



### Comparação de *softwares* em modelos ARIMA

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## Programa de Aperfeiçoamento de Ensino

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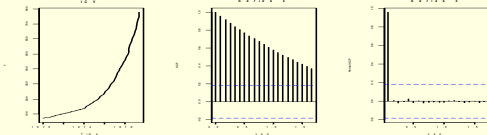
### Série ICV

(Morettin e Toloí, 2004), janeiro de  
1970 a junho de 1979.

Disponíveis em  
<http://www.ime.usp.br/pam/icv.txt>

### Leitura dos dados - R:

```
❑ z = scan(file='http://www.ime.usp.br/~pam/icv.txt')  
❑ par(mfrow=c(1,3))  
❑ z = ts(z,freq=12,start=c(1970,1))  
❑ plot(z,main='ICV'); acf(z); pacf(z)
```

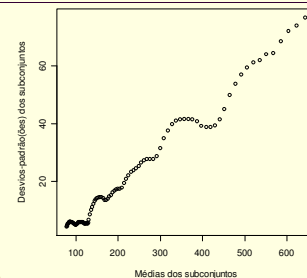


### Verificação da necessidade do uso de alguma transformação

```
❑ n<- length(z)  
❑ j<-12 # dados mensais #  
❑ abcissa<- NULL  
❑ ordenada<- NULL  
❑ for (i in 1:(n-j)){  
❑ abcissa[i]<-mean(z[i:(i+j)])  
❑ ordenada[i]<-sd(z[i:(i+j)])  
❑ }  
❑ plot(x=abcissa,y=ordenada, xlab='Médias dos  
subconjuntos', ylab= 'Desvios-padrão(ões) dos  
subconjuntos', main='Uso de alguma  
transformação?')
```

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### Uso de alguma transformação?



$y = \log(z)$   
❑ transformação logarítmica usada para induzir simetria  
aproximada e tentar estabilizar a variância.

```

❑ par(mfrow=c(3,3))

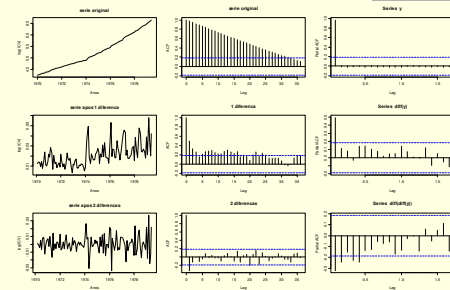
❑ plot(y,main='serie original',xlab='Anos',ylab='log(ICV)')
❑ m = acf(y,lag.max=36, plot=F)
❑ m$lag = m$lag*12
❑ plot(m,main='serie original')
❑ pacf(y)

❑ plot(diff(y),main='serie apos 1 diferenca',xlab='Anos',ylab='log(ICV)')
❑ m = acf(diff(y),lag.max=36, plot=F)
❑ m$lag = m$lag*12
❑ plot(m,main='1 diferenca')
❑ pacf(diff(y))

❑ plot(diff(diff(y)),main='serie apos 2 diferencas',xlab='Anos',ylab='log(ICV)')
❑ m = acf(diff(diff(y)),lag.max=36, plot=F)
❑ m$lag = m$lag*12
❑ plot(m,main='2 diferencas')
❑ pacf(diff(diff(y)))

```

## O que parece melhor?



## Candidatos:

- ❑ Um primeiro modelo candidato é então o ARIMA(1,1,0)
- ❑ Um segundo modelo candidato é então o ARIMA(1,1,0) + tendência determinística
- ❑ `m1 = arima(y,order=c(1,1,0))`
- ❑ `m2 = arima(y,order=c(1,1,0), xreg = seq(1,114,1))`

## Análise de resíduos (m1)

- ```

❑ tsdiag(m1)
❑ par(mfrow=c(2,1))
❑ w1=m1$residuals
❑ hist(w1,freq=F)
❑ d = seq(range(w1)[1]-3*sd(w1),range(w1)[2]+3*sd(w1),0.001)
❑ lines(d,dnorm(d,0,sd(w1)))
❑ qqnorm(w1)
❑ qqline(w1)
❑ shapiro.test(w1)

```

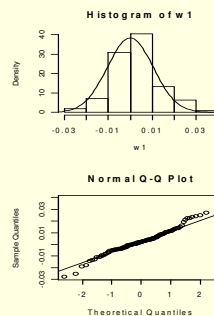
## Análise de resíduos (m2)

- ```

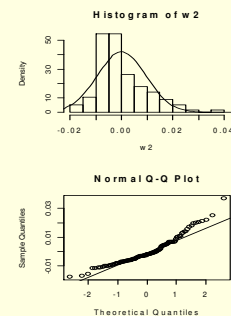
❑ tsdiag(m2)
❑ par(mfrow=c(2,1))
❑ w2=m2$residuals
❑ hist(w2,freq=F)
❑ d = seq(range(w2)[1]-3*sd(w2),range(w2)[2]+3*sd(w2),0.001)
❑ lines(d,dnorm(d,0,sd(w2)))
❑ qqnorm(w2)
❑ qqline(w2)
❑ shapiro.test(w2)

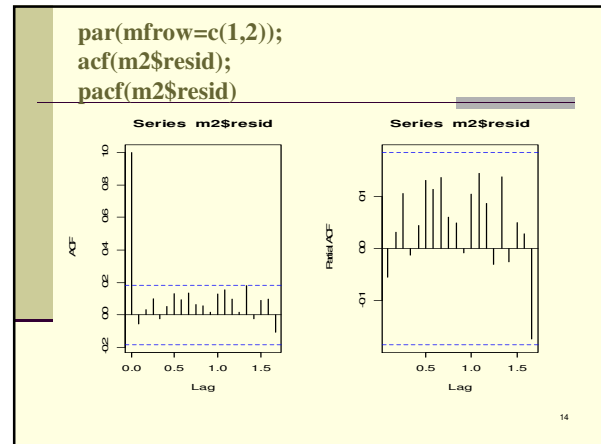
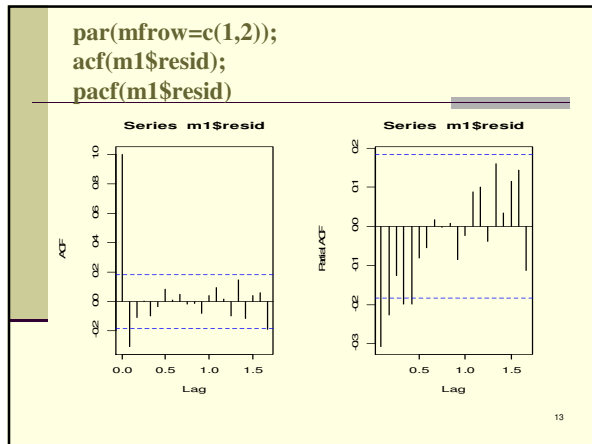
```

## m1



## m2





### Modelo com tendência determinística

- Call:  
arima(x = y, order = c(1, 1, 0), xreg = seq(1, 114, 1))
- Coefficients:  
ar1 seq(1, 114, 1)  
0.5073 0.0212  
s.e. 0.0822 0.0018
- sigma^2 estimated as 9.076e-05: log likelihood = 365.38, aic = -724.75
- LEMBRE-SE:  $\delta = \mu(1 - \phi \dots)$

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### Mesmo modelo no Minitab

Stat -> Time Series -> ARIMA

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### Saídas

- Results for: ICV.MTW
- ARIMA Model: DIFF(ln(ICV))
- Estimates at each iteration (Estimativas a cada iteração)
- Iteration SSE Parameters  
0 0,929375 0,100 0,109  
1 0,039267 0,242 0,032  
2 0,015942 0,392 0,020  
3 0,010439 0,494 0,012  
4 0,010257 0,509 0,011  
5 0,010255 0,512 0,010  
6 0,010255 0,512 0,010
- Relative change in each estimate less than 0,0010

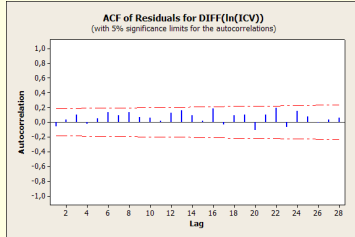
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### Saídas

- Final Estimates of Parameters
- Type Coef SE Coef T P  
AR 1 0,5119 0,0833 6,14 0,000  
Constant 0,0103600 0,0009040 11,46 0,000  
Mean 0,021224 0,001852
- Number of observations: 113
- Residuals: SS = 0,0102405 (backforecasts excluded)  
MS = 0,0000923 DF = 111
- Modified Box-Pierce (Ljung-Box) Chi-Square statistic
- Lag 12 24 36 48  
Chi-Square 10,5 34,1 43,3 67,1  
DF 10 22 34 46  
P-Value 0,398 0,048 0,132 0,023

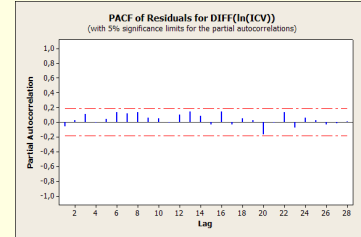
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### ACF dos resíduos – modelo com constante



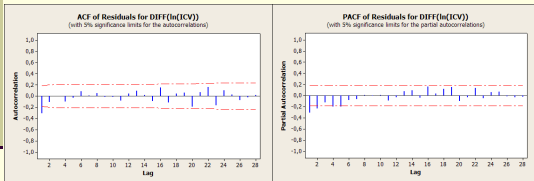
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### PACF dos resíduos – modelo com constante



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### ACF e PACF do modelo sem tendência determinística



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### S-PLUS

- ❑ `z<-scan("F:\\PAE\\icv.txt", what=list(icv=0))`
- ❑ `attach(z)`
- ❑ `z <- ts(z,freq=12,start=c(1970,1))`
- ❑ `z<-z$icv`
- ❑ `y<-log(z)`
- ❑ `par(mfrow=c(1,3))`
- ❑ `ts.plot(y,xlab="Tempo")`
- ❑ `acf(y)`
- ❑ `acf(y,type="partial")`
- ❑ `fit<-arima.mle(y,model = list(order=c(1,1,0)), xreg = seq(1, length(y), 1))`

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### Saídas

- ❑ Coefficients:
- ❑ AR : 0.50932
- ❑ Variance-Covariance Matrix:
- ❑ ar(1)
- ❑ ar(1) 0.006612406
- ❑ Coefficients for regressor(s): seq(1, length(y), 1)
- ❑ [1] 0.02146 (ISSO QUE É ESTIMADO É A MÉDIA!!!)
- ❑ Optimizer has converged
- ❑ Convergence Type: relative function convergence
- ❑ AIC: -720.22055

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### Umidade – S-PLUS

- ❑ `u<-scan("F:\\PAE\\umidade.txt", what=list(umid=0))`
- ❑ `attach(u)`
- ❑ `u<- ts(u)`
- ❑ `u<-u$umid`
- ❑ `par(mfrow=c(1,3))`
- ❑ `ts.plot(u,xlab="Tempo")`
- ❑ `acf(u)`
- ❑ `acf(u,type="partial")`
- ❑ `regres<-1 # (NOTE QUE NO MODELO ARMA É NECESSÁRIO ACRESCENTAR UM VETOR DE COMPRIMENTO 1 PARA QUE O S-PLUS ESTIME A CONSTANTE!)`
- ❑ `fit<-arima.mle(u, model = list(order=c(3,0,0)), xreg= regres)`
- ❑ `arima.diag(fit,std.resid=F, plot=T)`

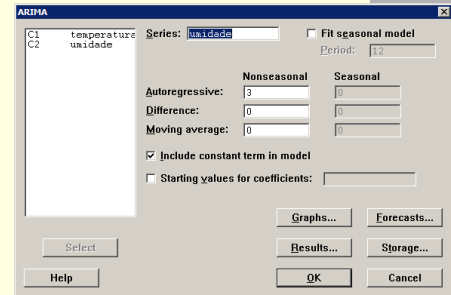
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## Saídas – S-PLUS

```
Call: arima.mle(x = u, model = list(order = c(3, 0, 0)), xreg = regres)
Method: Maximum Likelihood
Model: 3 0 0
Coefficients:
      AR : 0.5968 -0.16656 0.11326
Variance-Covariance Matrix:
      ar(1)  ar(2)  ar(3)
ar(1) 0.0027269958 -0.001596508 0.0002734048
ar(2) -0.0015965084 0.003634254 -0.0015965084
ar(3) 0.0002734048 -0.001596508 0.0027269958
Coefficients for regressor(s): intercept
      [1] 81.16082
Optimizer has converged
Convergence Type: relative function convergence
AIC: 2409.55443
```

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## Menu – MINITAB



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## Umidade – MINITAB

### Final Estimates of Parameters

Type	Coef	SE Coef	T	P
AR 1	0,5973	0,0523	11,42	0,000
AR 2	-0,1666	0,0605	-2,75	0,006
AR 3	0,1133	0,0524	2,16	0,031
Constant	36,9862	0,3499	105,71	0,000
Mean	81,1191	0,7674		

Number of observations: 365  
Residuals: SS = 16129,9 (backforecasts excluded)  
MS = 44,7 DF = 361

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## Umidade – R

```
u<-scan("F:\\PAE\\umidade.txt")
u<- as.ts(u)
par(mfrow=c(1,3))
plot(u,xlab="Tempo")
acf(u)
pacf(u)
regres<-seq(1,length(u),1)
fit<-arima (u, order=c(3,0,0), xreg= regres)
par(mfrow=c(1,2));
acf(fit$resid);
pacf(fit$resid)
```

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## fit<-arima (u, order=c(3,0,0), xreg=regres, include.mean = T)

```
Call:
arima(x = u, order = c(3, 0, 0), xreg = regres, include.mean = T)

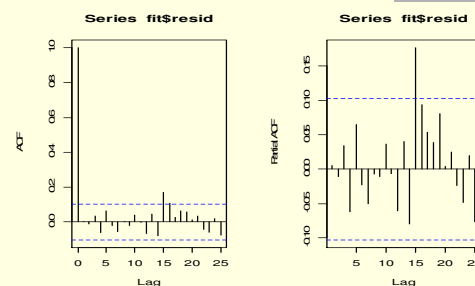
Coefficients:
      ar1      ar2      ar3  intercept  regres
      0.5956 -0.1657  0.1124    81.0381    0.0004
s.e. 0.0519  0.0600  0.0519    1.5103    0.0071

sigma^2 estimated as 44.19: log likelihood = -1209.53, aic = 2431.05

ESTIMATIVAS SEMELHANTES ÀS DO MINITAB E DO S-PLUS!!!
```

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## Análise de resíduos – acf e pacf



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