



# Analyse et interprétation des données en protéomique et métabolomique: points communs et spécificités

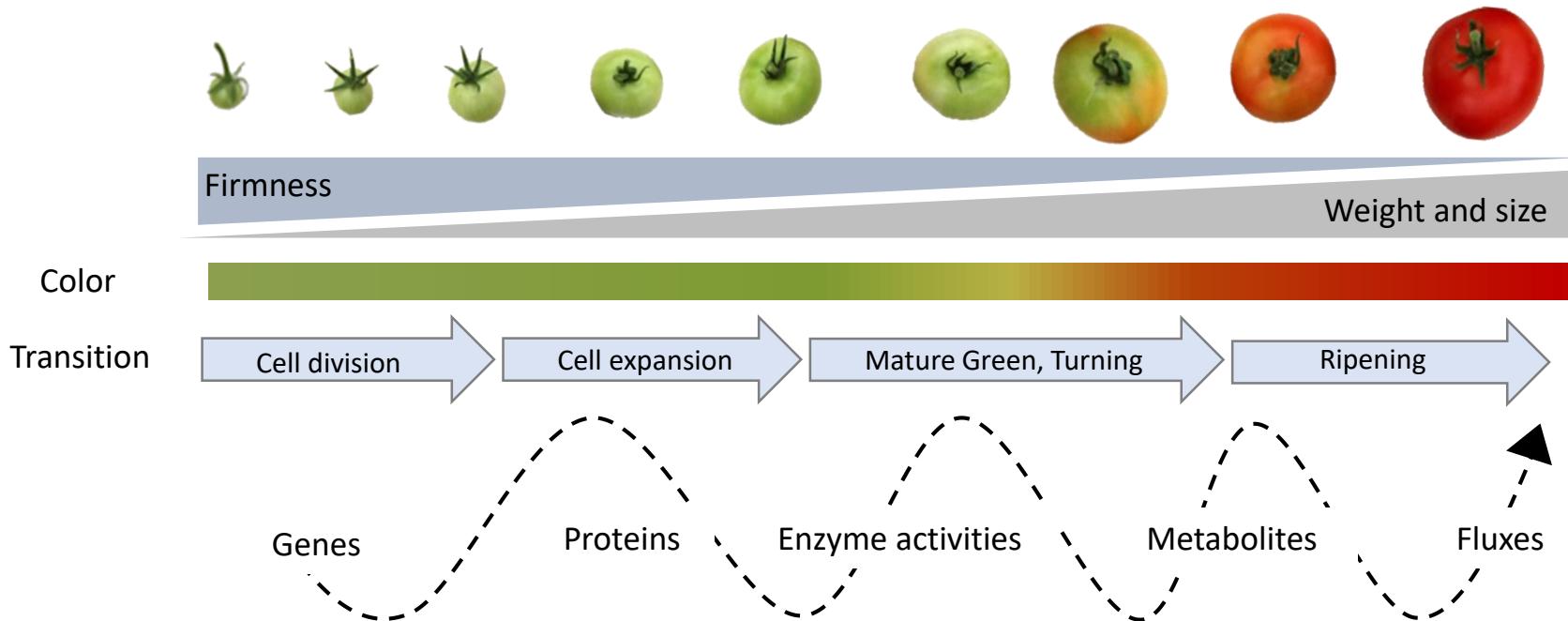
Omics integration and modeling:  
Prediction of protein lifetime in tomato fruit

Belouah Isma

## Tomato fruit: a model for fleshy fruit

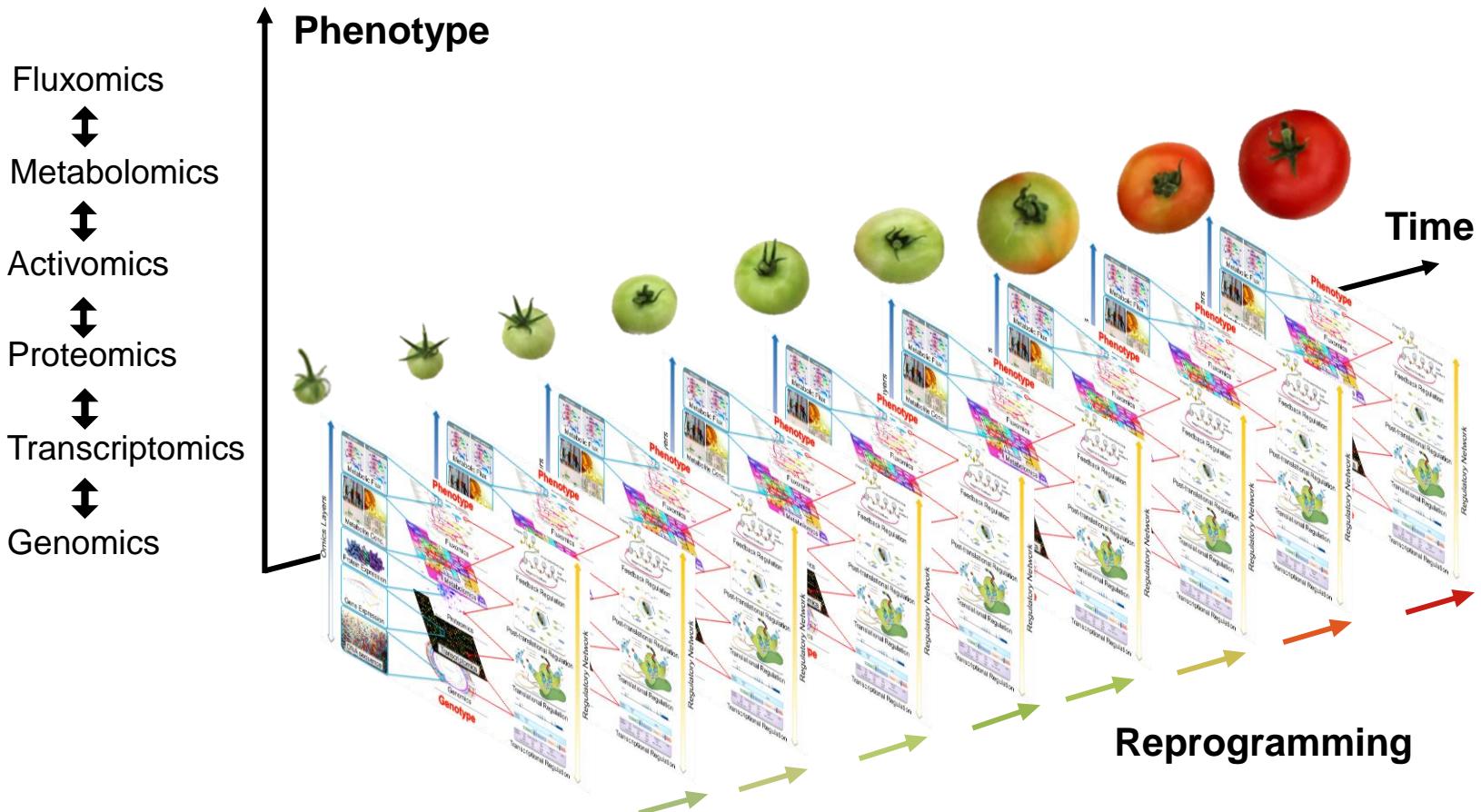
Why research on tomato fruit development:

- Agroeconomical interest (human nutrition, adaptation climate changes...)
- Characterize physiological transitions
- Understand the regulation of metabolite content



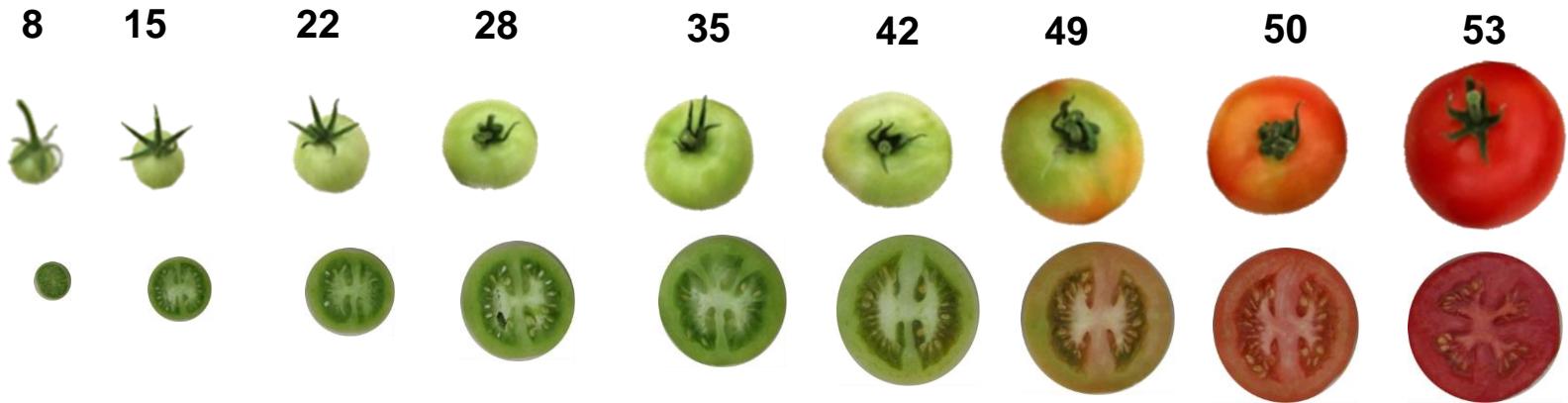
## Phenotype results from the interaction of Omics

- Each stage = integration of *Omics* on two dimensions (Time x *Omics*<sup>n</sup>)

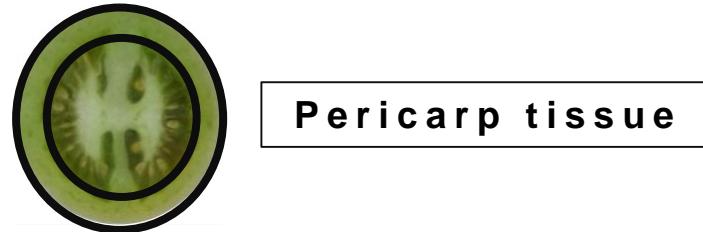


## Our project: 4 Omics throughout tomato fruit development

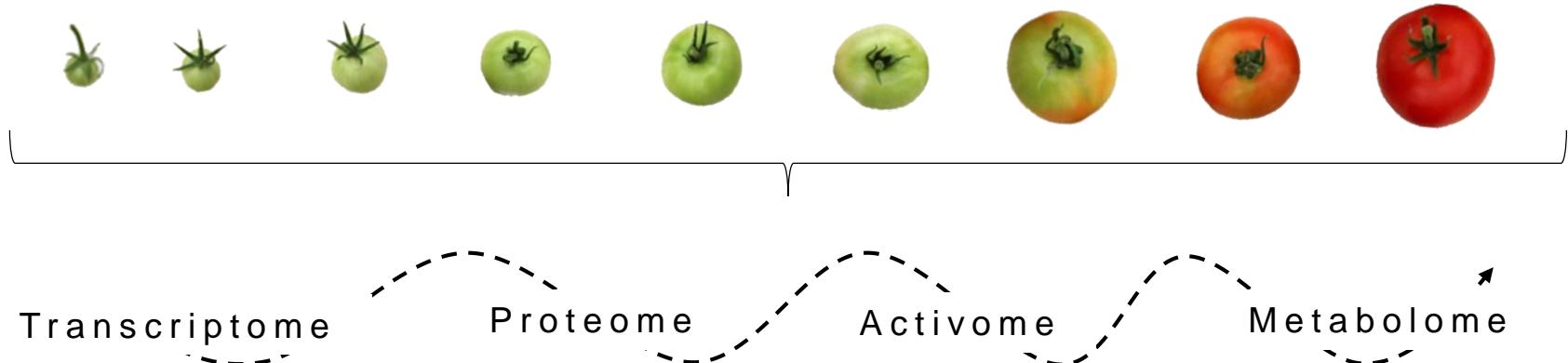
- Time-series of 9 developmental stages
- DPA = days post anthesis (fecondation)



- Omics analysis performed on pericarp tissue



## Our project: 4 Omics throughout tomato fruit development



### Methods:

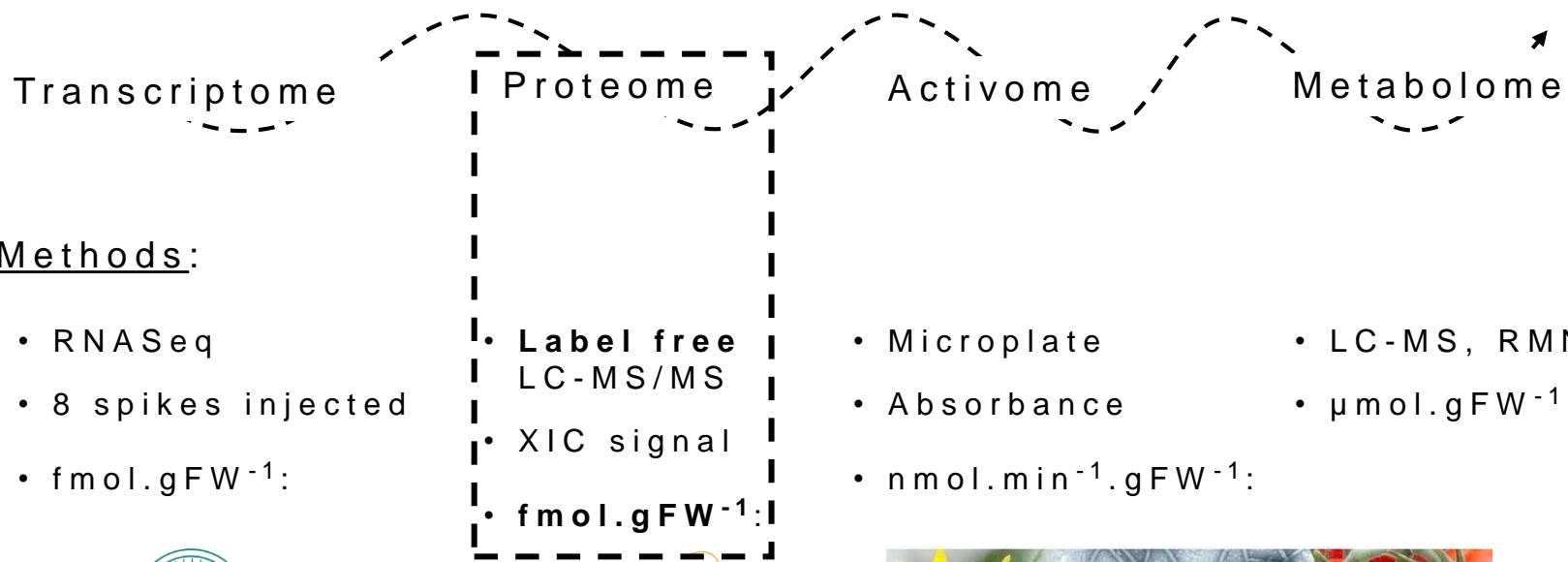
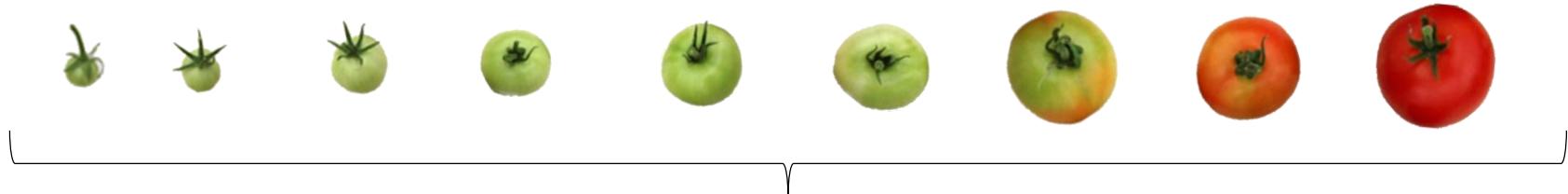
- |                             |                             |                                      |                               |
|-----------------------------|-----------------------------|--------------------------------------|-------------------------------|
| • RNASeq                    | • Label free LC-MS/MS       | • Microplate                         | • LC-MS, RMN                  |
| • 8 spikes injected         | • XIC signal                | • Absorbance                         | • $\mu\text{mol.g FW}^{-1}$ : |
| • $\text{fmol.g FW}^{-1}$ : | • $\text{fmol.g FW}^{-1}$ : | • $\text{nmol.min}^{-1}.g FW^{-1}$ : |                               |



HiTMe

MAHD

## Our project: 4 Omics throughout tomato fruit development



MAX-PLANCK-GESELLSCHAFT

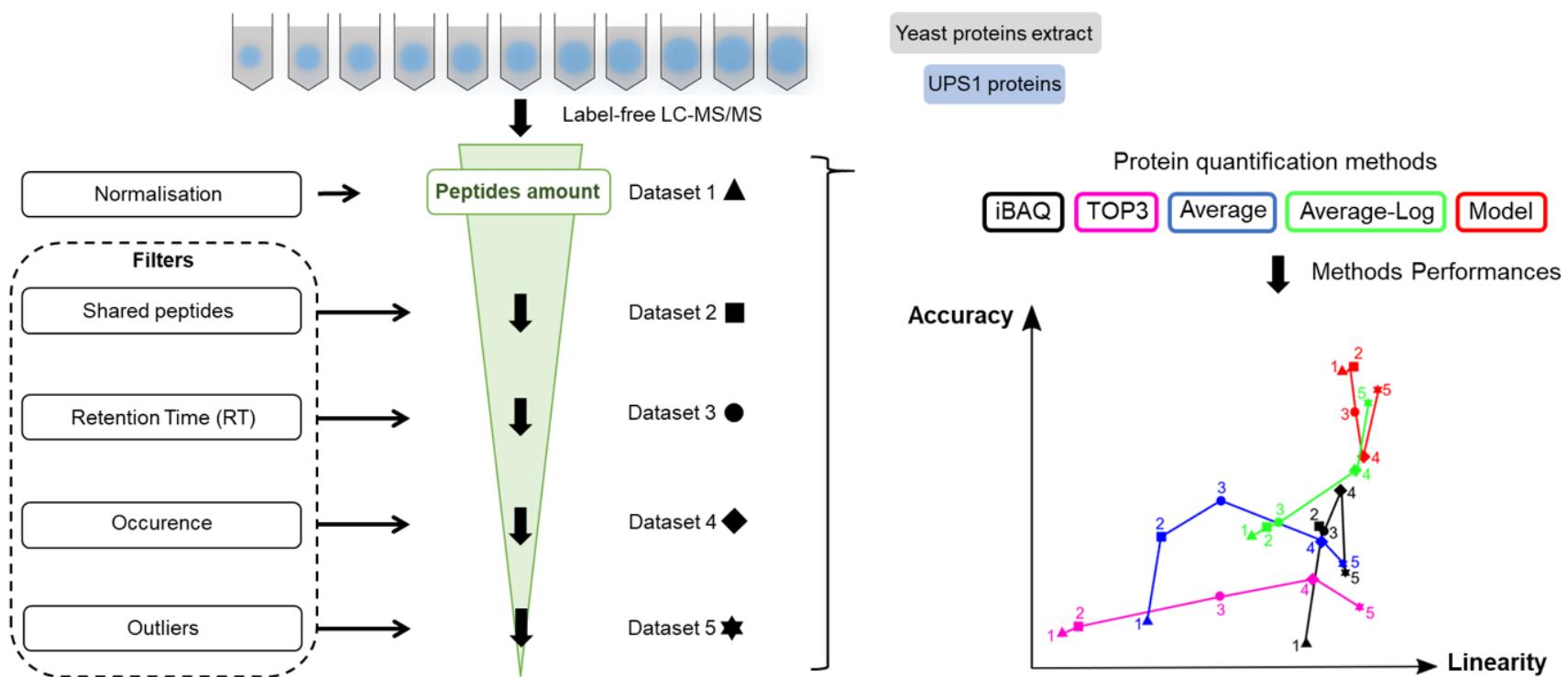


HiTMe

MAHD

## Peptides intensity modeling used to quantify the abundance of proteins

**Peptides intensity modeling:** method of protein quantification selected among five XIC based methods.



Submitted Belouah I et al

## Determination of the concentration of tomato proteins

Concentration of **2494 proteins** ( $\text{fmol.gFW}^{-1}$ ) determined from their abundance

$$\text{Protein}_{i,k} = \frac{\text{abundance protein}_{i,k}}{\left( \sum_1^n \text{abundance protein} \right)_k} \times (\text{Total protein content})_k \times \frac{1}{\text{MW}_{\text{protein}_i}}$$

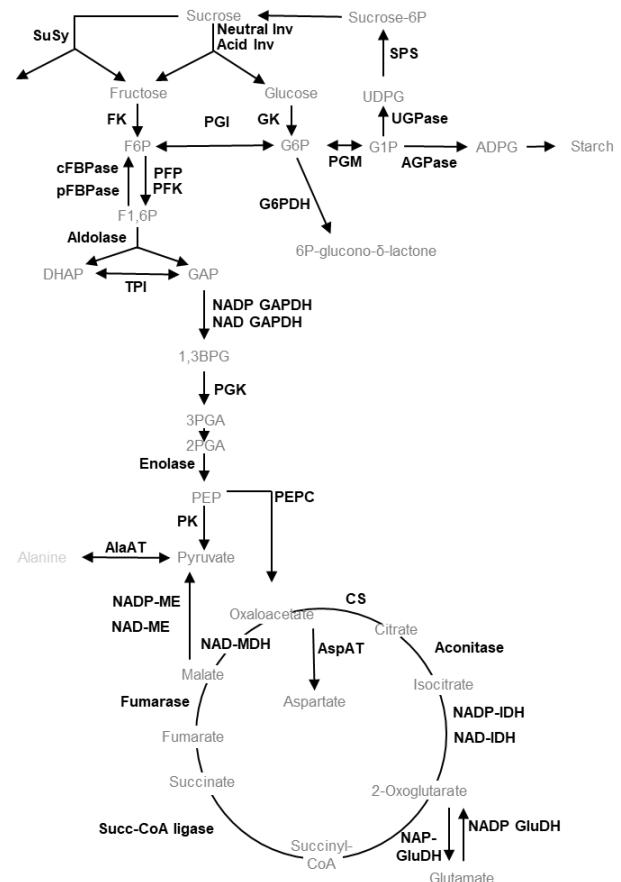
With,  
     $n$      the number of total proteins  
     $k$      the sample considered  
     $\text{MW}$  the molar mass ( $\text{g fmol}^{-1}$ )  
    Total protein content ( $\text{g gFW}^{-1}$ )  
     $i$      the protein considered

## Proteome versus Activome

- 32 enzyme capacities expressed as enzyme concentrations

$$[\text{Enzyme}_{i,k}] = \frac{V_{max,i,k}}{\text{Specific activity}_{\text{Enzyme}_i}} \times \frac{1}{MW_{\text{Enzyme}_i}}$$

With,  
*i* the enzyme considered  
*k* the sample considered  
 $V_{max}$  the enzyme activity ( $\text{mol} \cdot \text{min}^{-1} \cdot \text{gFW}^{-1}$ )  
 $MW$  molar mass of the enzyme ( $\text{g mol}^{-1}$ )  
 $\text{Specific activity}$  ( $\text{mol} \cdot \text{g}_{\text{Enzyme}}^{-1} \cdot \text{min}^{-1}$ )

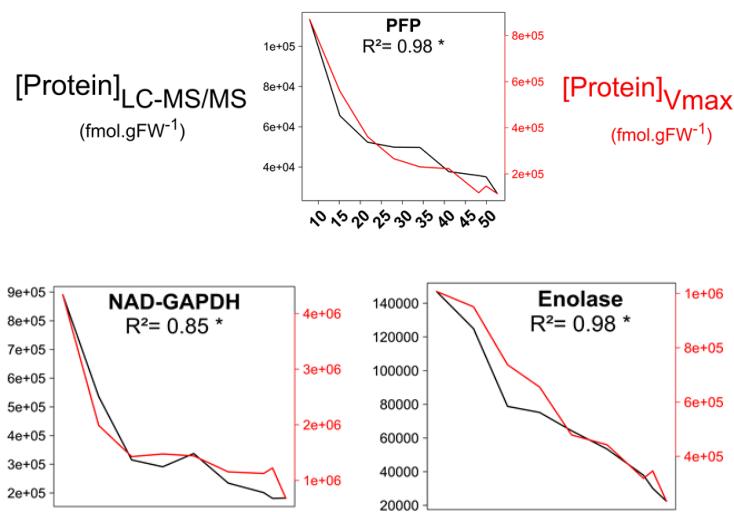


Biais et al., (2014)

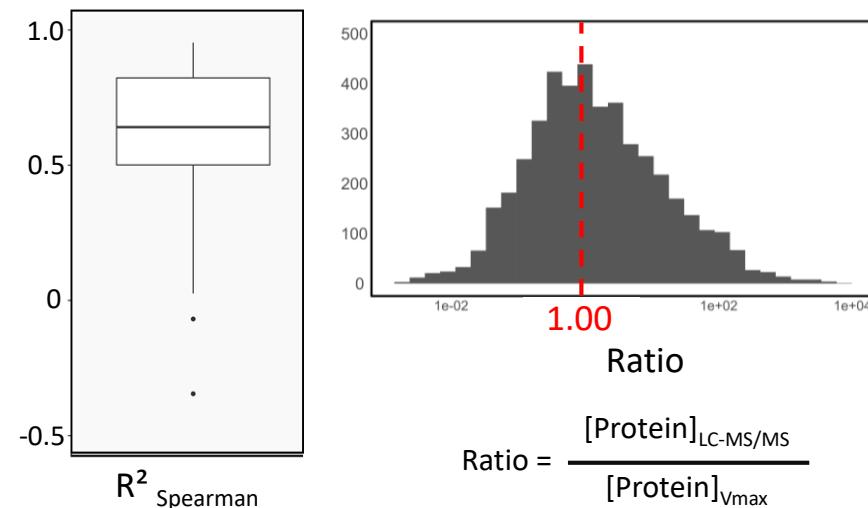
## Proteome versus Activome

- 32 enzyme capacities expressed as enzyme concentrations

### Three examples of correlated trends

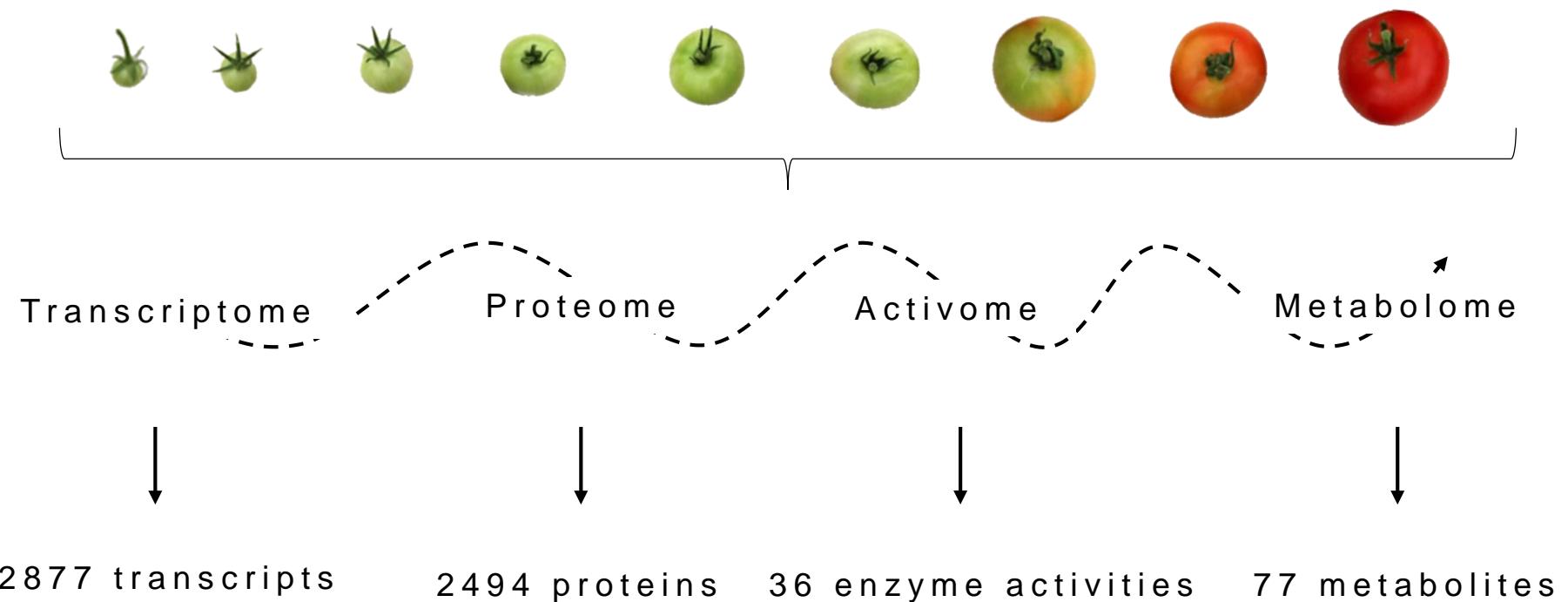


### Results on the 32 enzymes



- **Similar trend** of enzyme concentrations determined by both methods (*from LC-MS/MS vs from Vmax*)

## Our project: 4 Omics throughout tomato fruit development

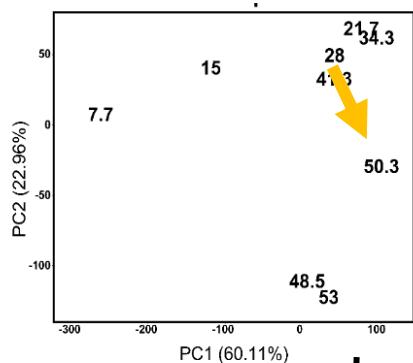


## Integrate four Omics to describe transition

- Four Omics and a similar PCA profile

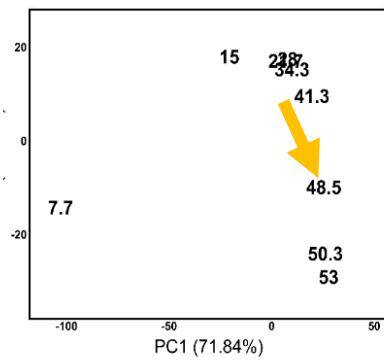
**Transcriptome**

22877 transcripts



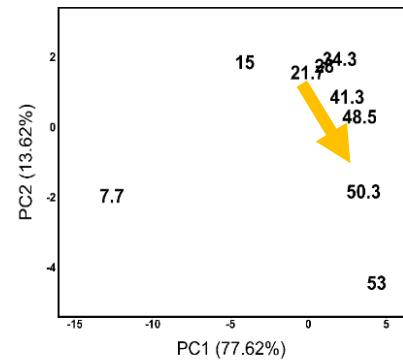
**Proteome**

2494 proteins



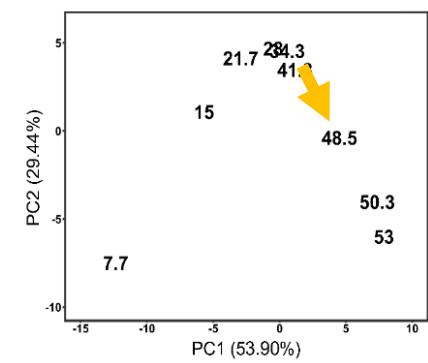
**Activome**

36 enzyme activities

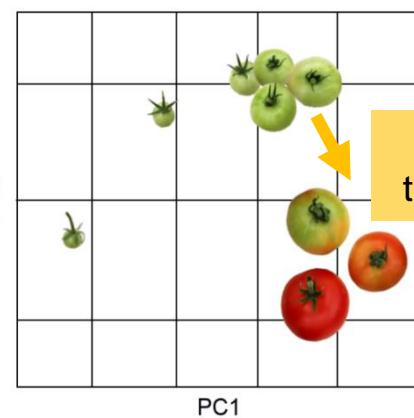


**Metabolome**

77 metabolites



Transition

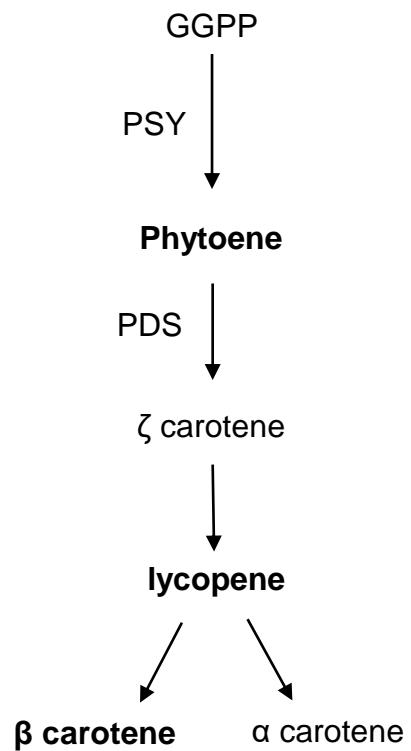
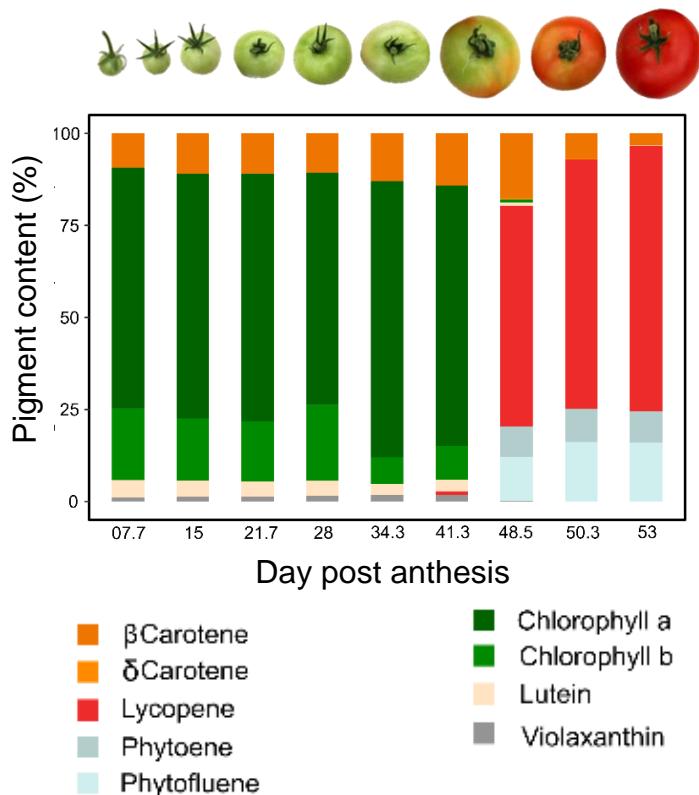


Ripening transition

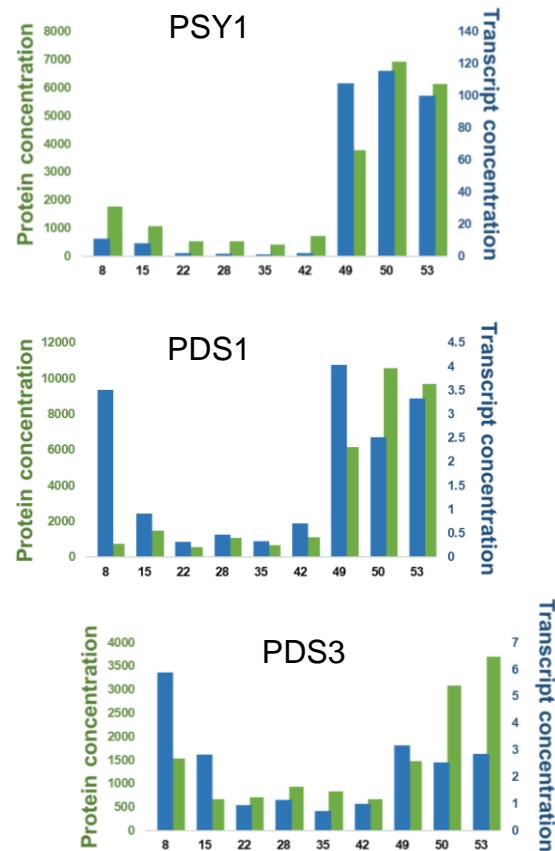
Development

## Exemple with pigments content

- Similar trend in carotenoids content and concentration of proteins and transcripts involved in pigment metabolism

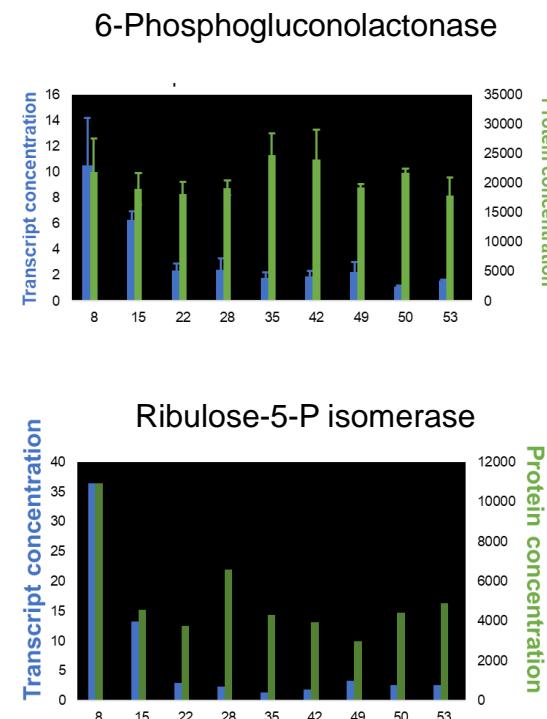
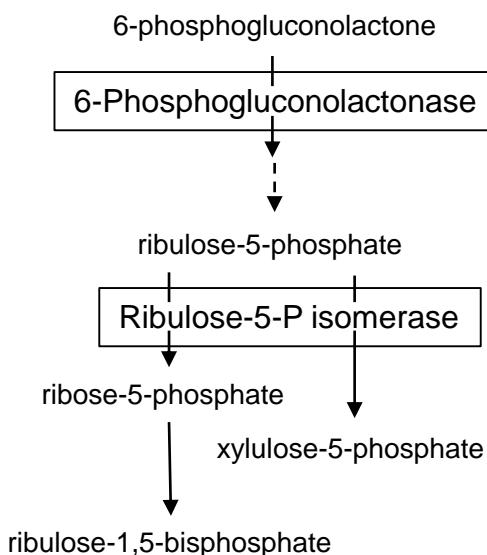
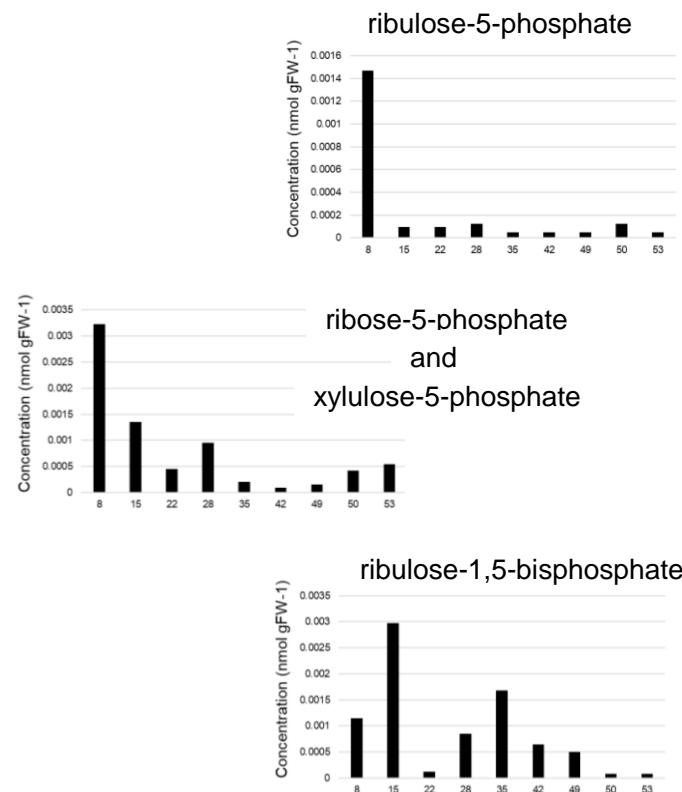


Bramley et al, (2007)



## Exemple with pentose phosphate pathway

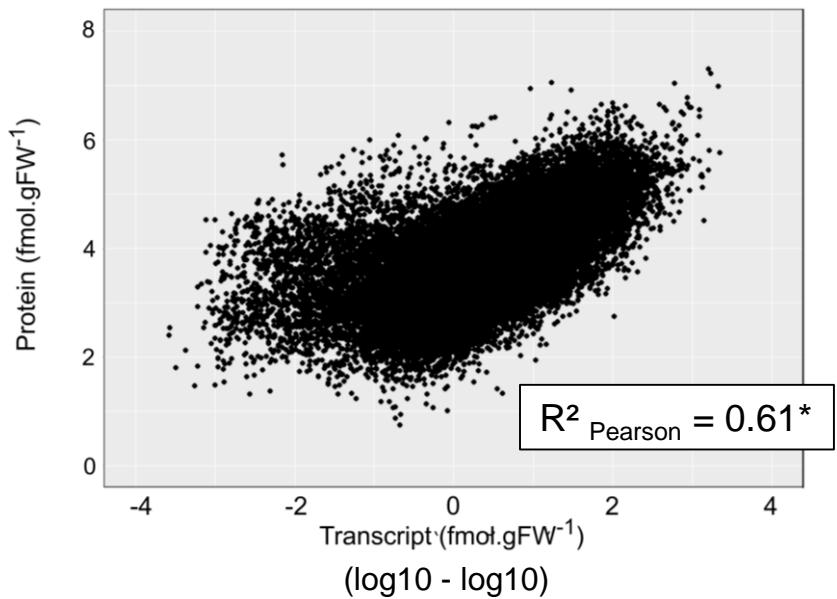
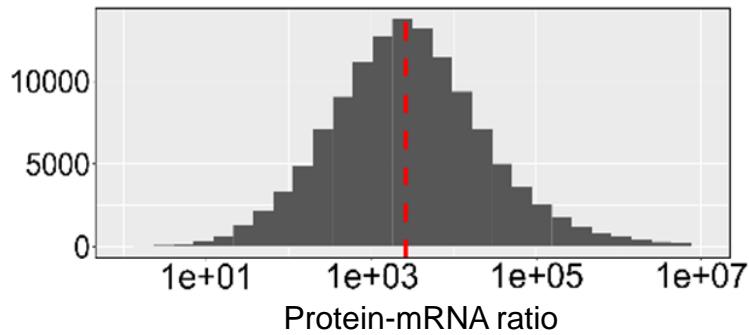
- Relationship between metabolites, proteins and transcripts is less simple



- What regulate protein content from transcript?

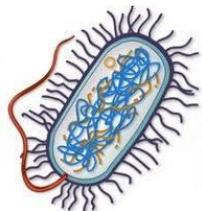
## Relation between proteins and transcripts concentration

- 2490 protein-transcript pairs
- « One transcript for a thousand proteins »
- More than 60% of the protein content can be explained by the transcript level



## Similar correlation in various organisms

Bacteria  
(*E. coli*)



$R^2 = 0.57$   
N = 1103 pairs

*Maier et al., (2009)*

Yeast  
(*S. Cerevisiae*)



$R^2 = 0.66$   
N = 2044 pairs

*Maier et al., (2009)*

Tomato fruit  
(Moneymaker)



$R^2 = 0.61$   
N = 2490 pairs

$R^2 < 0.58$   
N = 2188 pairs

*Ponnala et al., (2016)*

Maize leaves



Mammals  
(Human)

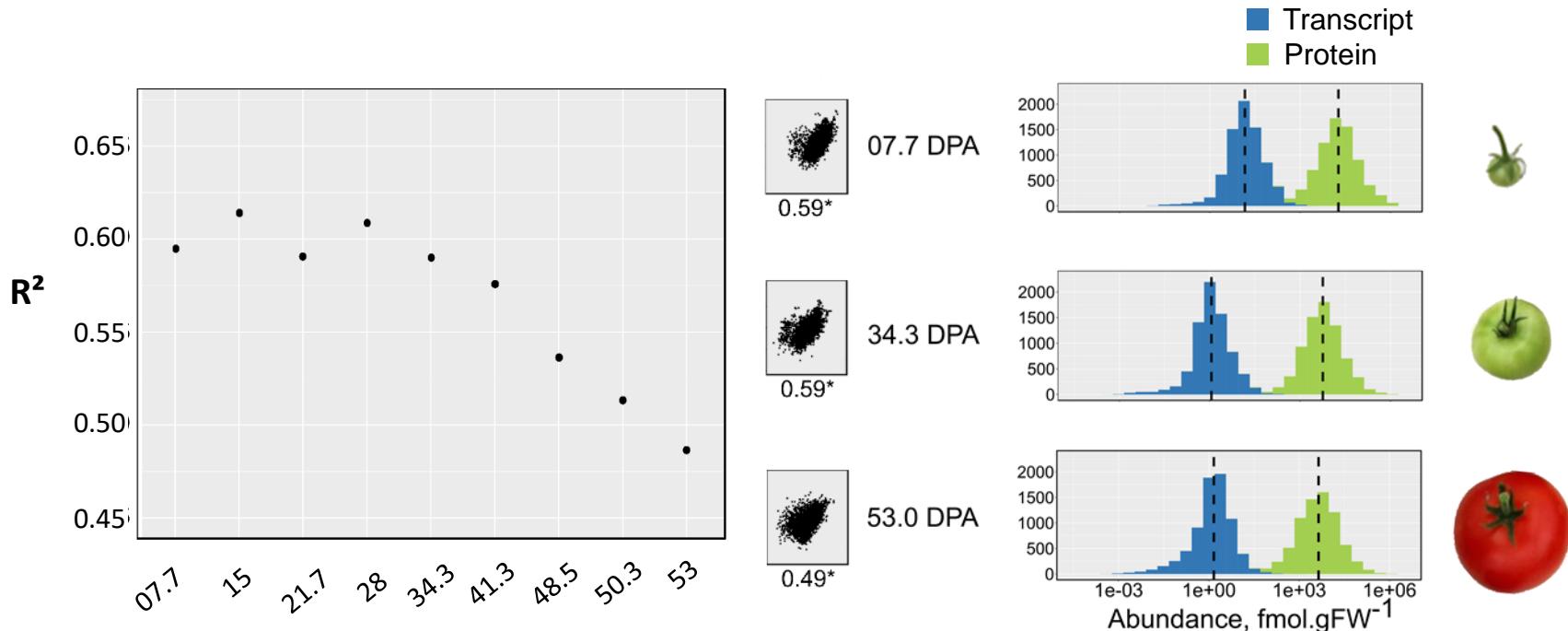


$R^2 = 0.41$   
N > 5000 pairs

*Schwanhäusser et al., (2011)*

## Relation between proteins and transcripts concentration

- Decrease of  $R^2$  (Pearson) throughout tomato fruit development

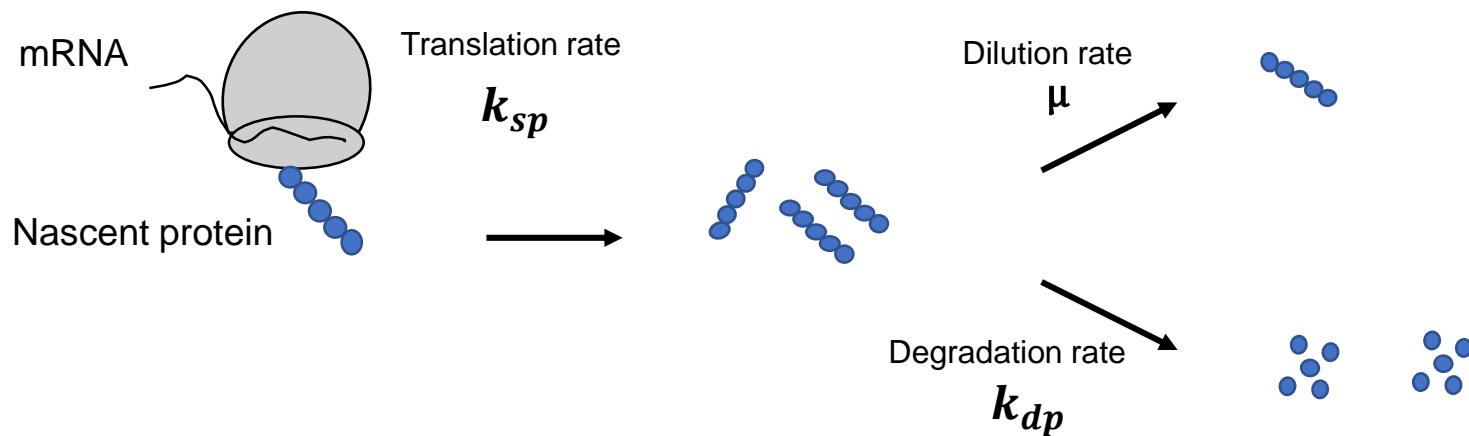


- Proteins are accumulated while transcript content decreased



Regulation of each protein content?

## A mathematical model to predict protein lifetime



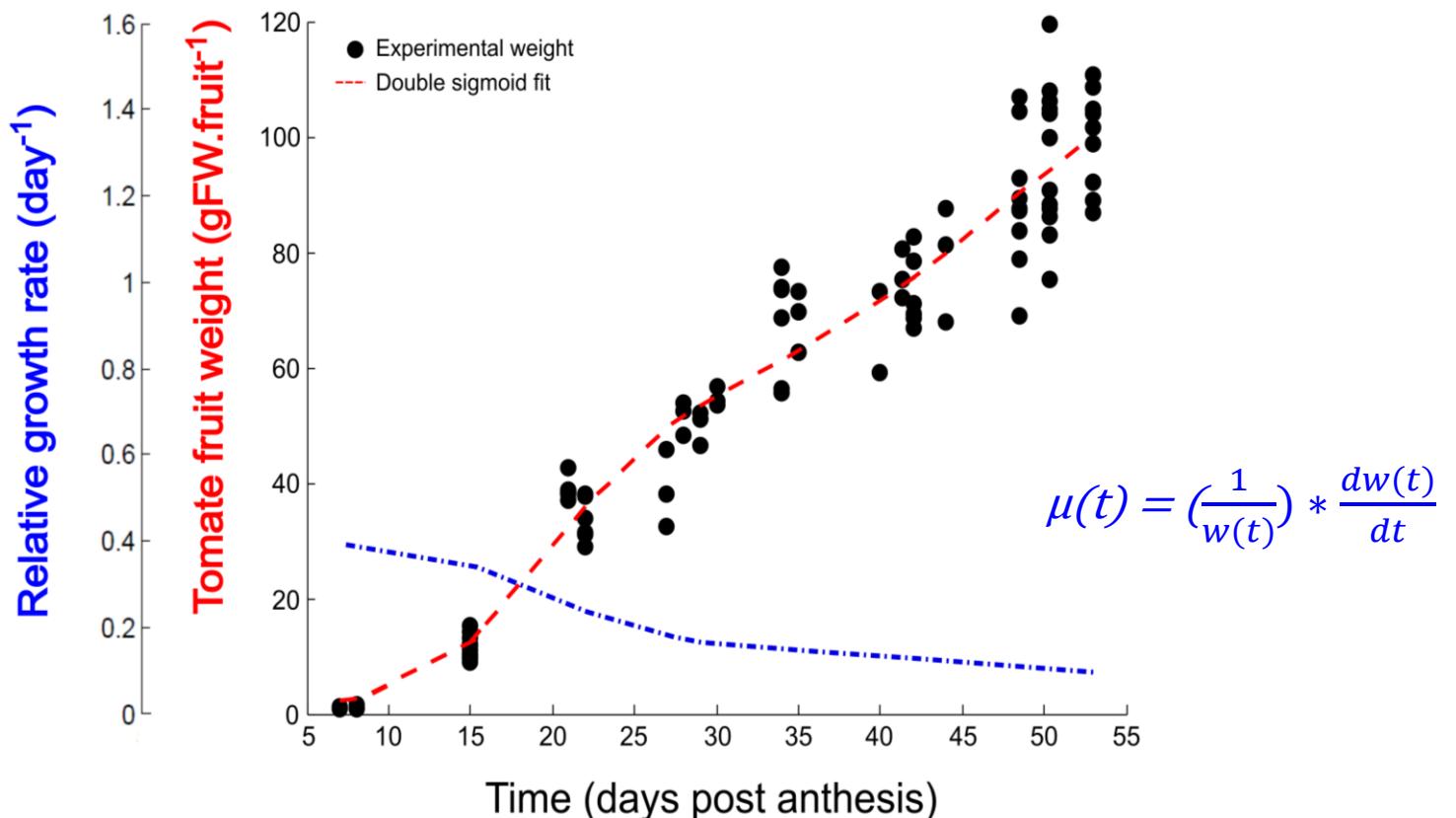
$$\frac{dp(t)}{dt} = k_{sp} r(t) - (k_{dp} + \mu(t)) p(t)$$

Dressaire et al., (2009)

With,  
     $p(t)$  the protein concentration ( $\text{fmol gFW}^{-1}$ )  
     $r(t)$  the transcript concentration ( $\text{fmol gFW}^{-1}$ )  
     $k_{sp}$  the constant synthesis rate ( $\text{day}^{-1}$ )  
     $k_{dp}$  the constant degradation rate ( $\text{day}^{-1}$ )

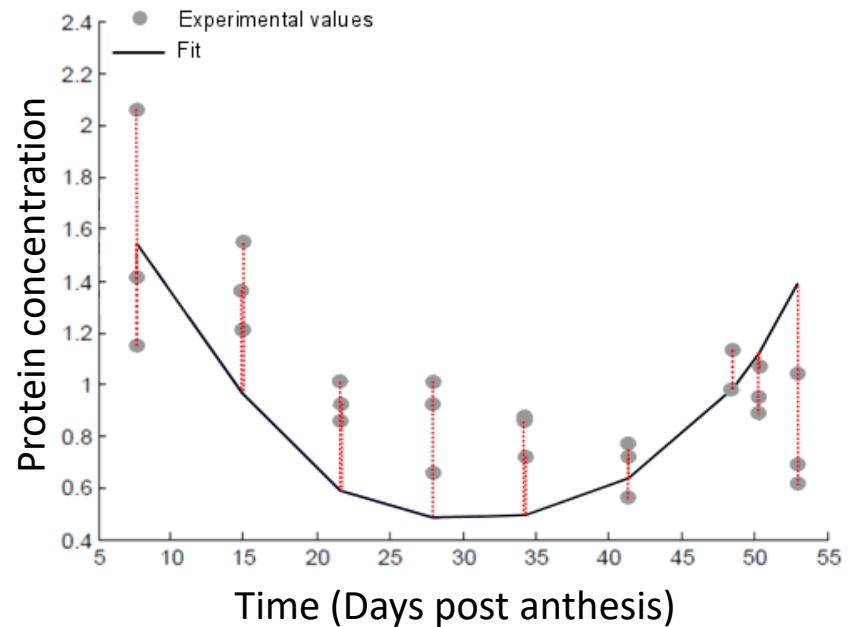
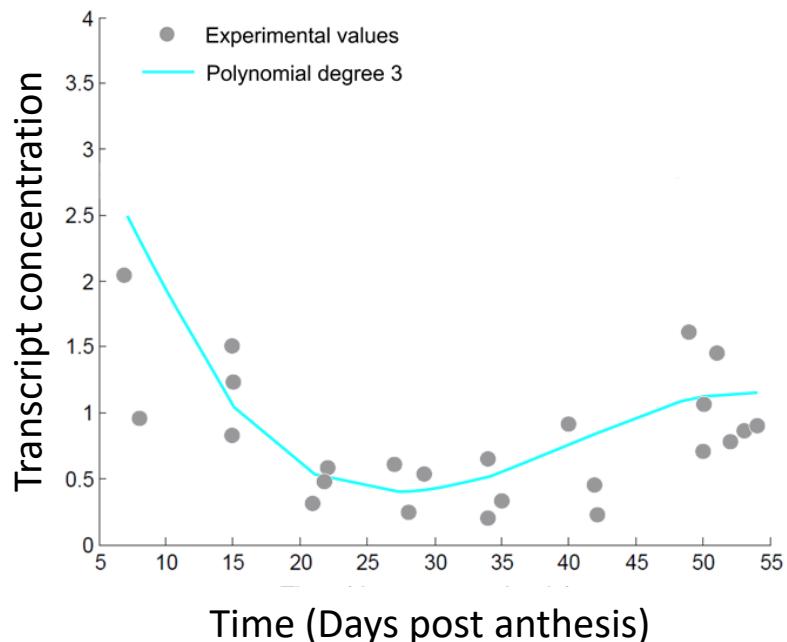
## Fit of the growth rate to determine concentrations at the fruit level

$$\frac{dp(t)}{dt} = k_{sp} r(t) - (k_{dp} + \mu(t)) p(t)$$



## Fit of the transcript concentration using polynomial function

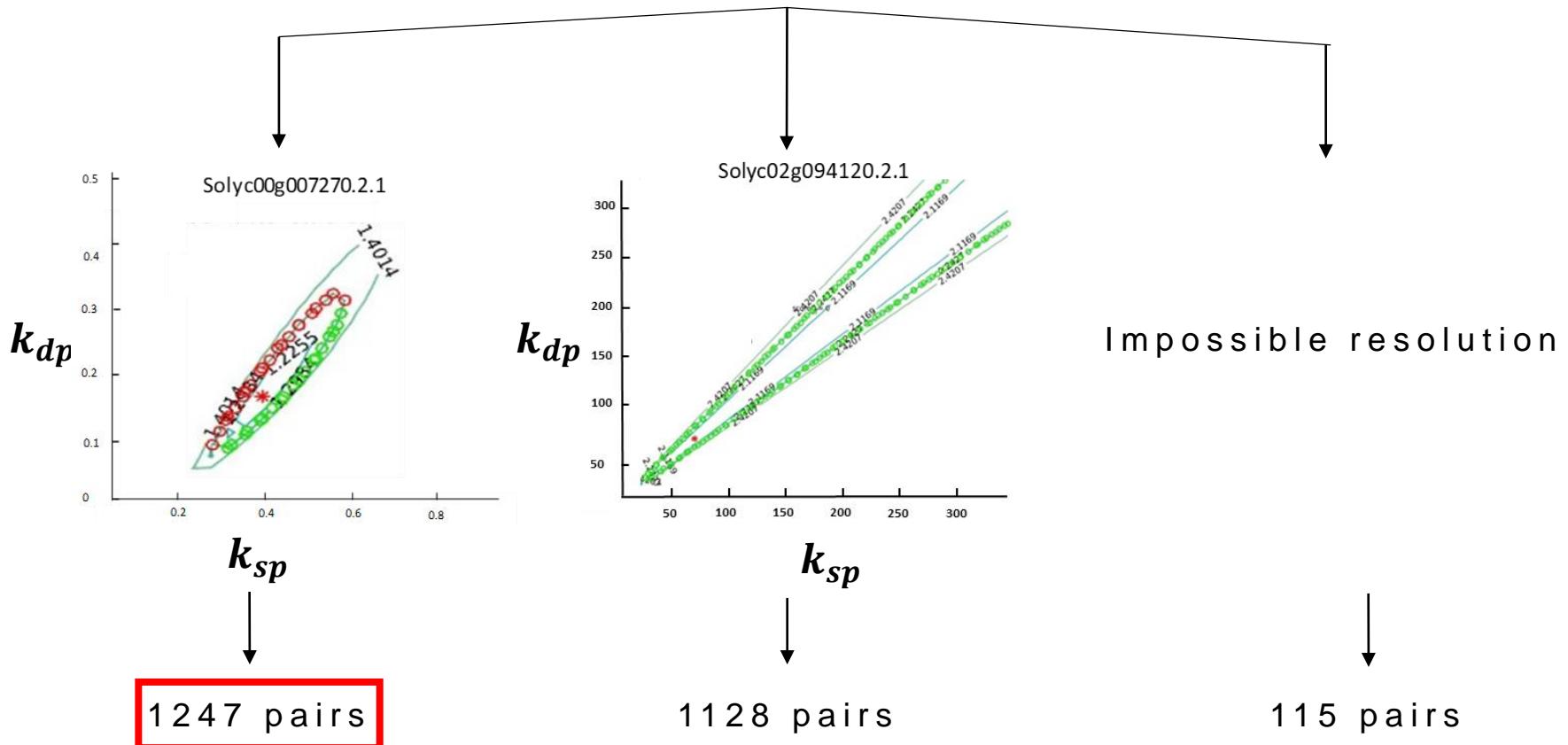
$$\frac{dp(t)}{dt} = k_{sp} r(t) - (k_{dp} + \mu(t)) p(t)$$



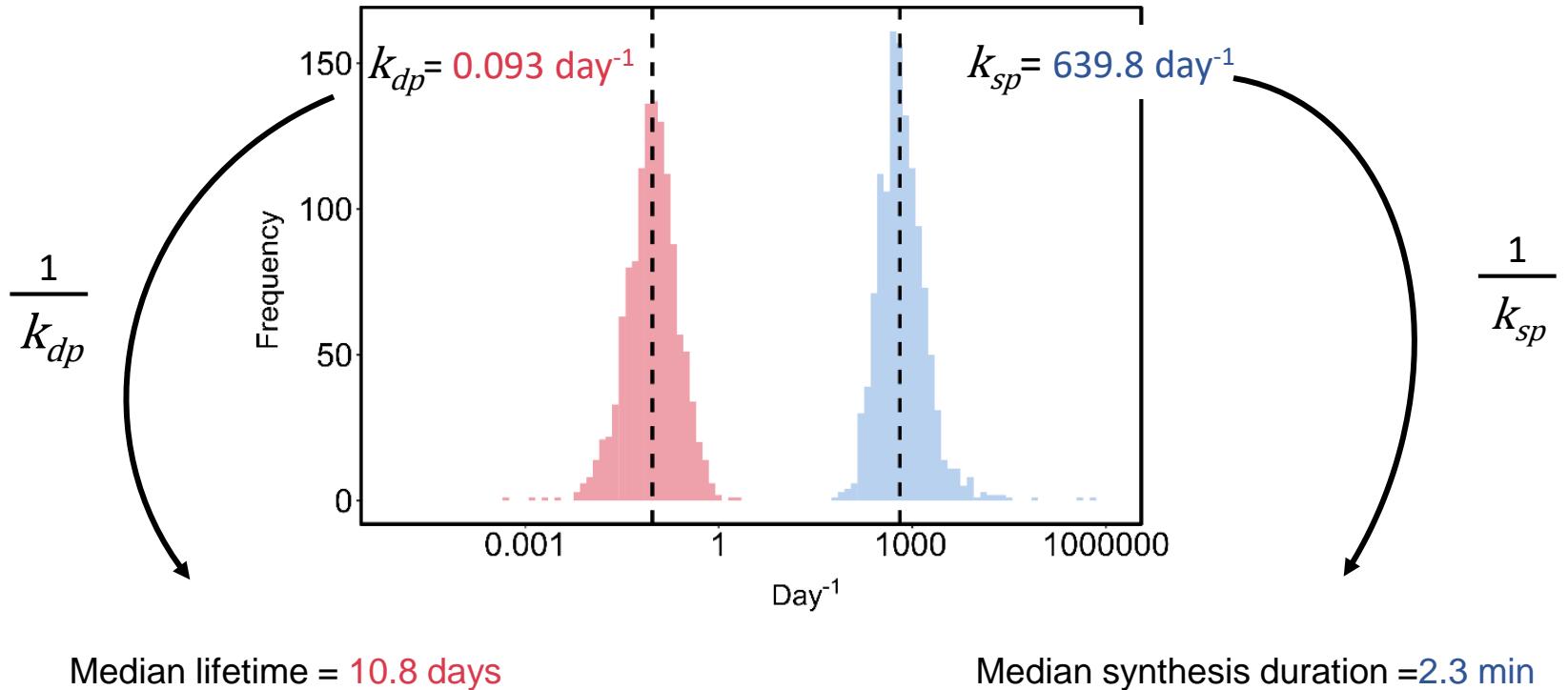
- Use of the least squares method to determine  $k_{sp}$  and  $k_{dp}$
- Finally, 2490 synthesis and degradation rate ( $k_{sp}$  and  $k_{dp}$ )

## The statistical evaluation by a confidence region

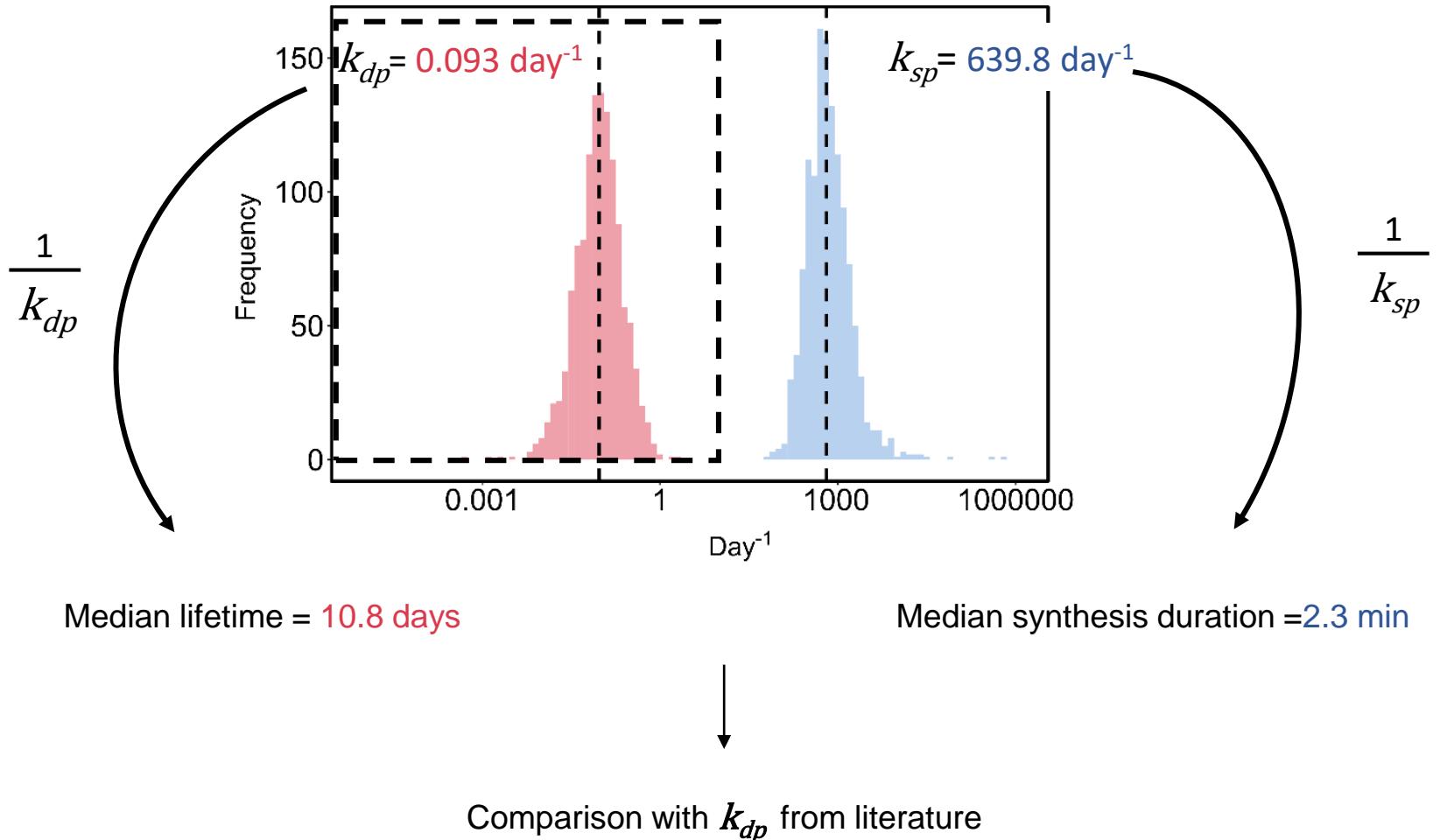
2490 protein-transcript pairs



## Tomato protein lifetime 7000 higher than synthesis duration

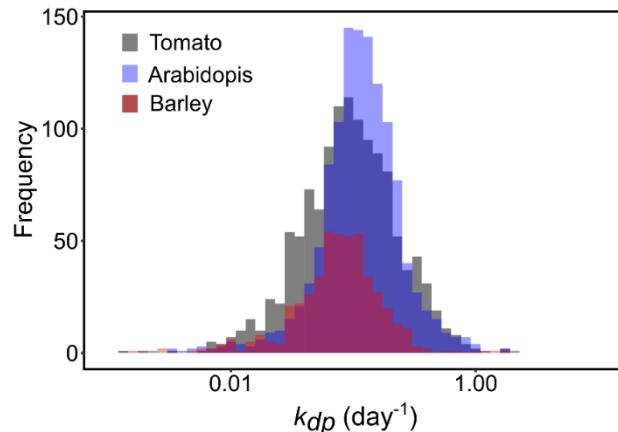


## Tomato protein lifetime 7000 higher than synthesis duration



## Comparison with other organisms and quantification methods

- Between plants



### Protein lifetime



10.8 days

### Methods

Label-free



8.8 days

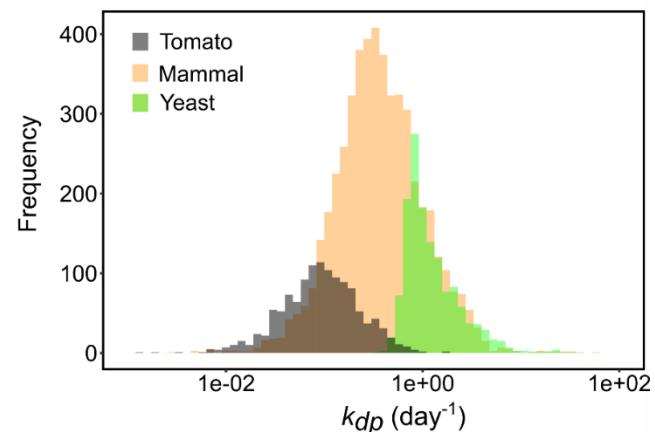
$^{15}\text{N}$  labeling



13.2 days

$^{15}\text{N}$  labeling

- Between organisms



### Protein lifetime



10.8 days

### Methods

Label-free



2.9 days

SILAC



1 day

SILAC

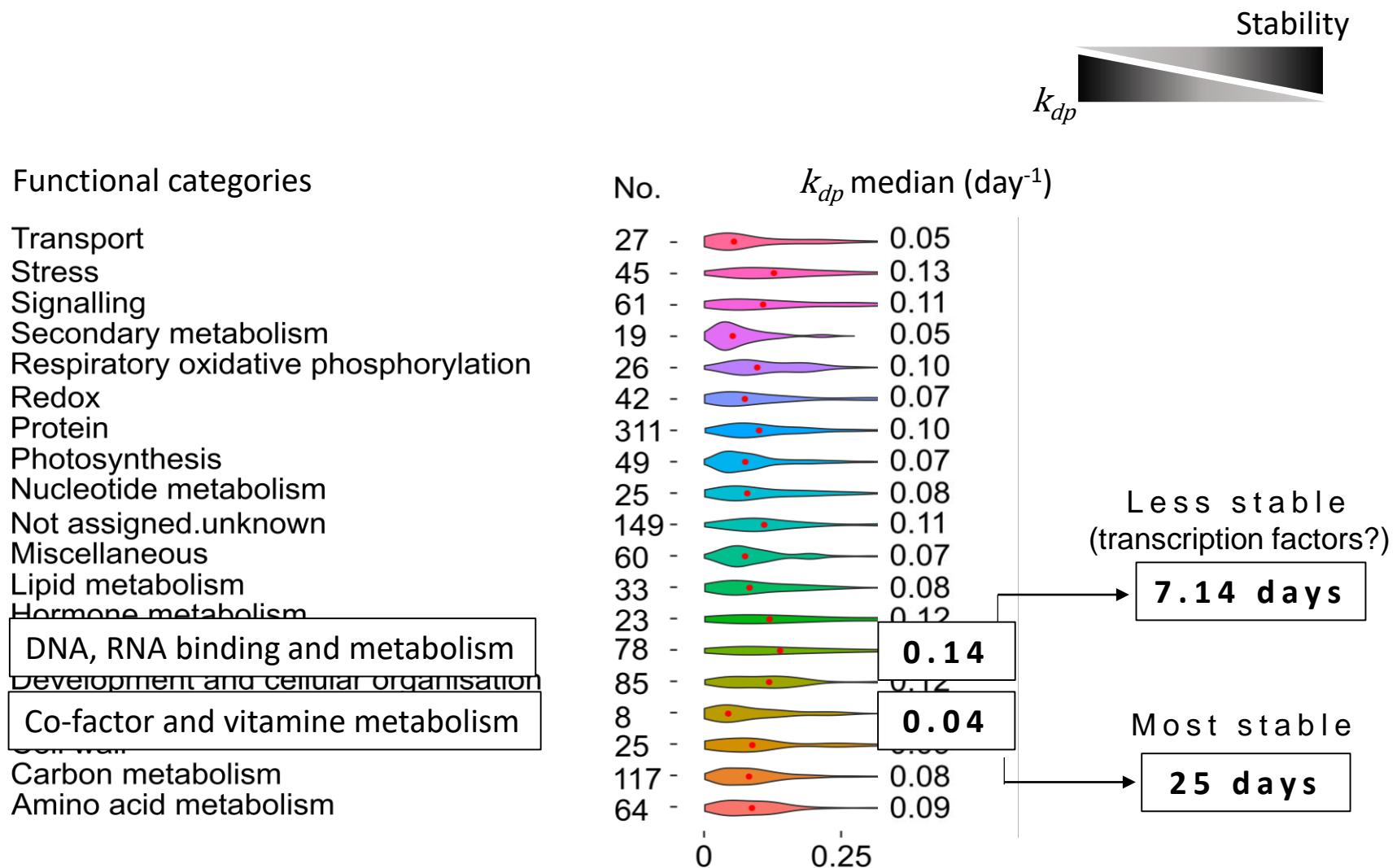
- Similar  $k_d$  medians obtained with and without labeling

- Plant proteins seem to have higher lifetime than mammal and yeast proteins

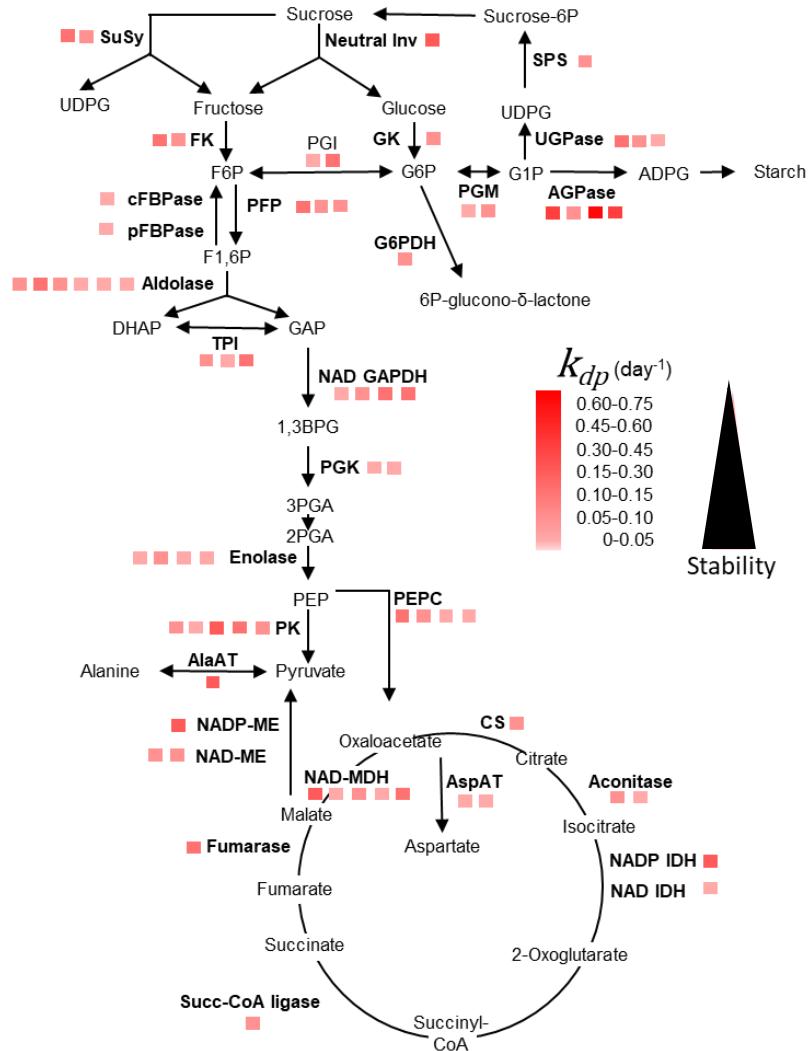
Lei et al (2017); Nelson et al (2014)

Schwanhäusser et al (2010); Lahtvee et al (2017)

## Protein lifetime and functional categories

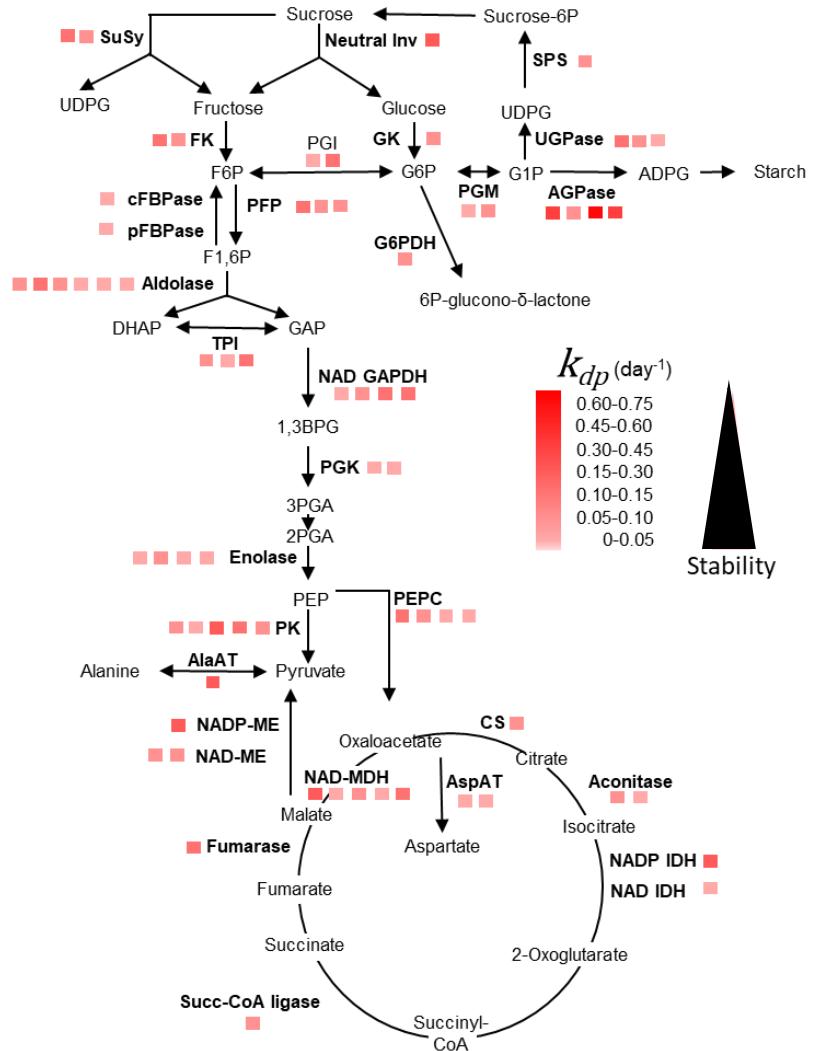


# Protein lifetime and primary metabolism



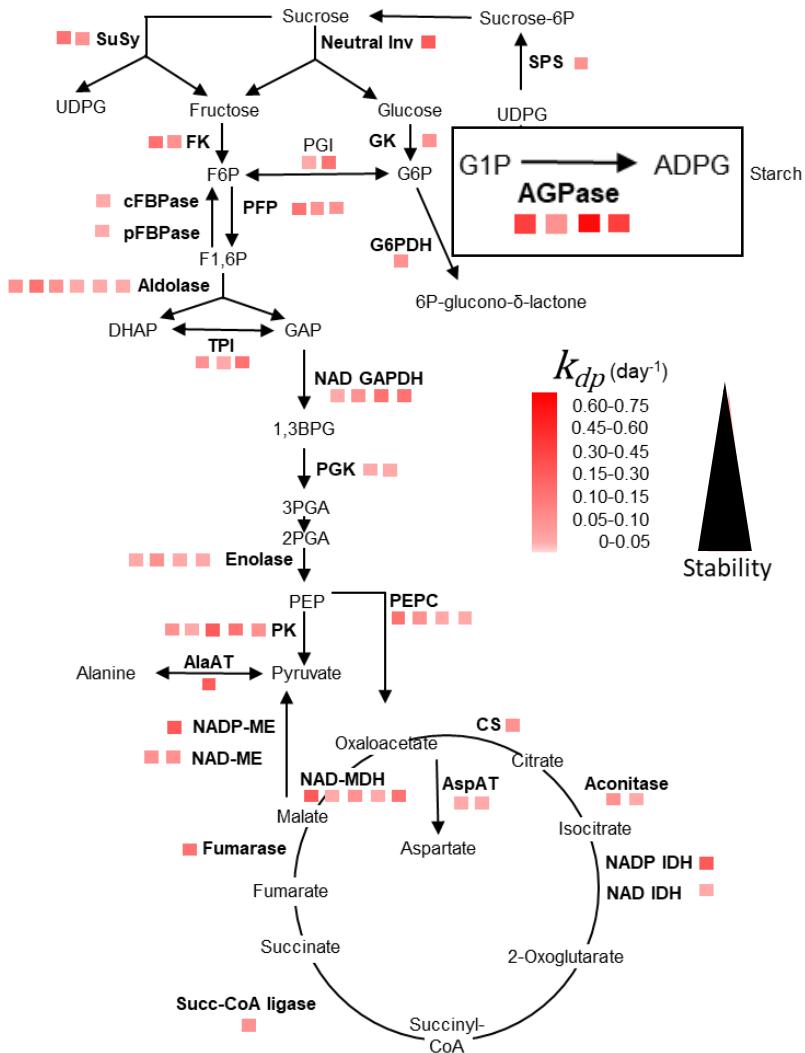
- $k_{dp}$  range : 1.3 to 106 days

# Protein lifetime and primary metabolism



- $k_{dp}$  range : 1.3 to 106 days
- Isoform differences

# Protein lifetime and primary metabolism



- $k_{dp}$  range : 1.3 to 106 days
- Isoform differences
- AGPase: starch metabolism

Isoforms	$k_{dp}$ (day $^{-1}$ )	Lifetime (day)
AGPase-1	0.37	2.69
AGPase-2	0.06	15.6
AGPase-3	0.79	1.27
AGPase-4	0.35	2.84

## To conclude

- A unique dataset of quantitative omics throughout a time-serie
- Determination of the most adapted method of protein quantification
- Quantification of the concentration of tomato proteins
- Tomato protein timelife is 10.8 days (median)
- Tomato protein synthesis duration is 2.3 min (median)
- Identification of potential point of regulation (AGPase?)

## Perspectives

- Relationship between degradation constants and biochemical properties (hydropathy...)
- Difference between organisms: temperature, growth rate
- Continue the integrative analysis of the four omics

Thanks for your attention

And to the contributors



Ségolène Augé  
Master internship