensus cluster

Methods distance and clustering of R, functions `dist()` and `hclust()`.

```
(data, distance = c("binary", ..), method = c("complete", ..),  
nboot = 500, duplicate = TRUE, cex.text = 1, col.text = "red",  
...)
```

```
data(pamCIP); rownames(pamCIP)<-substr(rownames(pamCIP),1,6)  
output<-consensus(pamCIP,distance="binary", method="complete", nboot=500)
```

```
Duplicates: 18  
New data : 25 Records  
Consensus hclust  
Method distance: binary  
Method cluster : complete  
rows and cols : 25 107  
n-bootstrap : 500  
  
Run time : 16.281 secs
```



## Consensus cluster

Methods distance and clustering of R, functions `dist()` and `hclust()`.

```
(data, distance = c("binary", ..), method = c("complete", ..),  
nboot = 500, duplicate = TRUE, cex.text = 1, col.text = "red",  
...)
```

### OUTPUT

```
> names(output)  
[1] "table.dend" "dendrogram" "duplicates"
```

to reproduce dendrogram

```
dend<-output$dendrogram  
data<-output$table.dend  
plot(dend)  
text(data[,3],data[,4],data[,5],col="blue",cex=1)
```

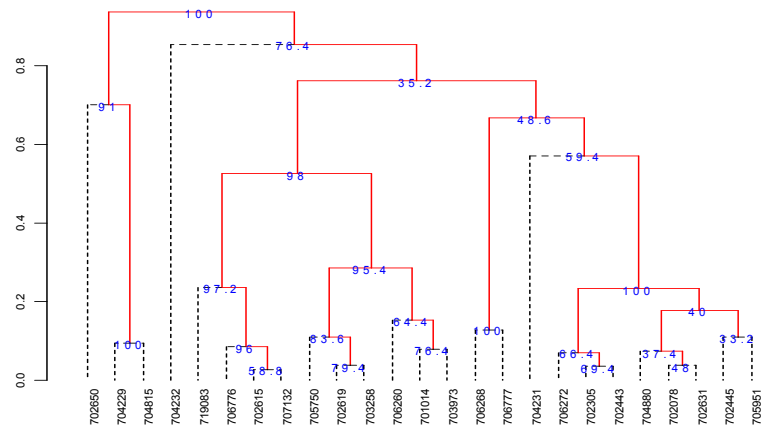
classical dendrogram

```
dend<-as.dendrogram(output$dendrogram)  
plot(dend,type="r",edgePar = list(lty=1:2, col=2:1))  
text(data[,3],data[,4],data[,5],col="blue",cex=1)
```

## Consensus cluster

Methods distance and clustering of R, functions `dist()` and `hclust()`.

```
(data, distance = c("binary", ..), method = c("complete", ..),
nboot = 500, duplicate = TRUE, cex.text = 1, col.text = "red",
...)
```



## Consensus cluster

Input: output consensus

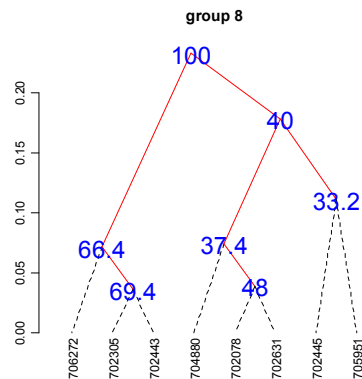
`hcut()`

```
(consensus, h, group, col.text = "blue", cex.text = 1, ...)
```

```
hcut(output,h=0.4,group=8,type="t",edgePar = list(lty=1:2,
col=2:1),main="group 8" ,col.text="blue",cex.text=2)
```

numbers

1	1
2	2
3	1
4	4
5	6
6	2
7	1
8	8



## Soil uniformity

```
Index.smith(data, ...)
```

```
table<-index.smith(rice, type="l",lty=4, lwd=3,
main="Relationship between CV\n per unit area and plot
size",col="red")
```

Smith's index of soil heterogeneity is used primarily to derive optimum plot size. The index gives a single value as a quantitative measure of soil heterogeneity in an area. The coefficient of variance is used to determine plot size and shape

```
> table
```

```
$model
lm(formula = CV ~
I(log(x)))
Coefficients:
(Intercept)      I(log(x))
 12.4782      -0.7009
```

```
$uniformity
      Size Width Length plots      Vx  CV
[1,]    1     1     1     648 9044.539 13.0
[2,]    2     1     2     324 7816.068 12.1
[3,]    2     2     1     324 7831.232 12.1
[4,]    3     1     3     216 7347.975 11.7
[5,]    3     3     1     216 7355.216 11.7
...
[40,]  162     9    18     4 4009.765  8.6
```

## Soil uniformity

```
Index.smith(data, ...)
```

```
table<-index.smith(rice, type="l",lty=4, lwd=3,
main="Relationship between CV\n per unit area and plot
size",col="red")
```

```
predict(table$model, new=data.frame(x=30))
```

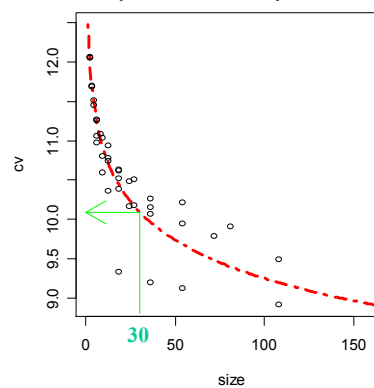
Relationship between CV per unit area and plot size

```
[1] 10.09436
```

If plot size = 30 unit <sup>2</sup>  
then CV = 10 %

rice

	V1	V2	V3	V4	V5
1	842	844	808	822	970
2	803	841	870	970	940
3	773	782	860	822	930
4	912	887	815	937	840
5	874	792	803	793	810
6	908	875	899	788	840
7	875	907	921	963	870
8	891	928	871	875	840
9	823	784	754	873	740



## Other functions and data sets

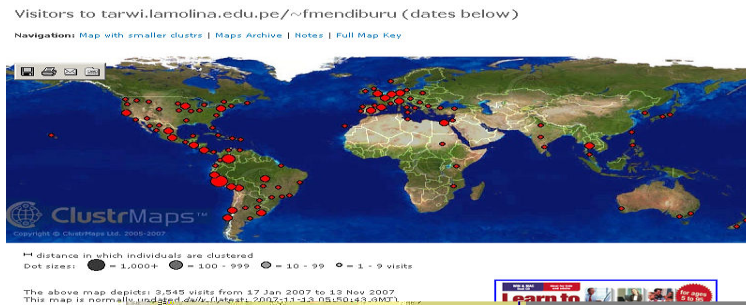
Genetic design: north carolina design, line x tester.  
Biodiversity index and confidence interval.  
Descriptive statistical: cross tabulations,...  
Model: simulation and resampling.

---

Data sets main in package 'agricolae':

ComasOxapampa	Data AUDPC Comas - Oxapampa
Glycoalkaloids	Data Glycoalkaloids
RioChillon	Data and analysis Mother and baby trials
clay	Data of Ralstonia population in clay soil
disease	Data evaluation of the disease overtime
huasahuasi	Data of yield in Huasahuasi
melon	Data of yield of melon in a Latin square experiment
natives	Data of native potato
pamCIP	Data Potato Wild
paracsho	Data of Paracsho biodiversity
ralstonia	Data of population bacterial Wilt: AUDPC
soil	Data of soil analysis for 13 localities
sweetpotato	Data of sweetpotato yield
trees	Data of species trees. Pucallpa
wilt	Data of Bacterial Wilt (AUDPC) and soil

2007  
Enero  
-  
Diciembre



2008  
Enero  
-  
Abril.

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Fachbereich Mathematik/Informatik  
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**Lineare Modelle und Versuchsplanung WS 2007/2008**  
**Linear Models and Experimental Design WS 2007/2008**

[http://www.mathematik.uni-kassel.de/~cmueller/Lehre/Versuchsplanung\\_WS0708.html](http://www.mathematik.uni-kassel.de/~cmueller/Lehre/Versuchsplanung_WS0708.html)

•**Content** The course has three parts: the lecture on Tuesday, which provides the methods, the tutorial and practice on Tuesday, where the methods are trained at data sets, and a second lecture for mathematicians at Thursday, where the mathematical foundations are given.  
The aim of the methodical parts of the course is that students should be able to analyse and design complex surveys and experiments with the free statistical software R. In particular the **R package “agricolae” is used but also other R packages for statistical analysis and for designing experiments are mentioned.** At first an introduction into the statistical software R is given and foundations of statistical testing are repeated at the example of the two-sample t-test. Then the analysis of variance (ANOVA) of one-way, two-way and multi-way layouts are presented and corresponding design questions as completely randomised block designs, balanced incomplete block designs, and split-block designs are considered. In a second part, regression experiments are studied, where linear and polynomial regression, multiple regression, the analysis of covariance and corresponding design considerations are treated. At last the multivariate analysis of variance (MANOVA) is presented.

**Agricolae Version 1.0-5**

<http://tarwi.lamolina.edu.pe/~fmendiburu>