

# Trajectories of dietary habits and body mass index in prodromal phase of dementia : dynamic approach with latent process

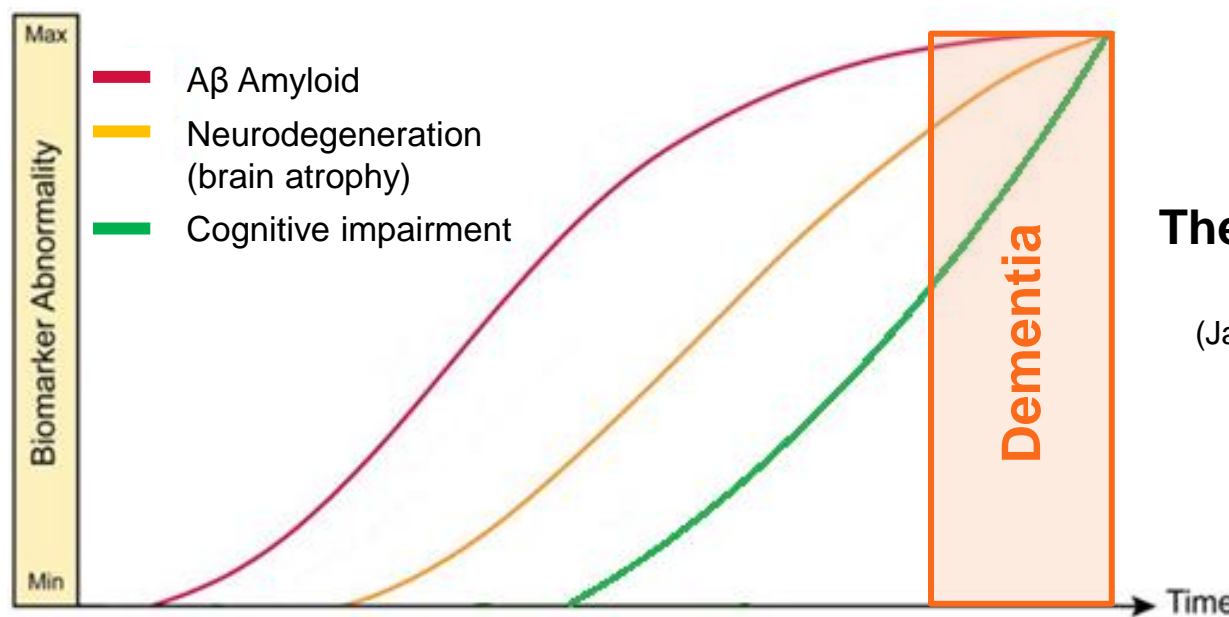
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# Dementia

- ▶ 2016 : **47.5 million** affected worldwide [1]
- ▶ 2020 : **1 in 4 french people** ( $\geq 65$  years) could be demented [2]
- ▶ Alzheimer's disease (AD) : main form of **dementia**
- ▶ Risk factors : age, genetics  
cardiovascular factors, lifestyle (nutrition)
- ▶ No etiological treatment → **Prevention**
- ▶ Long preclinical phase → **Long-term prevention**



## Theoretical pathological cascade

(Jack *et al.*, Lancet Neurol., 2010)



# Nutrition and dementia

- ▶ Lifelong exposure
- ▶ Modulates cardiovascular factors
- ▶ Anti-inflammatory and antioxydant properties

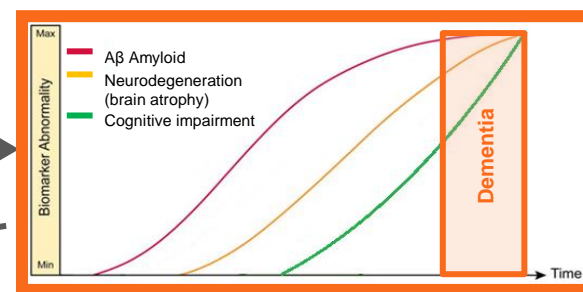
Féart C, 2009

**Causal relation**

**Nutrition**

**Reverse causation**

Guérin O, 2005



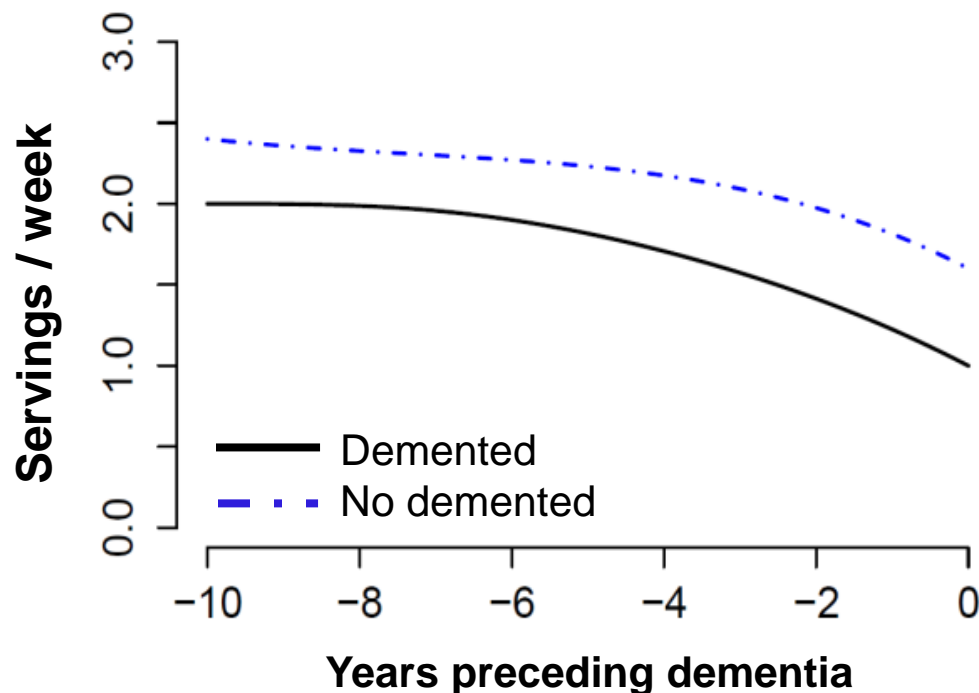
- Difficult interpretations in terms of causality
- Longitudinal studies most appropriate



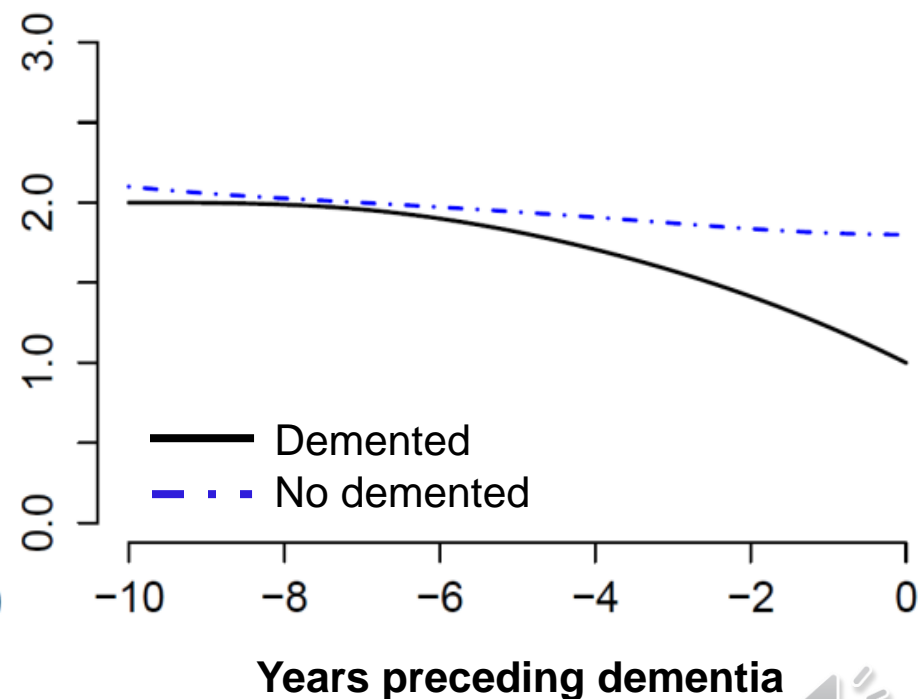
# Causality assumptions

- ▶ Expected trajectories of a **protective food**

**Causal relation**



**Reverse causation**



# Objective

Compare the consumption trajectories of major foods and body mass index in the 10 years prior to the diagnosis visit of dementia among demented cases and control subjects in the Three-City (3C) Study – Bordeaux

## Statistical issues

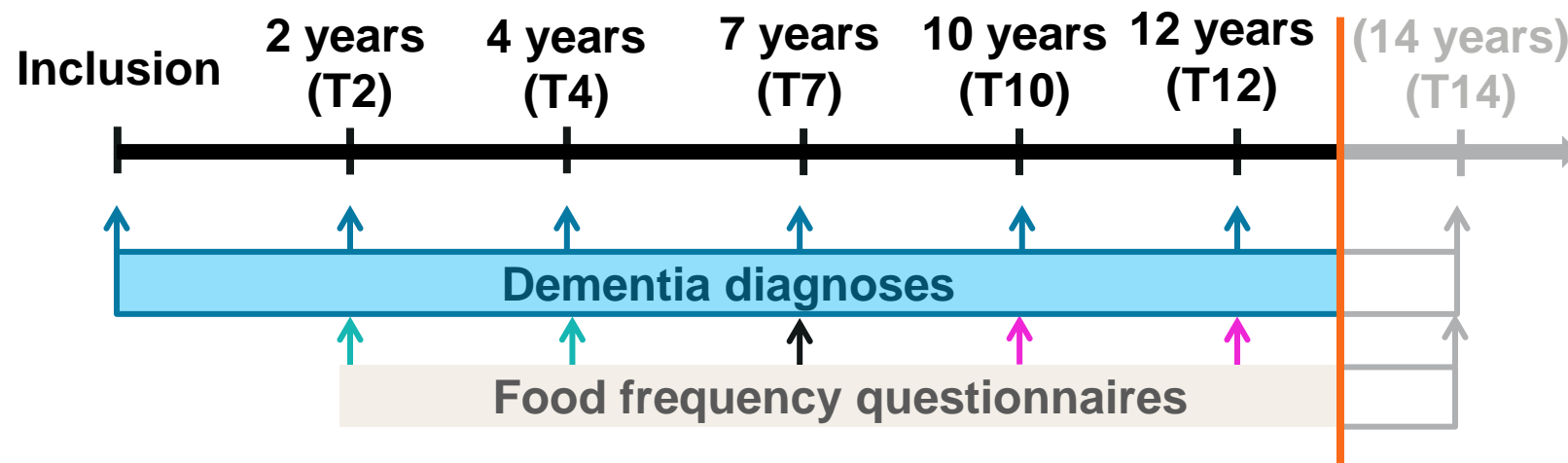
### Comparison of trajectories

- ▶ Selection of nested case-control study sample

### Complexity of data

- ▶ Change of food frequency questionnaire (FFQ) during the follow-up
- ▶ Potential non-gaussian data
  - Latent process multivariate mixed models

# Study sample (1)



## Population (N = 1425)

- ▶ Included in 3C – Bordeaux
- ▶ No demented at T2 (study baseline)
- ▶ Followed at least up to T4
- ▶ Nutritional evaluation at T2

## Subsample of demented (n = 212)

- ▶ Diagnosed with dementia at T4, T7, T10 or T12
- ▶ ≤ 1 follow-up visit missed before diagnostic

## Study sample (2)

### Case-control sample (n = 615)

#### Potential controls

- ▶ All subjects no demented at the diagnosis visit of case

#### Matching method

- ▶ Random sampling with replacement
- ▶ Control subjects possibly matched several times to different follow-ups

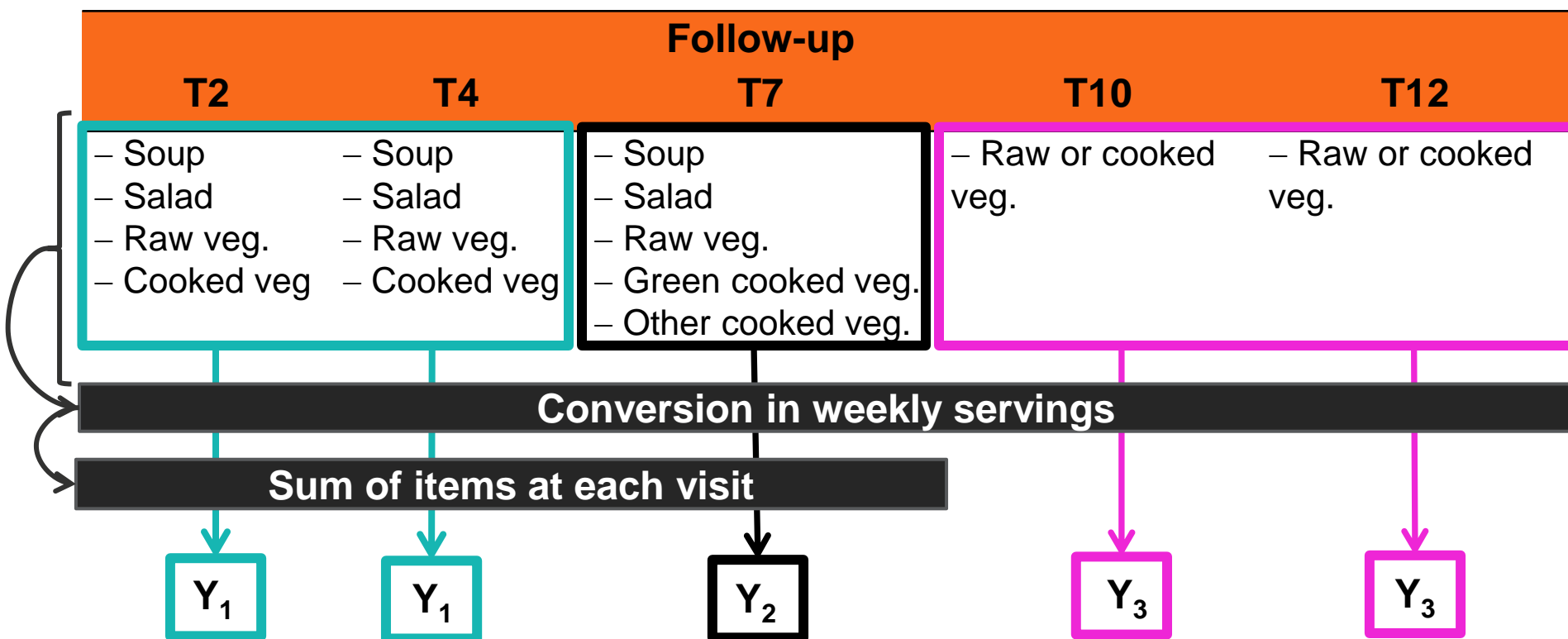
#### Matching variables

- ▶ Gender
- ▶ Initial age ( $\pm 3$  years)
- ▶ Educational level ( $\leq$  secondary school vs. higher)
- ▶ Number of food frequency questionnaire (FFQ) reply ( $\pm 1$ )



## 3C – Bordeaux data

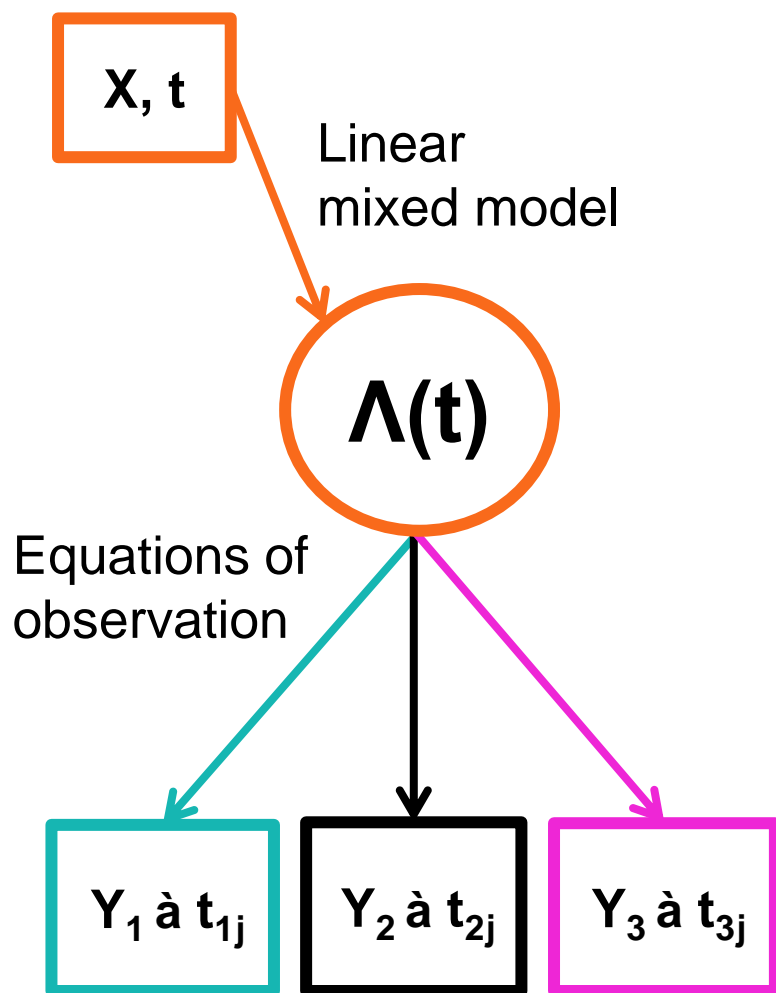
- ▶ Nutritional evaluation from T2 (comprehensive dietary survey) to T12
- ▶ **5 food families of interest** : Fruits, Vegetables, Meat, Fish, Carbohydrate-rich foods (cereal, rice, pasta, potatoes, dried vegetables)



→ 3 different measurement tools ( $k = 1, 2, 3$ )



# Latent process mixed model



## Latent consumption for a given food family

$$\Lambda_i(t) = X_i(t)^T \beta + Z_i(t)^T b_i$$

$$i = (1, \dots, N); b_i \sim N(0, B); t \in \mathbb{R}$$

## Measurement tools observed ( $k = 1, 2, 3$ )

- ▶ linear or non-linear (splines) transformations

$$H_k(Y_{kij}; \eta_k) = \Lambda_i(t_{kij}) + \varepsilon_{kij}$$

$$\varepsilon_{kij} \sim N(0, \sigma_{\varepsilon k}^2); \varepsilon_{kij} \perp \varepsilon_{kij'}; b_i \perp \varepsilon_i; j = (1, \dots, n_{ik})$$

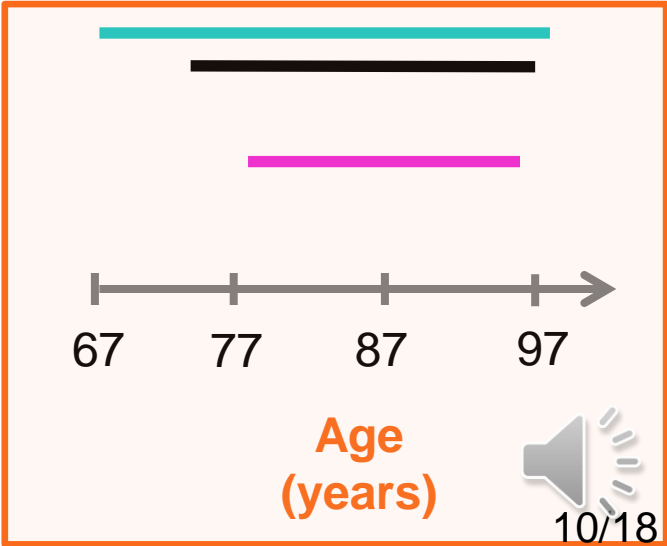
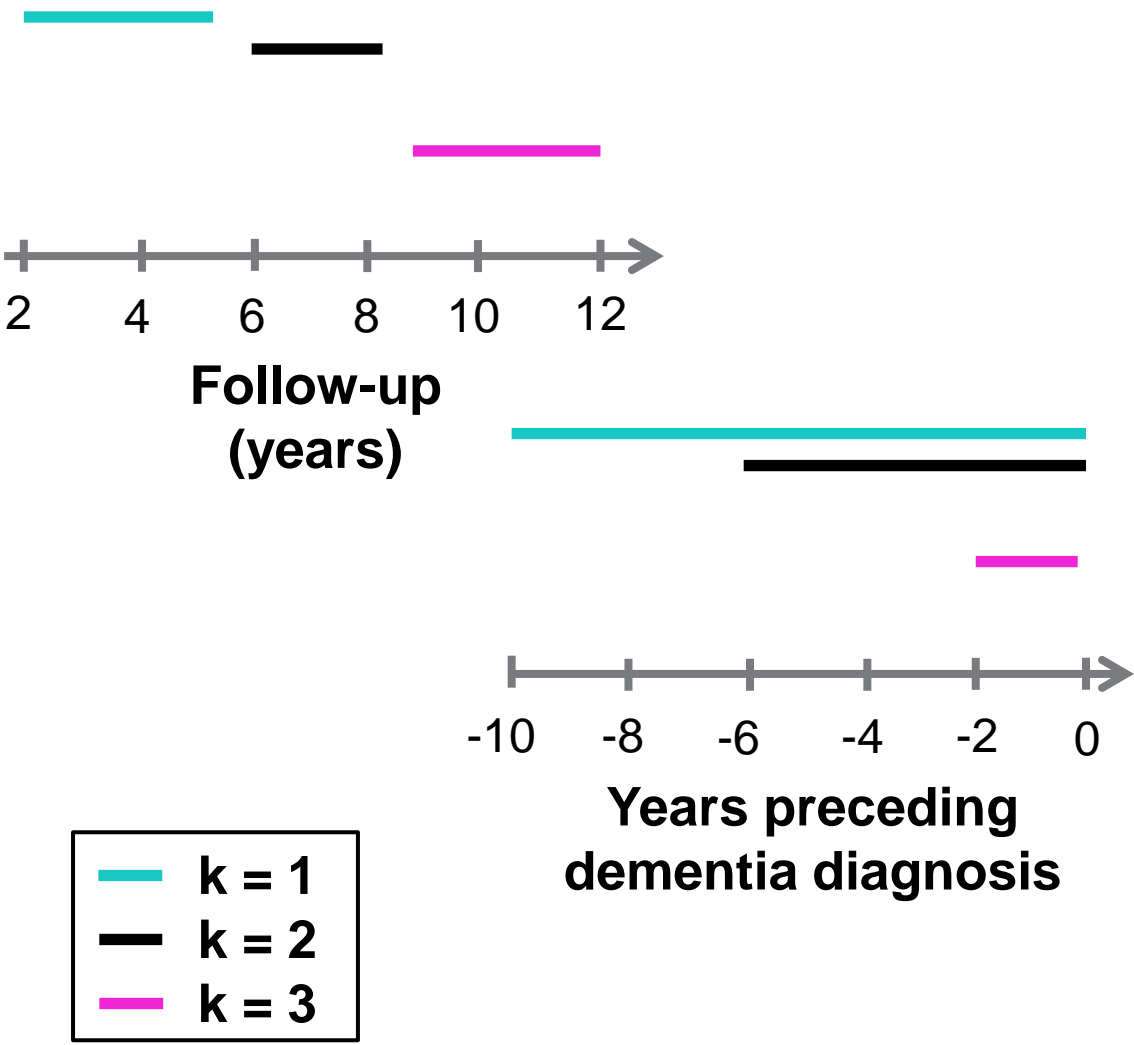
- ▶ thresholds transformations  
→ distributions < 10 different levels

$$Y_{kij} = m \Leftrightarrow \eta_m < \Lambda_i(t_{kij}) + \varepsilon_{kij} \leq \eta_{m+1}$$

$$\varepsilon_{kij} \sim N(0, \sigma_{\varepsilon k}^2); \varepsilon_{kij} \perp \varepsilon_{kij'}; b_i \perp \varepsilon_i; j = (1, \dots, n_{ik})$$

- ▶ Function **multlcmm** of the **lcmm** package developed in **R**

# Sequential change of FFQ over time



# Modelling strategy

## 1) Estimation of transformation parameters $\hat{\eta}$ by food family

- Timescale : age

$$\Lambda_i(t = \text{age67}) = \beta_1 t + \beta_2 t^2 + \beta_3 \text{age0}_i + b_{0i} + b_{1i} t$$

$$\text{age67} = (\text{age0} - 67)/100 ; b_i \sim N(0, B)$$

$$H_1(Y_{1ij}; \eta_1) = \Lambda_i(t_{1ij}) + \varepsilon_{1ij}$$

$$H_2(Y_{2ij}; \eta_2) = \Lambda_i(t_{2ij}) + \varepsilon_{2ij}$$

$$H_3(Y_{3ij}; \eta_3) = \Lambda_i(t_{3ij}) + \varepsilon_{3ij}$$

Vegetables

## 2) Estimation of trajectories

- Timescale : delay = (age at a given visit – age at the matching visit)/100
- Retrospective analyzes since the matching visit
- Fixed transformations :  $\eta = \hat{\eta}$

$$\Lambda_i(t = \text{delay}) = \beta_0 + \beta_1 t + \beta_2 t^2 + \beta_3 \text{case}_i + \beta_4 \text{case}_i^* t + \beta_5 \text{case}_i^* t^2 + \beta_6 \text{age0}_i + \beta_7 \text{gender}_i$$

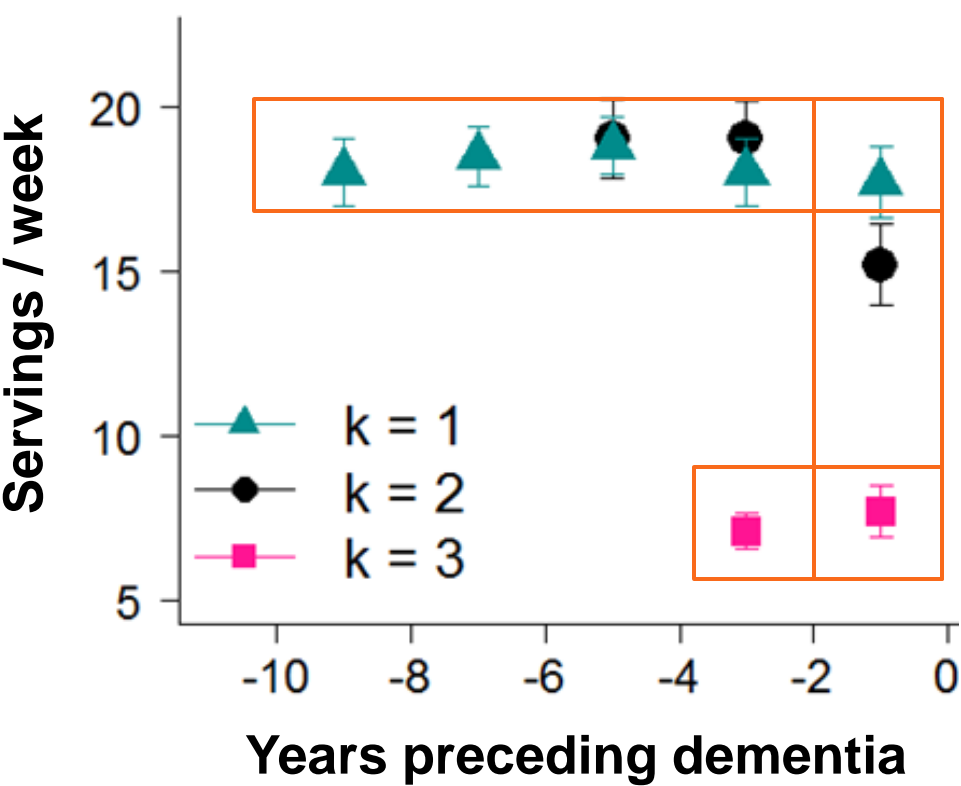
$$+ \beta_8 \text{education}_i + \beta_9 \text{age0}_i^* t + \beta_{10} \text{gender}_i^* t + \beta_{11} \text{education}_i^* t + b_{0i} + b_{1i}^* t \text{ with } b_i \sim N(0, E)$$

# Results

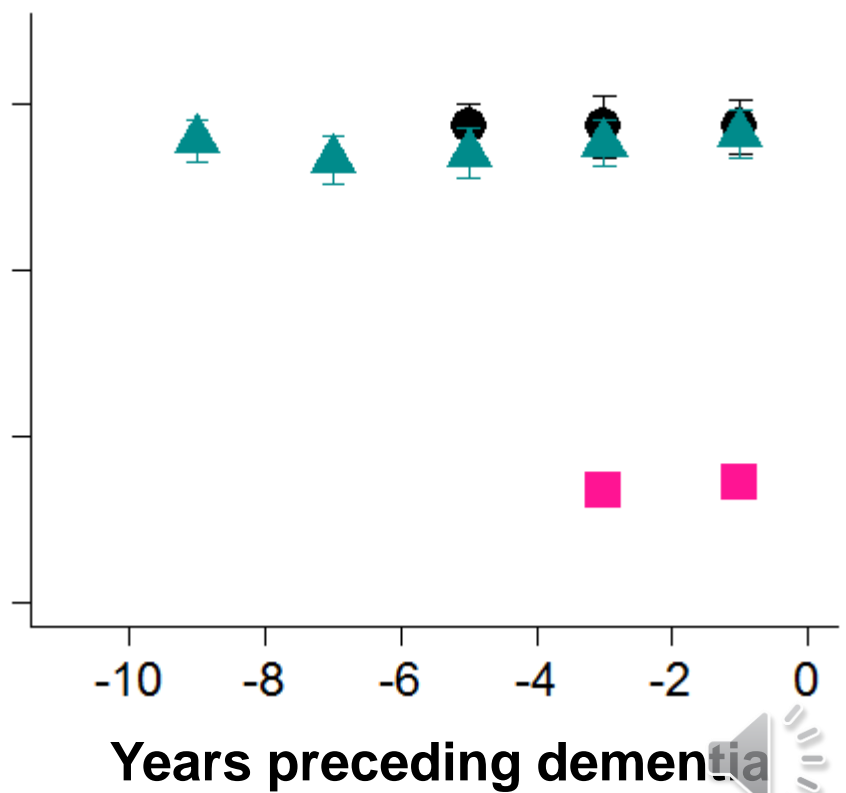
- ▶ Means and 95% confidence intervals of the observed intakes by period of 2 years

## Vegetables

Cases (n = 205)

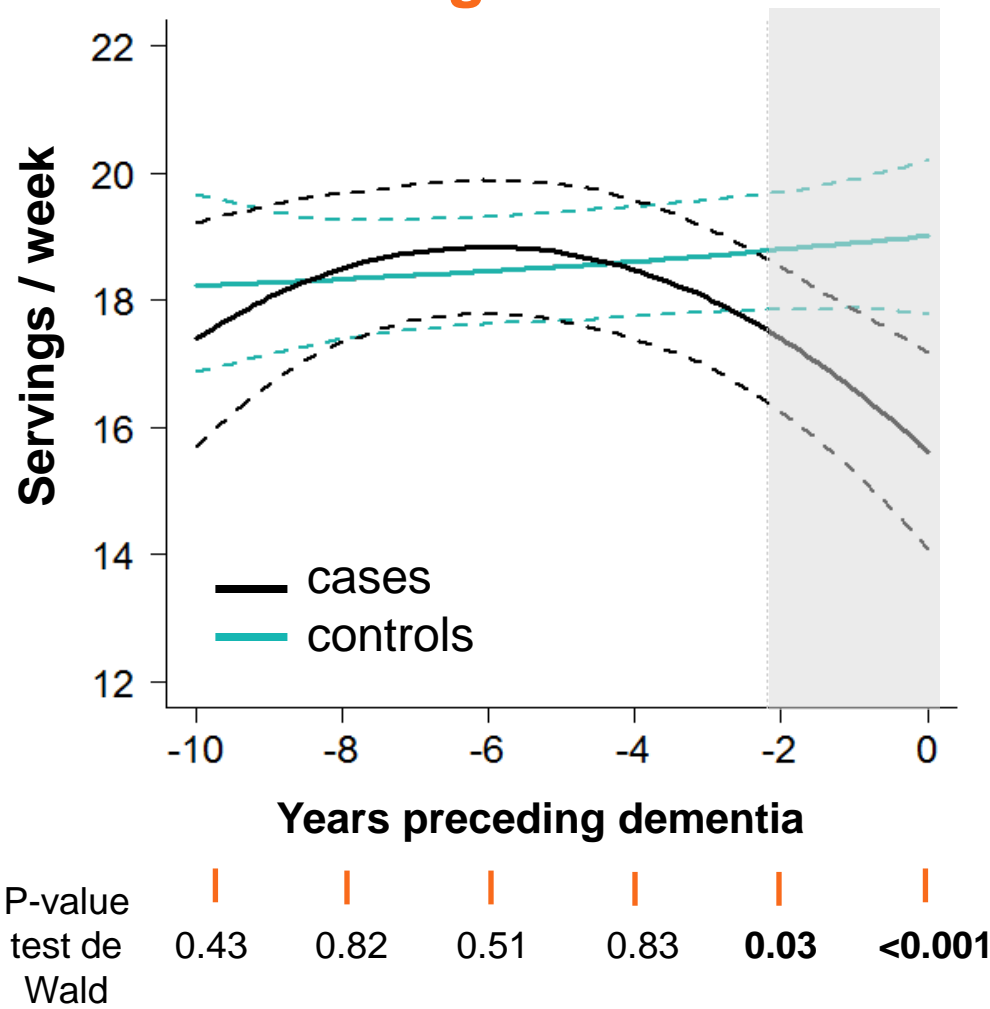


Controls (n = 410)



# Predicted trajectories of Vegetables

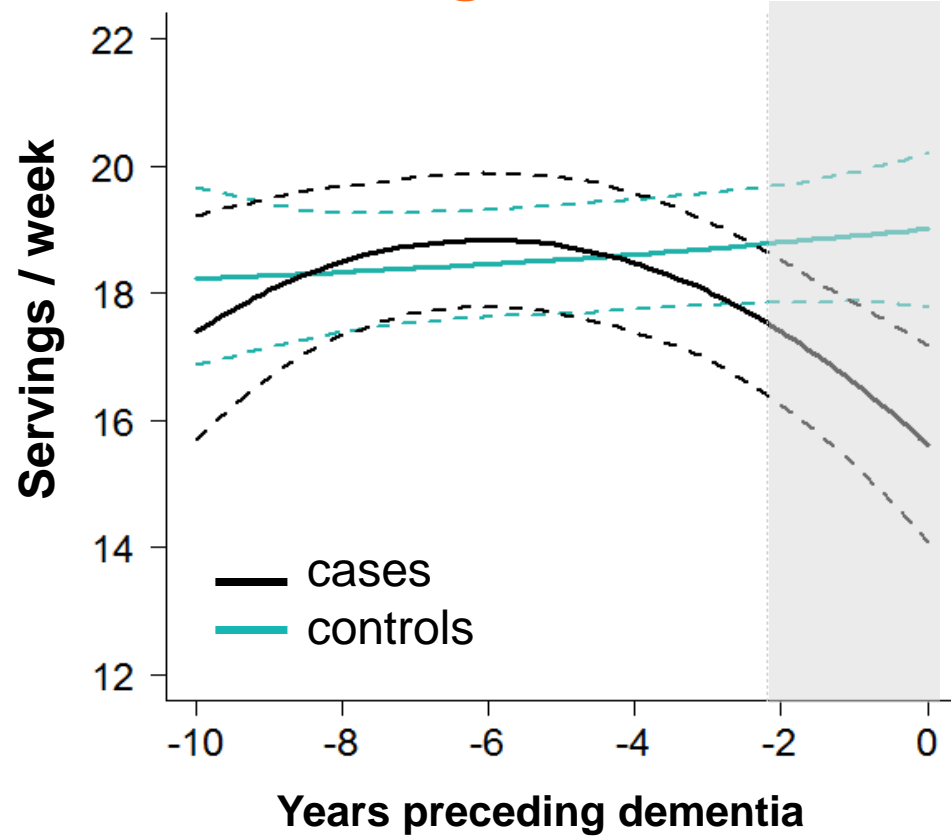
## Vegetables



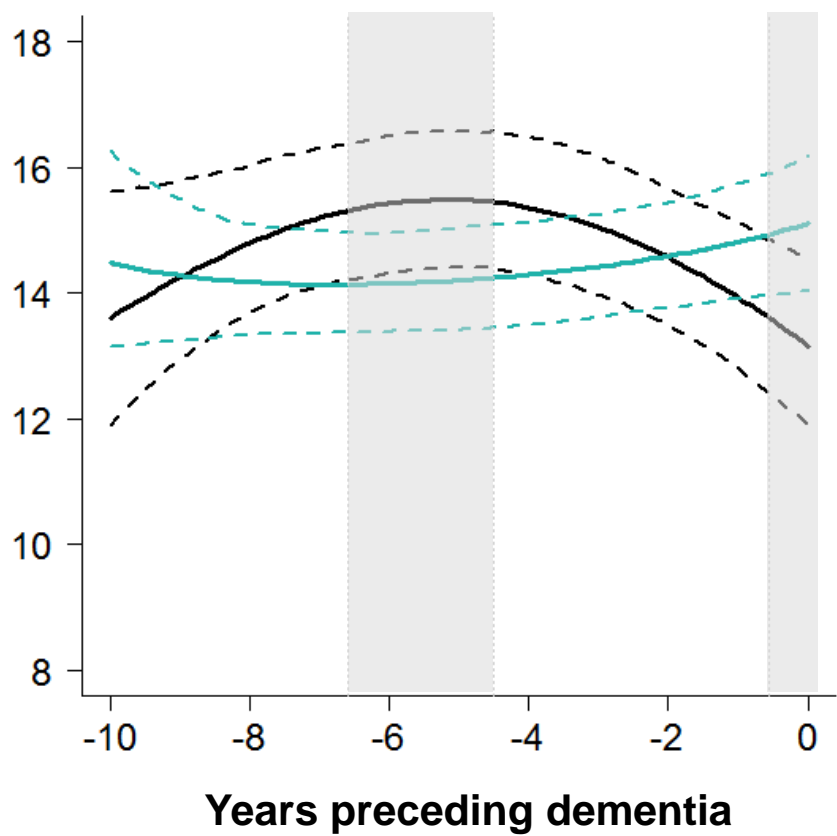
- ▶ Scale of the first FFQ
- ▶ Profile : woman, 77 years at T2, educational level < secondary school

# Predicted trajectories of Vegetables & Fruits

Vegetables



Fruits

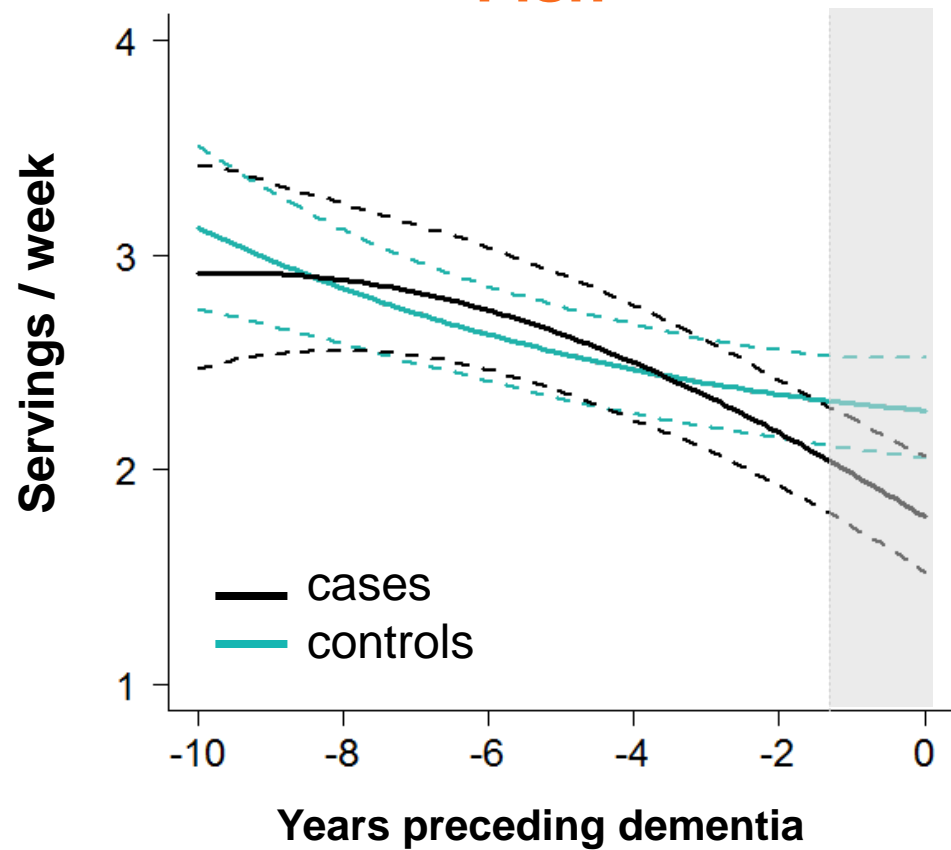


P-value	0.43	0.82	0.51	0.83	0.03	<0.001	0.37	0.33	0.03	0.08	0.97	0.009
test de												
Wald												

- ▶ Scale of the first FFQ
- ▶ Profile : woman, 77 years at T2, educational level < secondary school

# Predicted trajectories of Fish

Fish

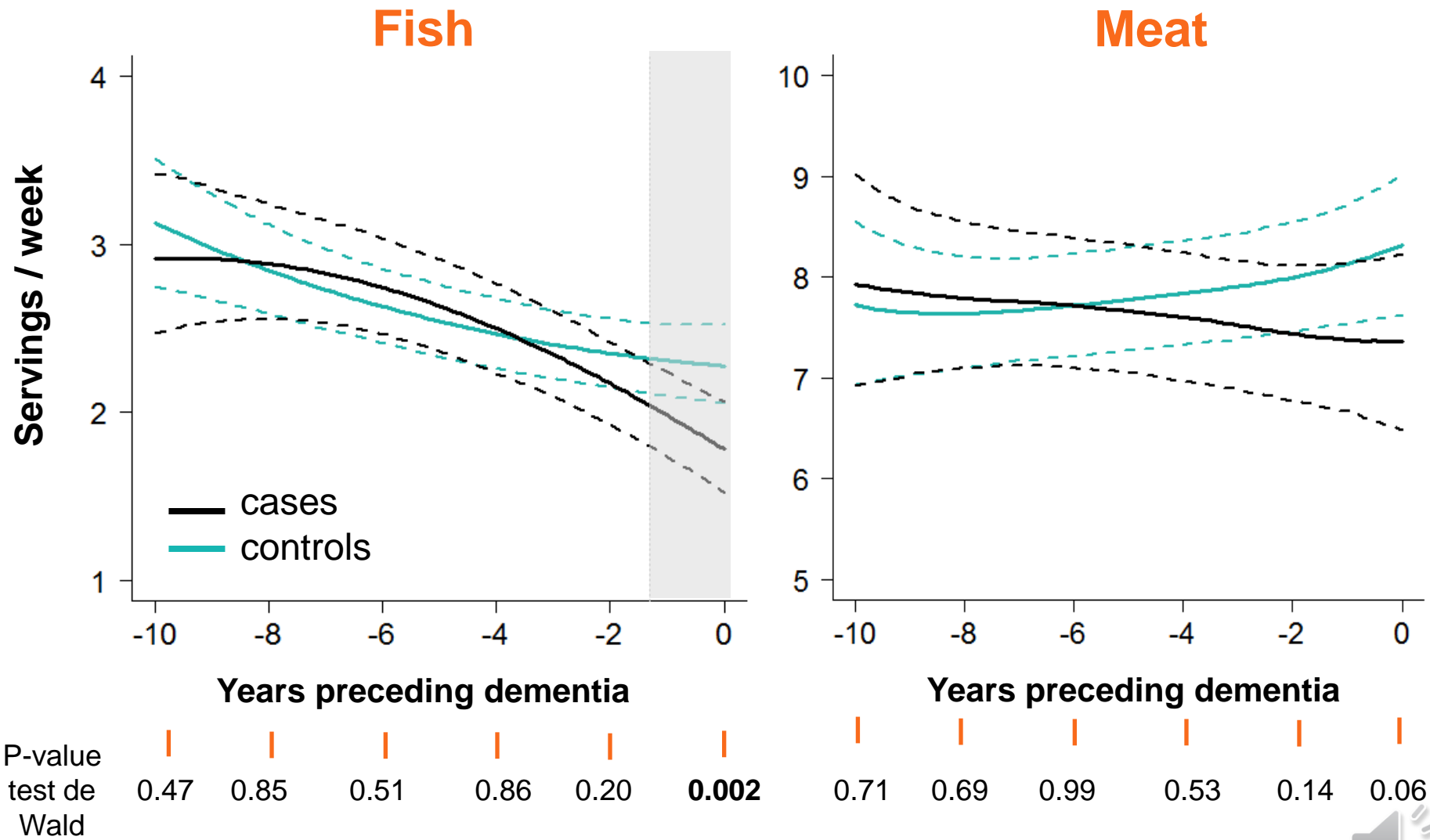


P-value						
test de	0.47	0.85	0.51	0.86	0.20	0.002
Wald						

- ▶ Scale of the first FFQ
- ▶ Profile : woman, 77 years at T2, educational level < secondary school



# Predicted trajectories of Fish & Meat

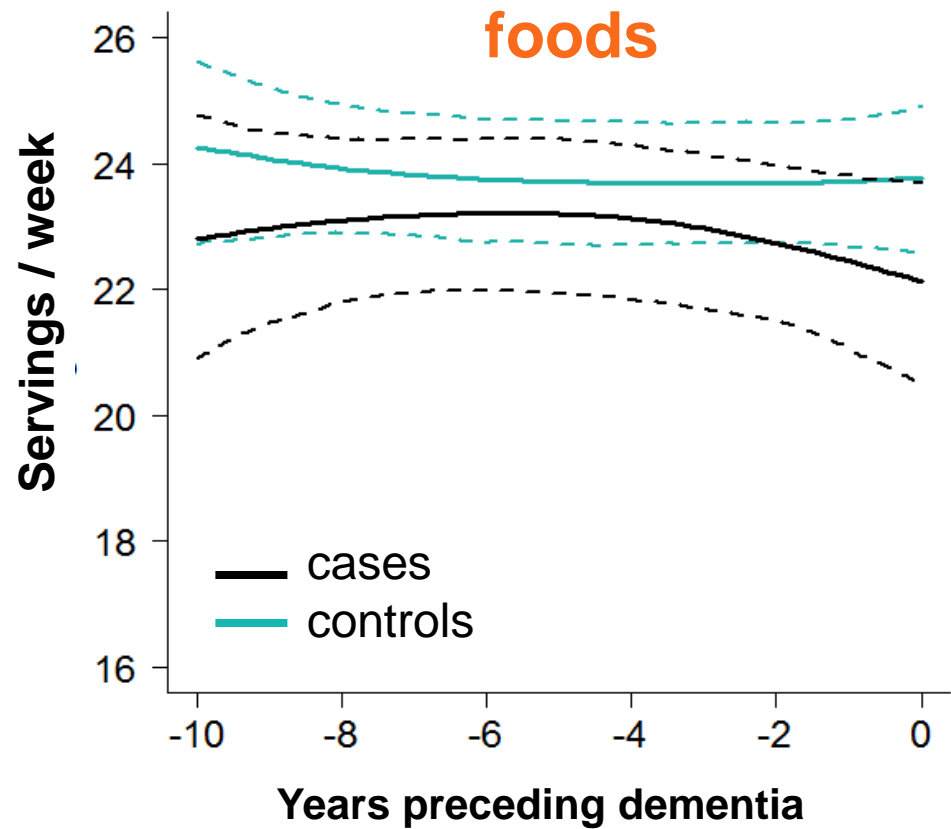


- Scale of the first FFQ
- Profile : woman, 77 years at T2, educational level < secondary school



# Predicted trajectories of Carbohyd.

## Carbohydrate-rich foods



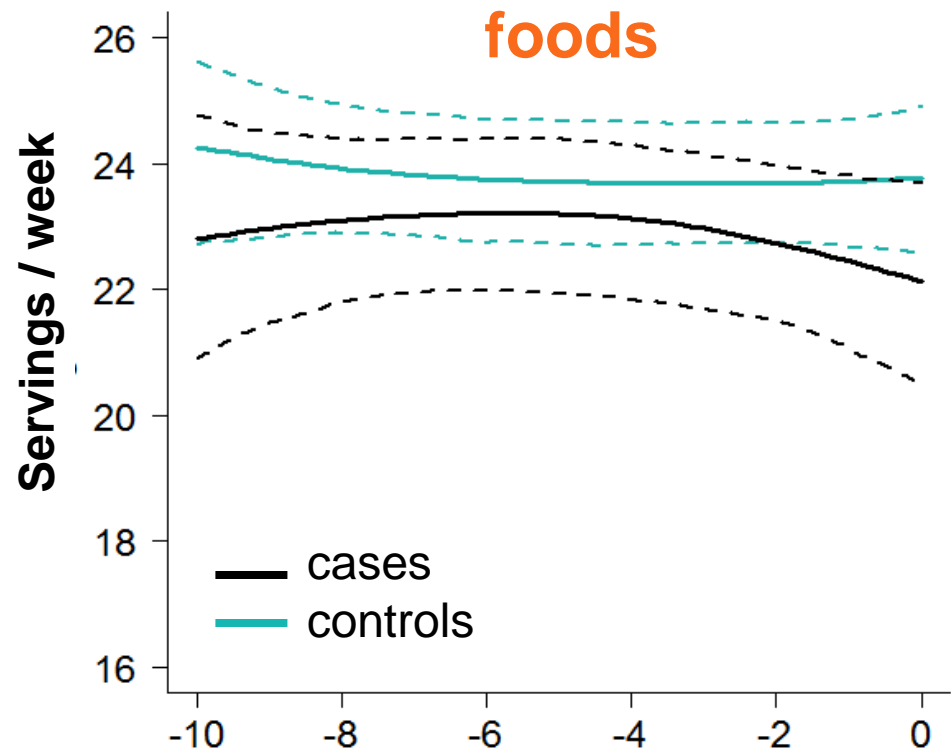
P-value	0.19	0.25	0.43	0.41	0.17	0.07
test de						
Wald						

- Scale of the first FFQ
- Profile : woman, 77 years at T2, educational level < secondary school



# Predicted trajectories of Carbohyd. & BMI

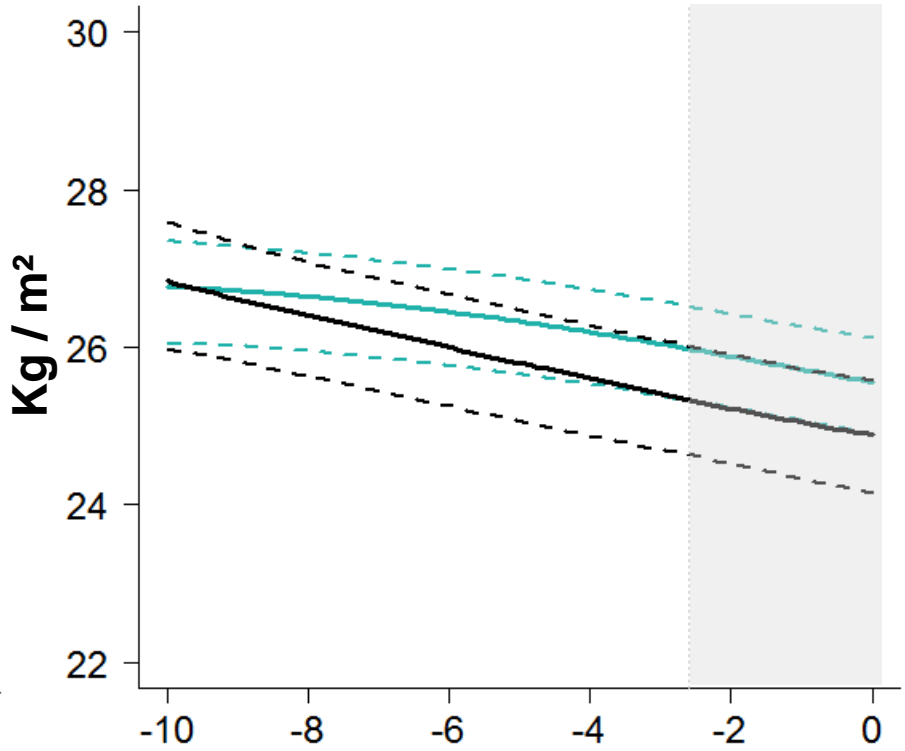
## Carbohydrate-rich foods



Years preceding dementia

P-value	0.19	0.25	0.43	0.41	0.17	0.07
test de						
Wald						

## BMI



Years preceding dementia

0.97	0.45	0.17	0.07	0.04	0.04
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- Scale of the first FFQ
- Profile : woman, 77 years at T2, educational level < secondary school

# Epidemiological discussion

- ▶ **Foods** : significant differences between groups few years before diagnosis
- ▶ **BMI** : progressive decline but faster among cases
- ▶ No evidence of **causal relationship** between T-10 and T-2
- ▶ Possible **inverse causality** near diagnosis (Vegetables, Fish, Fruits)
- ▶ Foods analyzed separately: no comprehensive approach to diet  
→ Overall diet (e.g., mediterranean diet)



# Statistical discussion

- ▶ Complexity of the data : necessary application of **latent process models**
- ▶ Takes into account :
  - the **sequential change** of the FFQ
  - the **deviation from the normality** of the data
- ▶ Case-control approach
  - **Directly compares** trajectories in prodromal phase of dementia and in normal aging
  - Lets **test the difference** with a multivariate Wald test
    - What joint model does not allow
- ▶ Study baseline = diagnosis visit of dementia (not age of dementia)
  - Possibly increase the reverse causation effect

# Perspectives

## Epidemiological

- ▶ Mediterranean diet – Denutrition score
- ▶ Biological parameters link to lifestyle
- ▶ Longlife data from midlife ( $\approx 40$  years)

## Statistical

- ▶ Evaluation of the modelling strategy in two-steps by simulations
- ▶ Coevolution with neuro-anatomics trajectories

**Thank you for  
your attention**



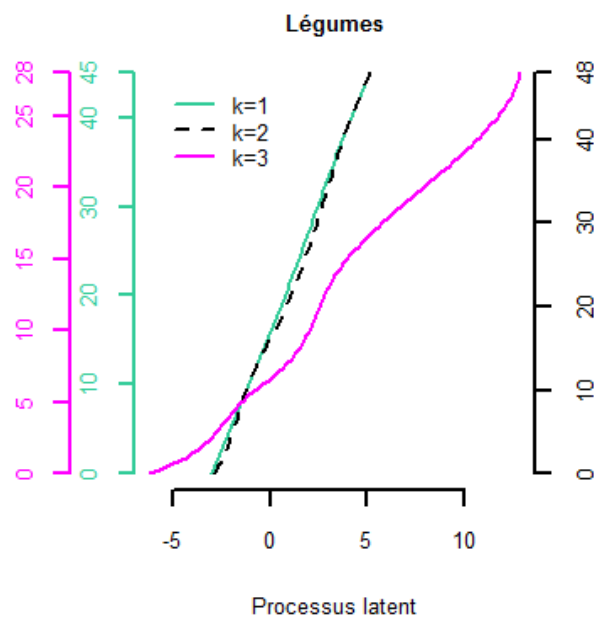
# References

- [1] WHO. Dementia. A public health priority. 2012 [cité 25 novembre 2016]; Disponible sur: [http://apps.who.int/iris/bitstream/10665/75263/1/9789241564458\\_eng.pdf?ua=1](http://apps.who.int/iris/bitstream/10665/75263/1/9789241564458_eng.pdf?ua=1)
- [2] INSERM. Alzheimer. [cité 25 novembre 2016]. Disponible sur: <http://www.inserm.fr/thematiques/neurosciences-sciences-cognitives-neurologie-psychiatrie/dossiers-d-information/alzheimer>
- [3] Jack JrCR, Knopman DS, Jagust WJ, Shaw LM, Aisen PS, Weiner MW, et al. Hypothetical model of dynamic biomarkers of the Alzheimer's pathological cascade. Lancet. 2010; (9): 119-28.
- [4] Féart C, Samieri C, Rondeau V, Amieva H, Portet F, Dartigues J-F, et al. Adherence to a Mediterranean diet, cognitive decline, and risk of dementia. JAMA. 2009;302(6):638-48.
- [5] Guérin O, Andrieu S, Schneider SM, Milano M, Boulahssass R, Brocker P, et al. Different modes of weight loss in Alzheimer disease: a prospective study of 395 patients. Am J Clin Nutr. 2005;82(2):435-41.

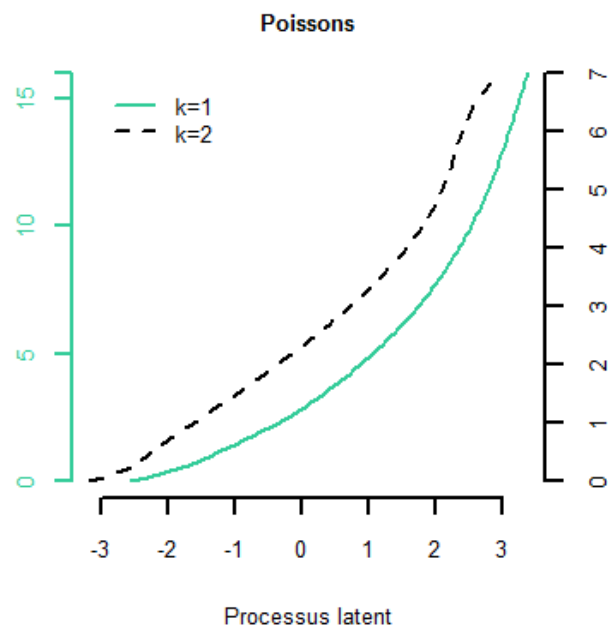
## Food Frequency Questionnaires

	↓ <b>T<sub>2</sub></b> (2001-2002)	↓ <b>T<sub>4</sub></b> (2003-2004)	↓ <b>T<sub>7</sub></b> (2006-2007)	↓ <b>T<sub>10</sub></b> (2009-2010)	↓ <b>T<sub>12</sub></b> (2011-2012)	
<b>Fish</b>	<b>Fi<sub>1</sub></b> (4)	<b>Fi<sub>1</sub></b> (4)	<b>Fi<sub>1</sub></b> (4)	<b>Fi<sub>2</sub></b> (1)	<b>Fi<sub>2</sub></b> (1)	K = 2
<b>Meat</b>	<b>M<sub>1</sub></b> (10)	<b>M<sub>2</sub></b> (4)	<b>M<sub>2</sub></b> (4)	<b>M<sub>3</sub></b> (1)	<b>M<sub>3</sub></b> (1)	K = 3
<b>Fruits</b>	<b>Fr<sub>1</sub></b> (18)	<b>Fr<sub>1</sub></b> (18)	<b>Fr<sub>1</sub></b> (18)	<b>Fr<sub>2</sub></b> (1)	<b>Fr<sub>2</sub></b> (1)	K = 2
<b>Vegetables</b>	<b>V<sub>1</sub></b> (8)	<b>V<sub>1</sub></b> (8)	<b>V<sub>2</sub></b> (10)	<b>V<sub>3</sub></b> (1)	<b>V<sub>3</sub></b> (1)	K = 3
<b>Carbohydrate-rich foods</b>	<b>C<sub>1</sub></b> (22)	<b>C<sub>2</sub></b> (8)	<b>C<sub>2</sub></b> (8)	<b>C<sub>3</sub></b> (3)	<b>C<sub>3</sub></b> (3)	K = 3





Pourcentage de variation expliquée			
Délai pré-diagnostic (années)	k=1 (%)	k=2 (%)	k=3 (%)
0	64,9	51,7	13,4
-2	62,8	49,3	12,3
-4	61,2	47,6	11,6
-6	60,2	46,6	11,2
-8	60,1	46,5	11,1
-10	60,8	47,2	11,4



Pourcentage de variation expliquée		
Délai pré-diagnostic (années)	k=1 (%)	k=2 (%)
0	70,3	52,7
-2	69,5	51,7
-4	69,1	51,2
-6	69,3	51,4
-8	70,0	52,3
-10	71,1	53,6