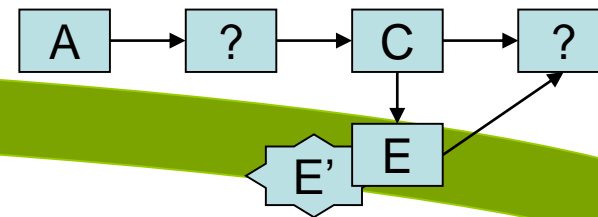
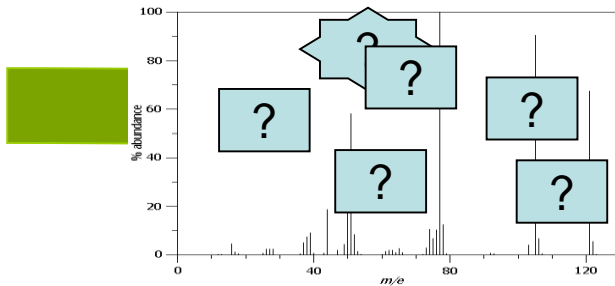
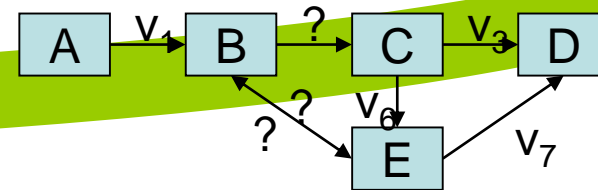
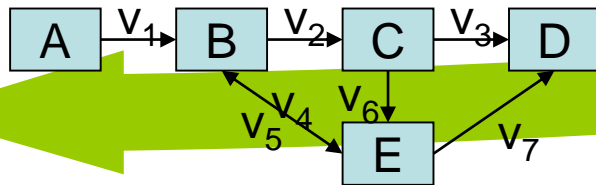


# Bioinformatics for Metabolomics and Fluxomics

RL 1; metabolite identification



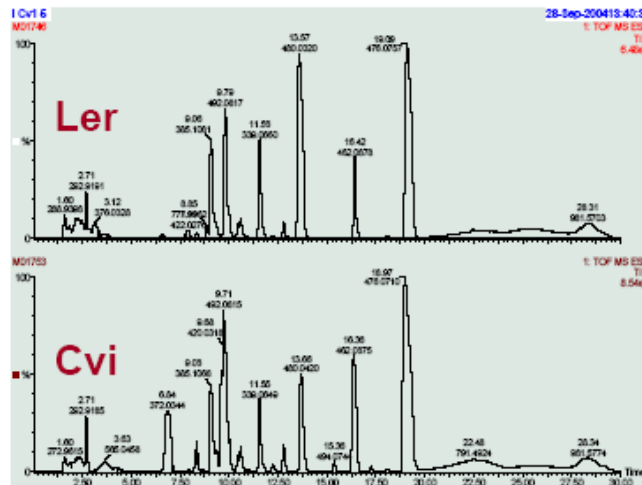
RL 1 & 2; pathway reconstruction



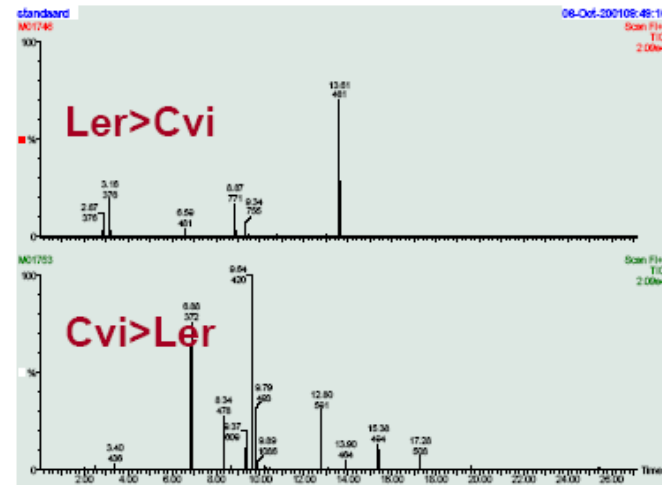
RL 2; metabolic flux analysis

# Metabolites and Metabolic Fluxes Play Key Roles in Organisms

## *First Example Application Domain : 200,000 metabolites in plants*



original LC-QTOF MS profiles



significantly different metabolites  
(factor 2 or more, 99% conf., n=5)

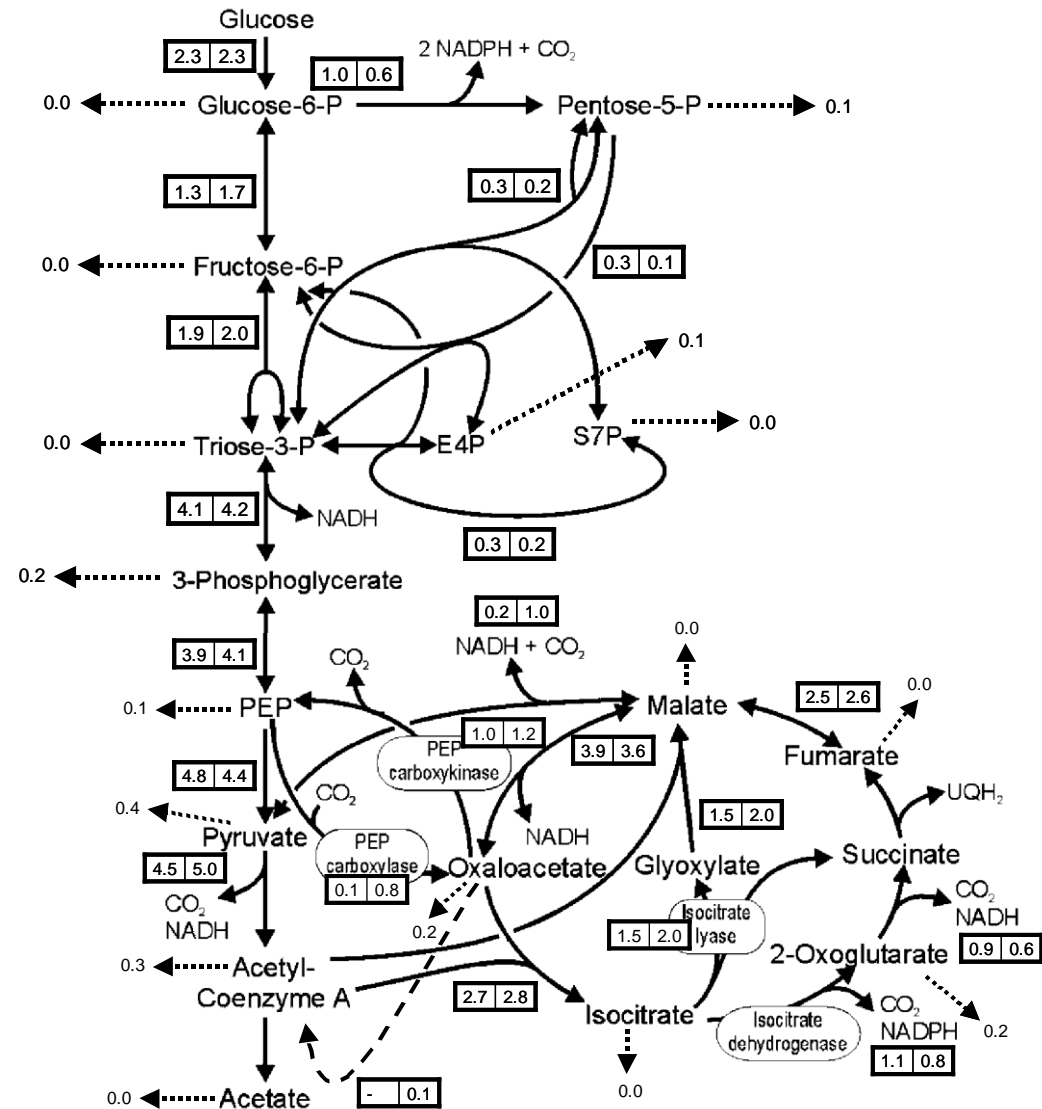


Metabolomics: (large scale) measurements of  
metabolites and their levels

# Metabolites and Metabolic Fluxes Play Key Roles in Organisms

## *Second Example : metabolic flux analysis in micro-organisms*

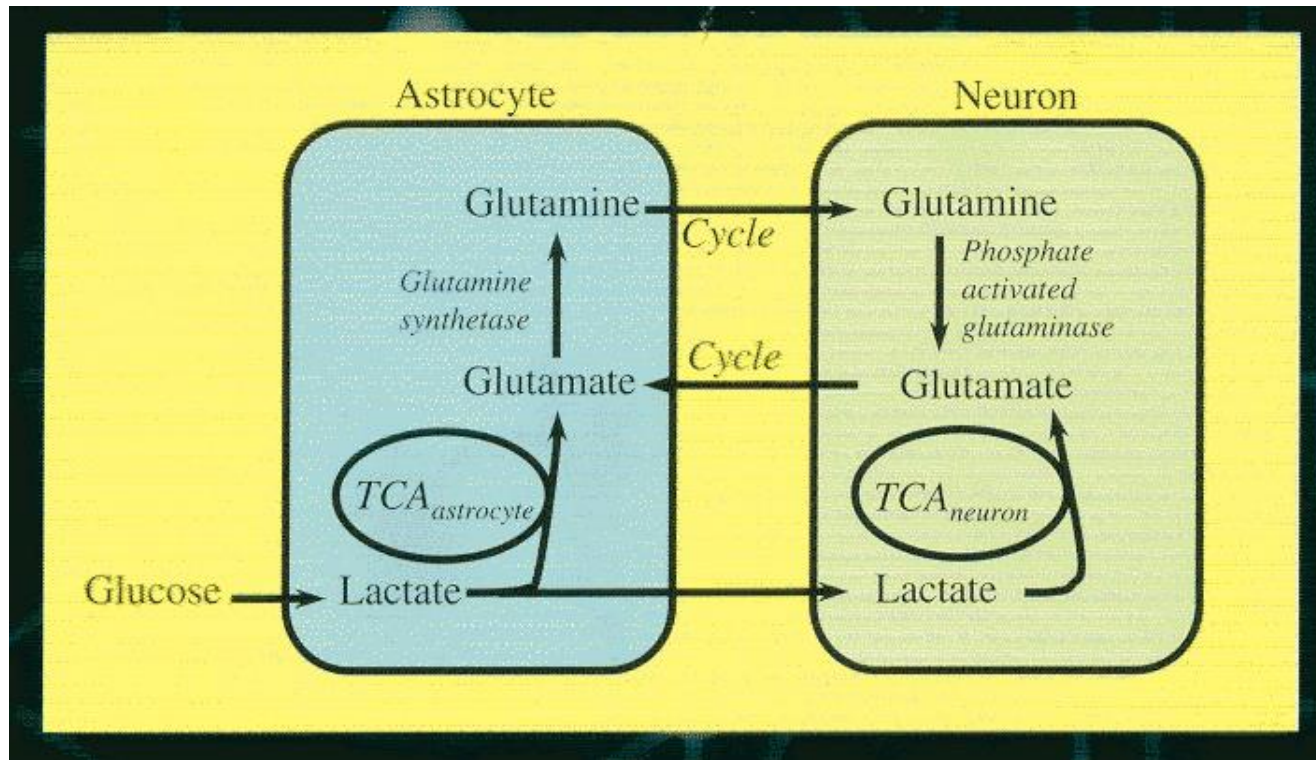
Metabolic flux analysis of *E. coli* strain grown in chemostat culture



Fluxomics: (large scale) measurements of metabolic fluxes

# Metabolites and Metabolic Fluxes Play Key Roles in Organisms

## *Third Example : Human and Animal Brain Neurotransmitter Cycling*



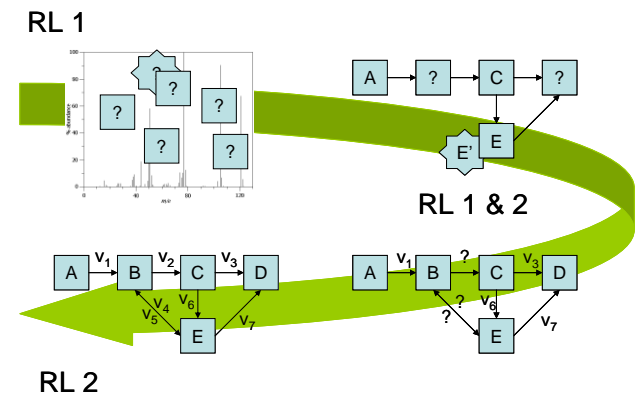
from: *Metabolic Engineering* (2004)

Fluxomics: (large scale) measurements of metabolic fluxes

# Goals Project

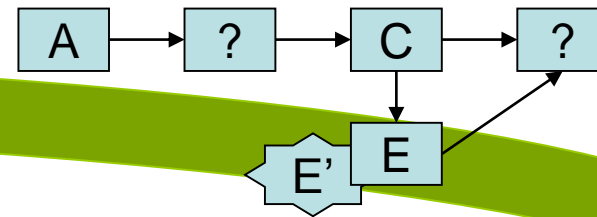
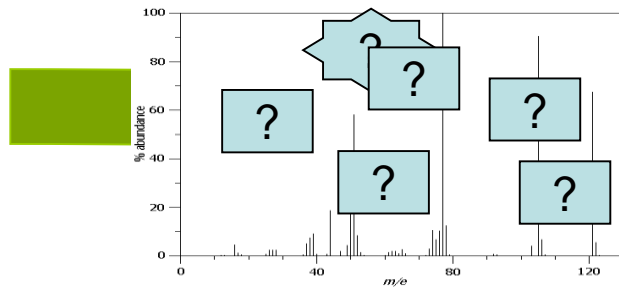
*develop bioinformatics methods for*

- metabolite and pathway identification
- quantification of metabolite levels and isotopic composition
- analysis of dynamic metabolic experiments
- quantification of metabolic fluxes

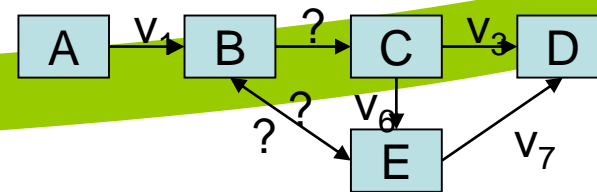
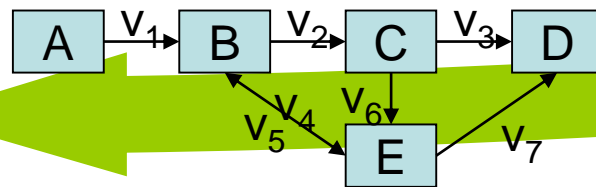


# Two Connected Research Lines

RL 1; metabolite identification



RL 1 & 2; pathway reconstruction



RL 2; metabolic flux analysis

# Expertise in the Netherlands Bundled

## Key Participants

Roeland C.H.J. van Ham, Raoul J. Bino,  
**Centre for BioSystems Genomics** / Plant Research International, Wageningen

Wouter A. van Winden, Joseph J. Heijnen,  
**Kluyver Centre** / Delft University of Technology, Dept. of Biotechnology

Johannes H.G.M. van Beek,  
**Centre for Medical Systems Biology** / VU University medical centre, Amsterdam

Ivo H.M. van Stokkum,  
**Centre for Medical Systems Biology** / Applied Computer Science, Vrije  
Universiteit, Amsterdam

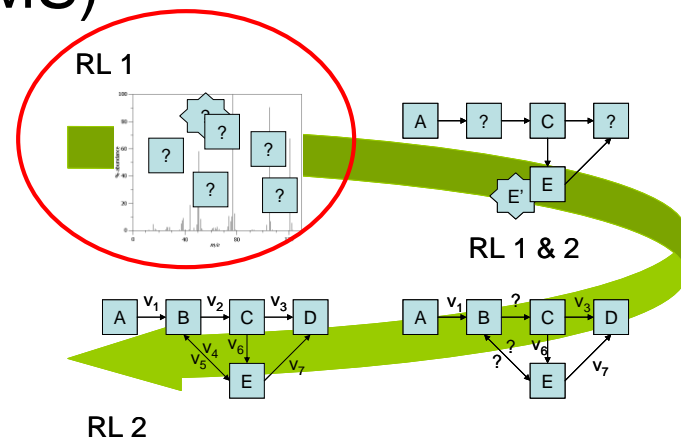
Further participants / consultants / collaborators :  
on the one hand computer science/database (Bakker/Kok, Bal), signal analysis  
(Verheijen, Van Ormondt/De Beer) and bioinformatics (a.o. Heringa) expertise.

On the other hand many scientists with metabolic research expertise and interests.

# RL1: Metabolite Identification

Develop platform for identification of metabolites from high-throughput metabolome data

- ❖ algorithms for compound identification from (LC-) mass spectrometry and NMR spectroscopy
- ❖ databases for raw and processed information; retrieving matching spectra of known chemical composition
- ❖ standardized and automated procedure for metabolite identification, in particular from LC-MS/MS (liquid chromatography coupled to tandem MS)





# Metabolite Identification

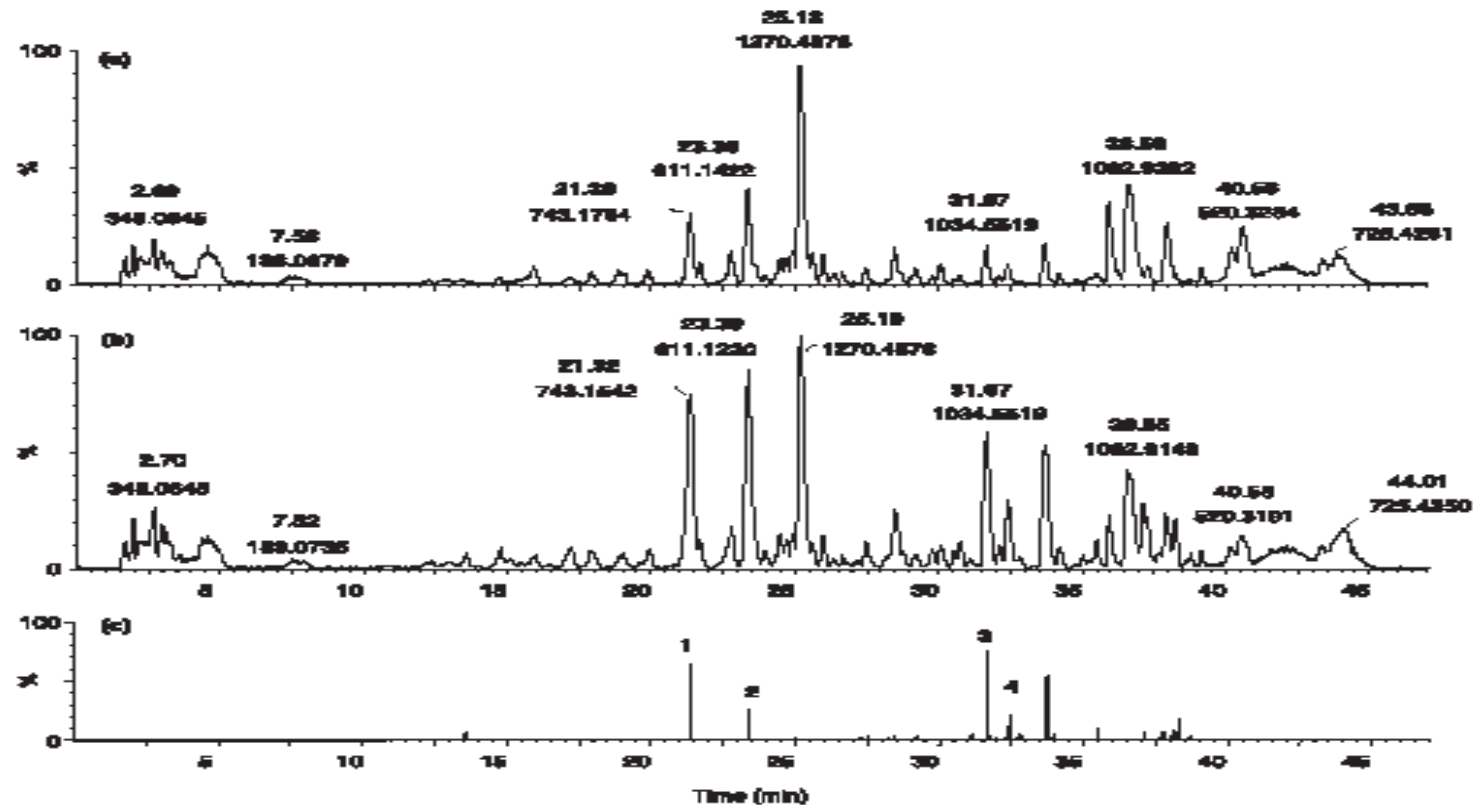
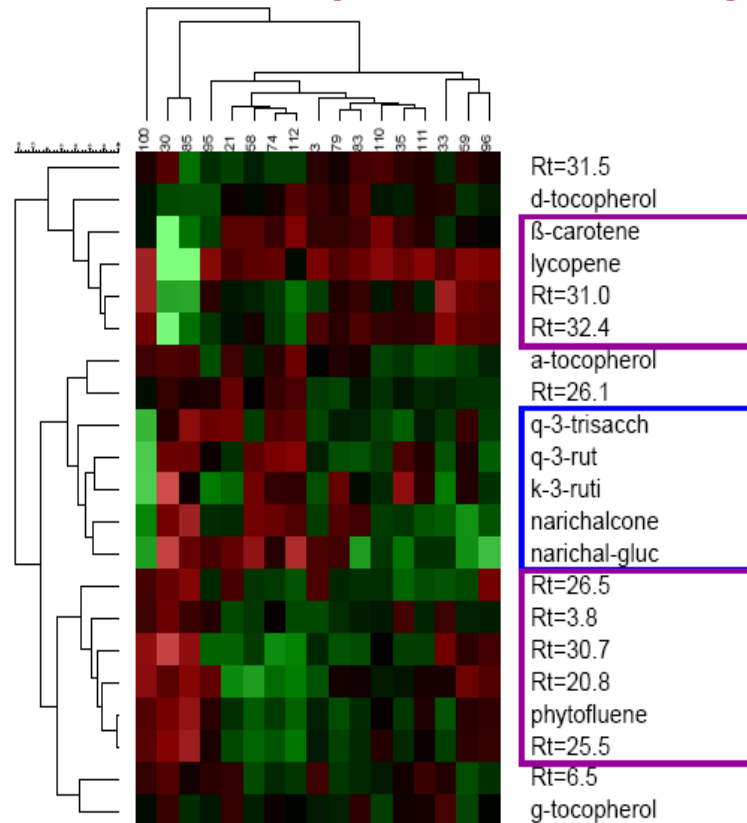


Fig. 2 Typical LC-QTOF-MS-ESI-positive chromatogram (given as base peak intensities) of aqueous methanol extracts from red fruits of control (a) and *hp-2<sup>del</sup>* (b) *Lycopersicon esculentum* (tomato) plants (numbers at peaks refer to retention time and mass), and mass peaks (c) that were significantly ( $P < 0.05$ ) increased at least twofold in fruits of *hp-2<sup>del</sup>* plants compared with the control. All chromatographic data were processed and compared using METALION software. Peaks were identified based on mass fragmentation patterns and PDA absorbance: peak 1, quercetin-3-trisaccharide; 2, rutin; 3, tomatine; 4, naringenin-chalcone glucoside.

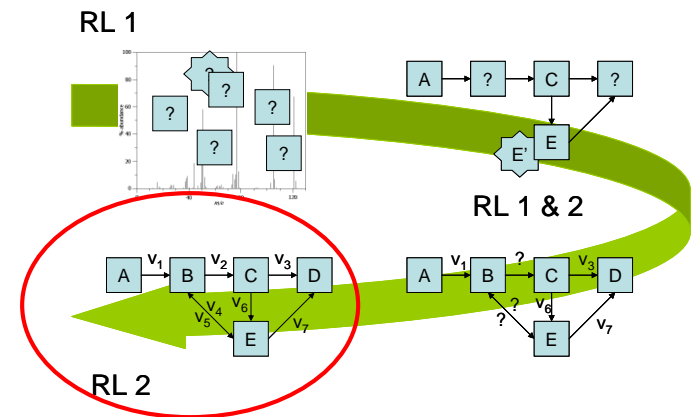
# Metabolite Identification

## Health compounds in cherry tomatoes

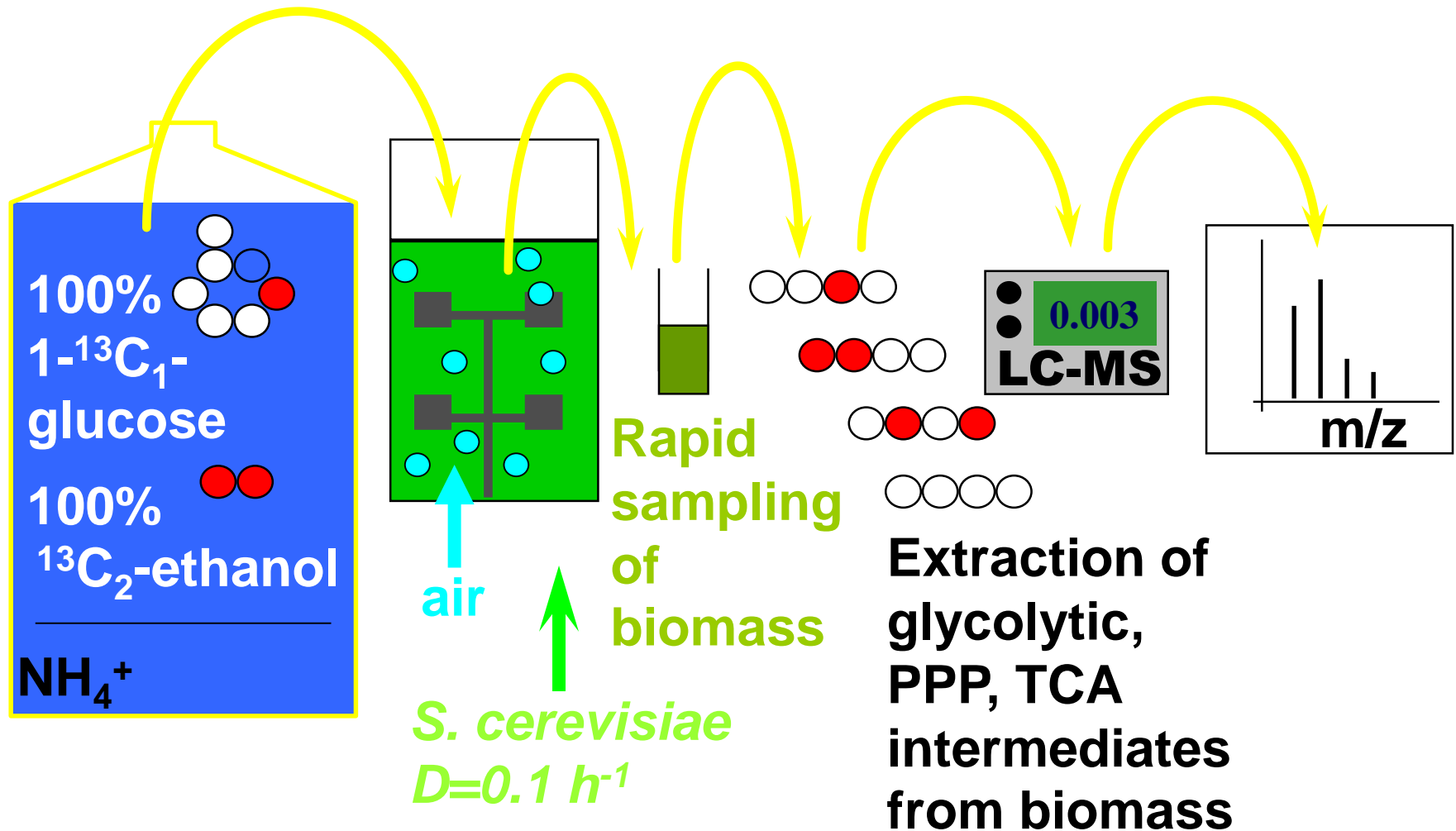


# RL2: Metabolic Flux Analysis

- Develop platform for flux analysis, derived from stable isotope incorporation measured with NMR and mass spectrometry
- ❖ a problem solving environment for simulation and analysis of metabolic flux models and experimental design
  - ❖ optimization algorithms for flux quantification
  - ❖ new metabolic pathway modules

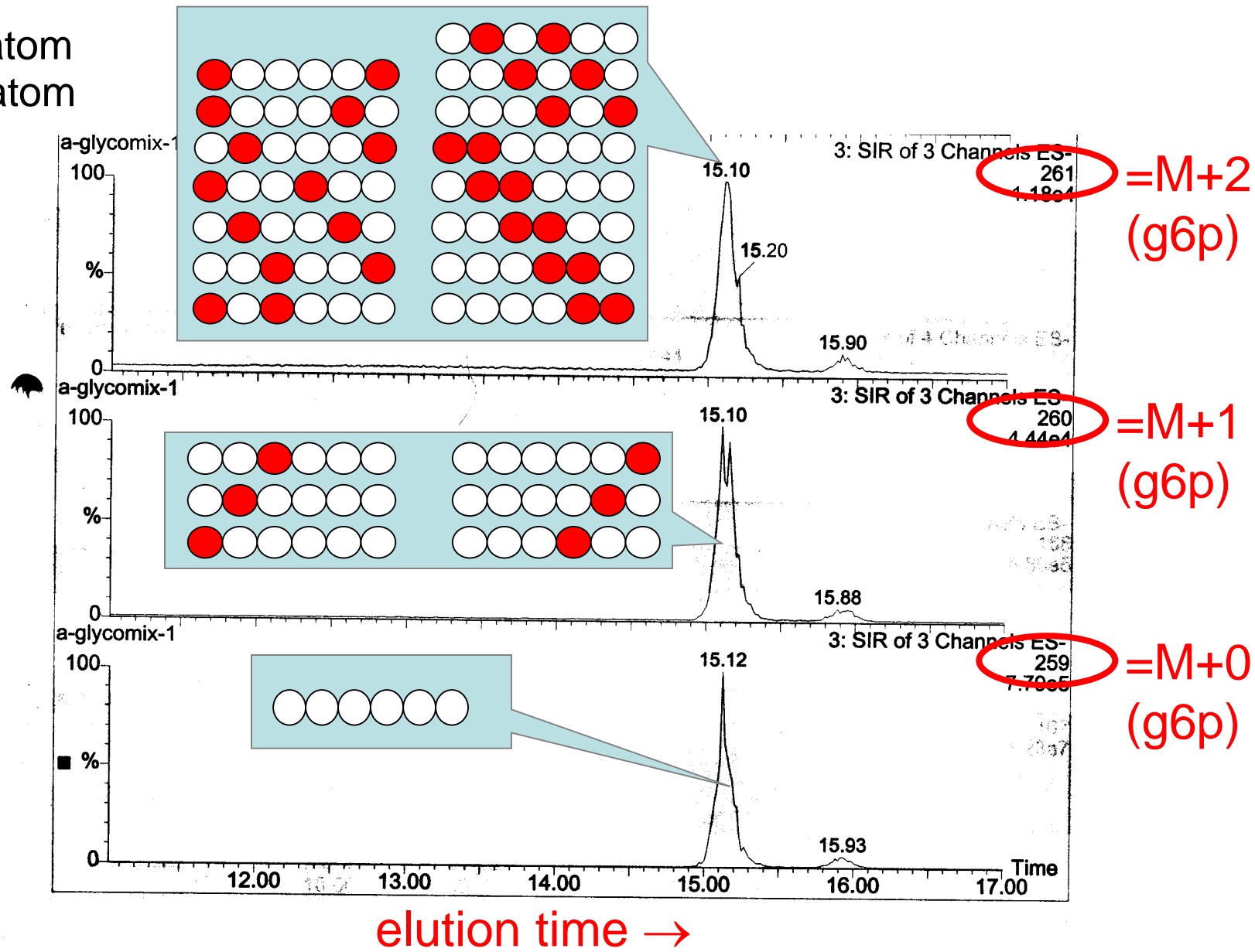


# $^{13}\text{C}$ -experiment for metabolic flux analysis in micro-organisms



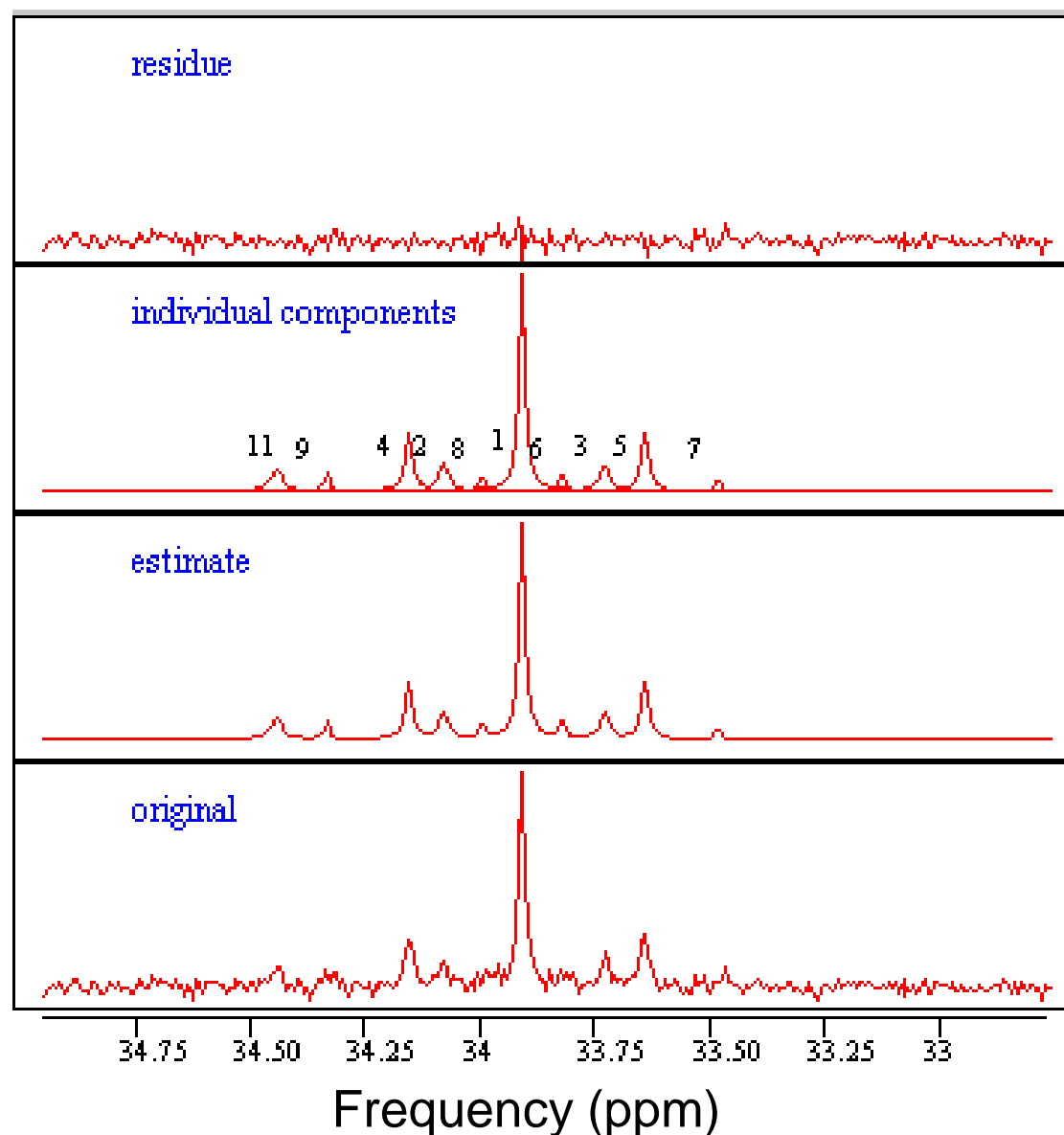
# Detection of mass isotopomer fractions of glucose-6-phosphate with LC-MS

○ =  $^{12}\text{C}$ -atom  
● =  $^{13}\text{C}$ -atom



# Flux Quantification *in vivo* Animal Experiment

**Fit to NMR  
multiplets of the  
4-carbon of  
glutamate from a  
biopsy from  
porcine heart**



# Flux Quantification *in Vivo* Animal Experiment

$58 \pm 23 \%$  acetyl CoA  
from infused acetate

acetate

[transport]

Transport time  
 $29.8 \pm 11.6$  sec

unenriched substrates

TCA cycle flux =  
 $7.7 \pm 3.0 \mu\text{mol/g/min}$

acetyl-CoA

glutamate  
content  
 $24.6 \mu\text{mol/g}$

6 C

4 C

aspartate

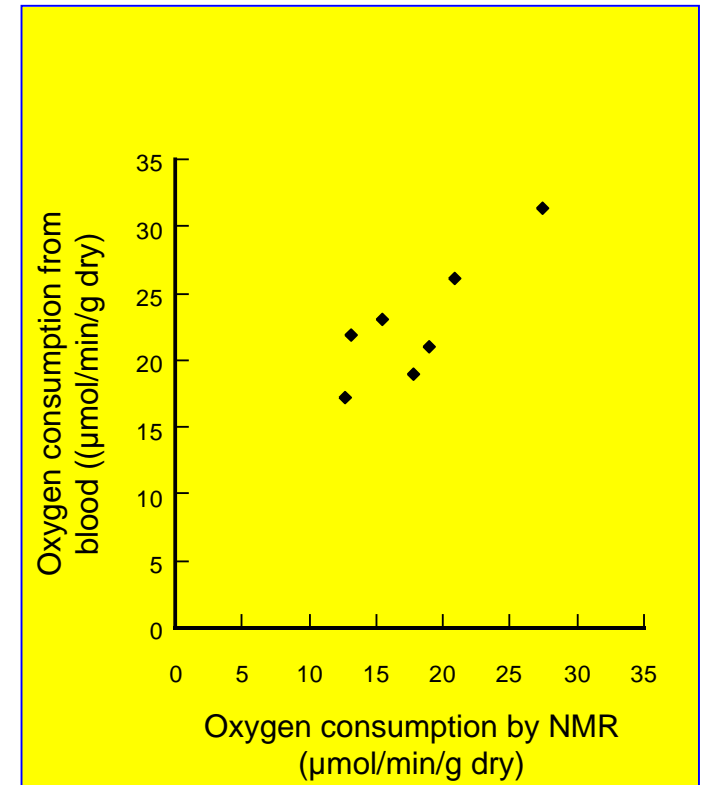
Anaplerosis  
 $16 \pm 12 \%$   
of TCA cycle flux

TCA  
cycle

Transamination  
 $17.4 \pm 6.0 \mu\text{mol/g/min}$

glutamate

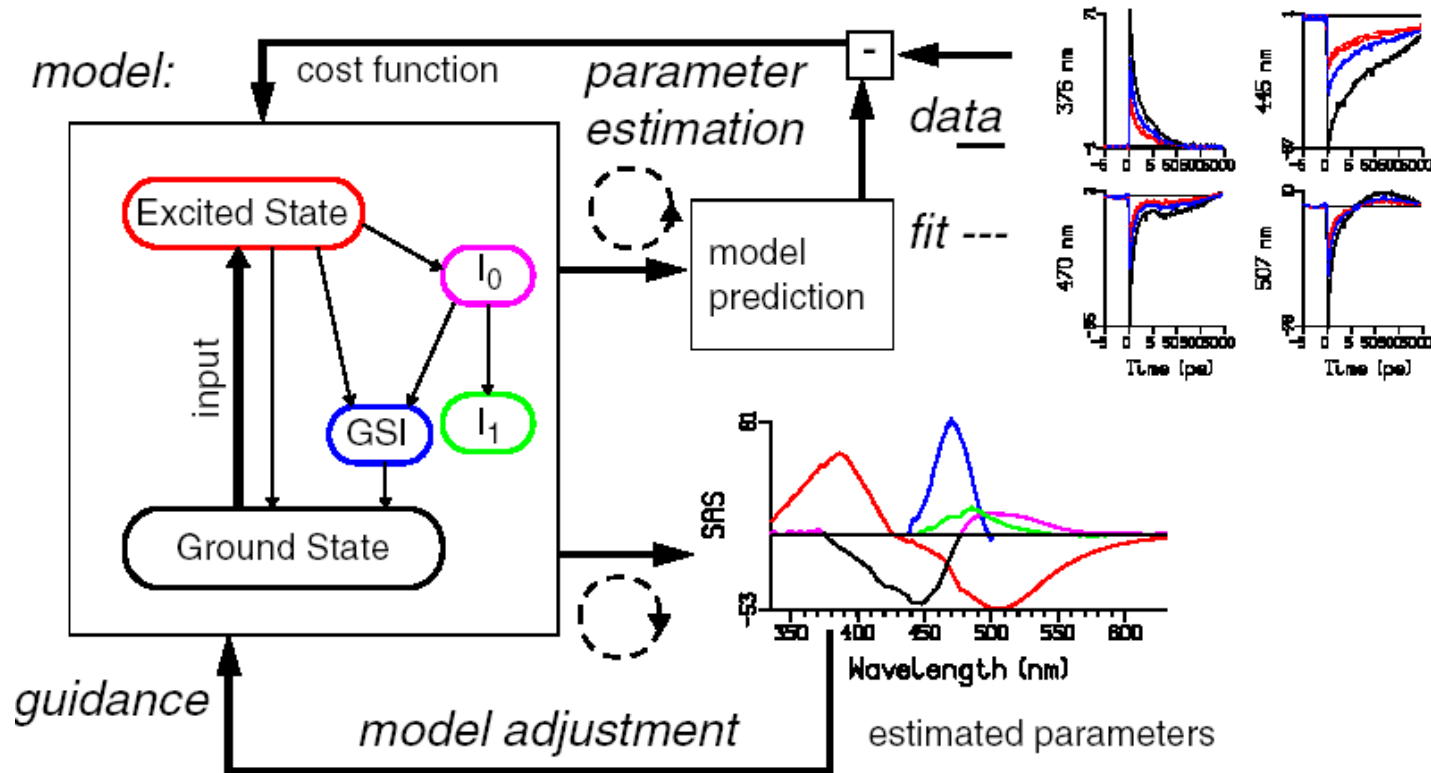
5 C




Myocardial Metabolism

# Integrated Problem Solving Environment

Integrated PSE (Problem Solving Environment) for metabolic flux experiment analysis





**TIMBeta** 

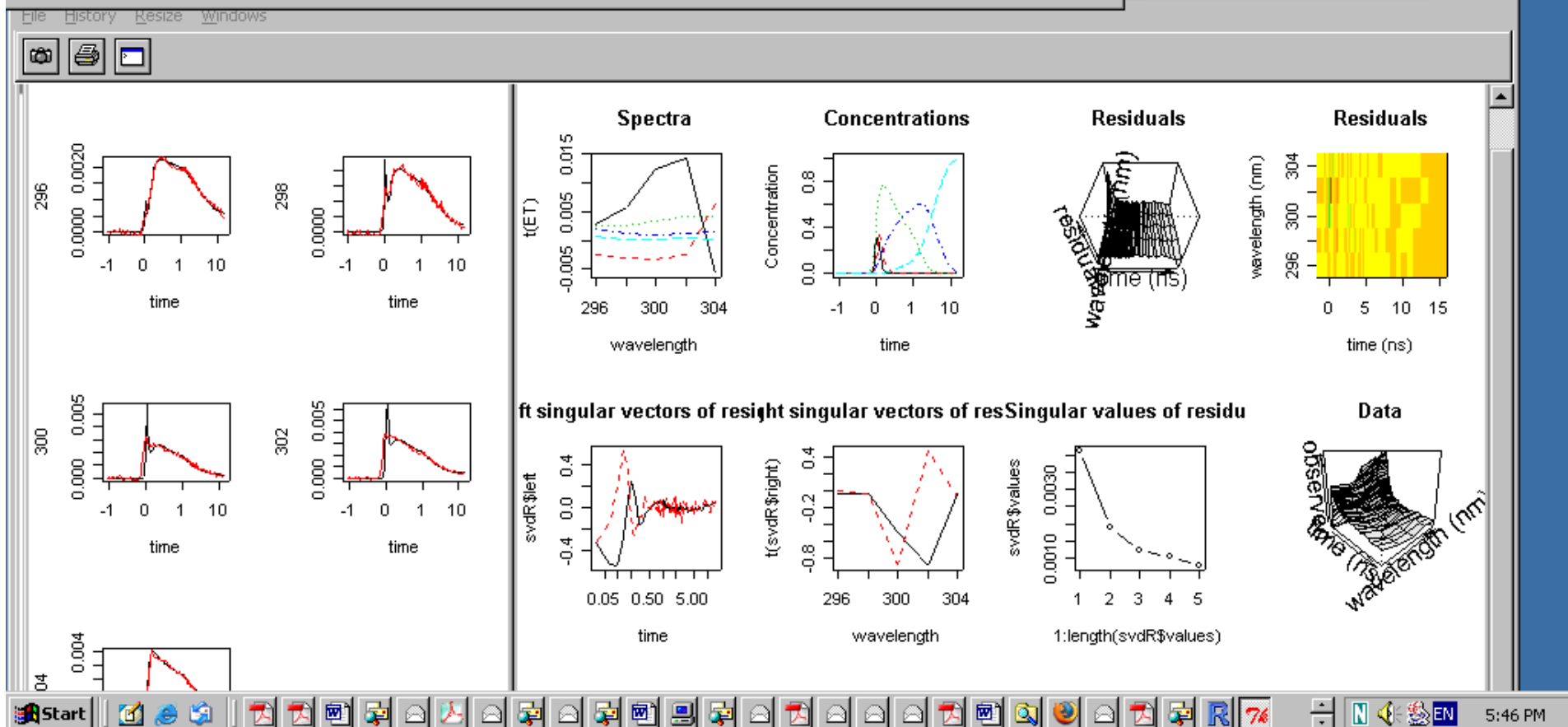
File Preprocess Weight Fix/Free IRF Compartmental model Spectral constraints Help

Starting values for decay rates:  Number of iterations:  Summarize current dataset

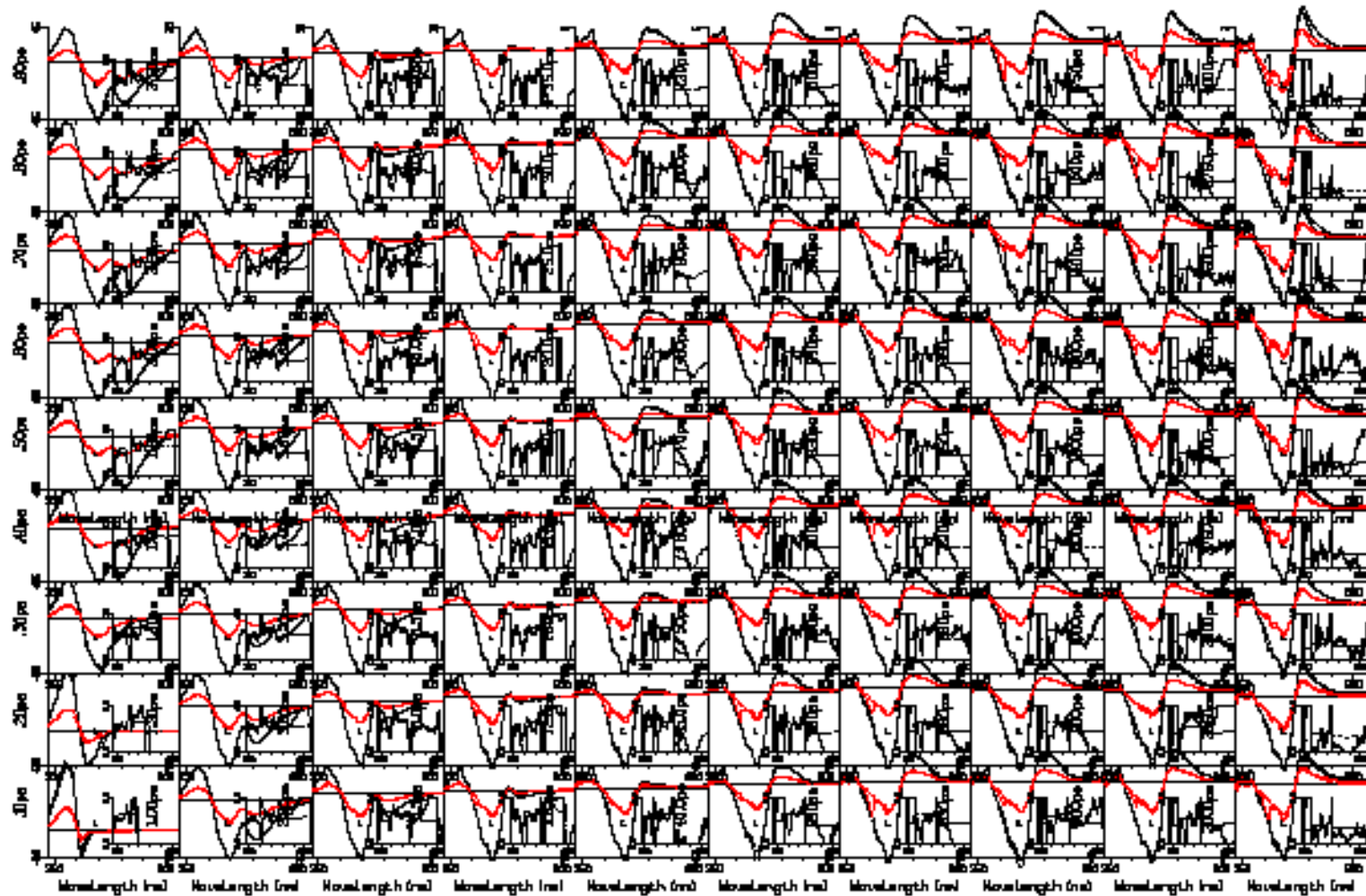
Force positive rate constraints? ☒ No ☐ Yes Plot linearly to time:  Summarize current model

Register values

Fit current model



# Large Data Sets Analysed



# Summary

Bioinformatics tools and problem solving environments are developed for

- metabolite identification and quantification
- analysis of dynamic experiments and quantification of metabolic fluxes
- expertise in the Netherlands is bundled
- collaboration of bioinformaticians, computer scientists and domain experts

