

Forecasting: principles and practice

Rob J Hyndman

1.1 Time series graphics

Time series in R

ts objects and ts function

A time series is stored in a `ts` object in R:

- a list of numbers
- information about times those numbers were recorded.

###Example

Year	Observation
2012	123
2013	39
2014	78
2015	52
2016	110

```
v <- ts(c(123, 39, 78, 52, 110), start=2012)
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###Example

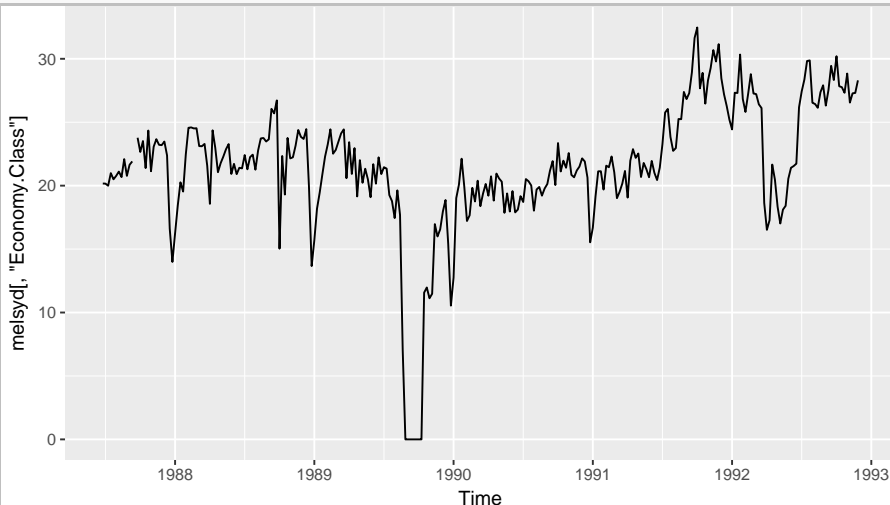
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Time plots

Time plots

```
autoplot(melsyd[, "Economy.Class"])
```

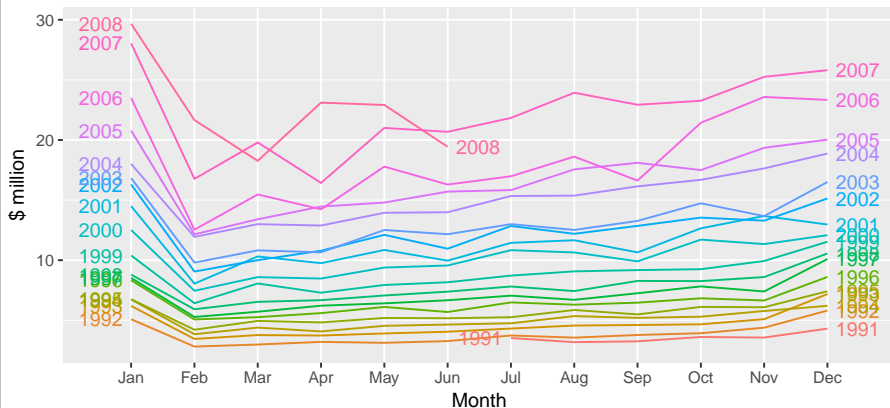


Seasonal plots

Seasonal plots

```
ggseasonplot(a10, ylab="$ million",  
  year.labels=TRUE, year.labels.left=TRUE) +  
  ggtitle("Seasonal plot: antidiabetic drug sales")
```

Seasonal plot: antidiabetic drug sales



Seasonal or cyclic?

##Time series patterns

Trend pattern exists when there is a long-term increase or decrease in the data.

Seasonal pattern exists when a series is influenced by seasonal factors (e.g., the quarter of the year, the month, or day of the week).

Cyclic pattern exists when data exhibit rises and falls that are *not of fixed period* (duration usually of at least 2 years).

##Time series components

###Differences between seasonal and cyclic patterns:

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##Time series components

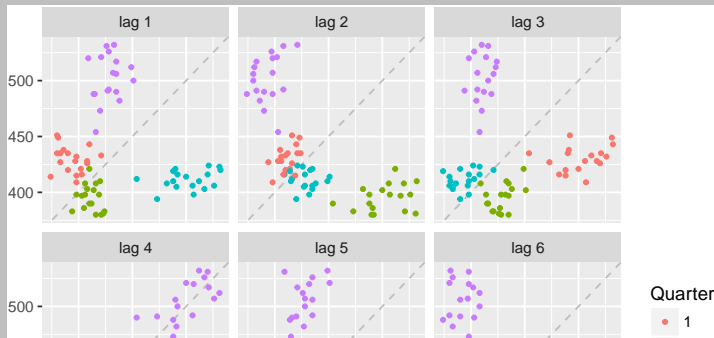
###Differences between seasonal and cyclic patterns:

Lag plots and autocorrelation

Example: Beer production

```
beer <- window(ausbeer, start=1992)
gglagplot(beer, lags=9, do.lines=FALSE,
  continuous=FALSE)
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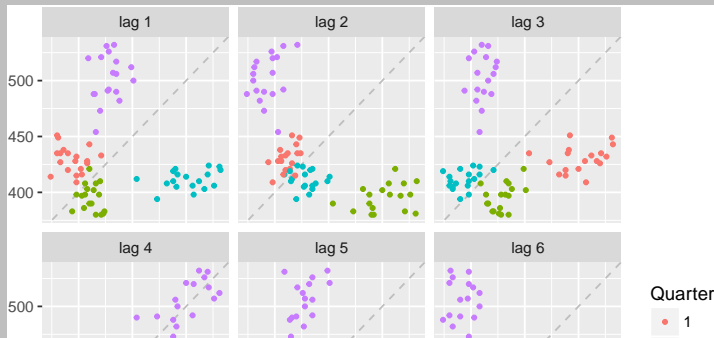


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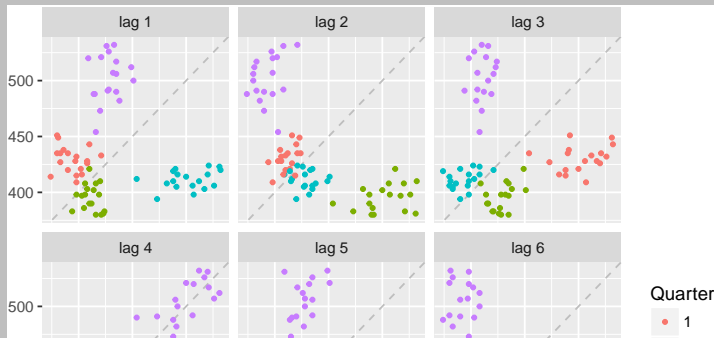


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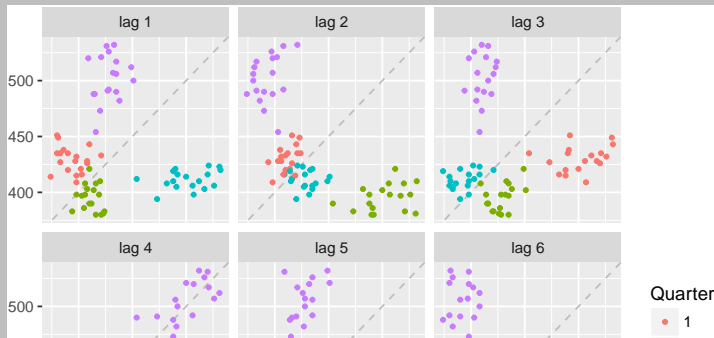


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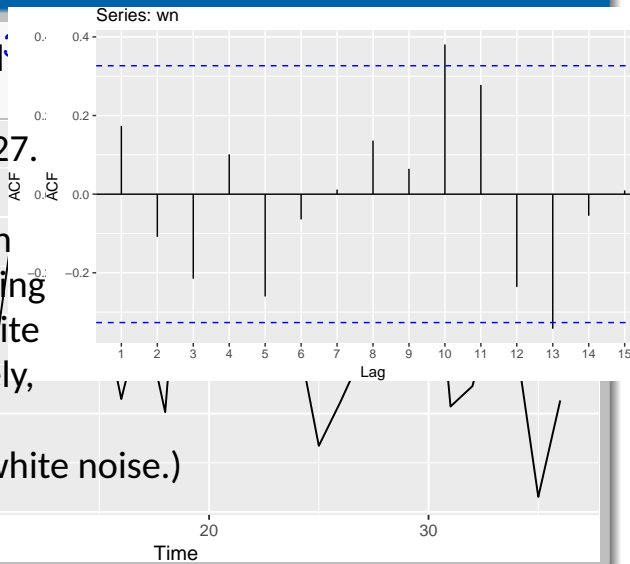
White noise

Example: White noise

Example:
`wn = ts(rnorm(36))`
`autoplot(wn)`

$\pm 1.96 / \sqrt{36} = \pm 0.327$.

All autocorrelation coefficients lie within these limits, confirming that the data are white noise. (More precisely, the data cannot be distinguished from white noise.)



White noise

Example: White noise

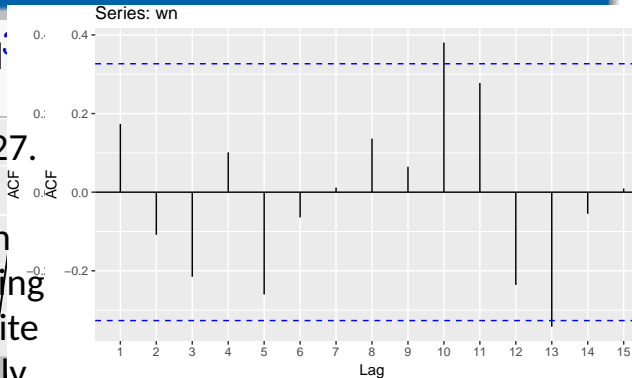
Example:

$T = 36$ and so critical values at $\pm 1.96 / \sqrt{36} = \pm 0.327$.

All autocorrelation coefficients lie within these limits, confirming that the data are white noise.

(More precisely, white noise data is uncorrelated across time with zero mean and constant variance. (technically, we require independence as well.)

the data cannot be distinguished from white noise.)



Time

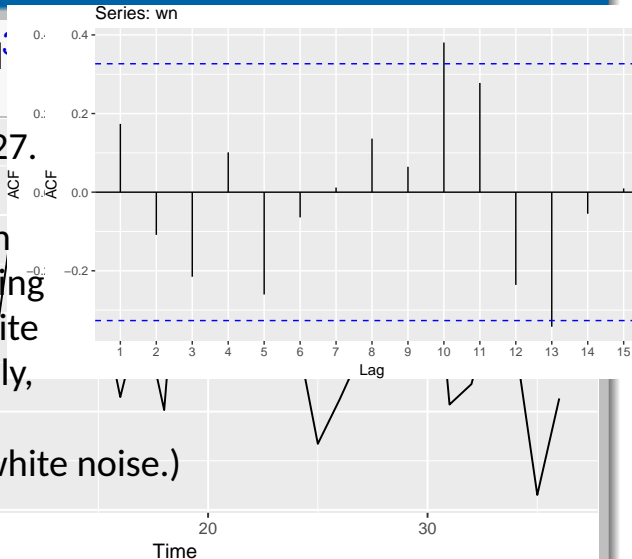
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