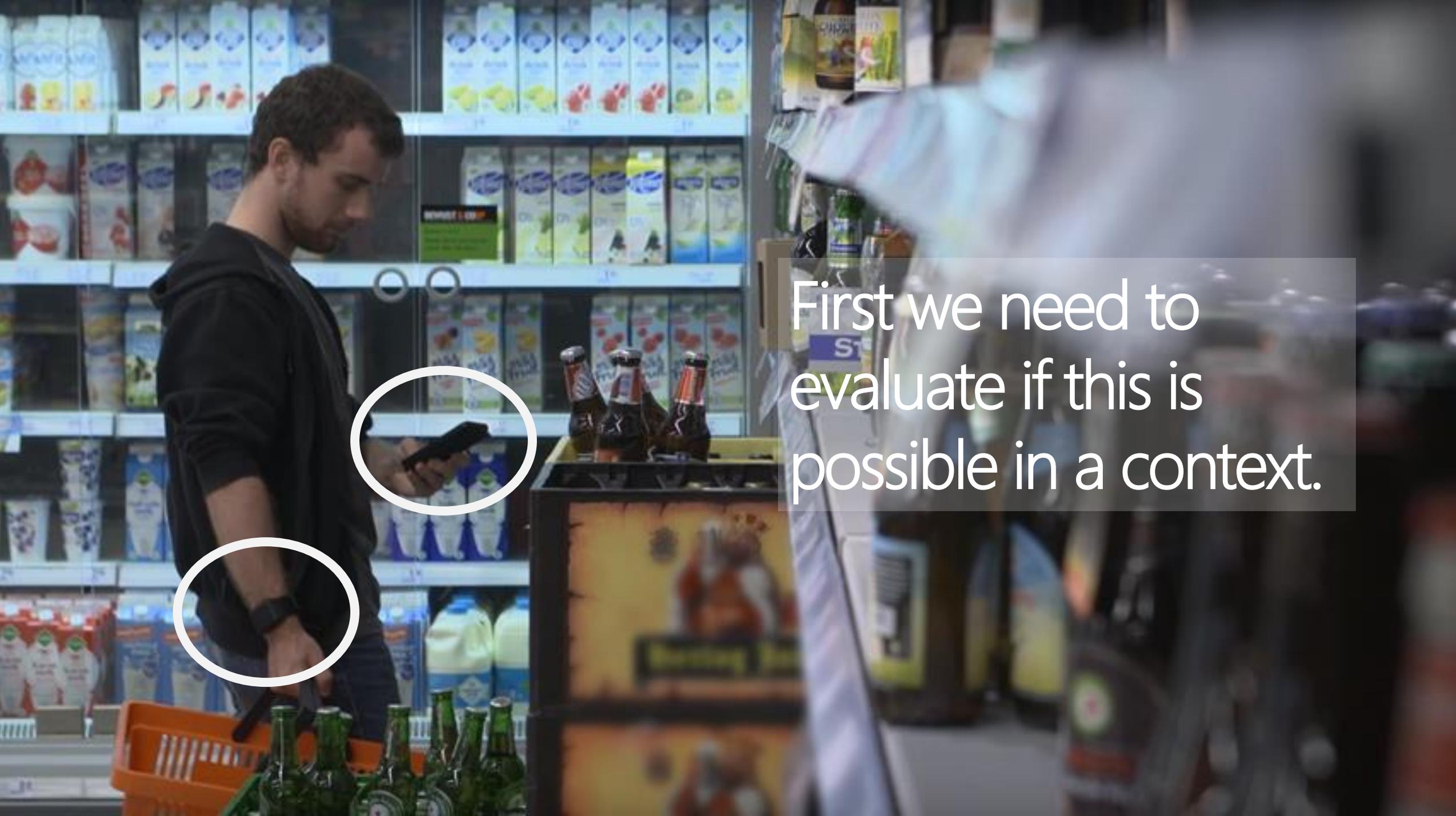


How to analyze a dynamic system of  
physiological and self-reported data (n=1)?  
- 22 september 2017 -

H.G. van Lier



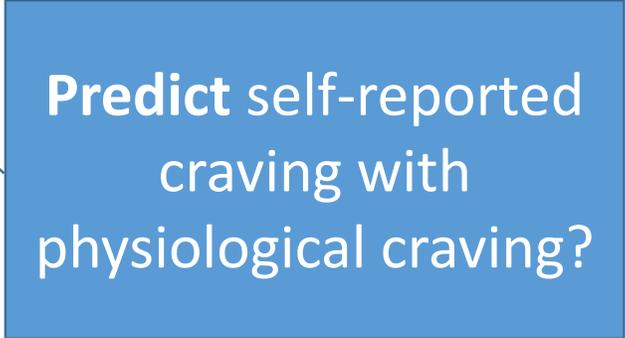
When developing an just in time intervention you try to predict the future for a person.



First we need to evaluate if this is possible in a context.

Is there dependence between physiological and self-reported craving **over time**?

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**Predict** self-reported craving with physiological craving?

**Replace** self-reported measurement with physiological measurement?

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**(Dis)prove** dependence between self-reported and physiological craving?

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Is there dependence between physiological and self-reported craving **over time**?

Predict self-reported craving with physiological craving?

2 physiological  
2 self-reported

# Data



Questionnaire every 3 hours.

# Variables



## **2 physiological:**

- (mean) skin conductance (SC) level
- (total) amplitude

# Variables

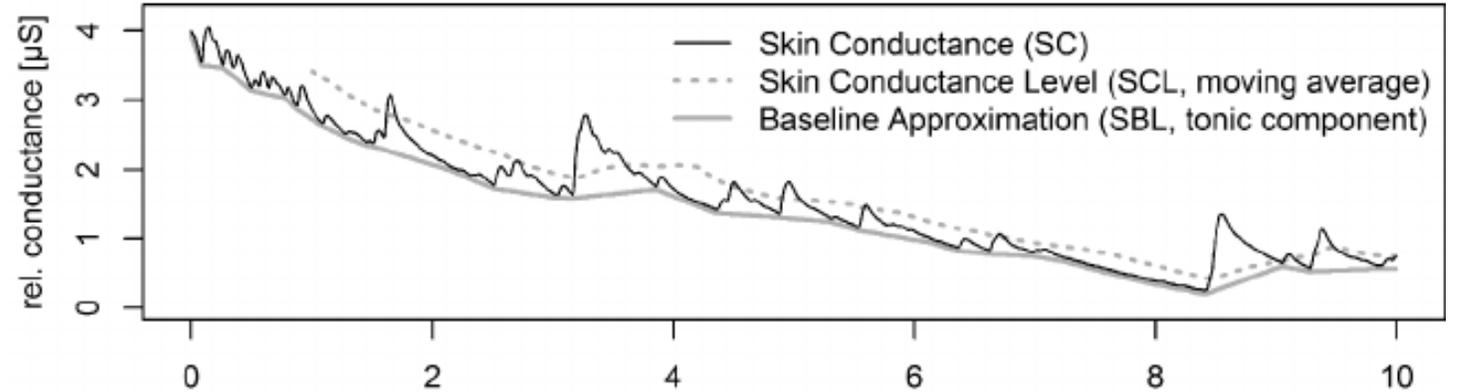
## **2 physiological:**

- (mean) SC level
- (total) amplitude

# Variables

## 2 physiological:

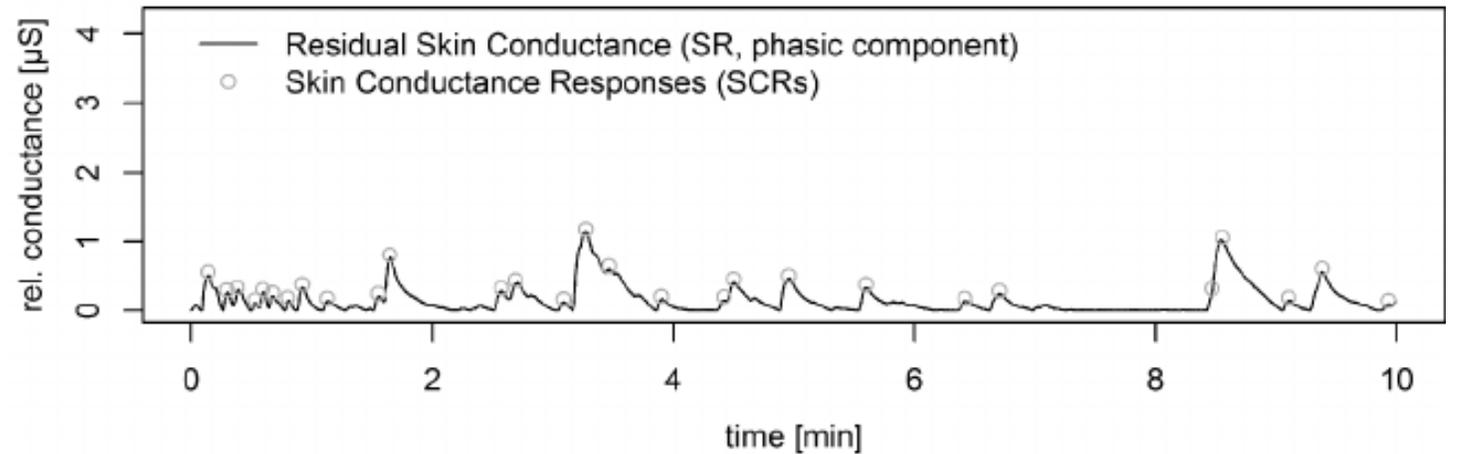
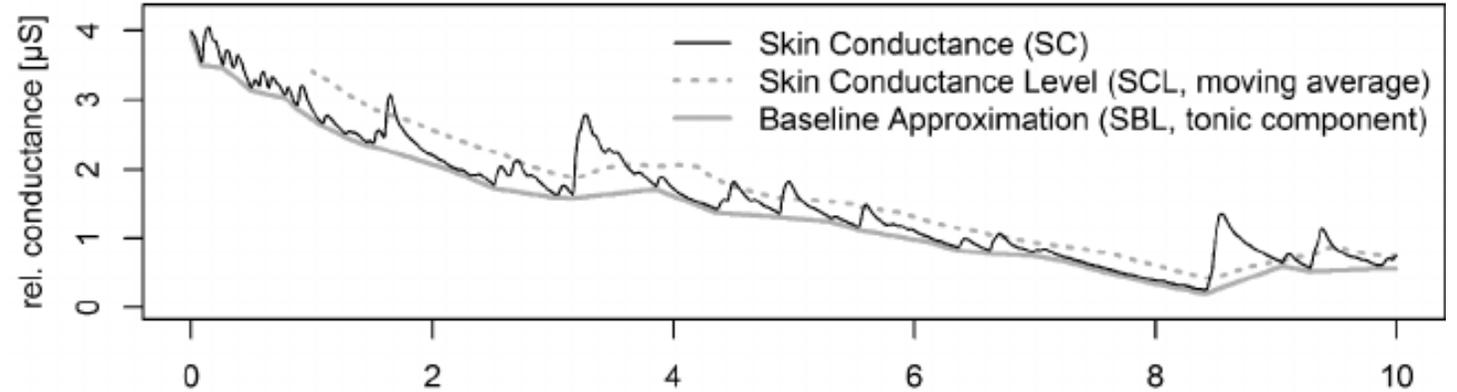
- (mean) SC level
- (total) amplitude



# Variables

## 2 physiological:

- (mean) SC level
- (total) amplitude

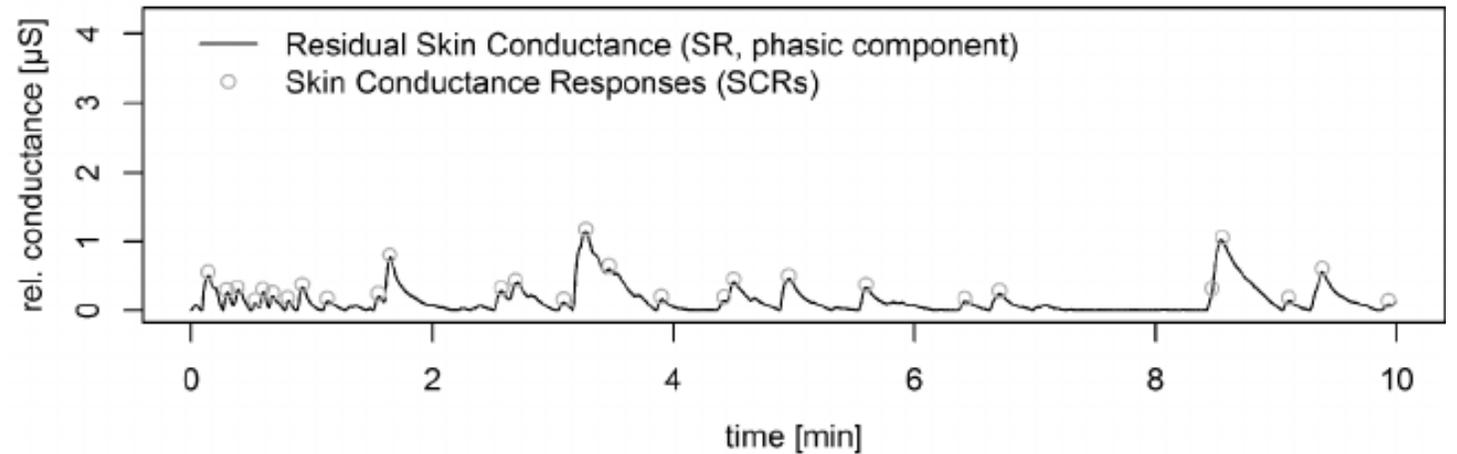
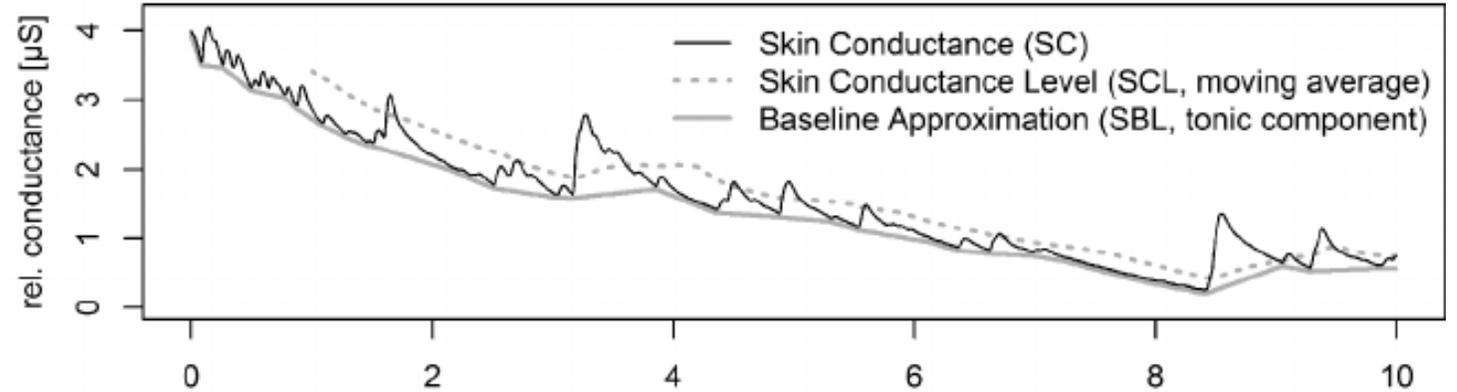
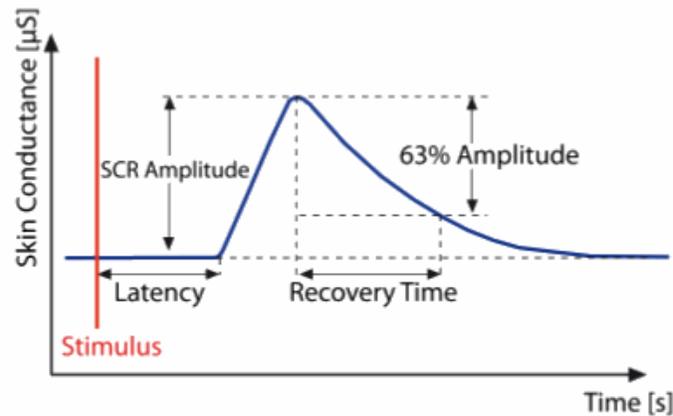


(Leiner, Fahr & Früh, 2012)

# Variables

## 2 physiological:

- (mean) SC level
- (total) amplitude



(Leiner, Fahr & Früh, 2012)

# Variables

## 2 self-reported:

- craving
- coping



# Variables

## 2 self-reported:

- craving
- coping

Ben NL 3G 10:07 94%

mQuest

Hoe sterk is uw trek op dit moment? Op een schaal van 0 (geen trek) tot 10 (extreme trek). 10

|

1	2 ABC	3 DEF
4 GHI	5 JKL	6 MNO
7 PQRS	8 TUV	9 WXYZ
,	0	⌫

How strong is your craving currently?  
On a scale of 0 (no craving) to 10  
(extreme craving).

# Variables

## 2 self-reported:

- craving
- coping

Ben NL 3G 10:07 94%

mQuest

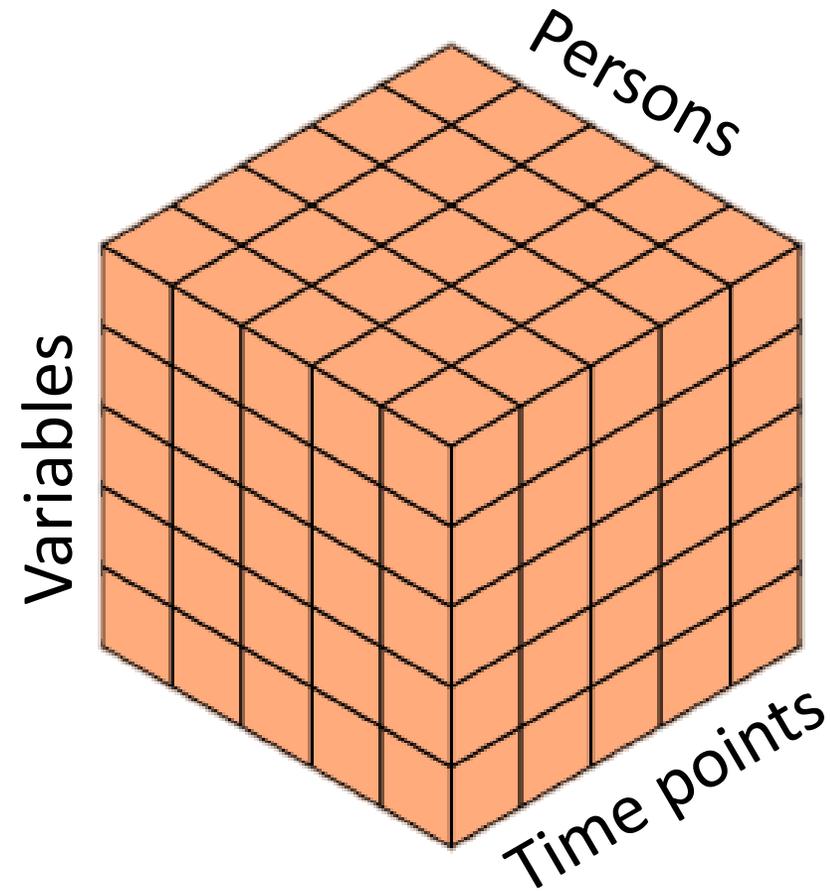
In hoeverre denk je dat je nu in staat bent om je trek in alcohol te weerstaan? Op een schaal van 0 (niet te weerstaan) tot 10 (makkelijk te weerstaan).

← ☰ 🗨 →

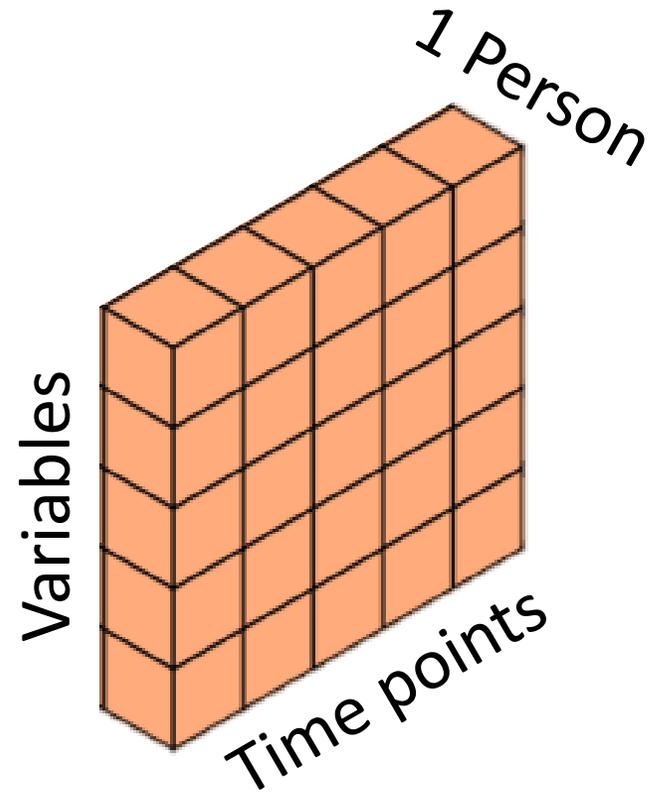
1	2 ABC	3 DEF
4 GHI	5 JKL	6 MNO
7 PQRS	8 TUV	9 WXYZ
,	0	⌫

To what extent do you think you are able to resist your craving currently? On a scale of 0 (not resistible) to 10 (easy to resist).

# Cattell's Data box (Cattell, 1952)



$N=1$



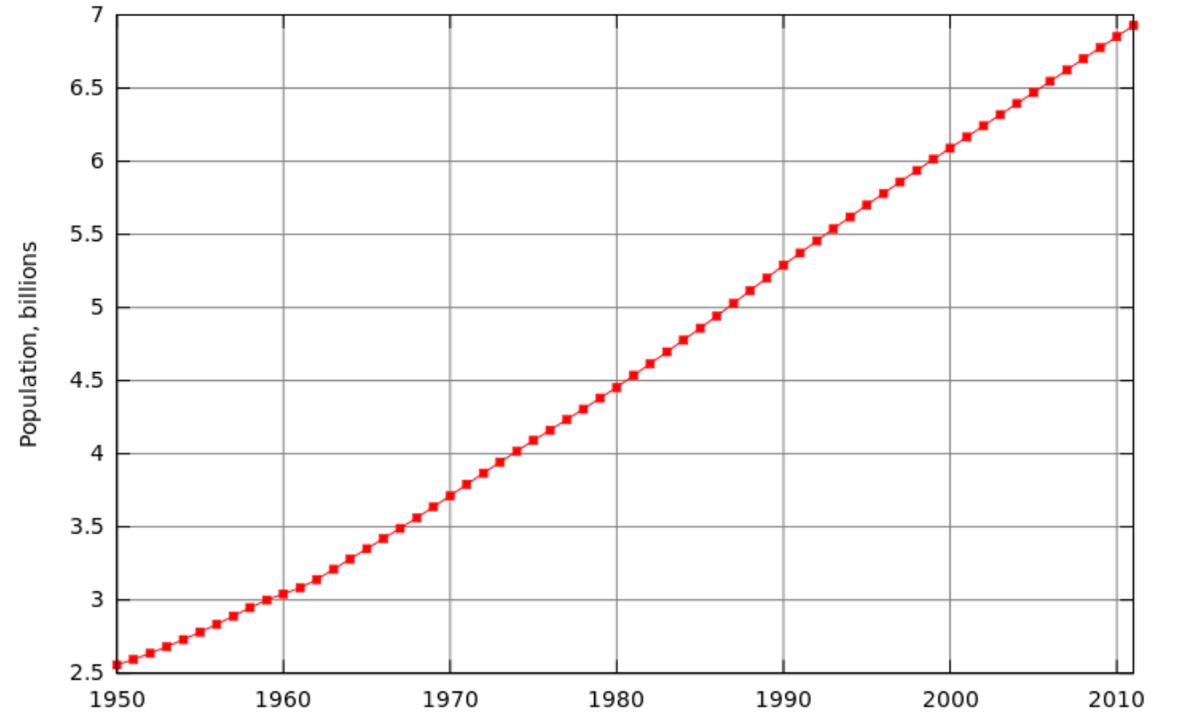
# Dynamic system

Two or more variables measured over time.

Not one outcome and another explanatory variable, but a system of variables continuously influencing each other back and forth over time.

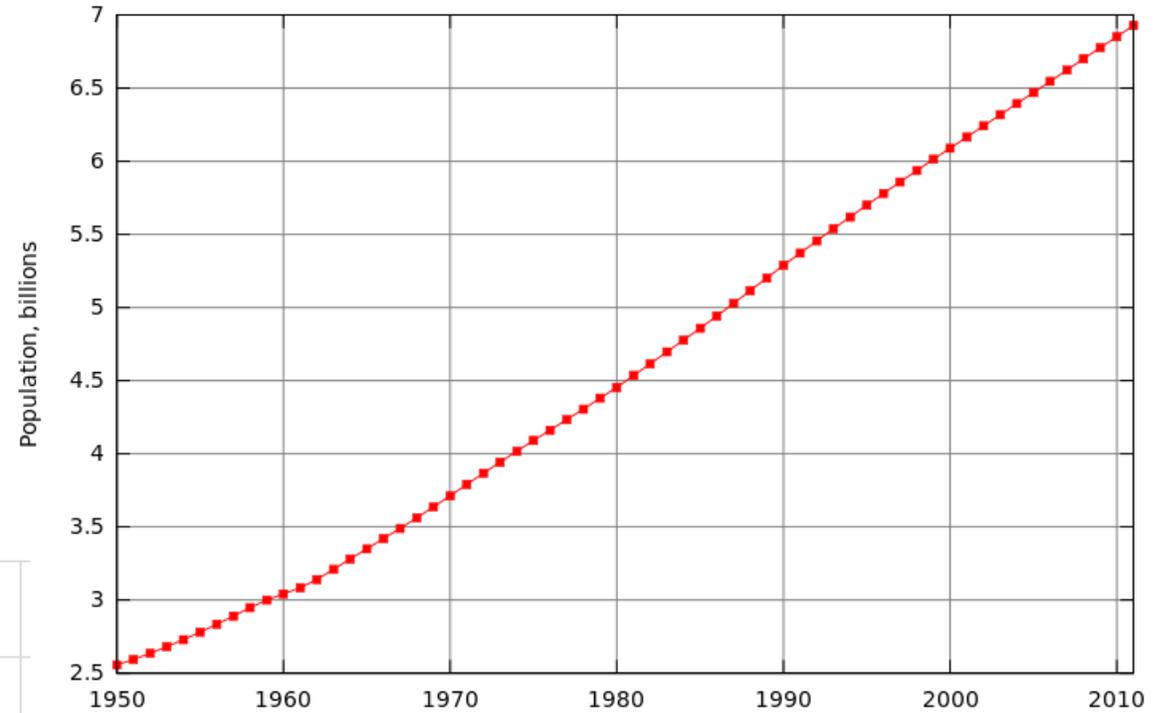
# Longitudinal data:

- (Linear) trend



# Longitudinal data:

- (Linear) trend



# Time series data:

- Autocorrelation
- (Linear) Trend

# Time series data

We want to study:

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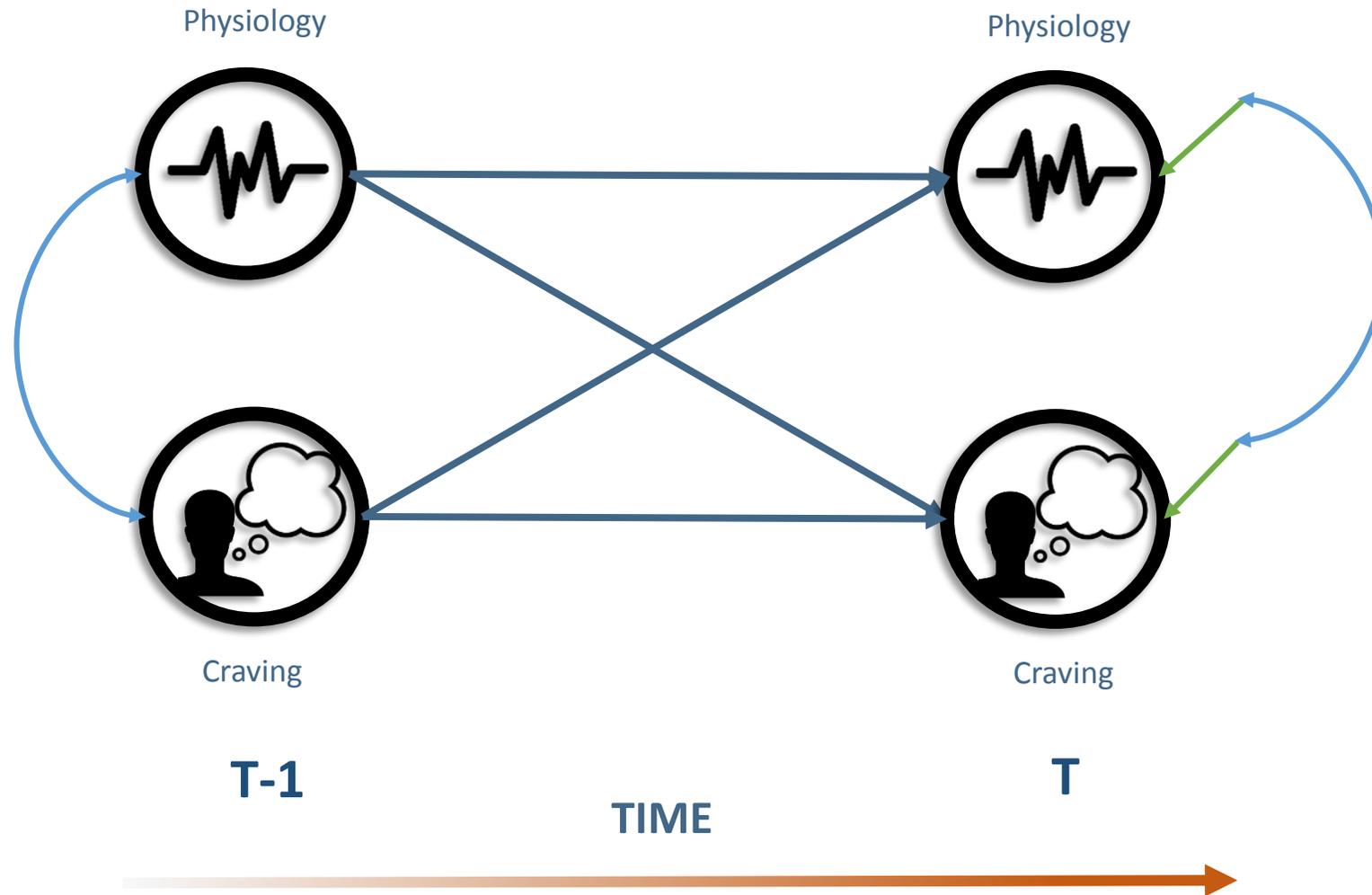
- relationships between a variable and itself on prior time point:  
**autoregressive relations**

# Time series data

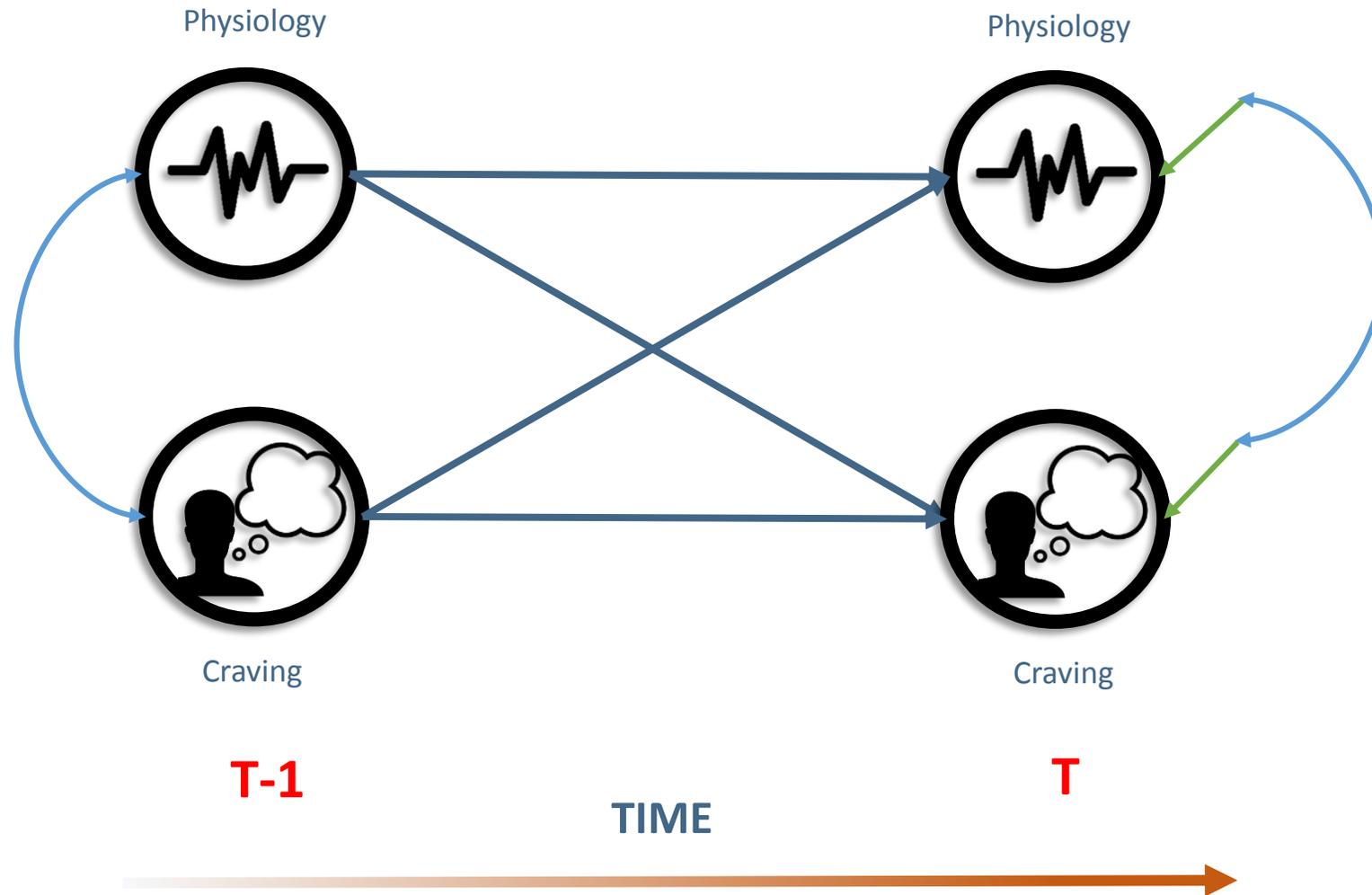
We want to study:

- relationships between a variable and itself on prior time point:  
**autoregressive relations**
- relationship between different variables on prior time point:  
**cross-lagged relations**

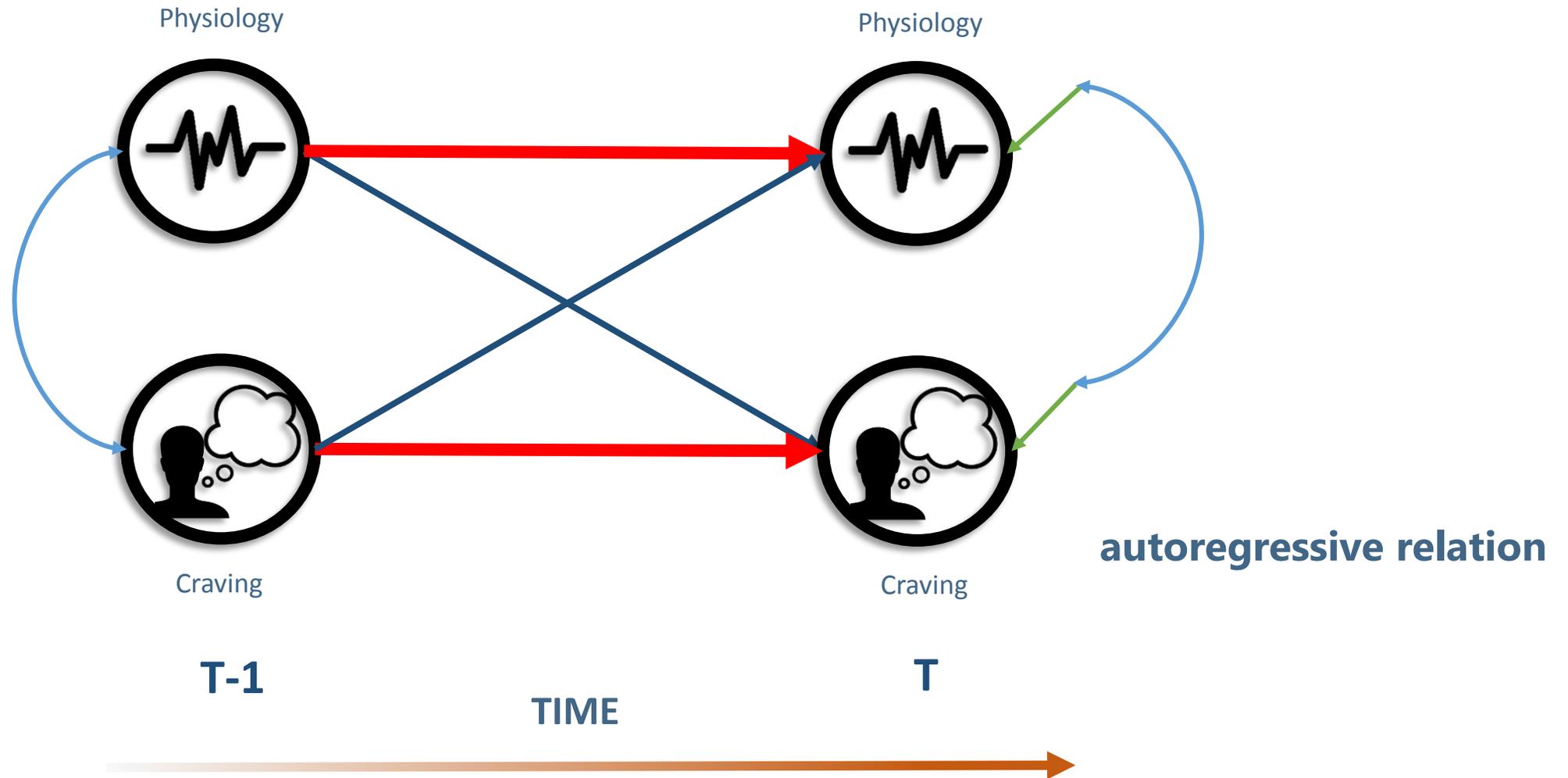
# Vector Auto Regressive Model



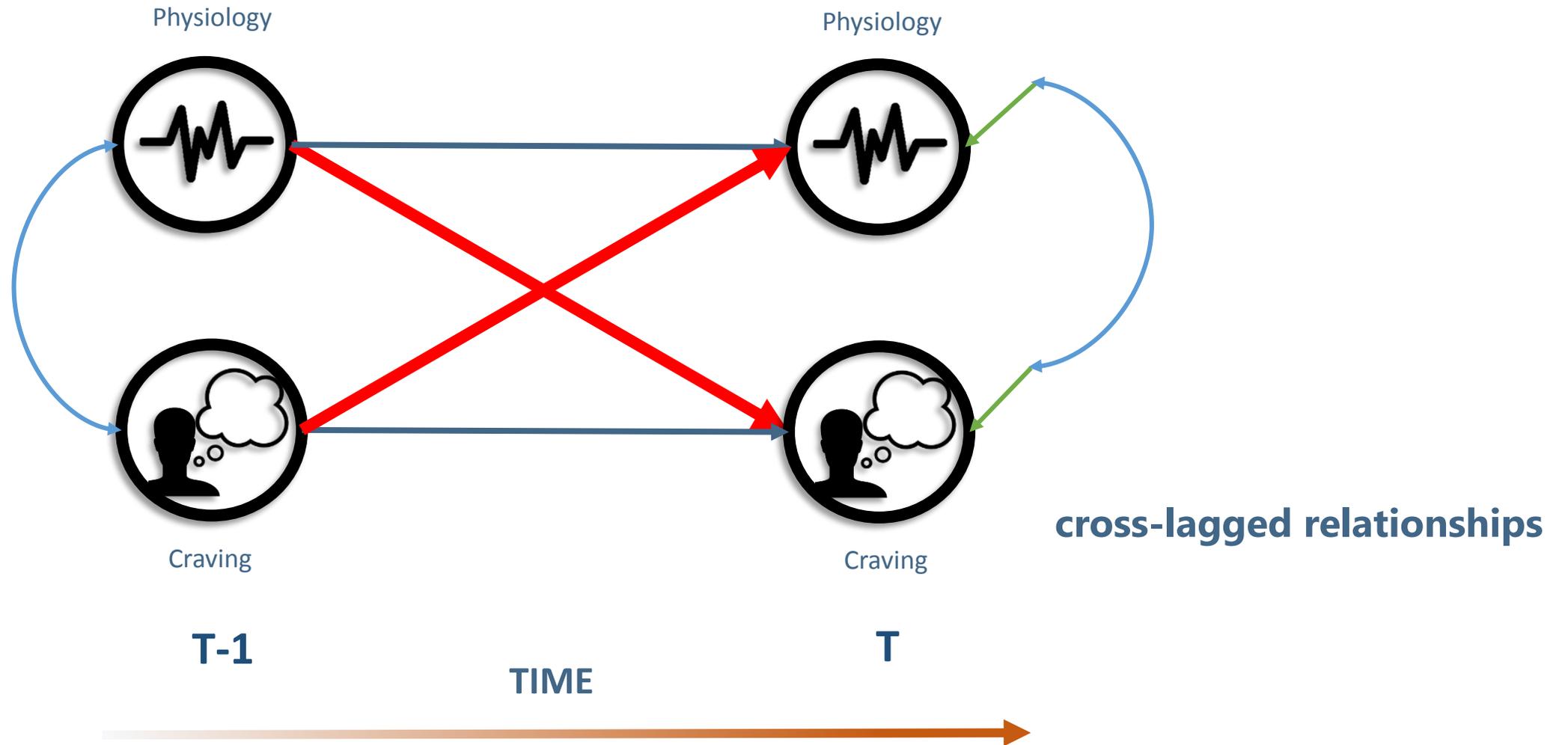
# Vector Auto Regressive Model



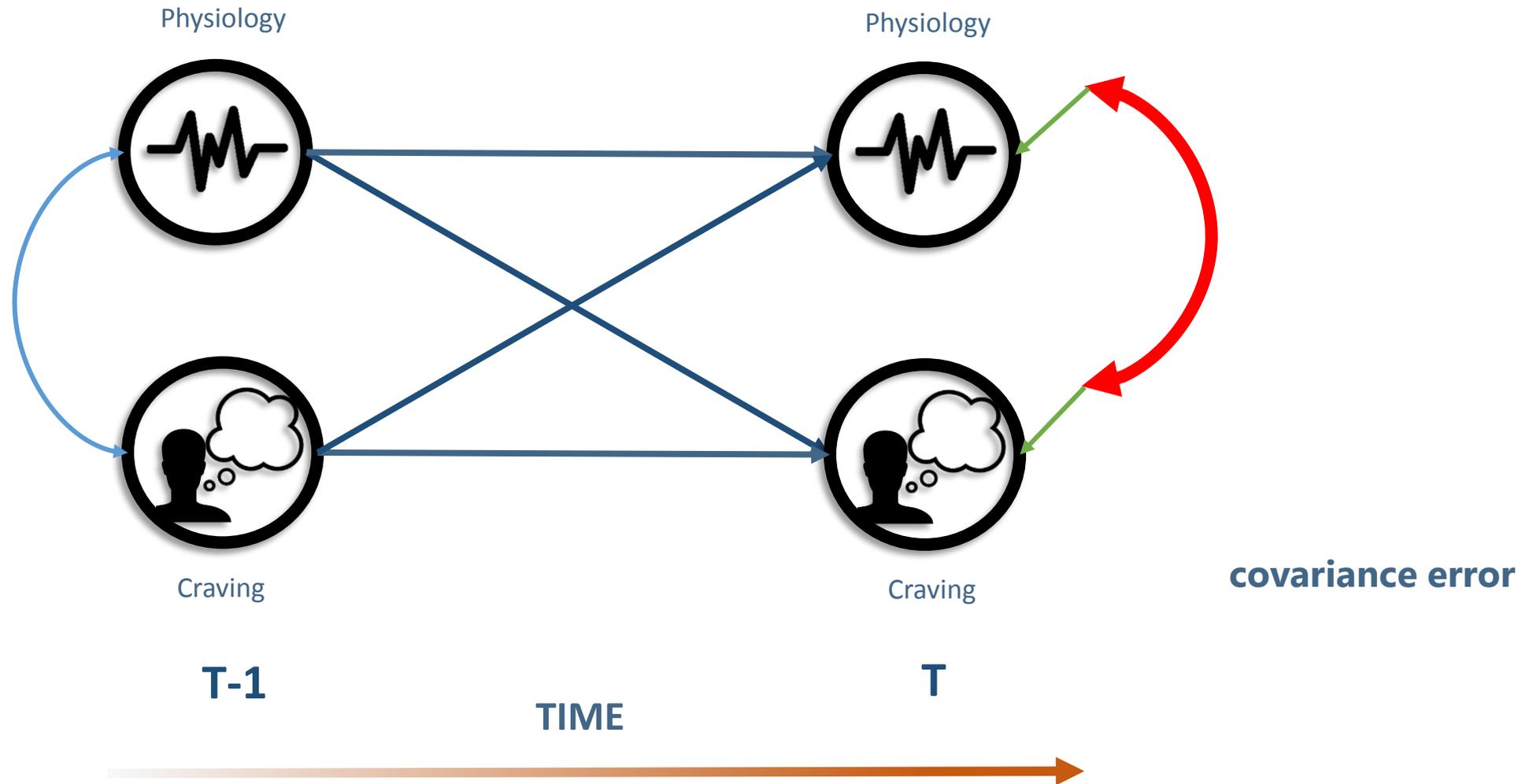
# Vector Auto Regressive Model



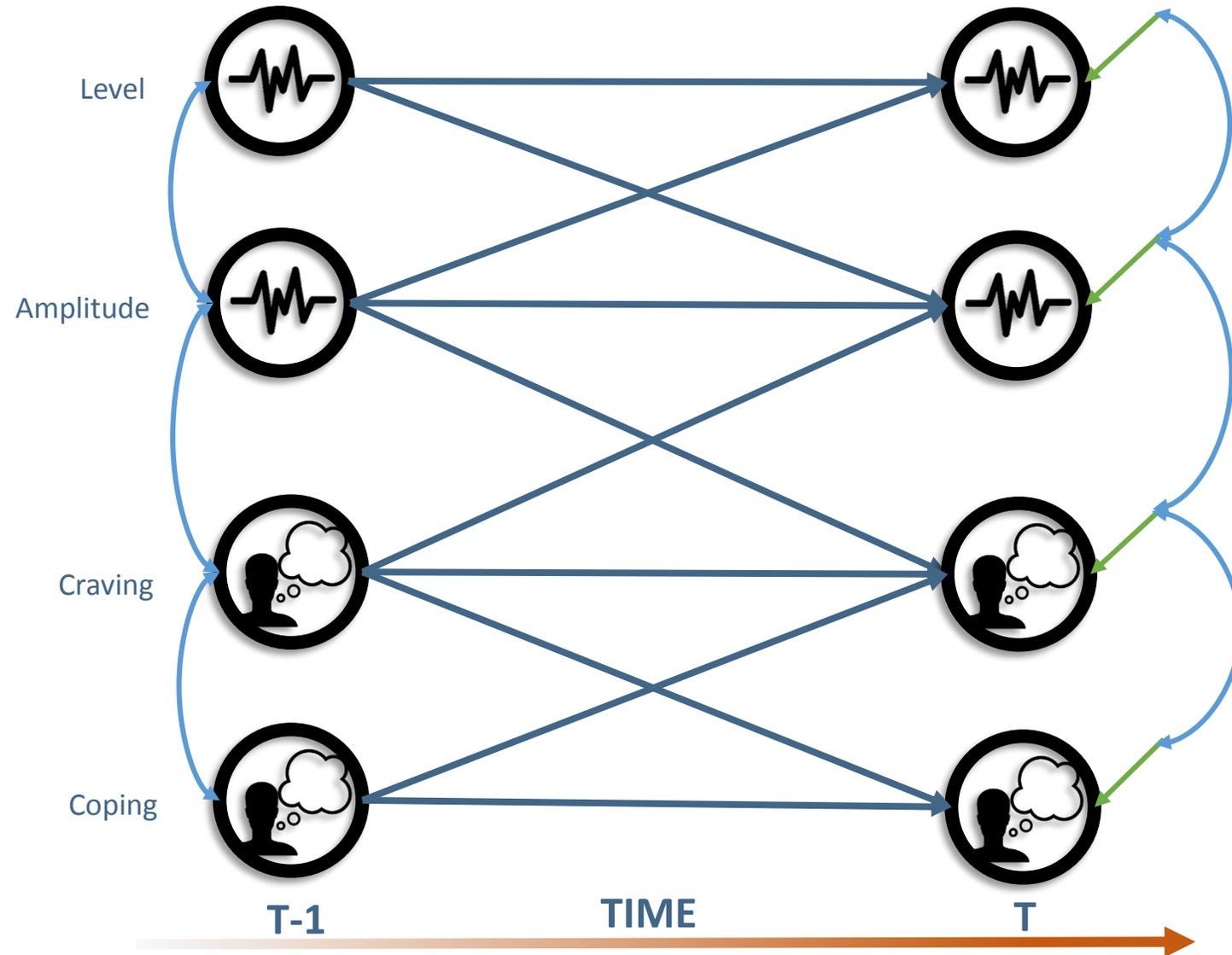
# Vector Auto Regressive Model



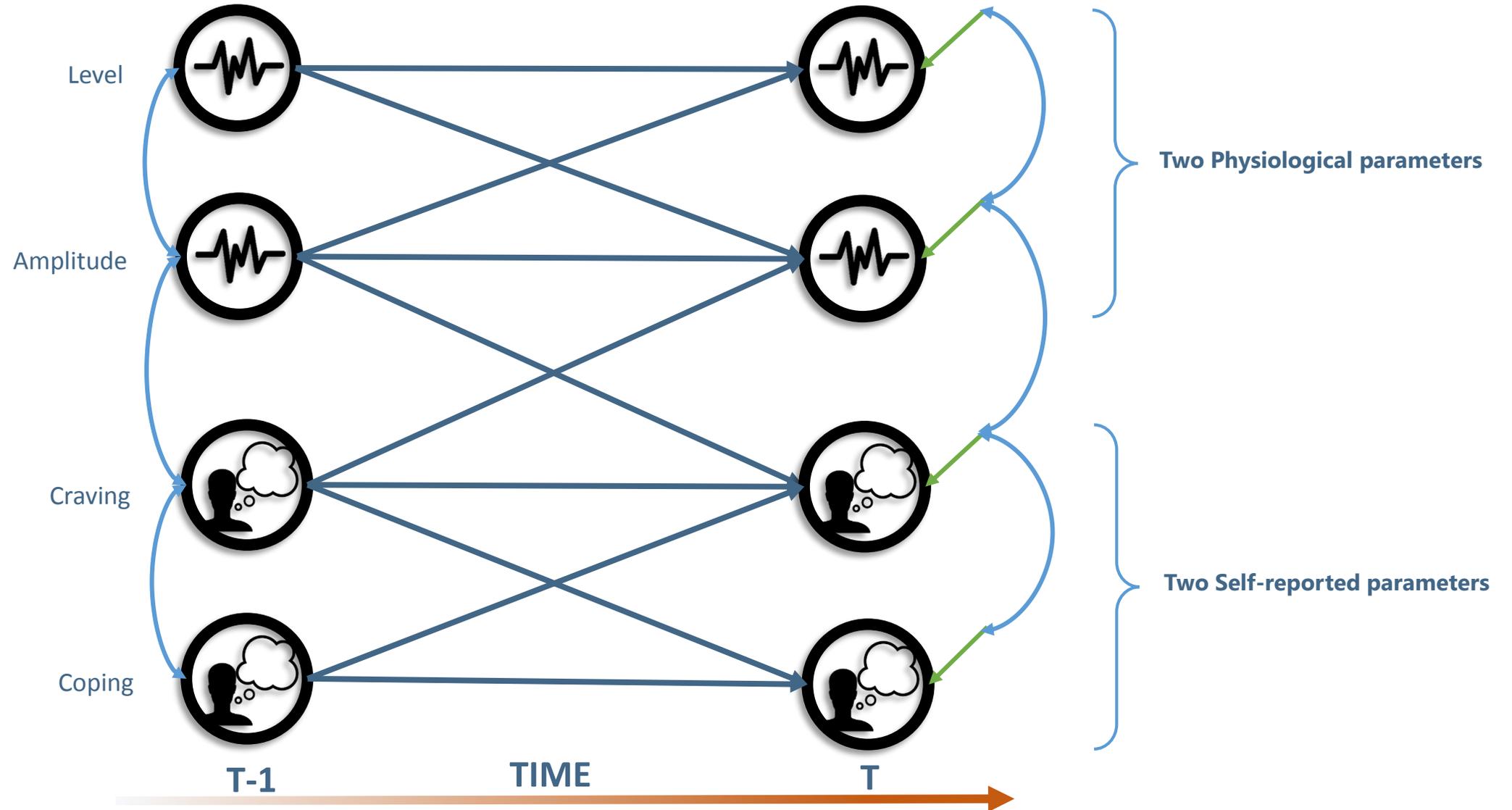
# Vector Auto Regressive Model



# Vector Auto Regressive Model



# Vector Auto Regressive Model



# Time series data

**Y**

$Y_1$

$Y_2$

$Y_3$

$Y_4$

...

$Y_T$

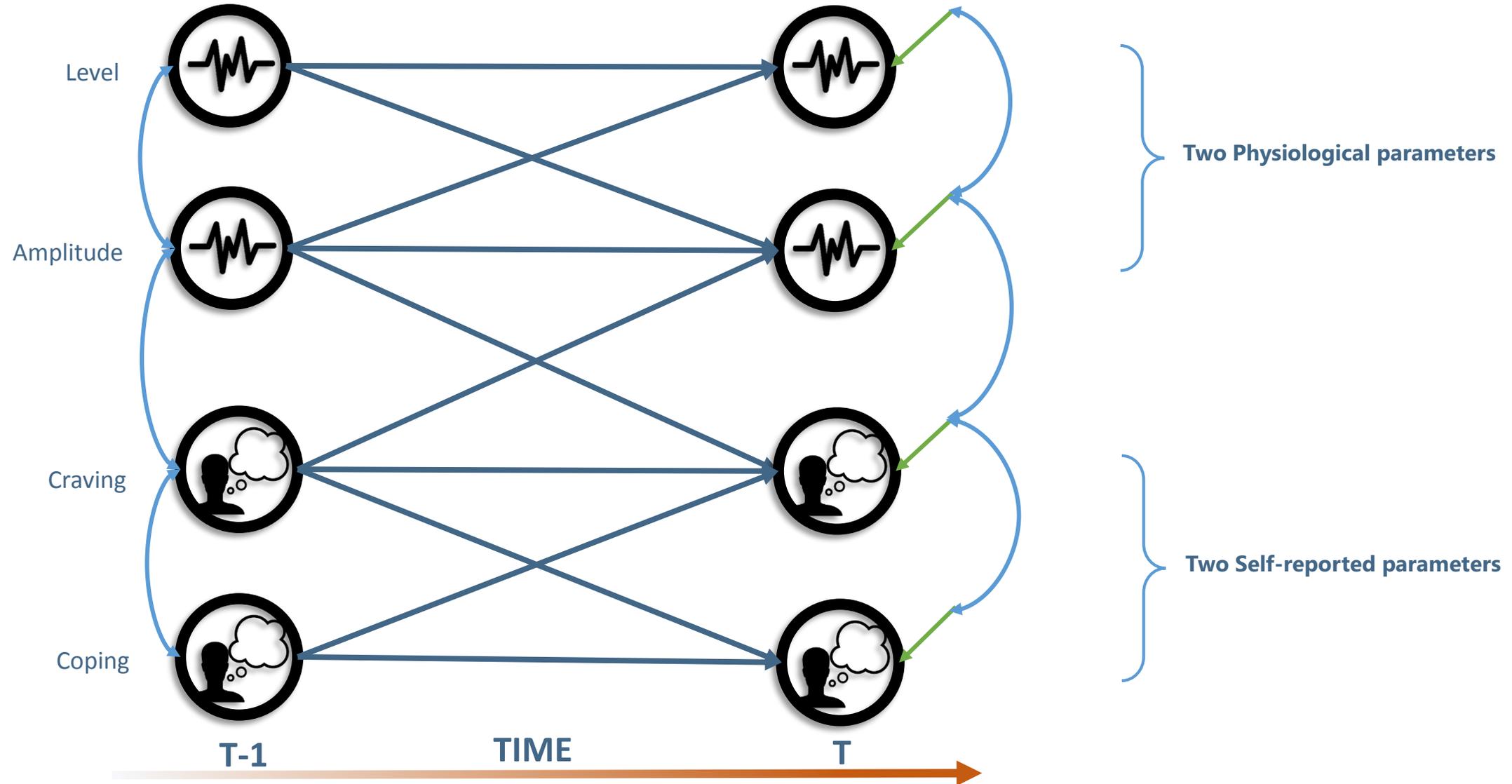
# Time series data

<b>Y</b>	<b>Y at lag 1</b>
$Y_1$	
$Y_2$	$Y_1$
$Y_3$	$Y_2$
$Y_4$	$Y_3$
...	...
$Y_T$	$Y_{T-1}$
	$Y_T$

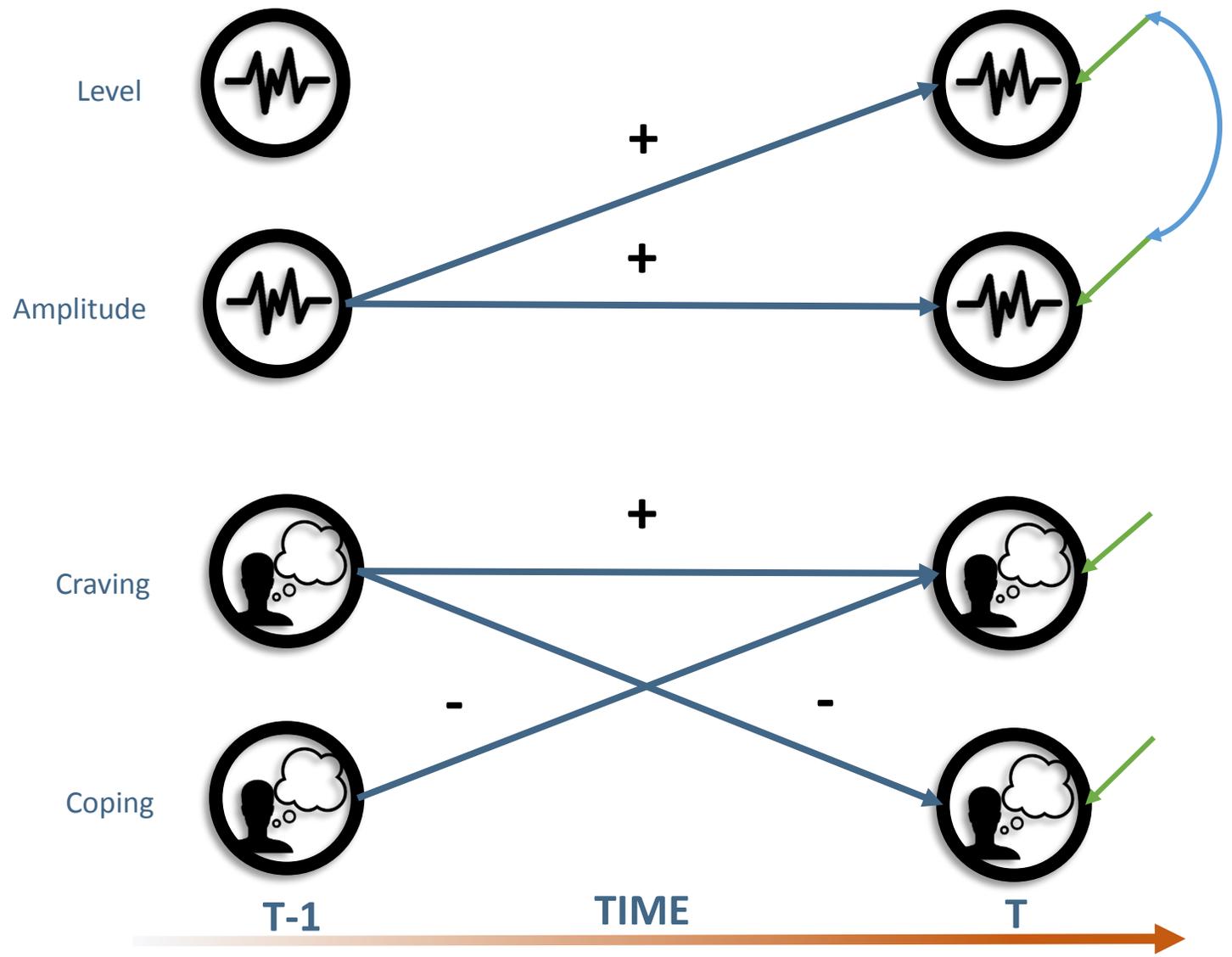
# Time series data

<b>Y</b>	<b>Y at lag 1</b>
$Y_1$	
$Y_2$	$Y_1$
$Y_3$	$Y_2$
$Y_4$	$Y_3$
...	...
$Y_T$	$Y_{T-1}$
	$Y_T$

# Vector Auto Regressive Model



# Results



# Conclusion

**No dependence** between physiology and self-reported craving over time for this person.

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Craving **predicts** coping 3 hours later  
and

Coping **predicts** craving 3 hours later

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Craving **predicts** coping 3 hours later  
and

Coping **predicts** craving 3 hours later

Total amplitude **predicts** mean SC level 3 hours later

# Wrap Up..

If you want to **predict the future for a person**, it is advisable to use a VAR model (instead of linear regression) to evaluate the dependence between physiological and self-reported measures.

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If you want to **predict the future for a person**, it is advisable to use a VAR model (instead of linear regression) to evaluate the dependence between physiological and self-reported measures.

**Added benefit:** You don't need to identify an outcome and an explanatory variable, but can analyze a system of variables continuously influencing each other back and forth over time.

# Future research

- Amount of measurements needed to determine an individualized just in time intervention strategy?

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- Amount of measurements needed to determine an individualized just in time intervention strategy?
- Other physiological parameters might predict craving?
- Does a similar non-dependence between the physiological and self-reported parameters exist in other persons as well?
- Physiology might predict relapse?

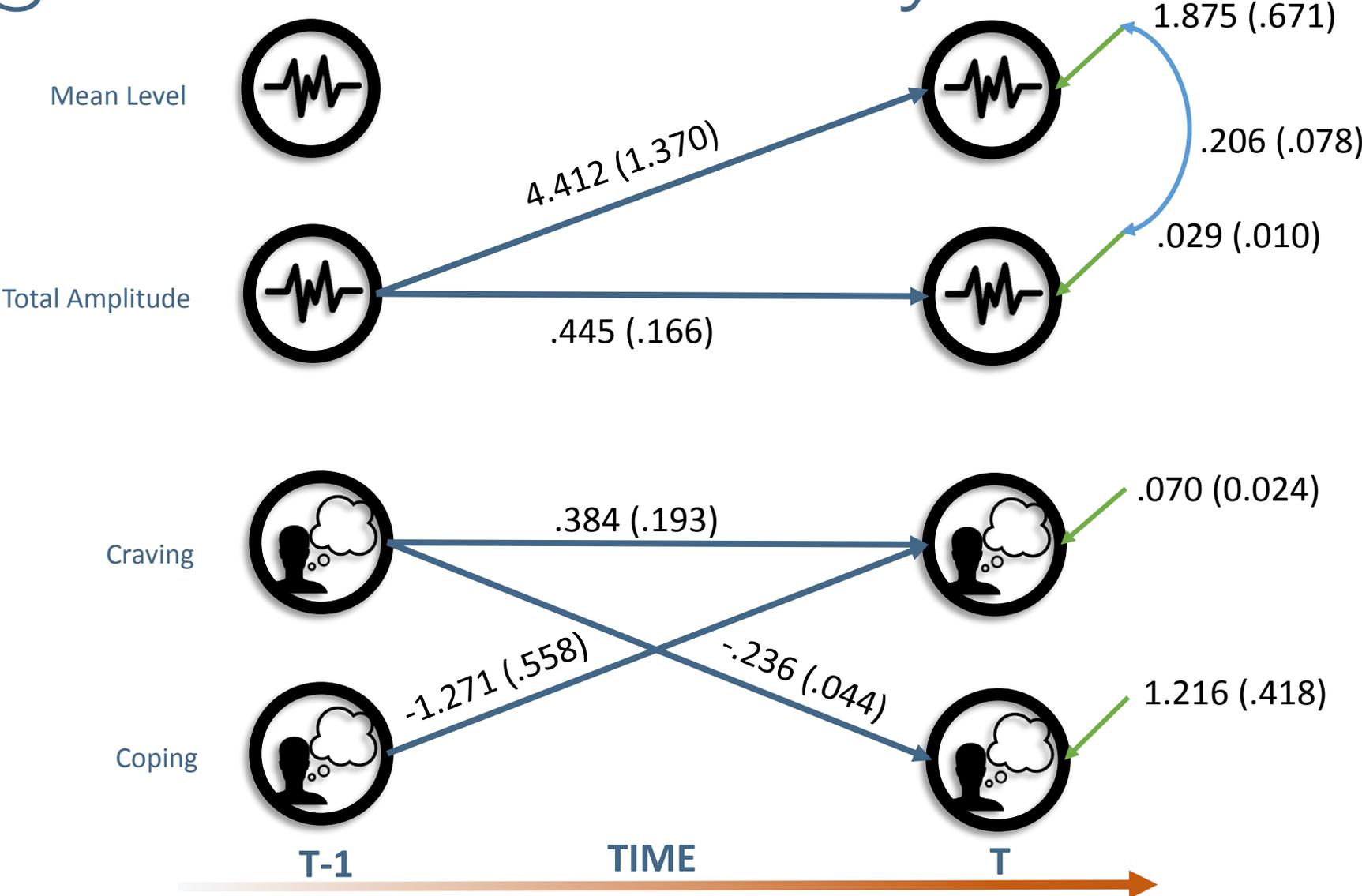


Questions?

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# Significant results only



# MPLUS CODE

## TITLE:

Physiology vs self-reported data;

## DATA:

FILE IS y.dat;

## VARIABLE:

NAMES ARE Crave Crave1 Coping Coping1 Amp Amp1 Level  
Level1;

USEVARIABLE ARE Crave Crave1 Coping Coping1 Amp Amp1 Level  
Level1;

MISSING ARE ALL (999);

## OUTPUT:

TECH1 MODINDICES;

## MODEL:

Crave ON Crave1;  
Crave ON Coping1;  
Crave ON Amp1;

Coping ON Coping1;  
Coping ON Crave1;

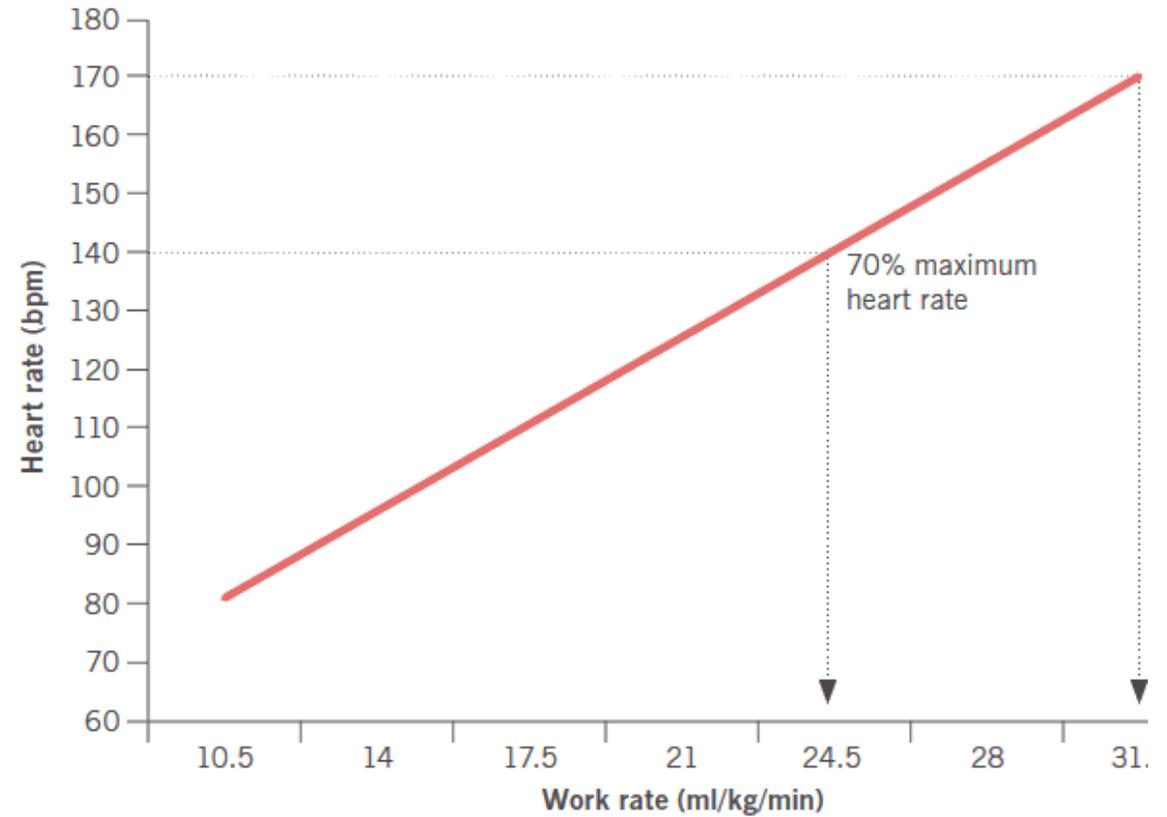
Amp ON Amp1;  
Amp ON Crave1;  
Amp ON Level1;

Level ON Level1;  
Level ON Amp1;

Amp WITH Crave;  
Crave WITH Coping;  
Level WITH Amp ;

# Normal regression

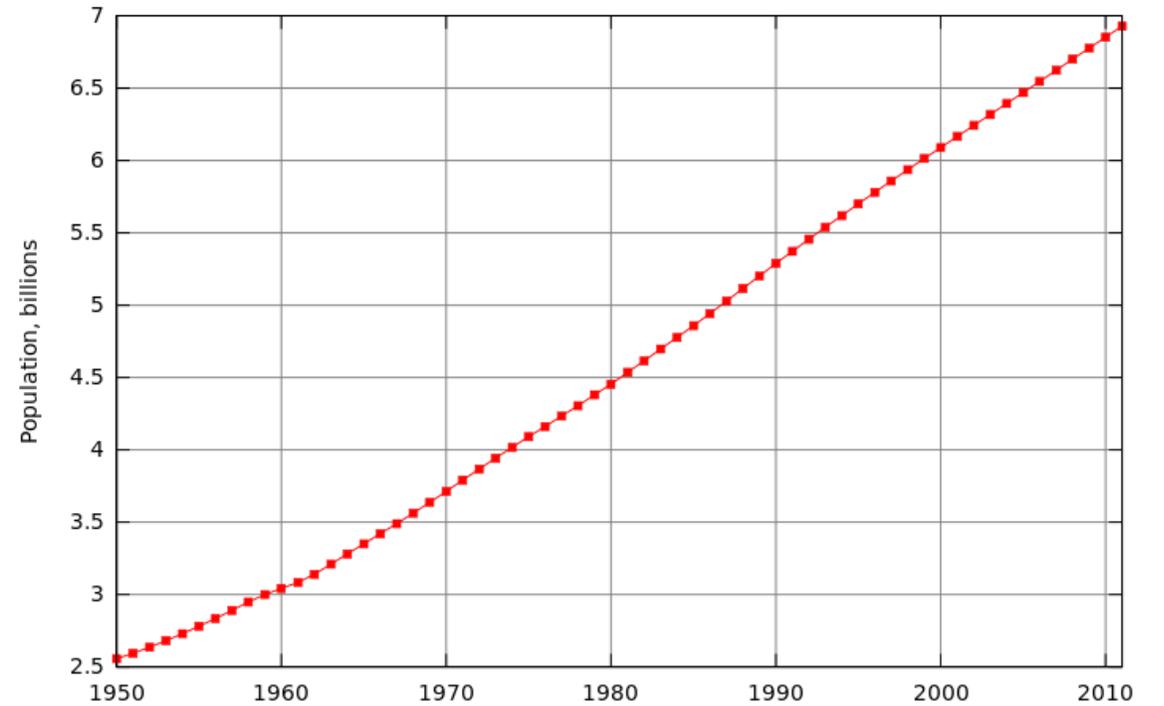
$$y = \beta_1 x_1 + \epsilon$$



# Linear trend

$$y = \beta_1 x_1 + \epsilon$$

$$y_t = \beta_t t + \epsilon$$



# Auto correlation

$$y = \beta_1 x_1 + \epsilon$$

$$y_t = \beta_t t + \epsilon$$

$$y_t = \beta_{t-1} y_{t-1} + \epsilon$$

