Analyse en Composantes Principales (ACP)

Analyse R

07 mars 2025

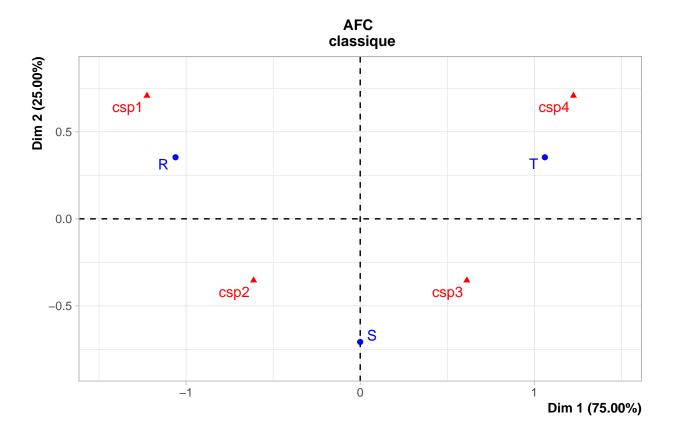
2 Données fictives

2.1 Création des données

```
csp <- as.factor(c("csp3","csp1","csp2","csp2","csp3","csp4"))
sport <- as.factor(c("S","R","R","S","T","T"))
fic.tab <- table(sport,csp)
fic.conting <- data.frame(unclass(fic.tab))
# Paramètres graphiques #
x11()
par(mfrow=c(1,3))</pre>
```

2.2 AFC de la table de contingence

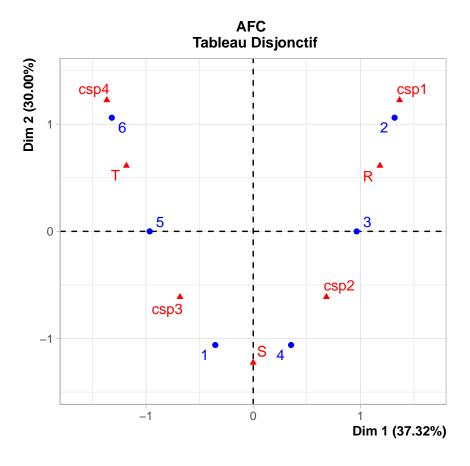
```
fic.afc <- CA(fic.conting,graph=FALSE)</pre>
fic.afc
## **Results of the Correspondence Analysis (CA)**
## The row variable has 3 categories; the column variable has 4 categories
## The chi square of independence between the two variables is equal to 6 \text{ (p-value = } 0.4231901 \text{)}.
## *The results are available in the following objects:
##
##
      name
                         description
## 1
     "$eig"
                         "eigenvalues"
## 2 "$col"
                         "results for the columns"
## 3 "$col$coord"
                         "coord. for the columns"
## 4 "$col$cos2"
                         "cos2 for the columns"
## 5 "$col$contrib"
                         "contributions of the columns"
## 6 "$row"
                         "results for the rows"
     "$row$coord"
                         "coord. for the rows"
## 7
     "$row$cos2"
                         "cos2 for the rows"
## 9 "$row$contrib"
                        "contributions of the rows"
## 10 "$call"
                         "summary called parameters"
## 11 "$call$marge.col" "weights of the columns"
## 12 "$call$marge.row" "weights of the rows"
```



2.3 AFC du tableau disjonctif complet

```
{\it\# Fonction construisant le tableau disjonctif complet \#}
disj.comp <- function(tab) {</pre>
n <- dim(tab)[1]</pre>
m <- dim(tab)[2]</pre>
ci <- sapply(tab,max)</pre>
c <- sum(ci)</pre>
disj.tab <- matrix(0,nrow=n,ncol=c)</pre>
id <- 0
for (j in 1:m) {
for (i in 1:n) {
disj.tab[i,id + tab[i,j]] <- 1</pre>
}
id <- id + ci[j]</pre>
}
disj.tab
# AFC du tableau disjonctif #
fic.disj.comp <- disj.comp(as.data.frame(cbind(csp,sport)))</pre>
colnames(fic.disj.comp) <- c(levels(csp),levels(sport))</pre>
```

```
fic.disj.afc <- CA(fic.disj.comp,graph=FALSE)</pre>
fic.disj.afc
## **Results of the Correspondence Analysis (CA)**
## The row variable has 6 categories; the column variable has 7 categories
## The chi square of independence between the two variables is equal to 30 (p-value = 0.4656537).
## *The results are available in the following objects:
##
##
                        description
      name
     "$eig"
                        "eigenvalues"
## 1
## 2
     "$col"
                        "results for the columns"
                        "coord. for the columns"
     "$col$coord"
## 3
                        "cos2 for the columns"
## 4
     "$col$cos2"
      "$col$contrib"
                        "contributions of the columns"
## 5
      "$row"
                        "results for the rows"
## 6
                        "coord. for the rows"
     "$row$coord"
## 7
## 8 "$row$cos2"
                        "cos2 for the rows"
## 9
     "$row$contrib"
                        "contributions of the rows"
## 10 "$call"
                        "summary called parameters"
## 11 "$call$marge.col" "weights of the columns"
## 12 "$call$marge.row" "weights of the rows"
```

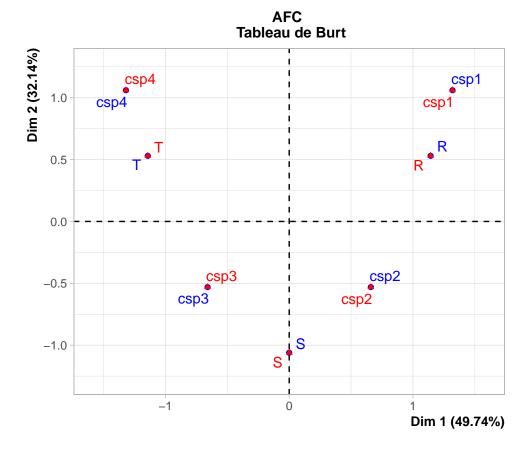


plot(fic.disj.afc,title="AFC \n Tableau Disjonctif")

2.4 AFC du tableau de Burt

plot(fic.burt.afc,title="AFC \n Tableau de Burt")

```
fic.burt <- t(fic.disj.comp) %*% fic.disj.comp</pre>
fic.burt.afc <- CA(fic.burt,graph=FALSE)</pre>
fic.burt.afc
## **Results of the Correspondence Analysis (CA)**
## The row variable has 7 categories; the column variable has 7 categories
\#\# The chi square of independence between the two variables is equal to 42 (p-value = 0.2269628 ).
## *The results are available in the following objects:
##
##
                        description
     name
## 1 "$eig"
                        "eigenvalues"
## 2 "$col"
                        "results for the columns"
                        "coord. for the columns"
## 3 "$col$coord"
## 4 "$col$cos2"
                        "cos2 for the columns"
                        "contributions of the columns"
## 5 "$col$contrib"
## 6 "$row"
                        "results for the rows"
                        "coord. for the rows"
## 7 "$row$coord"
## 8 "$row$cos2"
                        "cos2 for the rows"
## 9 "$row$contrib"
                        "contributions of the rows"
## 10 "$call"
                        "summary called parameters"
## 11 "$call$marge.col" "weights of the columns"
## 12 "$call$marge.row" "weights of the rows"
```



2.4.1 Comparaison des résultats des différentes analyses factorielle des correspondances (AFC)

Nous allons comparer les résultats obtenus en termes de valeurs propres et de graphique des représentations des individus et des modalités.

2.4.2 AFC de la table de contingence

- Chi carré : 6 (p-value = 0.423)
- Nombre de catégories :
- 3 modalités pour la variable "sport" (S, R, T)
- 4 modalités pour la variable "csp" (csp1, csp2, csp3, csp4)
- Valeurs propres (variance expliquée) :
- Dim 1 : **75.00**%
- Dim 2 : **25.00**%
- Interprétation graphique :
- La première dimension explique la majeure partie de l'inertie.
- Répartition relativement équilibrée des modalités sur le graphique.

2.4.3 AFC du tableau disjonctif complet

• Chi carré : 30 (p-value = 0.466)

• Nombre de catégories :

• 6 modalités (issues des deux variables combinées)

• 7 colonnes (variables binaires issues du codage disjonctif)

• Valeurs propres (variance expliquée) :

Dim 1 : 37.32%Dim 2 : 30.00%

• Interprétation graphique :

• La première dimension explique moins d'inertie que dans la table de contingence.

• Répartition plus dispersée des modalités, ce qui est attendu car le tableau disjonctif augmente le nombre de dimensions.

2.4.4 AFC du tableau de Burt

• Chi carré : 42 (p-value = 0.227)

• Nombre de catégories :

• 7 lignes et 7 colonnes

• Valeurs propres (variance expliquée) :

Dim 1 : 49.74%Dim 2 : 32.14%

• Interprétation graphique :

• Inertie de la première dimension plus importante que pour le tableau disjonctif complet.

• Structure plus dense des modalités, car le tableau de Burt est une matrice de produits scalaires entre les modalités.

2.4.5 Comparaison et conclusions

Méthode	Dim 1 (%)	Dim 2 (%)	Chi^2	p-value
Table de contingence	75.00	25.00	6	0.423
Tableau disjonctif	37.32	30.00	30	0.466
Tableau de Burt	49.74	32.14	42	0.227

Conclusion : - La table de contingence est idéale pour une interprétation simple des relations entre modalités. - Le tableau disjonctif complet offre plus de détails mais augmente la complexité de l'interprétation. - Le tableau de Burt donne une vue plus globale des relations entre toutes les modalités.

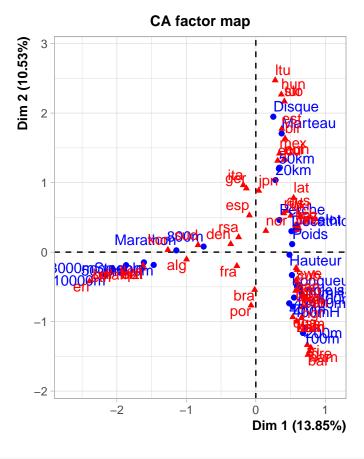
3. Données J.O

data(JO)

##		alg	aus	bah	bar	bdi	blr	bra	brn	can	chn	cub	cze	den	dom	ecu	eri
##	10000m	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1
##	100m	0	0	0	1	0	0	0	0	1	0	0	0	0	0	0	0
##	110mH	0	0	0	0	0	0	0	0	1	1	3	0	0	0	0	0
##	1500m	1	0	0	0	0	0	0	1	0	0	0	0	0	0	0	0
##	200m	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
##	20km	0	2	0	0	0	0	0	0	1	0	0	0	0	0	2	0
##	$3000 \mathtt{mSteeple}$	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
##	400m	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
##	400mH	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0
##	4x100m	0	0	0	0	0	0	2	0	1	0	2	0	0	0	0	0
##	4x400m	0	1	1	0	0	0	0	0	0	0	1	0	0	0	0	0
##	5000m	1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0
##	50km	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0
##	800m	1	0	0	0	0	0	0	0	0	0	0	0	2	0	0	0
##	Decathlon	0	0	0	0	0	1	0	0	0	0	1	3	0	0	0	0
##	Disque	0	0	0	0	0	2	0	0	0	0	1	0	0	0	0	0
##	Hauteur	1	0	0	0	0	0	0	0	0	0	2	1	0	0	0	0
##	Javelot	0	0	0	0	0	0	0	0	0	0	0	2	0	0	0	0
##	Longueur	0	1	0	0	0	0	0	0	0	0	2	0	0	0	0	0
##	Marathon	0	0	0	0	0	0	1	0	0	0	0	0	0	0	0	0
##	Marteau	0	0	0	0	0	2	0	0	0	0	0	0	0	0	0	0
##	Perche	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0
	Poids	0	0	0	0	0	1	0	0	0	0	0	0	1	0	0	0
##	Triple saut	0	0	2	0	0	0	0	0	0	0	2	. 0	. 0	, 0	0	, 0
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##	10000m	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	0
##	110mH	0	0	0	0	0	0	0	1	0	0	0	0	0	0	0	0
##	1500m	2	0	0	0	0	0	0	0	0	0	0	0	0	0	5	0
##	200m	0	0	0	0	0	0	1	0	1	0	0	1	0	0	0	0
##	20km	2	0	0	0	0	0	0	0	0	0	2	0	0	0	0	0
##	3000mSteeple	0	0	0	0	0	1	0	0	0	0	1	0	0	0	12	0
##	400m	0	0	0	0	0	0	1	0	0	0	0	1	0	0	1	0
##	400mH	0	0	0	0	0	1	1	0	0	0	0	2	0	0	0	0
##	4x100m	0	0	0	0	0	0	1	0	0	0	0	1	1	0	0	0
##	4x400m	0	0	0	0	0	0	2	0	0	0	0	2	0	0	0	0
##	5000m	0	0	4	0	0	0	0	1	0	0	0	0	0	0	5	0
##	50km	1	0	0	1	0	0	0	1	0	0	1	0	0	0	0	0
##	800m	0	0	0	0	0	0	0	1	0	0	0	0	0	0	5	0
##	Decathlon	1	1	0	0	0	0	0	1	0	0	0	0	0	1	0	0
##	Disque	0	2	0	0	0	0	0	3	0	1	0	0	0	0	0	0
##	Hauteur	0	0	0	0	0	0	2	0	0	0	0	0	0	0	0	0
##	Javelot	0	0	0	0	3	0	3	0	0	0	0	0	0	0	0	0
	Longueur	1	0	0	0	0	0	0	0	0	0	0	1	0	0	0	0
	Marathon	0	0	3	0	0	0	0	1	0	0	1	0	1	0	3	2
	Marteau	0	0	0	3	0	0	0	0	0	2	1	0	2	0	0	0
	Perche	1	0	0	2	0	1	0	1	0	0	1	0	0	0	0	0
	Poids	0	0	0	1	1	0	0	0	0	0	0	0	0	0	0	0
	Triple saut	0	0	0	0	0	0	3	0	0	0	0	0	0	0	0	0
##	10000	ksa						ngr			-	-	-	_			
	10000m	0	0	0	2	0	0	0	0	0	0	0	0	0	0	0	0
	100m	0	0	0	0	0	2	0	0	0	0	0	1	0	0	0	0
##	110mH	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0

```
## 1500m
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## 3000mSteeple
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## 400m
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## 400mH
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## 4x100m
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## 4x400m
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## 5000m
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## 50km
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## 800m
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## Decathlon
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## Disque
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                               0
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## Hauteur
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## Javelot
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## Longueur
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## Marathon
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## Perche
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## 100m
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## 110mH
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## 1500m
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## 200m
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## 20km
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## 3000mSteeple
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## 400m
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## 400mH
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## 4x100m
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## 4x400m
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## Decathlon
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## Disque
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## Hauteur
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## Javelot
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## Longueur
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## Marathon
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## Marteau
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## Perche
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## Poids
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## Triple saut
                     0
                                    0
                                         0
                                             0
                                                  0
                                                       0
                               1
```

J0.ca <- CA(J0)</pre>



JO.ca

```
## **Results of the Correspondence Analysis (CA)**
## The row variable has 24 categories; the column variable has 58 categories
## The chi square of independence between the two variables is equal to 2122.231 (p-value = 2.320981e-
## *The results are available in the following objects:
##
##
     name
                        description
     "$eig"
                        "eigenvalues"
## 1
## 2
     "$col"
                        "results for the columns"
## 3 "$col$coord"
                        "coord. for the columns"
     "$col$cos2"
                        "cos2 for the columns"
## 4
                        "contributions of the columns"
     "$col$contrib"
## 5
## 6
     "$row"
                        "results for the rows"
                        "coord. for the rows"
## 7
     "$row$coord"
                        "cos2 for the rows"
## 8
     "$row$cos2"
## 9 "$row$contrib"
                        "contributions of the rows"
## 10 "$call"
                        "summary called parameters"
## 11 "$call$marge.col" "weights of the columns"
## 12 "$call$marge.row" "weights of the rows"
```

round(J0.ca\$eig,2)

```
## dim 2
                 0.62
                                         10.53
                                                                             24.38
## dim 3
                                                                             33.62
                 0.54
                                         9.23
## dim 4
                 0.48
                                         8.16
                                                                             41.78
## dim 5
                 0.40
                                         6.72
                                                                             48.50
## dim 6
                 0.36
                                         6.17
                                                                             54.67
## dim 7
                 0.33
                                         5.55
                                                                             60.23
## dim 8
                 0.32
                                         5.35
                                                                             65.58
## dim 9
                 0.27
                                         4.56
                                                                             70.14
## dim 10
                 0.24
                                         4.16
                                                                             74.29
## dim 11
                 0.23
                                         3.91
                                                                             78.20
## dim 12
                 0.18
                                         3.11
                                                                             81.31
                                                                             84.09
## dim 13
                 0.16
                                         2.78
## dim 14
                 0.14
                                                                             86.55
                                         2.46
## dim 15
                 0.13
                                         2.22
                                                                             88.77
## dim 16
                 0.12
                                         2.06
                                                                             90.82
## dim 17
                 0.10
                                         1.76
                                                                             92.58
## dim 18
                 0.09
                                         1.58
                                                                             94.16
                 0.08
## dim 19
                                         1.44
                                                                             95.60
                 0.08
## dim 20
                                         1.35
                                                                             96.95
## dim 21
                                                                             98.21
                 0.07
                                         1.27
## dim 22
                 0.06
                                         1.05
                                                                             99.27
## dim 23
                 0.04
                                         0.73
                                                                            100.00
```

Valeurs propres

