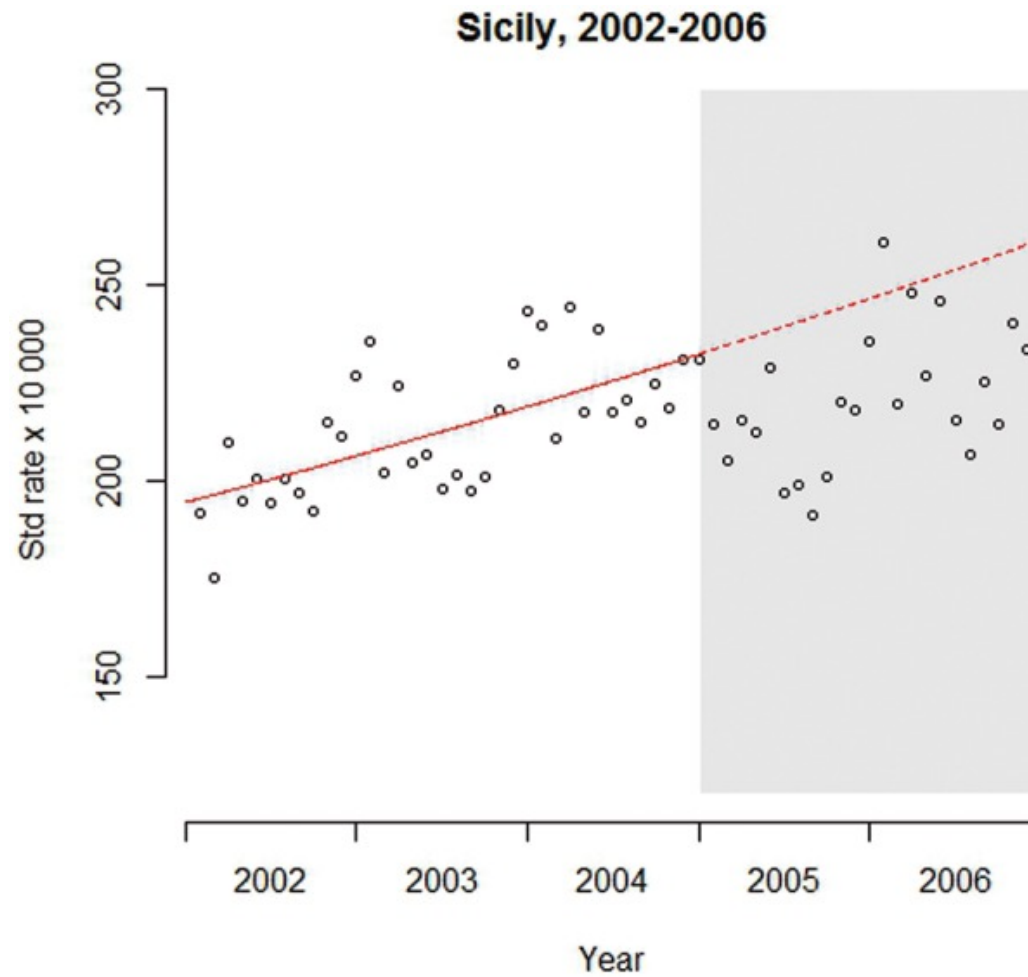


# Interrupted Time Series Analyses

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# Interrupted Time Series Analysis



## Deciding if an ITS analysis is appropriate

### **Intervention:**

- Clear moment in time in which the intervention is introduced.

### **Outcome:**

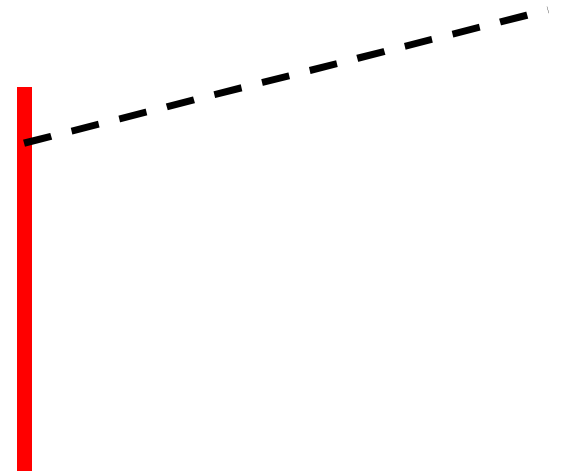
- Can be count, continuous or binary
- Short-term outcomes (ie. those that are expected to change relatively quickly after an intervention) ... or those that have a clearly defined lag before impact

### **Data requirements:**

- Sequential measures of the outcome both before and after the intervention
- Routine data
- No fixed recommendation for number of time points

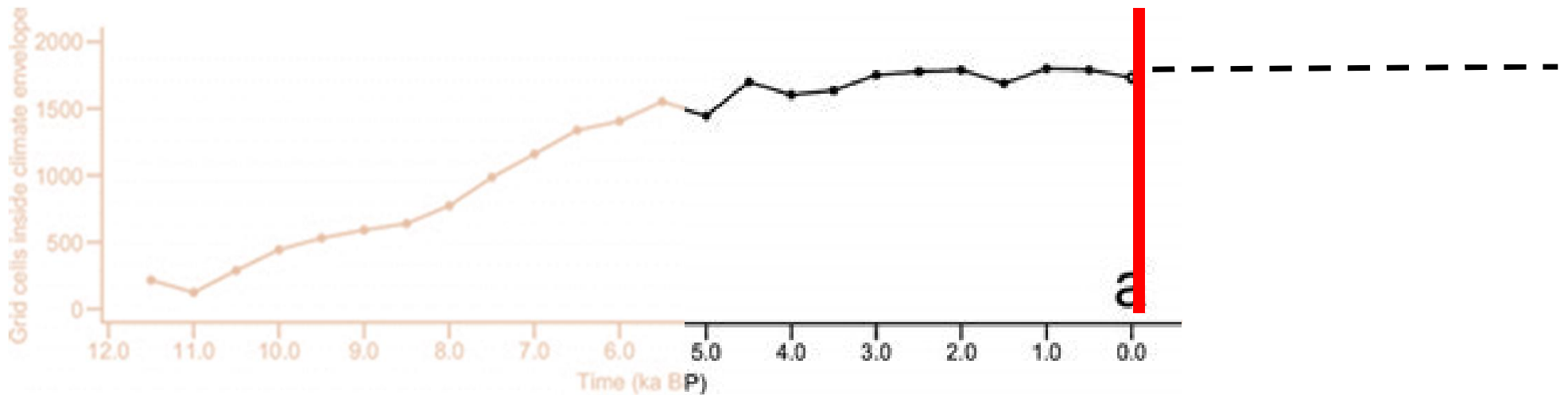
# Number of time points and power

Power increases with the number of time points, but its not always preferable to have more data points:



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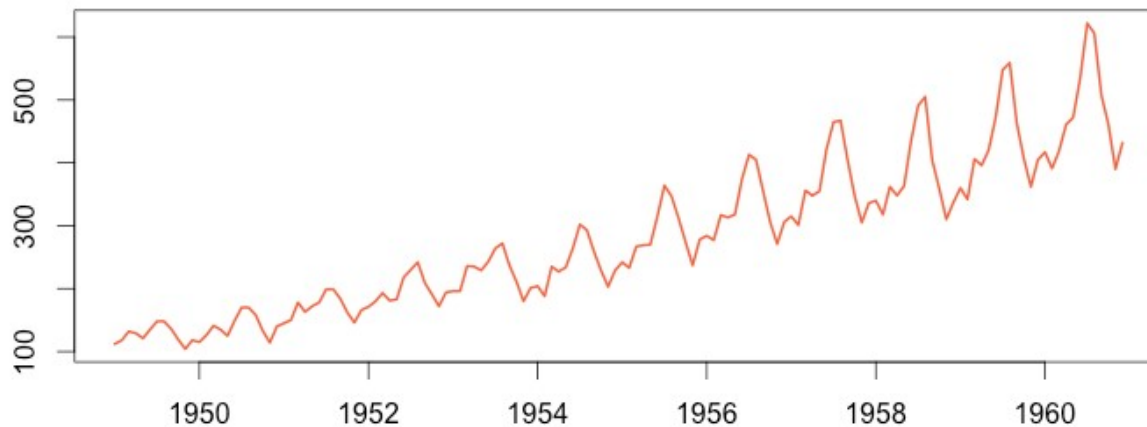


Important to visually inspect data.

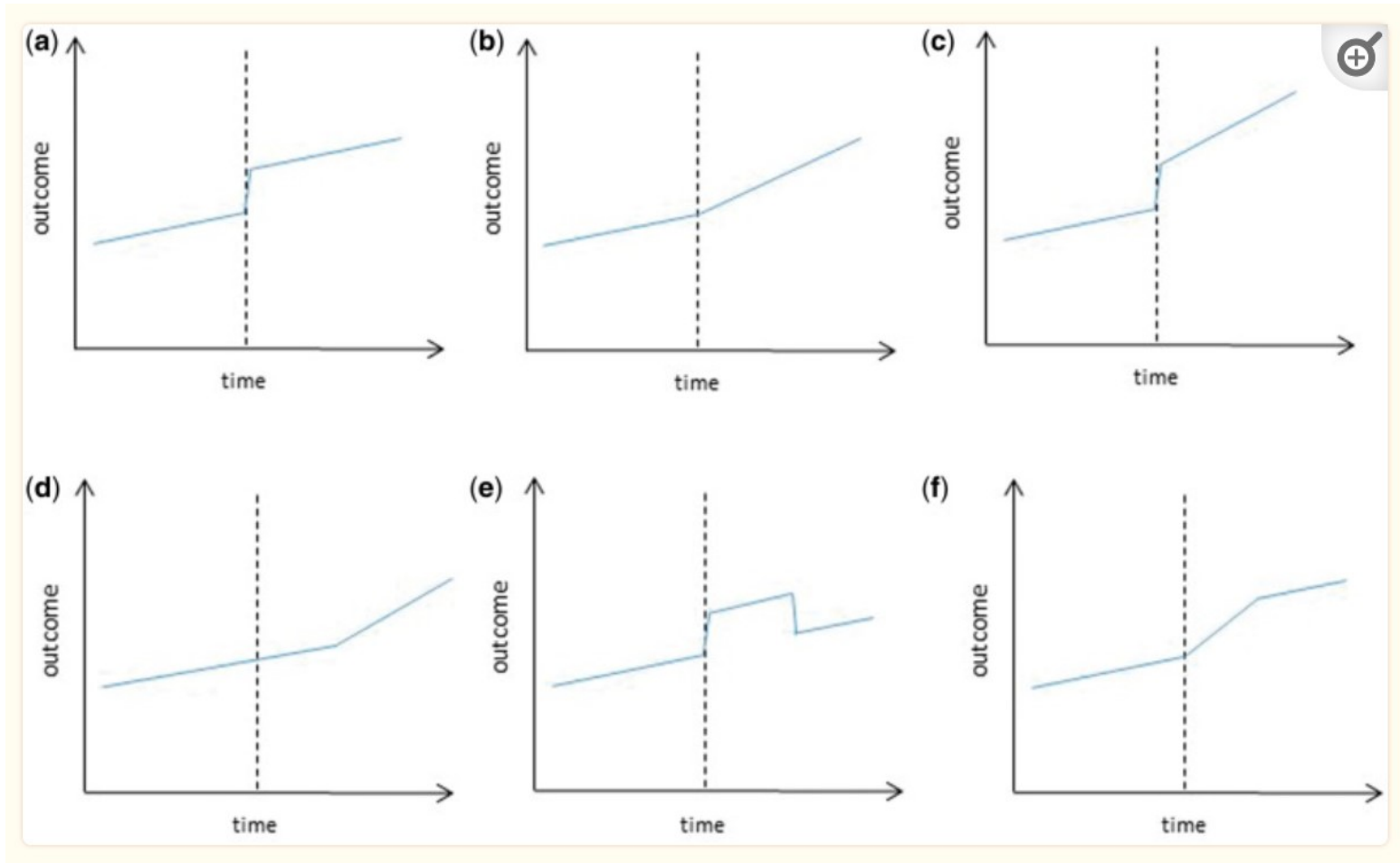
# Number of time points and power

Power also depends on various other factors:

- Distribution of data points before and after the intervention
- variability within the data
- strength of effect
- and the presence of confounding effects such as seasonality.



# Choosing an appropriate model



## Regression Methods

A minimum of three variables are required for an ITS analysis:

$T$ : the time elapsed since the start of the study

$X_t$ : a binary variable indicating pre-intervention period (0) or the post-intervention period (1);

$Y_t$ : the outcome at time  $t$ .

In standard ITS analyses, the following segmented regression model is used:

$$Y_t = \beta_0 + \beta_1 T + \beta_2 X_t + \beta_3 TX_t$$

$\beta_0$  represents the baseline level at  $T = 0$ ,

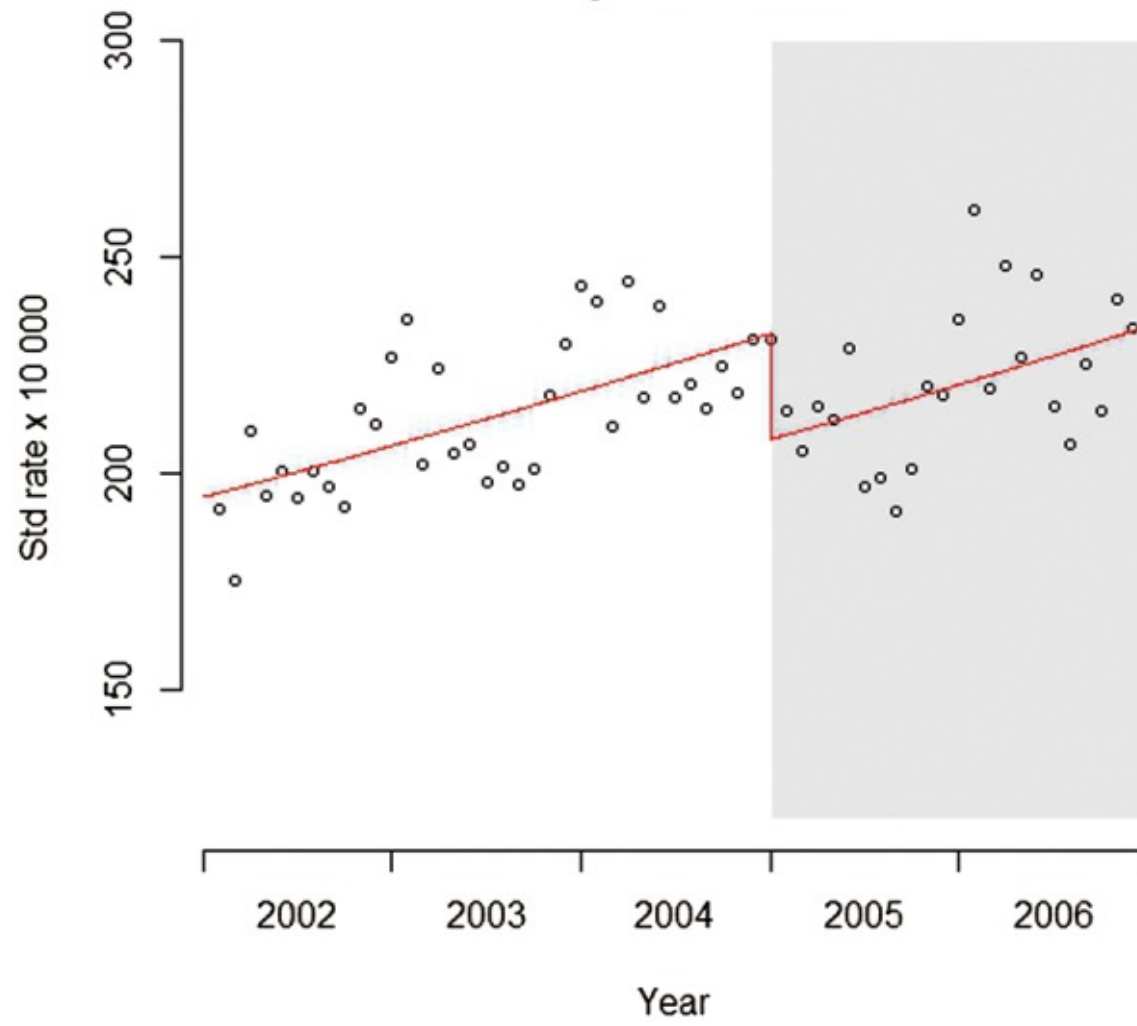
$\beta_1$  is interpreted as the change in outcome associated with a time unit increase (representing the underlying pre-intervention trend),

$\beta_2$  is the level change following the intervention

$\beta_3$  indicates the slope change following the intervention (using the interaction between time and intervention:  $TX_t$ ).



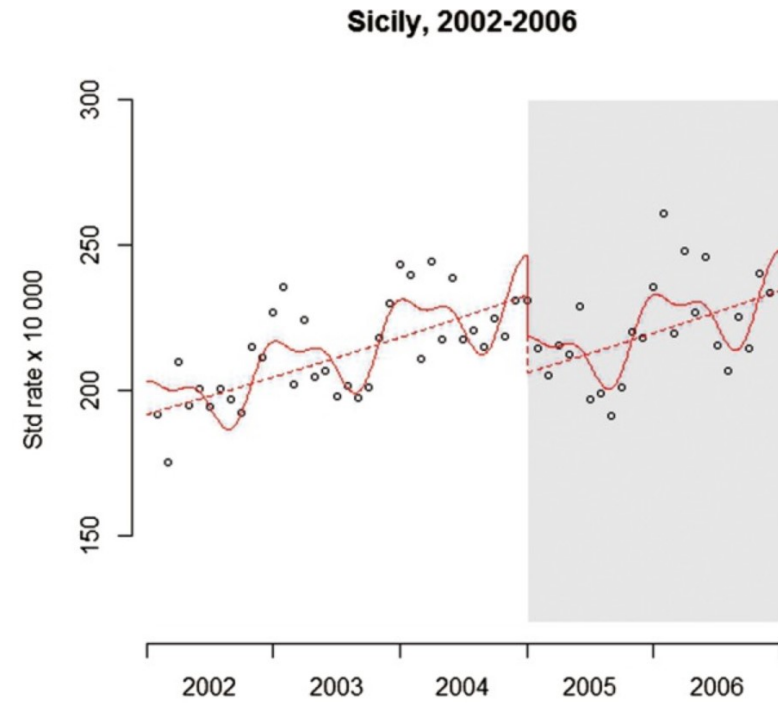
### Sicily, 2002-2006



## Addressing methodological issues

### Seasonality:

- Risk of Bias
- Autocorrelation



### Managing seasonality:

- model stratified by the calendar month (or other time period)
- more complex functions such as 'Fourier terms' or 'spline'

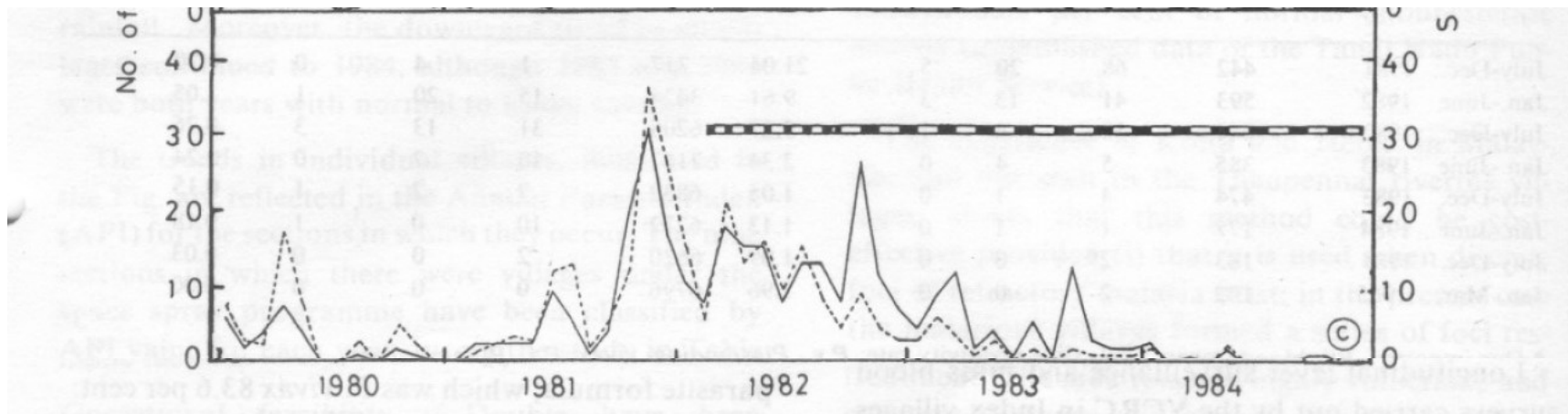
# Addressing methodological issues

## **Other time-varying confounders:**

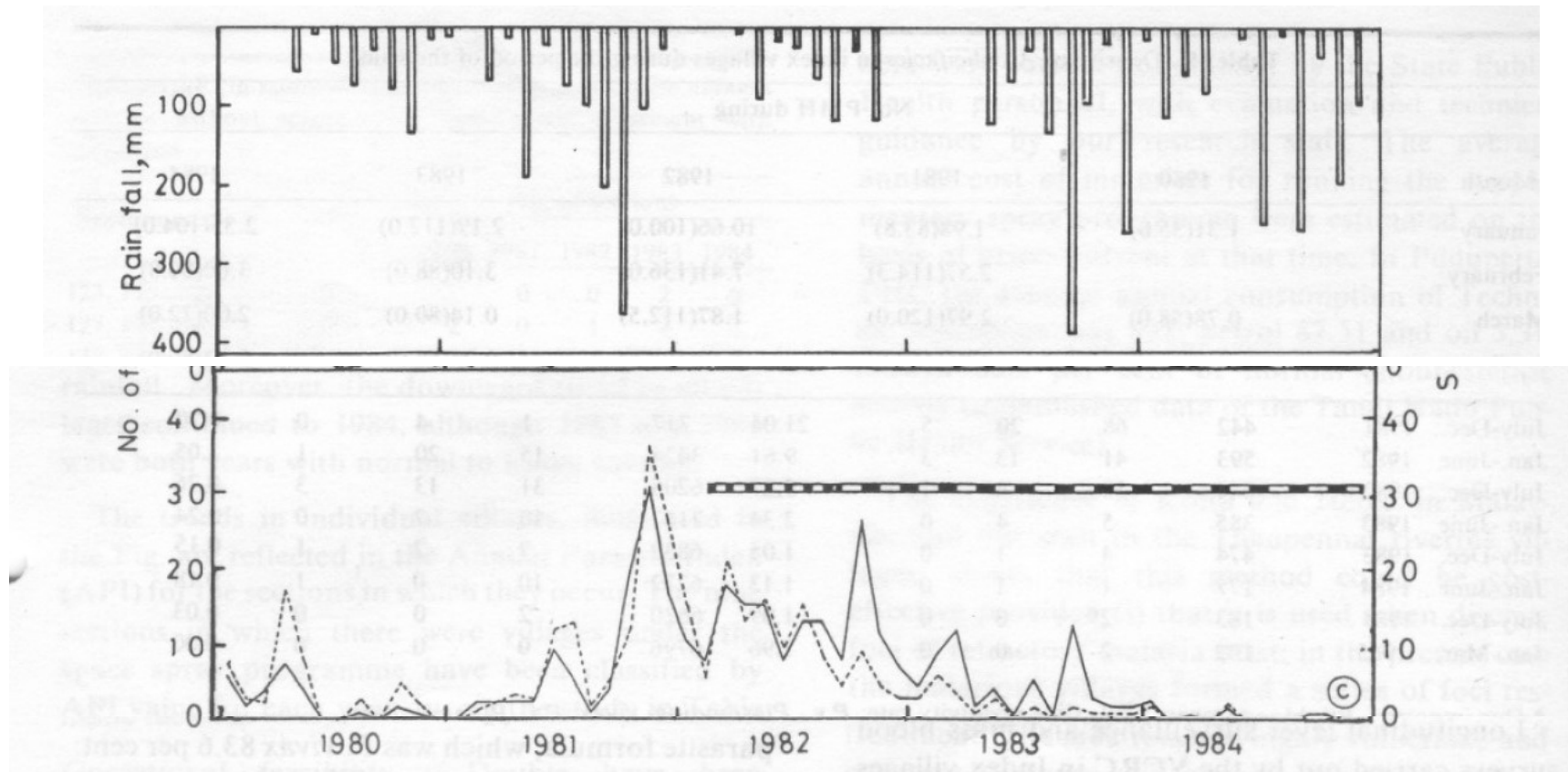
- ITS typically unaffected by typical confounding variables which remain fairly constant over time
- Can be affected by more rapidly-changing time varying confounders
- Seasonality
- Weather events

# Addressing methodological issues

## Time-varying confounders:



# Addressing methodological issues



## Addressing methodological issues

### **Time-varying confounders:**

- Other natural events affecting the outcome
- Other interventions targeting the same outcome

### **Managing time-varying confounders:**

- Where measured, include variables representing them in the regression model
- If unknown or unmeasured, there are some design adaptations.
- Controlled ITS, multiple baseline design, introduction and withdrawal