

MONASH BUSINESS SCHOOL

ETC3550/ETC5550 Applied forecasting

Ch2. Time series graphics OTexts.org/fpp3/



```
# A tsibble: 15,150 x 6 [1Y]
           Country [263]
# Kev:
   Year Country
                        GDP Imports Exports Population
  <dbl> <fct>
                        <dbl>
                                <dbl>
                                       <dbl>
                                                 <dbl>
   1960 Afghanistan 537777811. 7.02 4.13
                                               8996351
   1961 Afghanistan 548888896. 8.10 4.45
                                               9166764
   1962 Afghanistan 546666678. 9.35 4.88
                                               9345868
   1963 Afghanistan 751111191.
                                16.9
                                        9.17
                                               9533954
   1964 Afghanistan 800000044.
                                18.1 8.89
                                                9731361
   1965 Afghanistan 1006666638.
                                21.4
                                       11.3
                                                9938414
   1966 Afghanistan 139999967.
                                18.6
                                        8.57
                                               10152331
   1967 Afghanistan 1673333418.
                                14.2
                                        6.77
                                               10372630
   1968 Afghanistan 1373333367.
                                15.2
                                        8.90
                                              10604346
   1969 Afghanistan 1408888922.
                                15.0
                                       10.1
                                               10854428
# ... with 15,140 more rows
```

```
# A tsibble: 15,150 x 6 [1Y]
           Country [263]
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   Index <fct>
                        <dbl>
                                <dbl>
                                       <dbl>
                                                 <dbl>
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                                               8996351
   1961 Afghanistan 548888896. 8.10 4.45
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                                               9345868
   1963 Afghanistan 751111191.
                                16.9
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                                                9731361
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                                       11.3
                                                9938414
   1966 Afghanistan 139999967.
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                                        8.57
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                                              10604346
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            Country [263]
# Kev:
   Year Country
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   Index
         Kev
                         <dbl>
                                <dbl>
                                        <dbl>
                                                  <dbl>
   1960 Afghanistan 537777811. 7.02 4.13
                                                8996351
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                                        11.3
                                                9938414
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                                               10152331
   1967 Afghanistan 1673333418.
                                14.2
                                         6.77
                                               10372630
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                                               10604346
   1969 Afghanistan 1408888922.
                                15.0
                                        10.1
                                               10854428
# ... with 15,140 more rows
```

```
# A tsibble: 15,150 x 6 [1Y]
            Country [263]
# Kev:
   Year Country
                           GDP Imports Exports Population
                    Measured variables
   Index
         Kev
   1960 Afghanistan 537777811.
                                  7.02
                                          4.13
                                                  8996351
   1961 Afghanistan 548888896.
                                  8.10
                                          4.45
                                                  9166764
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                                  9.35
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                                                  9345868
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                                          8.89
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                                 14.2
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                                                 10372630
   1968 Afghanistan 1373333367.
                                 15.2
                                          8.90
                                                 10604346
   1969 Afghanistan 1408888922.
                                 15.0
                                         10.1
                                                 10854428
# ... with 15,140 more rows
```

tourism

```
# A tsibble: 24,320 x 5 [10]
# Kev:
            Region, State, Purpose [304]
  Quarter Region State Purpose
                                Trips
    <gtr> <chr> <chr> <chr>
                                 <dbl>
1 1998 Q1 Adelaide SA
                        Business 135.
2 1998 02 Adelaide SA Business 110.
3 1998 Q3 Adelaide SA Business 166.
4 1998 O4 Adelaide SA Business 127.
5 1999 Q1 Adelaide SA
                        Business 137.
6 1999 O2 Adelaide SA
                        Business 200.
7 1999 O3 Adelaide SA
                        Business 169.
8 1999 O4 Adelaide SA
                        Business 134.
                        Business 154.
9 2000 Q1 Adelaide SA
  2000 Q2 Adelaide SA
                        Business 169.
# ... with 24,310 more rows
```

tourism

```
# A tsibble: 24,320 x 5 [10]
# Kev:
            Region, State, Purpose [304]
  Quarter Region State Purpose
                                 Trips
    <gtr> <chr> <chr> <chr>
                                 <dbl>
1 1998 Q1 Adelaide SA
                        Business 135.
2 1998 O2 Adelaide SA
                        Business 110.
3 1998 Q3 Adelaide SA
                        Business 166.
4 1998 O4 Adelaide SA
                        Business 127.
5 1999 Q1 Adelaide SA
                        Business
                                  137.
6 1999 O2 Adelaide SA
                        Business
                                  200.
7 1999 03 Adelaide SA
                        Business 169.
8 1999 O4 Adelaide SA
                        Business 134.
                        Business 154.
9 2000 Q1 Adelaide SA
  2000 Q2 Adelaide SA
                        Business 169.
# ... with 24,310 more rows
```

tourism

```
# A tsibble: 24,320 x 5 [10]
# Key:
            Region, State, Purpose [304]
  Quarter Region State Purpose
                                  Trips
          <chr> <chr> <chr>
   Index
                                  <db1>
 1 1998 O1 Adelaide SA
                         Business
                                   135.
 2 1998 O2 Adelaide SA
                         Business 110.
 3 1998 Q3 Adelaide SA
                         Business 166.
 4 1998 O4 Adelaide SA
                         Business 127.
 5 1999 Q1 Adelaide SA
                         Business
                                   137.
 6 1999 O2 Adelaide SA
                         Business
                                   200.
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                         Business
                                 169.
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                         Business 134.
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                         Business
                                   169.
# ... with 24,310 more rows
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tourism

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# A tsibble: 24,320 x 5 [10]
# Kev:
             Region, State, Purpose [304]
  Quarter Region State Purpose
                                   Trips
   Index
           Kevs
                                   <fdb>>
1 1998 Q1 Adelaide SA
                          Business
                                    135.
2 1998 02 Adelaide SA
                          Business
                                   110.
3 1998 Q3 Adelaide SA
                          Business 166.
4 1998 O4 Adelaide SA
                          Business 127.
5 1999 Q1 Adelaide SA
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                          Business
                                    169.
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tourism

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# Kev:
            Region, State, Purpose [304]
  Quarter Region State Purpose
                                   Trips
   Index
           Kevs
                                    Measure
1 1998 Q1 Adelaide SA
                          Business
                                    135.
2 1998 02 Adelaide SA
                          Business
                                  110.
3 1998 Q3 Adelaide SA
                          Business 166.
4 1998 O4 Adelaide SA
                          Business 127.
5 1999 Q1 Adelaide SA
                          Business
                                    137.
6 1999 O2 Adelaide SA
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7 1999 03 Adelaide SA
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                                    169.
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                          Business 134.
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9 2000 Q1 Adelaide SA
  2000 Q2 Adelaide SA
                          Business
                                    169.
# ... with 24,310 more rows
```

A tsibble allows storage and manipulation of multiple time series in R.

It contains:

- An index: time information about the observation
- Measured variable(s): numbers of interest
- Key variable(s): optional unique identifiers for each series
- It works with tidyverse functions.

The tsibble index

Common time index variables can be created with these functions:

Frequency	Function
Annual	start:end
Quarterly	yearquarter()
Monthly	yearmonth()
Weekly	yearweek()
Daily	as_date(),ymd()
Sub-daily	as_datetime()

Seasonal or cyclic?

Differences between seasonal and cyclic patterns:

- seasonal pattern constant length; cyclic pattern variable length
- average length of cycle longer than length of seasonal pattern
- magnitude of cycle more variable than magnitude of seasonal pattern

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- magnitude of cycle more variable than magnitude of seasonal pattern

The timing of peaks and troughs is predictable with seasonal data, but unpredictable in the long term with cyclic data.

Trend and seasonality in ACF plots

- When data have a trend, the autocorrelations for small lags tend to be large and positive.
- When data are seasonal, the autocorrelations will be larger at the seasonal lags (i.e., at multiples of the seasonal frequency)
- When data are trended and seasonal, you see a combination of these effects.

Which is which?

