

Perlombongan Data Jujukan

```
data(mvad)
str(mvad)
```

```
## 'data.frame':    712 obs. of  86 variables:
## $ id      : int  1 2 3 4 5 6 7 8 9 10 ...
## $ weight  : num  0.33 0.57 1.59 1.59 0.57 1.59 0.57 2.75 2 3.6 ...
## $ male    : Factor w/ 2 levels "no","yes": 1 1 2 1 2 2 2 2 1 1 ...
## $ catholic : Factor w/ 2 levels "no","yes": 1 1 2 1 1 2 2 2 1 1 ...
## $ Belfast : Factor w/ 2 levels "no","yes": 1 1 1 1 1 1 1 1 1 1 ...
## $ N.Eastern: Factor w/ 2 levels "no","yes": 1 1 1 1 1 1 1 1 1 1 ...
## $ Southern: Factor w/ 2 levels "no","yes": 1 1 1 1 1 1 1 1 1 1 ...
## $ S.Eastern: Factor w/ 2 levels "no","yes": 1 1 1 1 1 1 1 1 2 2 ...
## $ Western  : Factor w/ 2 levels "no","yes": 2 2 2 2 2 2 2 2 1 1 ...
## $ Grammar  : Factor w/ 2 levels "no","yes": 1 1 1 1 1 1 1 2 1 1 ...
## $ funemp   : Factor w/ 2 levels "no","yes": 1 1 1 1 2 1 1 1 1 1 ...
## $ gcse5eq  : Factor w/ 2 levels "no","yes": 1 2 1 1 1 1 1 1 1 1 ...
## $ fmpr     : Factor w/ 2 levels "no","yes": 2 1 1 1 1 1 1 2 1 1 ...
## $ livboth  : Factor w/ 2 levels "no","yes": 2 2 2 2 2 1 1 2 1 2 ...
## $ Jul.93   : Factor w/ 6 levels "school","FE",...: 4 5 5 4 5 5 5 3 5 3 ...
## $ Aug.93   : Factor w/ 6 levels "school","FE",...: 4 5 5 4 5 5 5 3 5 3 ...
## $ Sep.93   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 5 2 2 4 1 ...
## $ Oct.93   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 1 ...
## $ Nov.93   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 1 ...
## $ Dec.93   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 1 ...
## $ Jan.94   : Factor w/ 6 levels "school","FE",...: 4 2 4 4 2 4 2 2 4 1 ...
## $ Feb.94   : Factor w/ 6 levels "school","FE",...: 4 2 4 4 2 4 2 2 4 1 ...
## $ Mar.94   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 1 ...
## $ Apr.94   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 1 ...
## $ May.94   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 1 ...
## $ Jun.94   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 1 ...
## $ Jul.94   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 5 ...
## $ Aug.94   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 5 ...
## $ Sep.94   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 3 ...
## $ Oct.94   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 3 ...
## $ Nov.94   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 3 ...
## $ Dec.94   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 3 ...
## $ Jan.95   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 3 ...
## $ Feb.95   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 3 ...
## $ Mar.95   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 3 ...
## $ Apr.95   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 3 ...
## $ May.95   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 4 3 ...
## $ Jun.95   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 2 3 3 ...
## $ Jul.95   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 3 3 3 ...
## $ Aug.95   : Factor w/ 6 levels "school","FE",...: 3 2 4 4 2 4 2 3 3 3 ...
## $ Sep.95   : Factor w/ 6 levels "school","FE",...: 3 2 2 4 2 4 2 3 3 3 ...
## $ Oct.95   : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 4 2 3 3 3 ...
```

```

## $ Nov.95 : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 4 2 3 3 3 ...
## $ Dec.95 : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 4 2 3 3 3 ...
## $ Jan.96 : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 4 2 3 3 3 ...
## $ Feb.96 : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 4 2 3 3 3 ...
## $ Mar.96 : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 4 3 3 3 3 ...
## $ Apr.96 : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 4 3 3 3 3 ...
## $ May.96 : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 4 3 3 3 3 ...
## $ Jun.96 : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 4 3 3 3 3 ...
## $ Jul.96 : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 3 3 3 3 3 ...
## $ Aug.96 : Factor w/ 6 levels "school","FE",...: 3 2 2 4 6 3 3 3 3 3 ...
## $ Sep.96 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ Oct.96 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ Nov.96 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ Dec.96 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ Jan.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ Feb.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ Mar.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ Apr.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ May.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ Jun.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ Jul.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 4 6 3 3 3 3 3 ...
## $ Aug.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ Sep.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ Oct.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ Nov.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ Dec.97 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ Jan.98 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ Feb.98 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ Mar.98 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ Apr.98 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ May.98 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ Jun.98 : Factor w/ 6 levels "school","FE",...: 3 6 2 3 6 3 3 3 3 3 ...
## $ Jul.98 : Factor w/ 6 levels "school","FE",...: 3 6 3 3 6 3 3 3 3 5 ...
## $ Aug.98 : Factor w/ 6 levels "school","FE",...: 3 6 3 3 6 3 3 3 3 5 ...
## $ Sep.98 : Factor w/ 6 levels "school","FE",...: 3 6 3 3 6 3 3 3 3 5 ...
## $ Oct.98 : Factor w/ 6 levels "school","FE",...: 3 6 3 5 6 3 3 3 3 5 ...
## $ Nov.98 : Factor w/ 6 levels "school","FE",...: 3 6 3 5 6 3 3 3 3 5 ...
## $ Dec.98 : Factor w/ 6 levels "school","FE",...: 3 6 3 5 6 3 3 3 3 5 ...
## $ Jan.99 : Factor w/ 6 levels "school","FE",...: 3 6 3 5 6 3 3 3 3 5 ...
## $ Feb.99 : Factor w/ 6 levels "school","FE",...: 3 6 3 5 6 3 3 3 3 5 ...
## $ Mar.99 : Factor w/ 6 levels "school","FE",...: 3 6 3 5 6 3 3 3 3 5 ...
## $ Apr.99 : Factor w/ 6 levels "school","FE",...: 3 6 3 5 6 3 3 3 3 5 ...
## $ May.99 : Factor w/ 6 levels "school","FE",...: 3 6 5 5 6 3 3 3 3 5 ...
## $ Jun.99 : Factor w/ 6 levels "school","FE",...: 3 6 5 5 6 3 3 3 3 5 ...

```

Lajur 1-14 adalah maklumat demografi, bukan data jujukan.

Data jujukan bermula lajur 15-86.

Takrifkan label dan kod bagi setiap keadaan.

Penunjuk ringkasan statistik

1. Min (purata) masa proses berada dalam setiap keadaan.

```
seqmeant(mvad.seq)
```

```
##      Mean
## EM 32.2
## FE 11.7
## HE  8.4
## JL  6.2
## SC  6.1
## TR  7.4
```

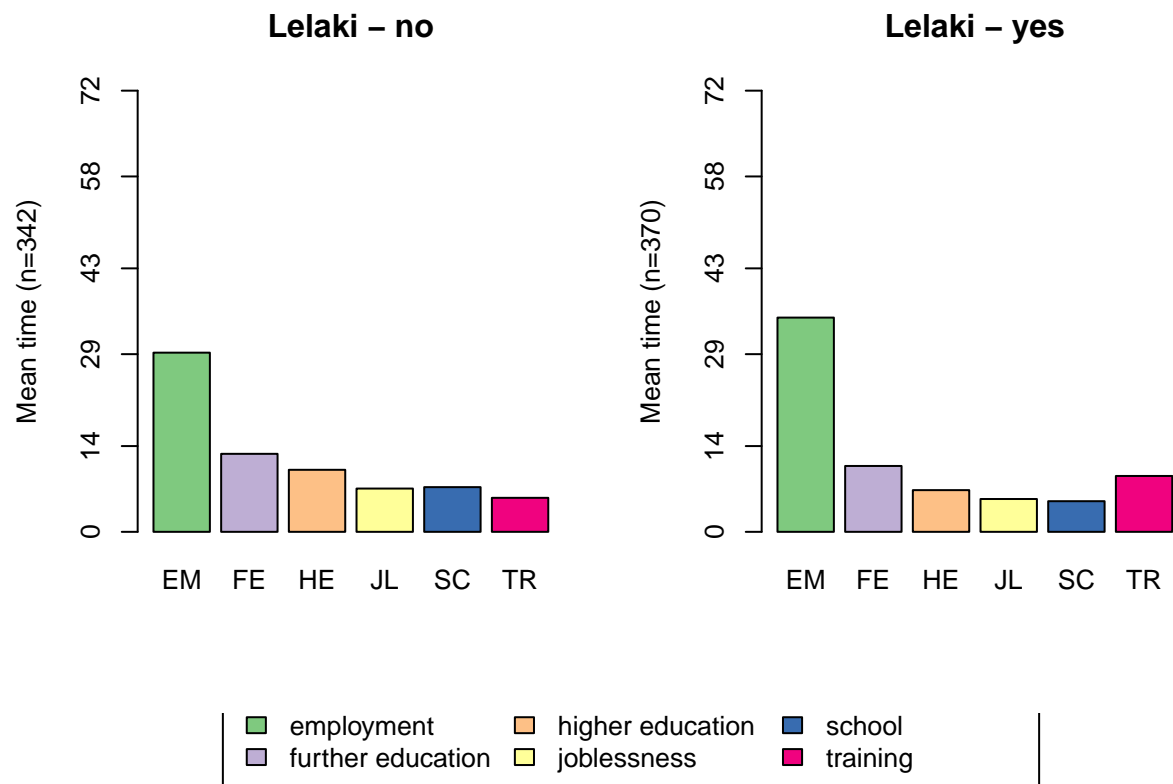
2. Min (purata) masa proses berada dalam setiap keadaan bagi kumpulan tertentu.

Bagi kumpulan Jantina

```
by(mvad.seq,mvad$male,seqmeant)
```

```
## mvad$male: no
##      Mean
## EM 29.2
## FE 12.7
## HE 10.1
## JL  7.1
## SC  7.3
## TR  5.5
## -----
## mvad$male: yes
##      Mean
## EM 35.0
## FE 10.8
## HE  6.8
## JL  5.4
## SC  5.0
## TR  9.1
```

```
seqmplot(mvad.seq, group = mvad$male, main='Lelaki')
```

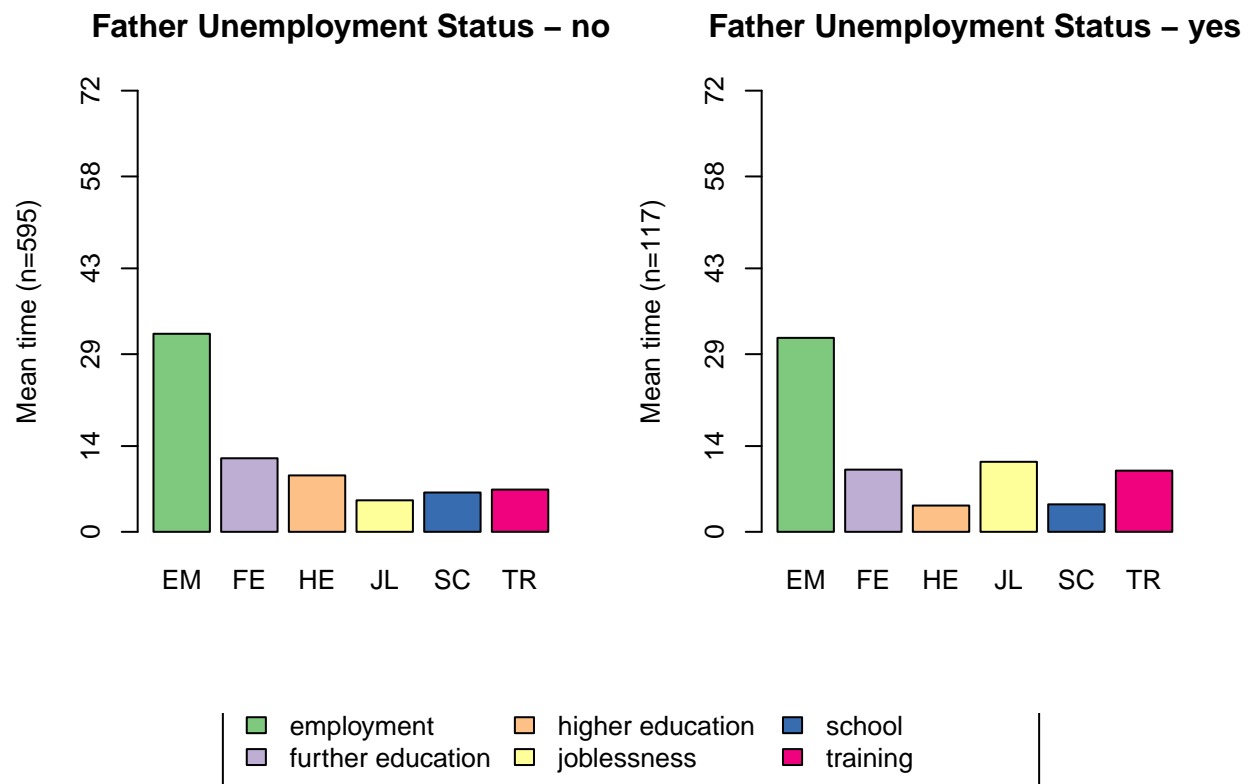


```
by(mvad.seq,mvad$funemp,seqmeant)
```

```
## mvad$funemp: no
##   Mean
## EM 32.3
## FE 12.0
## HE  9.2
## JL  5.1
## SC  6.4
## TR  6.9
## -----
## mvad$funemp: yes
##   Mean
## EM 31.7
## FE 10.2
## HE  4.3
## JL 11.4
## SC  4.5
## TR 10.0
```

Pengvisualan

```
seqmplot(mvad.seq, group = mvad$funemp, main='Father Unemployment Status')
```



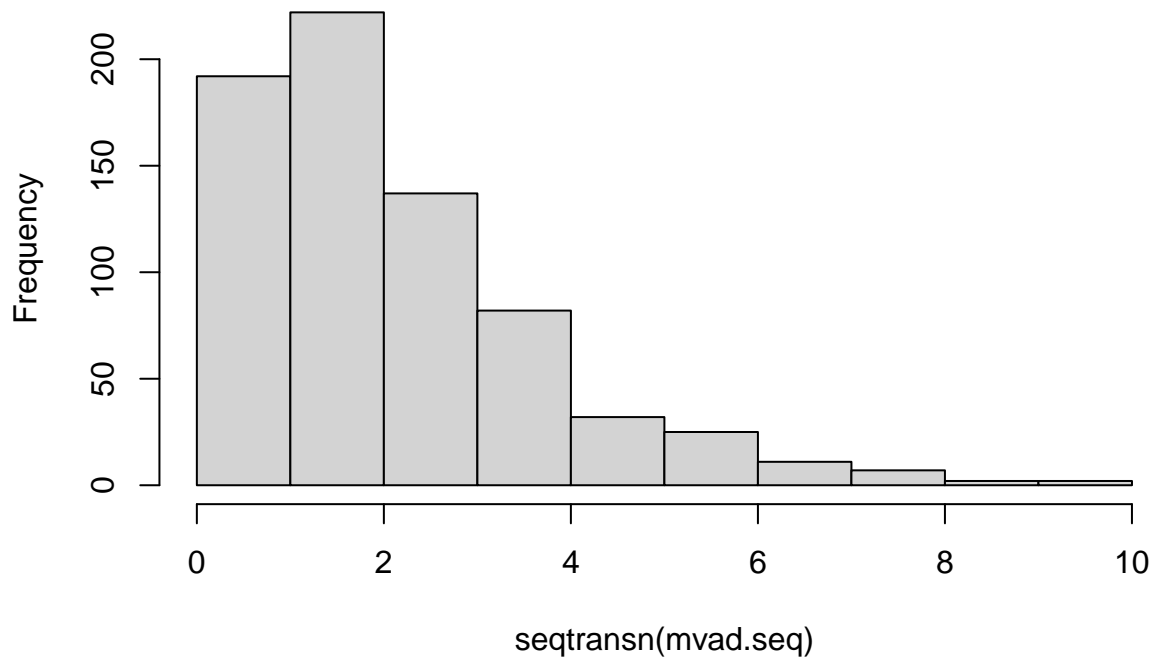
3. Bilangan transisi (peralihan)

```
head(seqtransn(mvad.seq),10)
```

```
##      Trans.
## 1         3
## 2         2
## 3         4
## 4         2
## 5         2
## 6         2
## 7         2
## 8         2
## 9         2
## 10        4
```

```
hist(seqtransn(mvad.seq), main = 'Bilangan Transisi')
```

Bilangan Transisi



4. Kadar peralihan.

```
mvad.trate = seqtrate(mvad.seq)
```

```
## [>] computing transition probabilities for states EM/FE/HE/JL/SC/TR ...
```

```
mvad.trate
```

```
##          [-> EM]      [-> FE]      [-> HE]      [-> JL]      [-> SC]
## [EM ->] 0.98156148 0.0051218100 0.002494099 0.006502472 0.0017369617
## [FE ->] 0.02727710 0.9525354482 0.006488825 0.008771930 0.0009613074
## [HE ->] 0.01023541 0.0001705902 0.987205732 0.001876493 0.0000000000
## [JL ->] 0.04226660 0.0278680910 0.002090107 0.903855086 0.0090571296
## [SC ->] 0.01357883 0.0115074799 0.017031070 0.005293441 0.9482163406
## [TR ->] 0.03742401 0.0039893617 0.000000000 0.013107903 0.0007598784
##          [-> TR]
## [EM ->] 0.0025831737
## [FE ->] 0.0039653929
## [HE ->] 0.0005117707
## [JL ->] 0.0148629819
## [SC ->] 0.0043728423
## [TR ->] 0.9447188450
```

5. Keadaan peralihan yang bergantung terhadap masa.

```
, , Jul.93
      [-> EM]      [-> FE] [-> HE]      [-> JL] [-> SC]      [-> TR]
[EM ->] 0.982658960 0.000000000      0 0.01156069      0 0.005780347
[FE ->] 0.000000000 1.000000000      0 0.00000000      0 0.000000000
[HE ->] 0.000000000 0.000000000      0 0.00000000      0 0.000000000
[JL ->] 0.037837838 0.005405405      0 0.92972973      0 0.027027027
[SC ->] 0.000000000 0.000000000      0 0.00000000      1 0.000000000
[TR ->] 0.008196721 0.000000000      0 0.00000000      0 0.991803279

, , Aug.93
      [-> EM]      [-> FE] [-> HE]      [-> JL] [-> SC]      [-> TR]
[EM ->] 0.382022472 0.39887640      0 0.005617978 0.16853933 0.04494382
[FE ->] 0.000000000 1.00000000      0 0.000000000 0.00000000 0.00000000
[HE ->] 0.000000000 0.00000000      0 0.000000000 0.00000000 0.00000000
[JL ->] 0.057471264 0.49425287      0 0.086206897 0.21264368 0.14942529
[SC ->] 0.007407407 0.12592593      0 0.000000000 0.81481481 0.05185185
[TR ->] 0.031496063 0.02362205      0 0.007874016 0.01574803 0.92125984
```

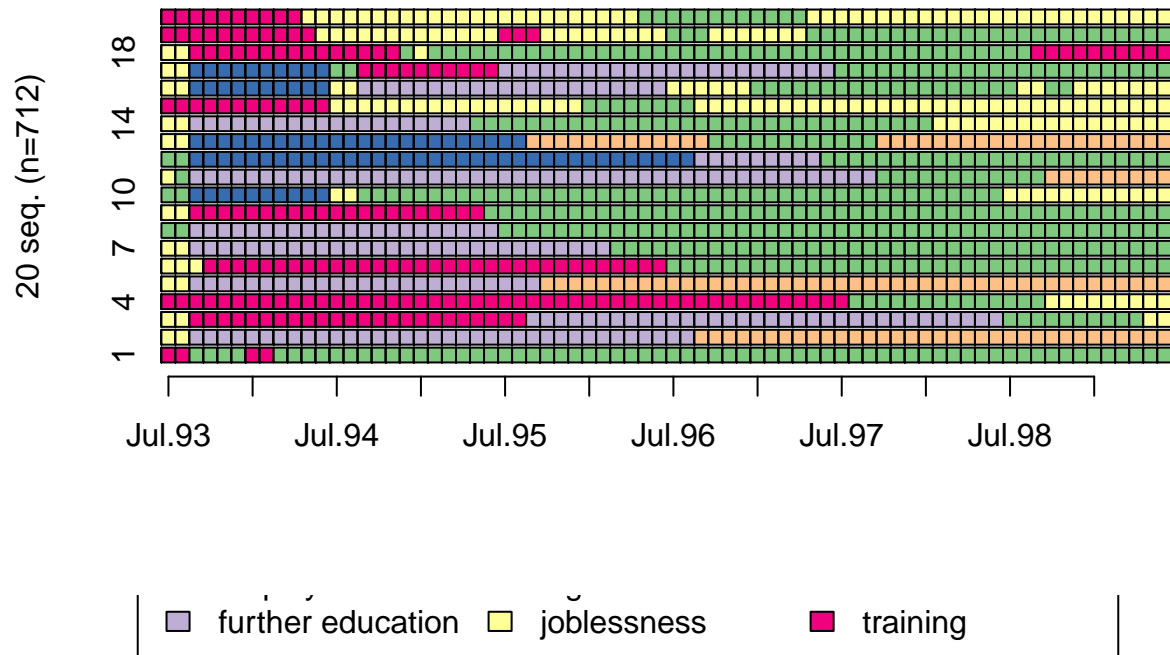
Pengvisualan

Plot indeks jujukan

20 Individu pertama

```
seqplot(mvad.seq, main='Plot indeks jujukan',
        idxs=1:20)
```

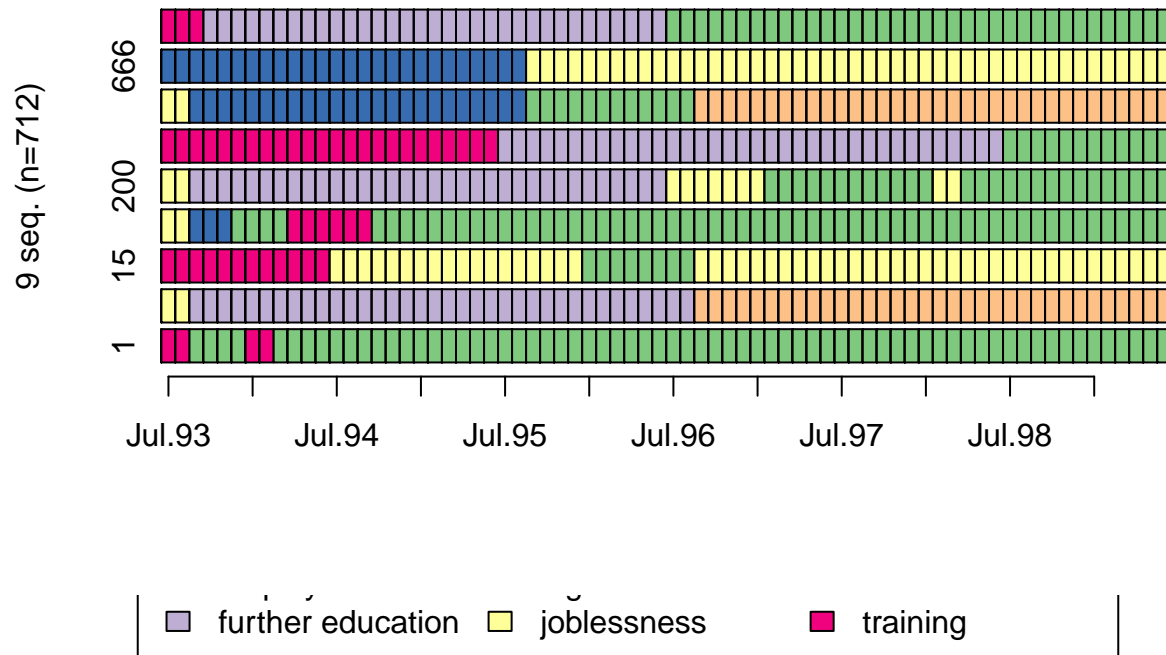

Plot indeks jujukan



pilih individu khusus (1,2,15,90,200,267, 456,666,700)

```
seqiplot(mvad.seq, main='Plot indeks jujukan',
         idxs=c(1,2,15,90,200,267, 456,666,700))
```

Plot indeks jujukan

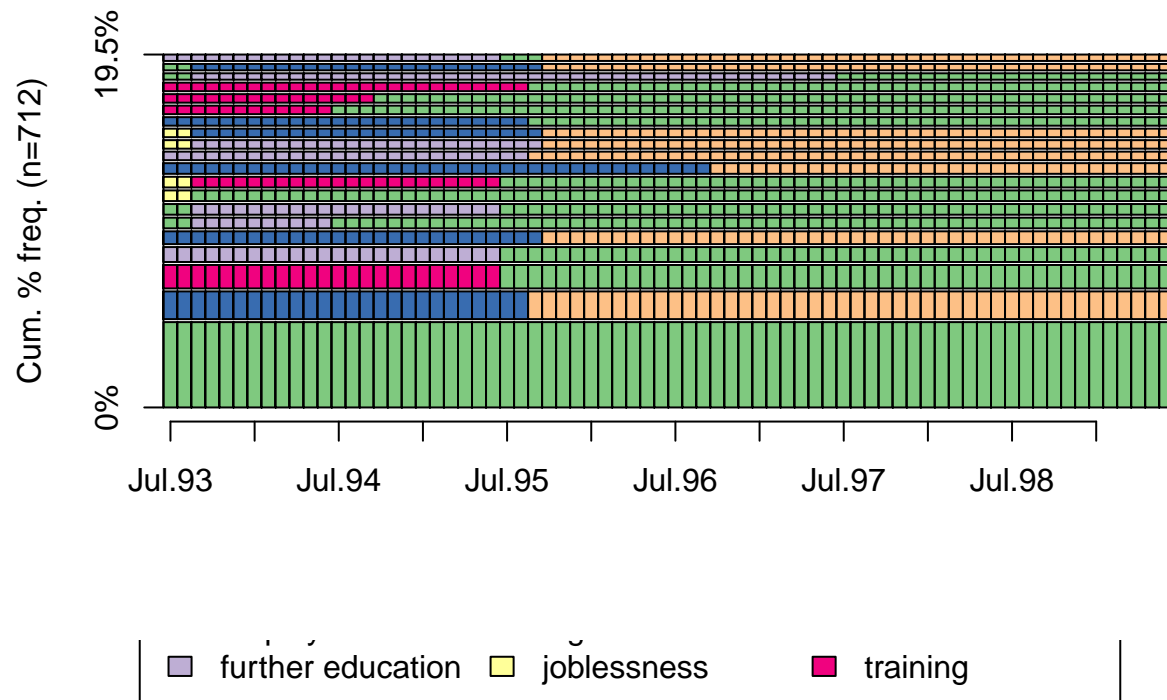


Plot Jujukan kekerapan

20 jujukan yang paling kerap berlaku

```
seqfplot(mvad.seq, main='20 jujukan yang paling kerap berlaku',
         idxs=1:20)
```

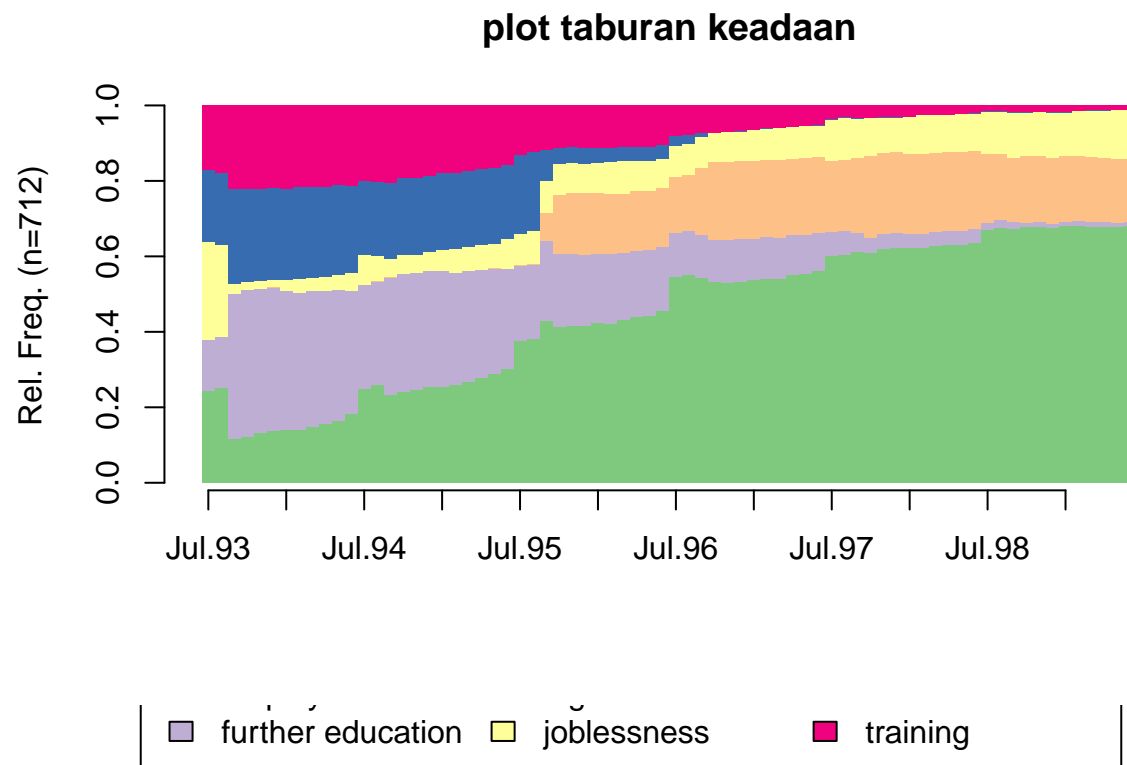
20 jujukan yang paling kerap berlaku



Plot taburan keadaan

corak umum keseluruhan set trajektori dalam data jujukan

```
seqdplot(mvad.seq, border=NA,
         main='plot taburan keadaan')
```

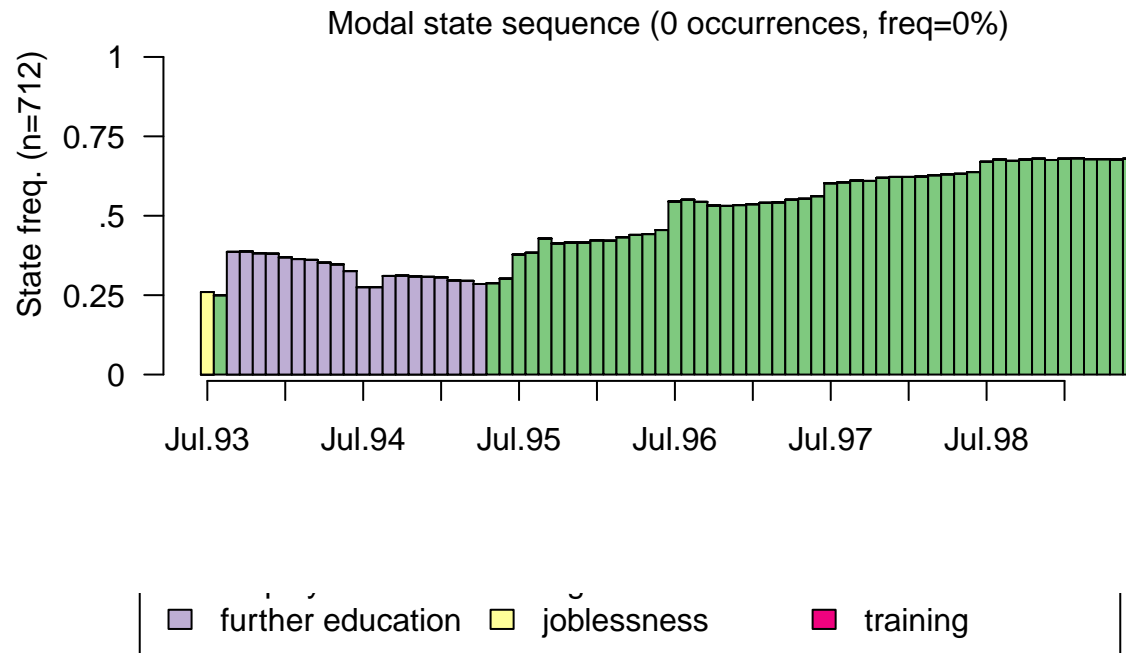


Plot keadaan modal

jujukan bagi keadaan yang paling kerap berlaku pada setiap kedudukan

keadaan dominan pada setiap masa

```
seqmsplot(mvad.seq)
```



Indeks Entropi

Ukuran terhadap variasi keadaan dalam data jujukan

$$h(p_1, \dots, p_a) = - \sum_{i=1}^a p_i \log(p_i)$$

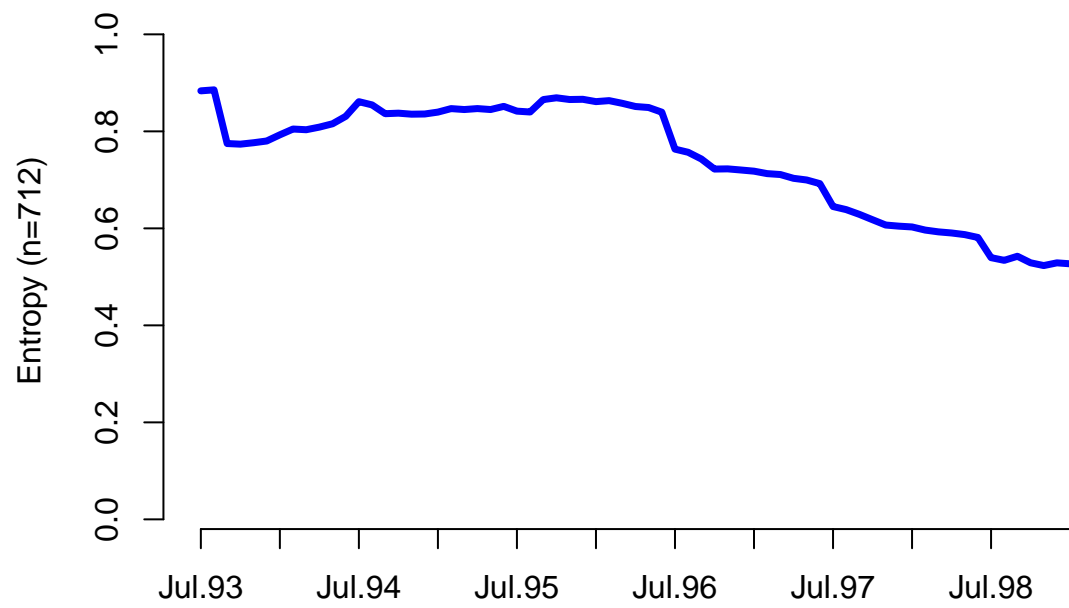
dengan p_i ialah perkadaran entiti dalam keadaan- i , a ialah bilangan keadaan.

Jika nilai entropi= 0 menunjukkan bahawa semua entiti berada dalam keadaan yang sama (variasi adalah 0)

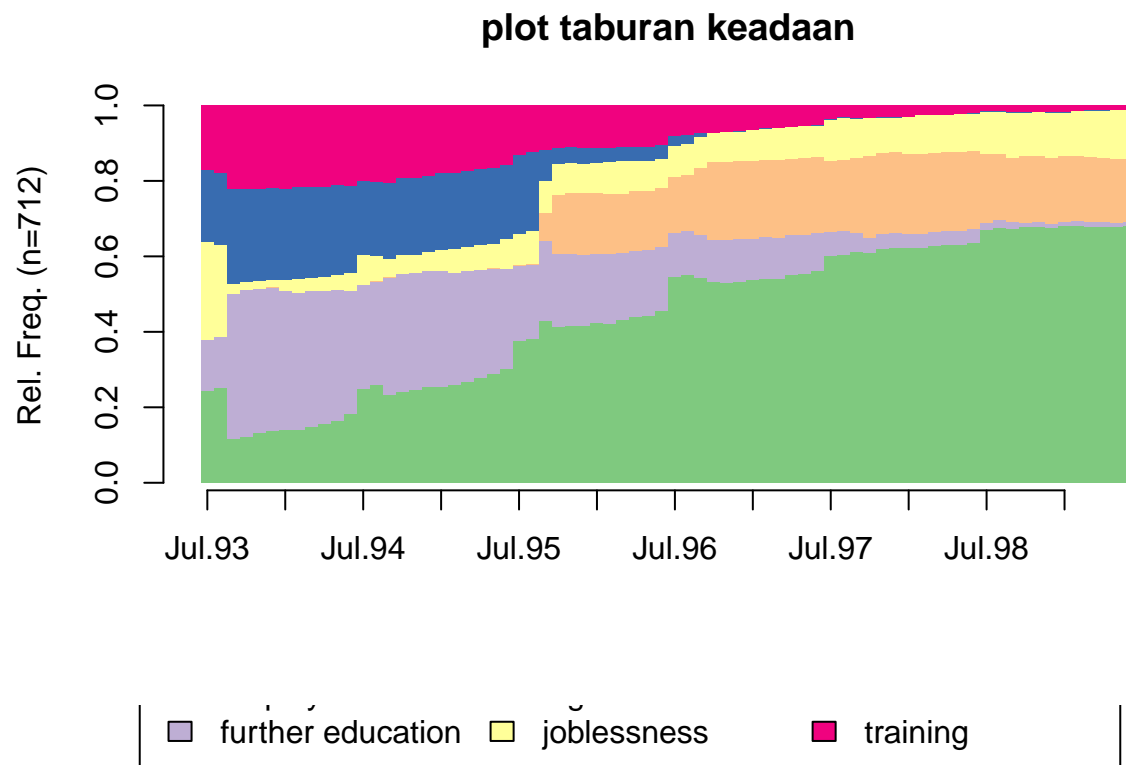
Entropi Rentas Lintang

```
seqHtplot(mvad.seq, main='Entropi Rentas Lintang')
```

Entropi Rentas Lintang



```
seqdplot(mvad.seq, border=NA, main='plot taburan keadaan')
```



Data Jujukan Peristiwa

```
mvad.seqe = seqecreate(mvad.seq)
head(mvad.seqe)
```

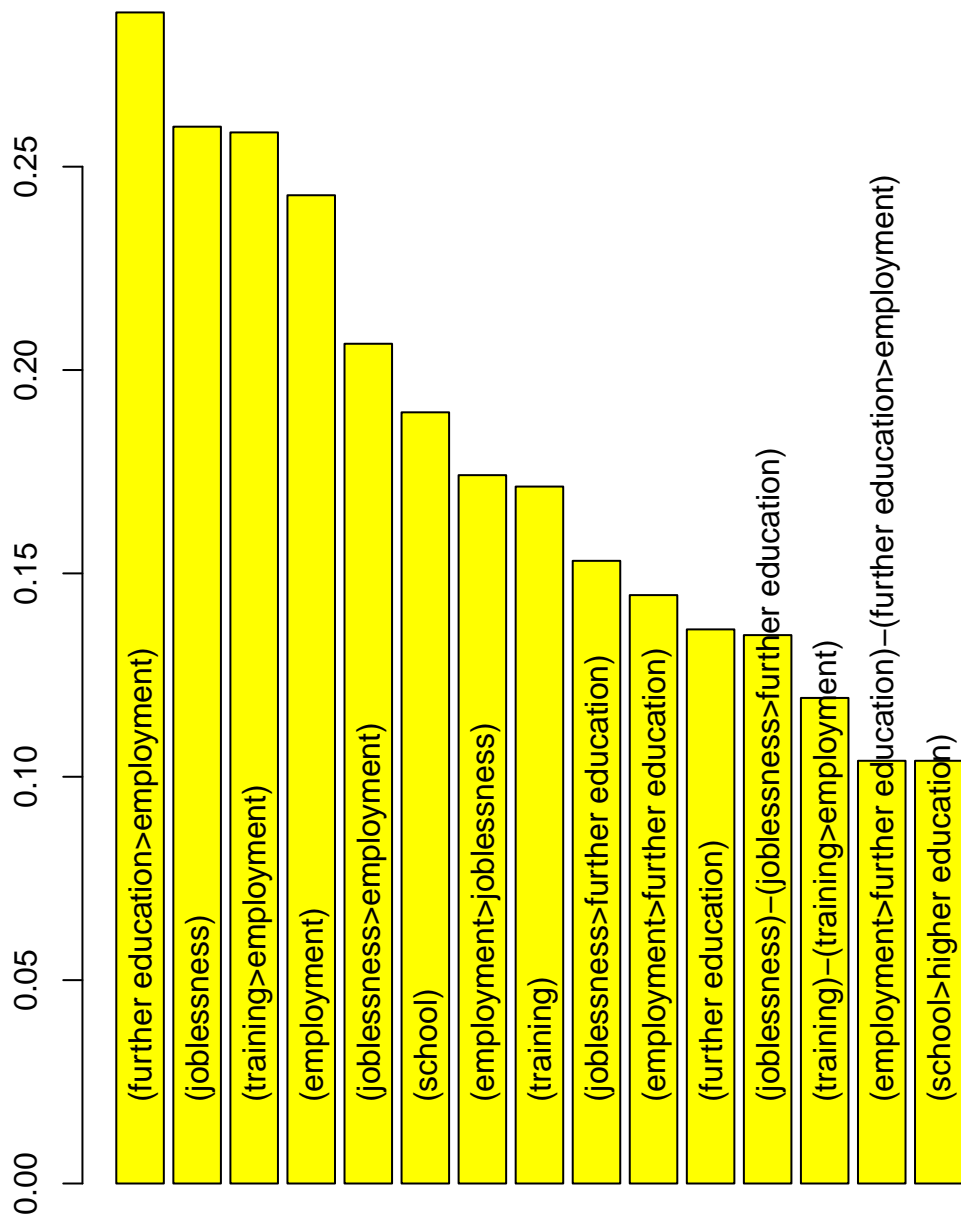
```
## [1] (training)-2-(training>employment)-4-(employment>training)-2-(training>employment)-64
## [2] (joblessness)-2-(joblessness>further education)-36-(further education>higher education)-34
## [3] (joblessness)-2-(joblessness>training)-24-(training>further education)-34-(further education>emp
## [4] (training)-49-(training>employment)-14-(employment>joblessness)-9
## [5] (joblessness)-2-(joblessness>further education)-25-(further education>higher education)-45
## [6] (joblessness)-3-(joblessness>training)-33-(training>employment)-36
```

Sub-jujukan

```
fsubseq = seqefsub(mvad.seqe, pmin.support=0.05)
```

15 subjujukan paling kerap

```
plot(fsubseq[1:15], col='yellow')
```



Mengkategorikan corak

```
library(cluster)
```

```
submat = seqsubm(mvad.seq, method = 'TRATE')
```

```
## [>] creating substitution-cost matrix using transition rates ...
```

```
## [>] computing transition probabilities for states EM/FE/HE/JL/SC/TR ...
```

```
submat
```

```
##           EM      FE      HE      JL      SC      TR
## EM 0.000000 1.967601 1.987270 1.951231 1.984684 1.959993
## FE 1.967601 0.000000 1.993341 1.963360 1.987531 1.992045
## HE 1.987270 1.993341 0.000000 1.996033 1.982969 1.999488
## JL 1.951231 1.963360 1.996033 0.000000 1.985649 1.972029
## SC 1.984684 1.987531 1.982969 1.985649 0.000000 1.994867
## TR 1.959993 1.992045 1.999488 1.972029 1.994867 0.000000
```

```
dist.om = seqdist(mvad.seq, method='OM',sm=submat)
```

```
## [>] 712 sequences with 6 distinct states
```

```
## [>] checking 'sm' (size and triangle inequality)
```

```
## [>] 557 distinct sequences
```

```
## [>] min/max sequence lengths: 72/72
```

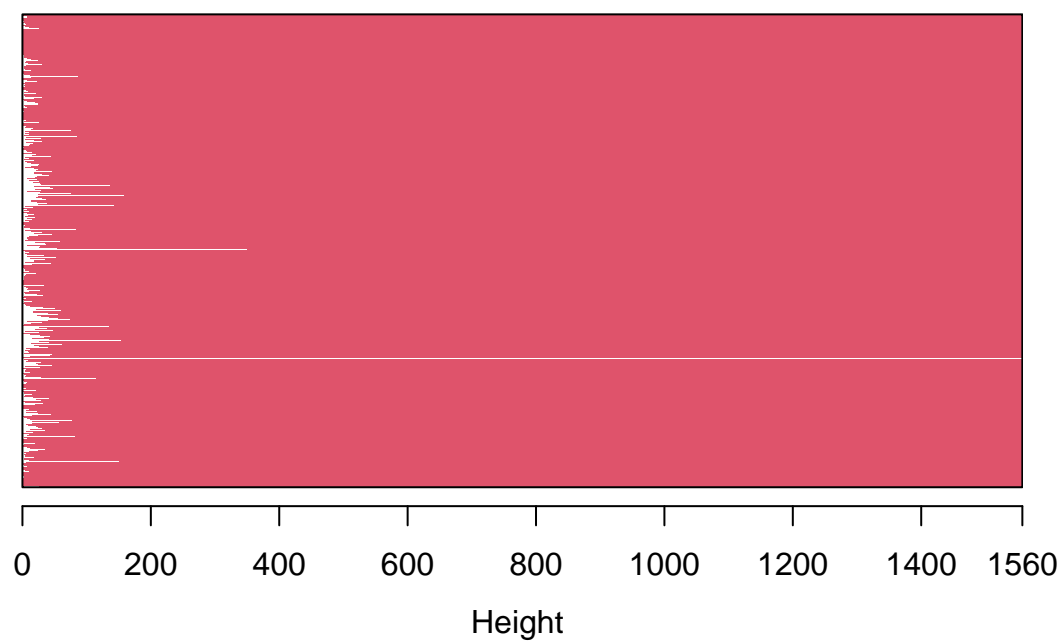
```
## [>] computing distances using the OM metric
```

```
## [>] elapsed time: 0.86 secs
```

dapatkan kelompok dalam data berdasarkan jarak optimum

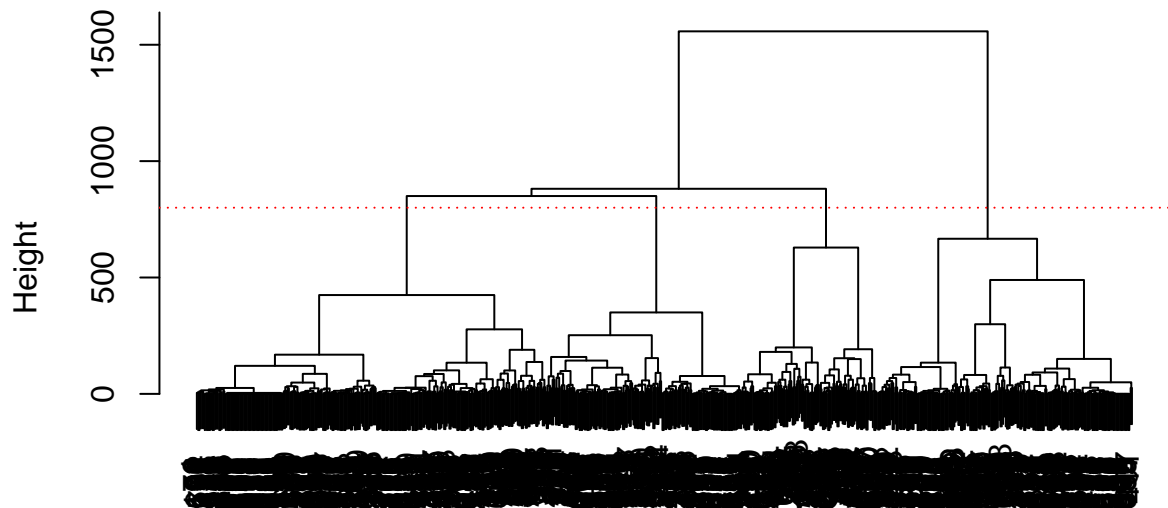
```
clusterward = agnes(dist.om, diss=T, method='ward')
plot(clusterward);abline(h=800, lty='dotted', col='red')
```

Banner of `agnes(x = dist.om, diss = T, method = "ward")`



Agglomerative Coefficient = 0.99

Dendrogram of `agnes(x = dist.om, diss = T, method = "ward")`



dist.om
Agglomerative Coefficient = 0.99

misalkan k=4 kelompok adalah signifikan

```
cl.4 = cutree(clusterward, 4)
cl4fac = factor(cl.4, labels=paste("Kumpulan", 1:4))
head(cl4fac)
```

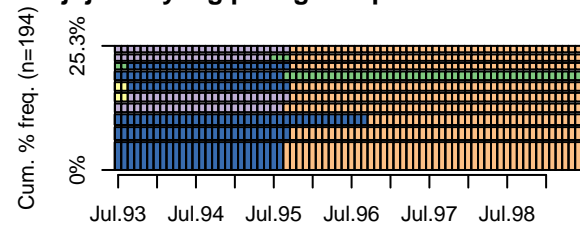
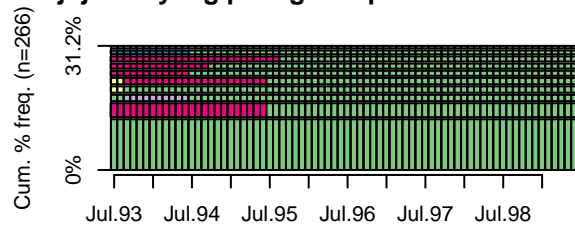
```
## [1] Kumpulan 1 Kumpulan 2 Kumpulan 3 Kumpulan 4 Kumpulan 2 Kumpulan 4
## Levels: Kumpulan 1 Kumpulan 2 Kumpulan 3 Kumpulan 4
```

Jalankan analisis lanjutan terhadap setiap group

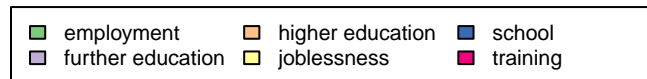
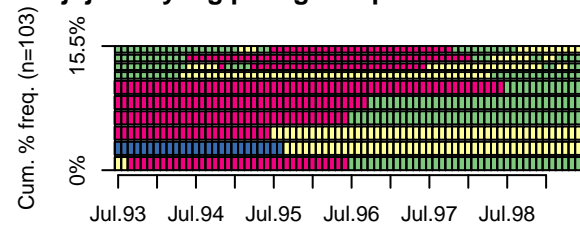
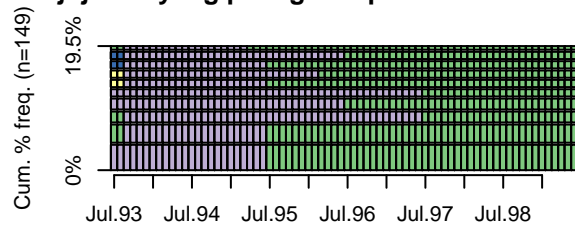
setiap individu dalam kumpulan yang sama akan mempunyai ciri yang hampir sama

```
seqfplot(mvad.seq, group = cl4fac,
          main='10 jujukan yang paling kerap berlaku',
          idxs=1:10)
```

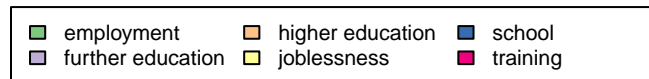
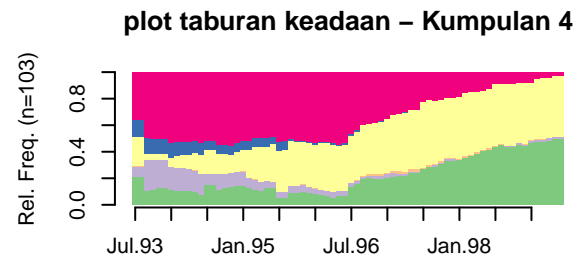
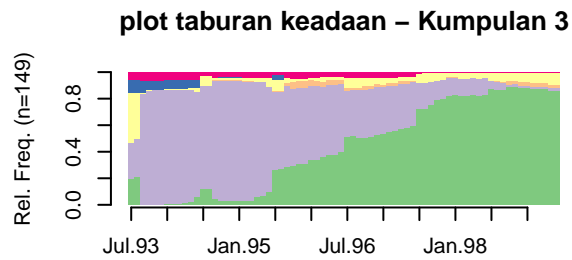
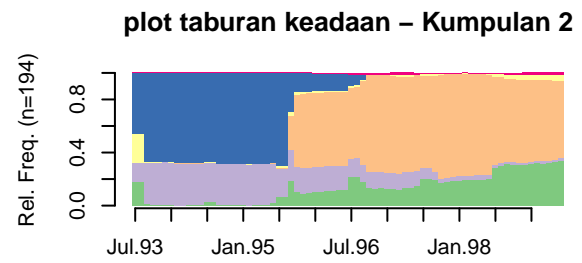
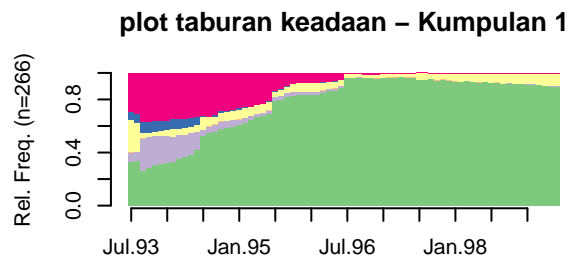
10 jujukan yang paling kerap berlaku – Kumpula 10 jujukan yang paling kerap berlaku – Kumpula



10 jujukan yang paling kerap berlaku – Kumpula 10 jujukan yang paling kerap berlaku – Kumpula

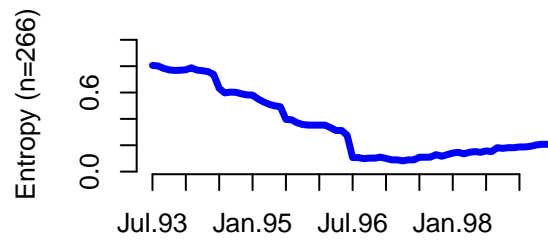


```
seqdplot(mvad.seq,
  group=cl4fac,
  border=NA,
  main='plot taburan keadaan')
```

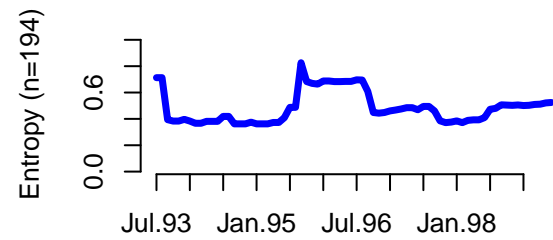


```
seqHtplot(mvad.seq,group=cl4fac, main='Entropi Rentas Lintang')
```

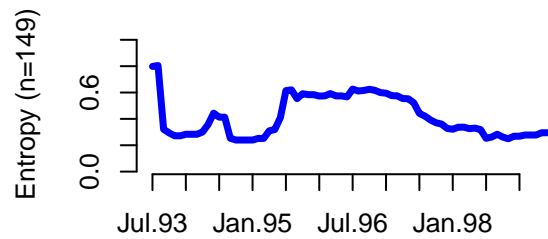
Entropi Rentas Lintang – Kumpulan 1



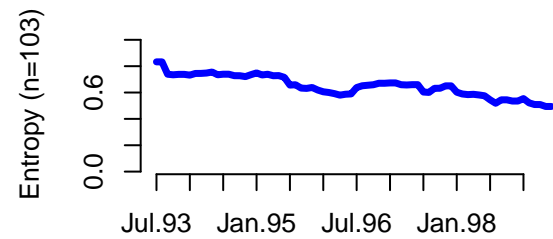
Entropi Rentas Lintang – Kumpulan 2



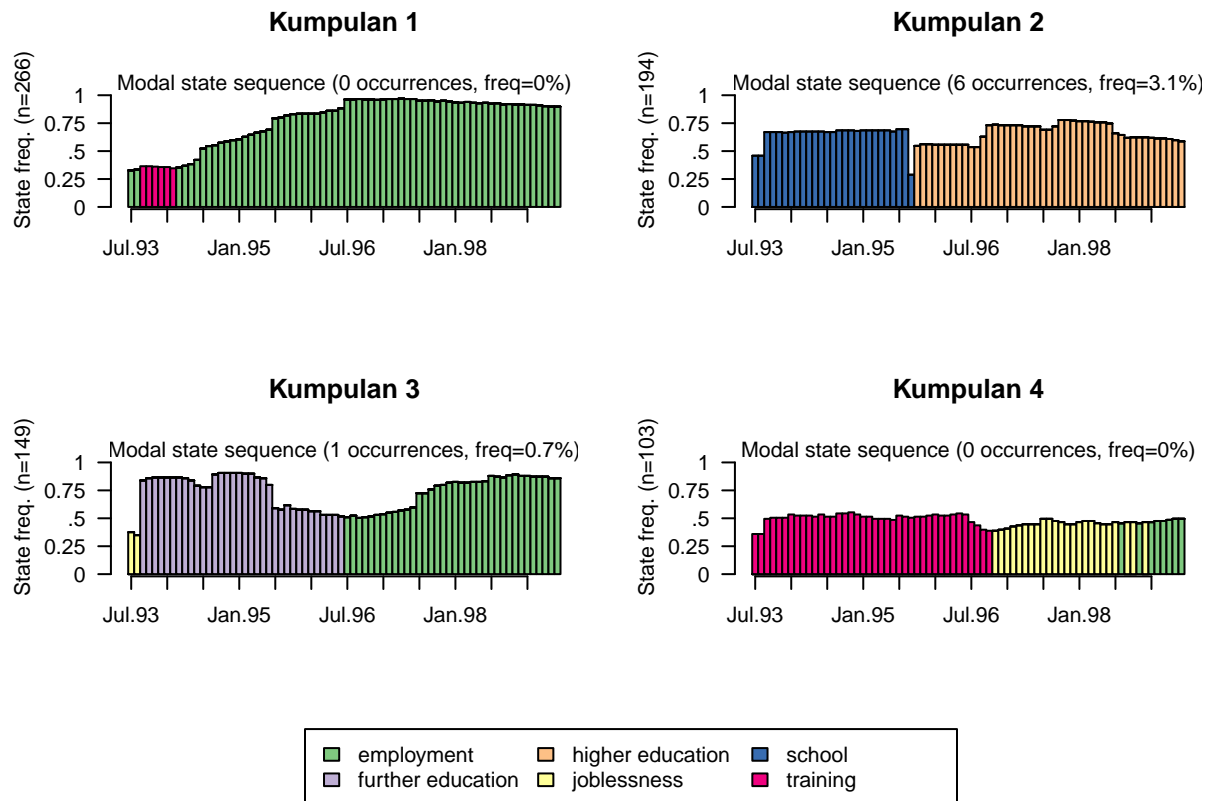
Entropi Rentas Lintang – Kumpulan 3



Entropi Rentas Lintang – Kumpulan 4

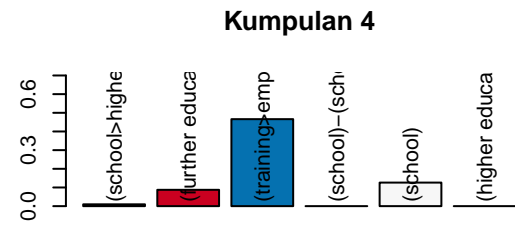
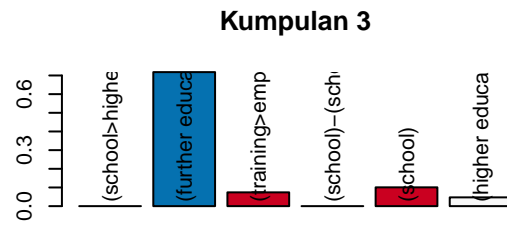
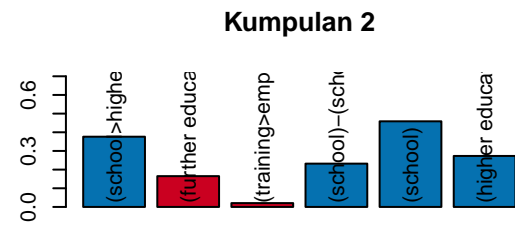
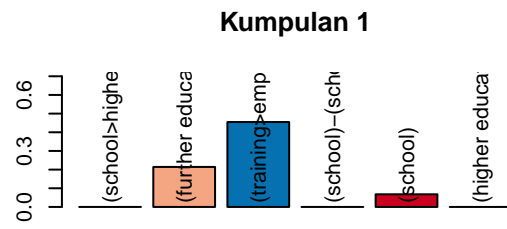


```
seqmsplot(mvad.seq, group=c14fac)
```



sub-jujukan bagi setiap group

```
disc = seqecmpgroup(fsubseq, group = cl4fac)
plot(disc[1:6])
```



Color by sign and significance of Pearson's residual

