

fitbit

weight loss

efficacy of drug treatment

## Longitudinal Data and Time Series (April 4th, 2016)

Examples: atmospheric data GDP  
oceanic data stock markets  
weather

population  
↳ "space-time"  
bacteria cultures/  
other bio stuff

**Time Series:** Measuring a single variable over points in time

Can be regularly or irregularly spaced time intervals:

Data structure:

one person/object:

~~at~~ J time points

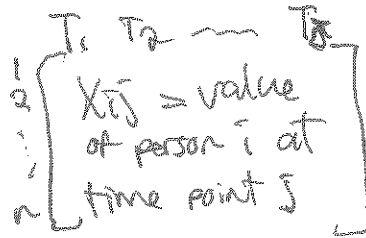


$T_1, T_{1+h}, T_{1+2h}, T_{1+3h}$   
↳ regularly spaced

several people/objects:

n obs; J time points

$n \times J$  matrix



$T_1, T_2, T_3, \dots, T_J$   
↳ irregularly spaced

Can have more than one variable:

one person/object



several people/objects

several  $n \times J$  matrices

↳ one for each variable.

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## Analyzing and Comparing Time Series

What are we interested in seeing with time series?

increasing trend? decreasing trend?  
seasonal trends (monthly data)  
weekly trends (e.g. NYC bike)

periodicity / patterns / cyclical trends / seasonal trends

What if we have multiple time series? How to compare?

variability over time  
parallel vs. opposite  
↑↑ or ↓↓ vs. ↑↓ or ↓↑

sudden changes  
in reaction to events

Must be on the same time ~~scale~~ scale  
↳ (points should "line up")

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check for differences in subgroups

Con H W 10: "all" vs. "males" vs. "females"

$X$  mean( $X[(K-ww):K]$ )  
 $\downarrow$   
 vector  
 $1 \times n$

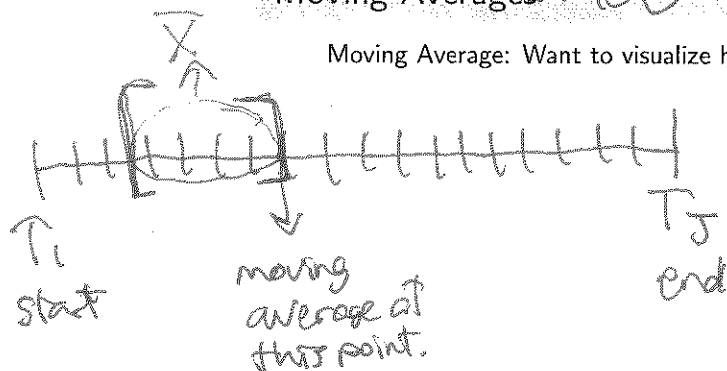
$\hookrightarrow$  MA at  $K$

not really a MA;  
 $ww=1 \rightarrow$  just the series

## Moving Averages Plots

parameter

Moving Average: Want to visualize how the trend changes over time.



$[ ]$  = "window"  
 $\hookrightarrow$  "window width"  
 big  $ww \rightarrow$  smooth MAs  
 small  $ww \rightarrow$  jagged MAs  
 $\hookrightarrow$  high variability

Can downweight older observations in your moving window:

"weighted Moving average"  $\rightarrow$  often useful in prediction  
 how do we weight the observations in the MA window?

$\hookrightarrow$  suppose  $ww=3$ , set weight (importance of each obs

(e.g.  $5, 2, 1/2$ )  $\rightarrow \frac{5}{5+2+1/2}, \frac{2}{5+2+1/2}, \frac{1/2}{5+2+1/2}$

$\hookrightarrow$  scale weights/importances by their sum  $\Rightarrow$  wts sum to 1

## Lags and Autocorrelation

Lags: Does one time point influence future time point(s)?

Lag 1: looking at time series vs. itself at previous time point

Lag 2: - 2nd prev. time point

IAR:

$X[1:(n-1)]$  vs  $X[2:n]$

$X[1:(n-2)]$  vs  $X[3:n]$

**Autocorrelation:** Correlation between a time series and a lagged version of itself

$$R(s, t) = \frac{E[(X_s - \mu_s)(X_t - \mu_t)]}{\sigma_s \sigma_t}$$

$\hookrightarrow$  two time points

