



# Valorisation de la biodiversité microbienne pour les aliments fermentés : analyse multi-échelle du génotype au phénotype pour un choix rationnel des ferments lactiques

[www.lisbp.fr](http://www.lisbp.fr)

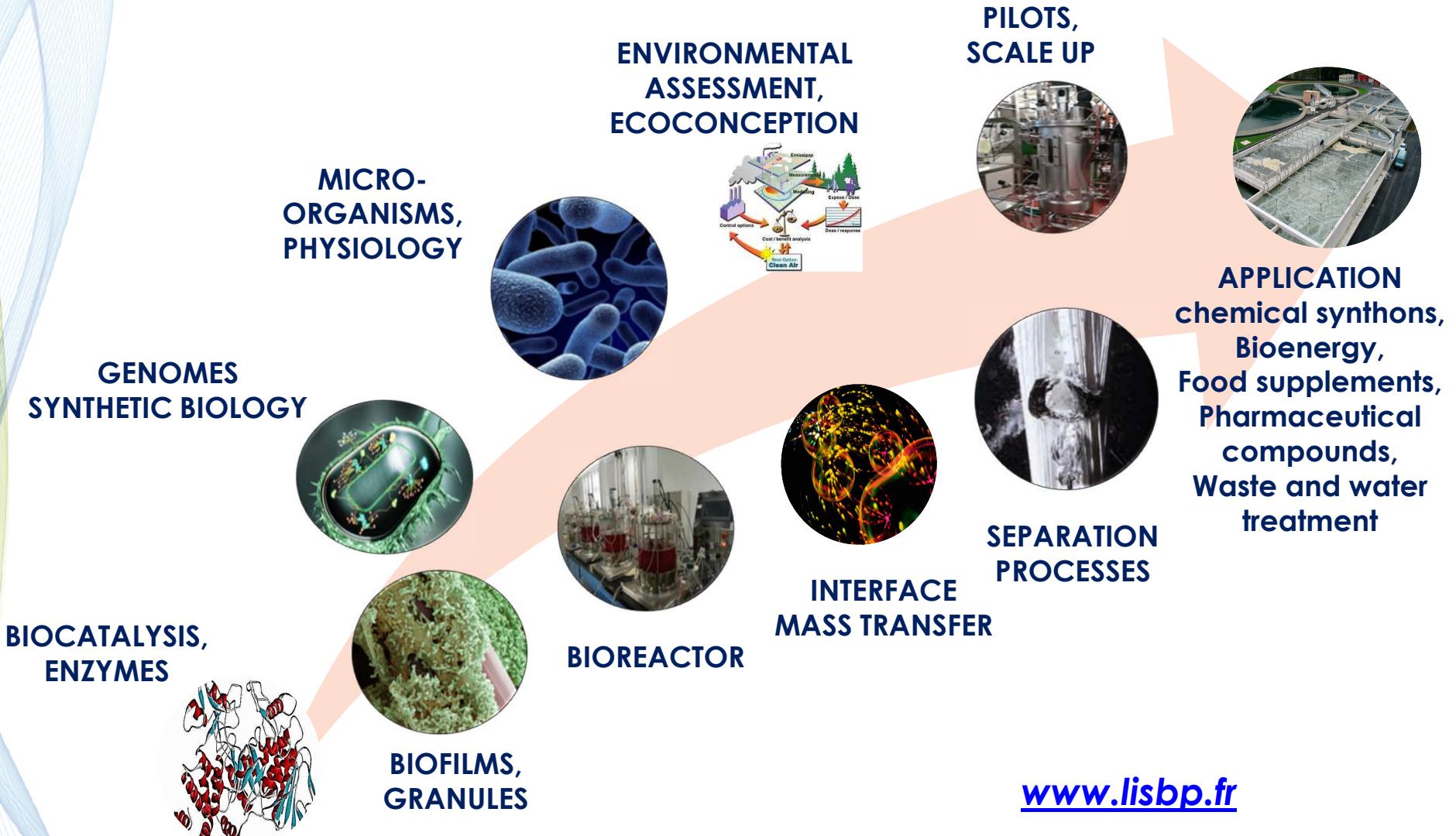
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ML Daveran-Mingot, M. Cocaign-Bousquet

Toulouse, France



# LISBP: a cascade of competences in biotechnology

## 5 scientific poles, 4 platforms, 350 people

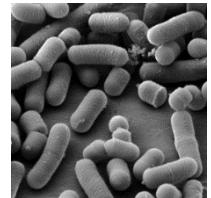
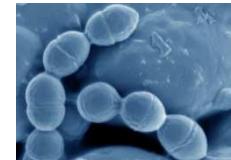


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# Lactic Acid Bacteria



Gram-positive, non-spore forming cocci and rods  
Anaerobic aerotolerant, catalase negative  
GRAS (Generally Recognized As Safe) organisms



Large number of species for a variety of fermented foods



*Oenococcus oeni*

*Leuconostoc mesenteroides*



*Lactobacillus delbrueckii*

*Lactobacillus sakei*

*Lactobacillus casei*    *Lactobacillus sanfranciscensis*



*Pediococcus pentosaceus*

*Lactobacillus brevis*

*Lactobacillus plantarum*



0.05

B.subtilis  
(outgroup)

*Streptococcus thermophilus*

*Lactococcus lactis*

*L. lactis* subsp *lactis*

" *biovar diacetilactis*

*L. lactis* subsp *cremoris*

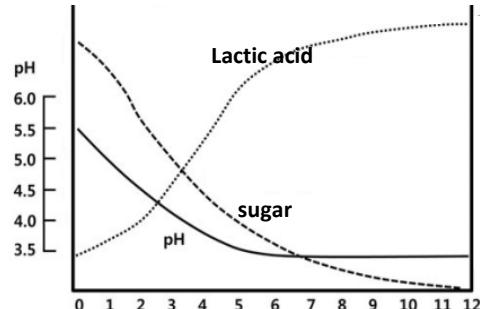
*L. lactis* subsp *hordniae*

*L. lactis* subsp *tructae*

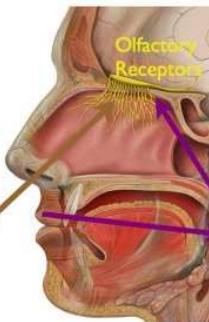


# Lactic acid bacteria and food fermentation

## Acidification (Lactic acid production)



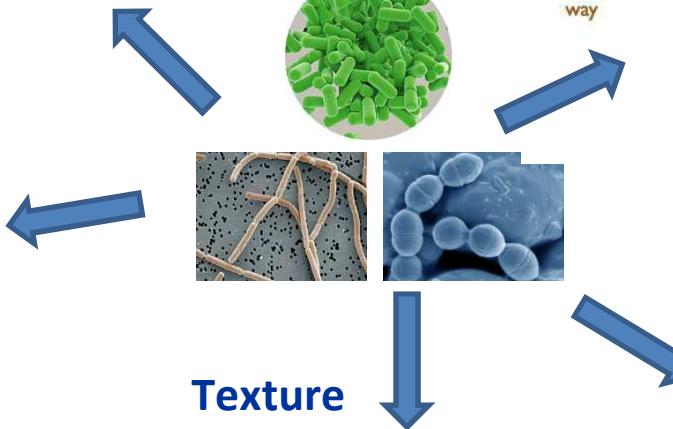
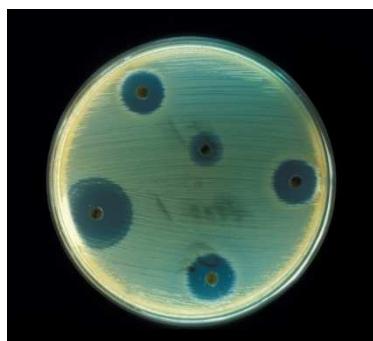
## Direct construction of orthonormal basis



## Flavor



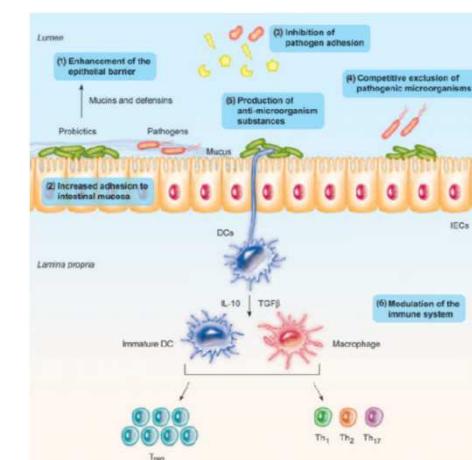
## Antimicrobial compounds



# Texture



# Nutraceutic production, Probiotic bacteria



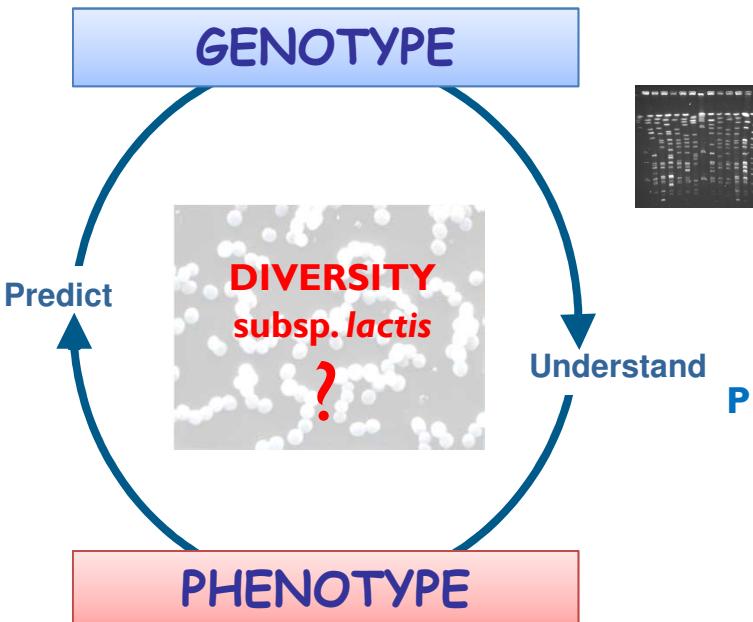
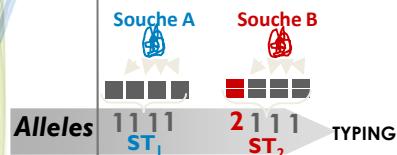
# Diversity and functional characterization of starters: an integrated approach

## Genetics

Genes content and genes variation

CGH (Comparative Genomic hybridization)

MLST (Multilocus sequence typing)



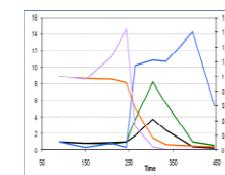
## Genomics

Genome sequencing **NGS**

Genome pattern analysis

PFGE (Pulsed Field Gel Electrophoresis)

## Physiology

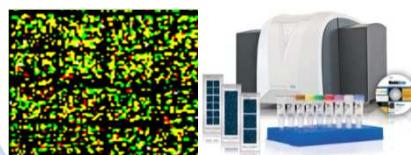


Growth, metabolites and acidification kinetics

Enzymatic analysis

Microbial energetics

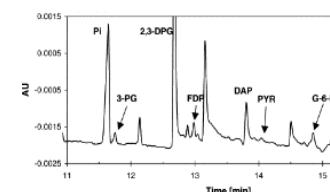
## Transcriptomics



## Proteomics

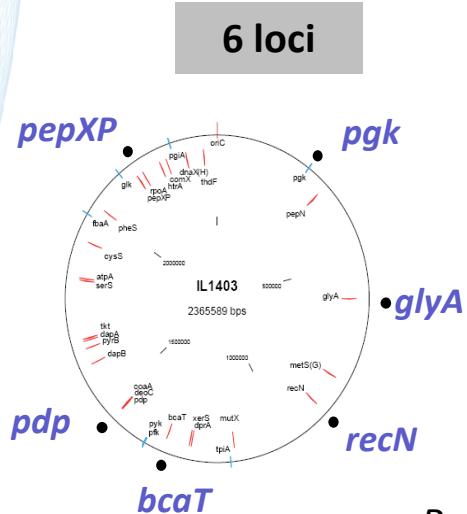


## Metabolomics



# Genetic diversity of *Lactococcus lactis* subsp *lactis* strains

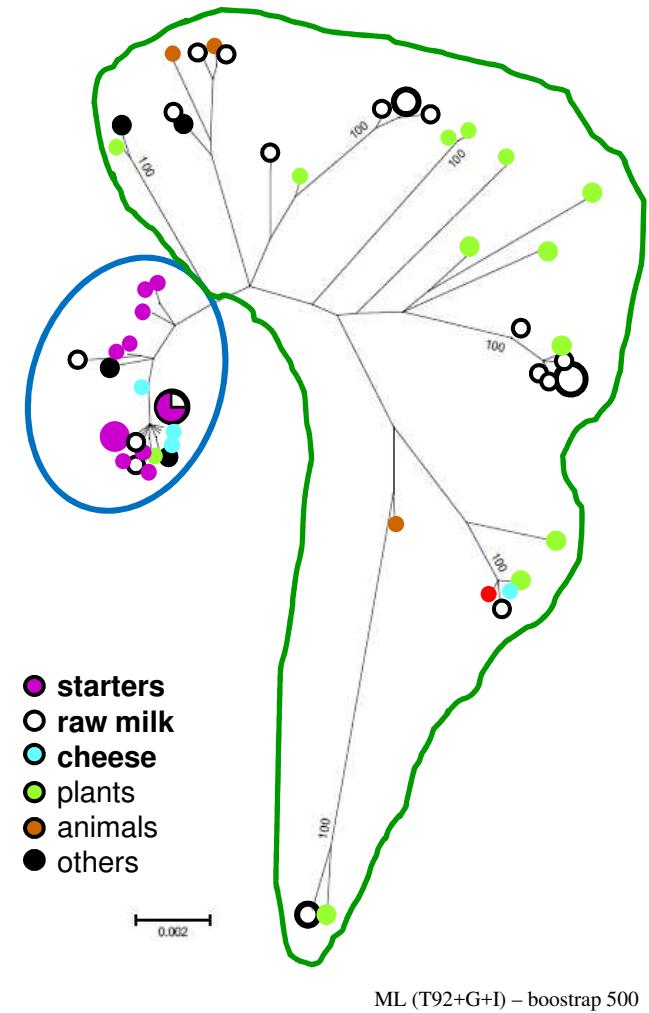
## MLST (Multi Locus Sequence Typing)



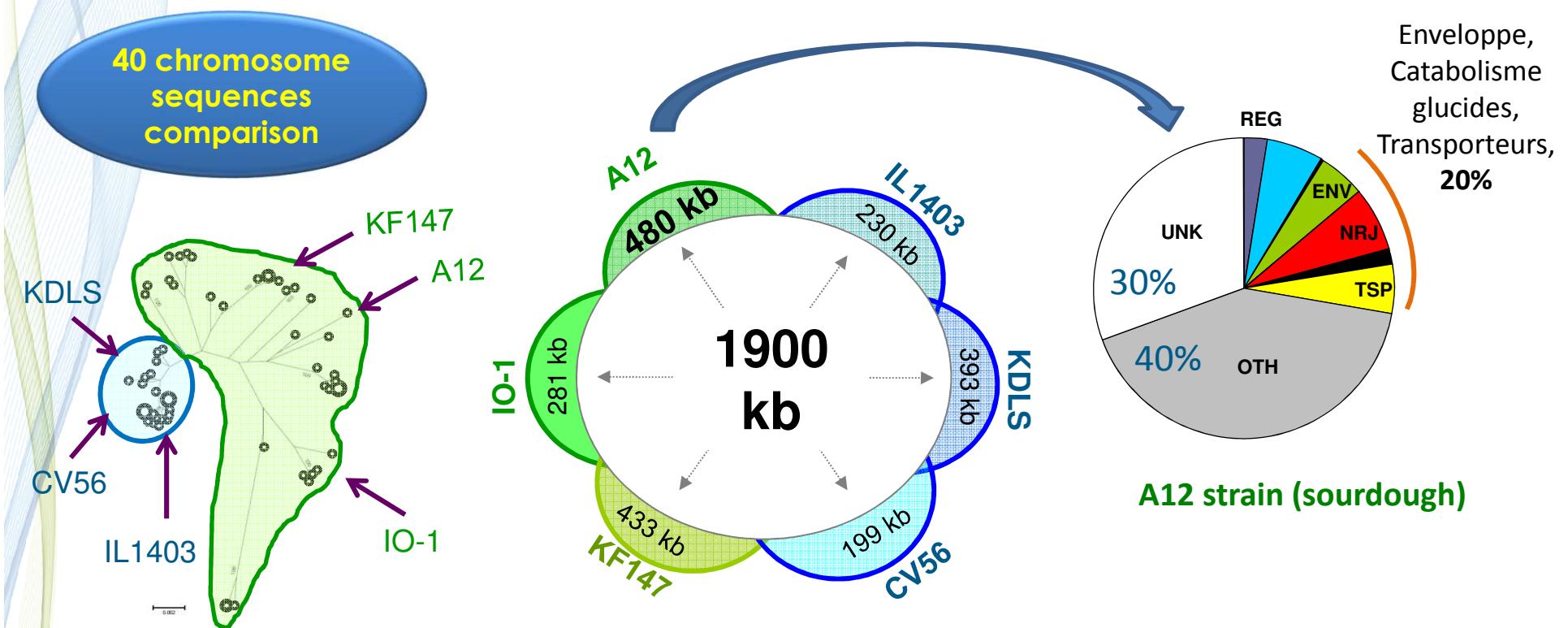
154 strains -> 70 ST  
*L. lactis* subsp. *lactis*

Passerini et al., Plos One 2010

- Environmental strains
  - high genetic diversity
  - plants, animals, raw milk
- Domesticated strains
  - low genetic diversity
  - industrial processes (starters, cheeses)



# Genomic diversity of *L. lactis* subsp *lactis* strains

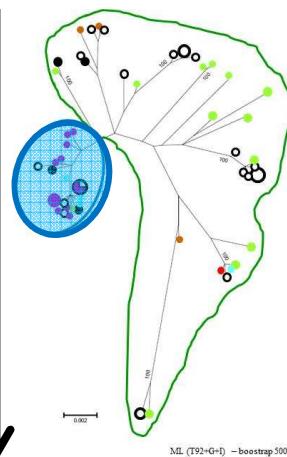


- « Strain-specific » genomic content (200 to 480 kb)
- **A12 strain = 20% of genes related to sugar transport /catabolism**  
Efficient metabolism of plant sugars (i.e., raffinose) → adaptation to sourdough

(Passerini et al., AEM 2013)

# Functional diversity of *L. lactis* subsp *lactis* strains

Six “domesticated” strains



Cultivated as a model Cheese

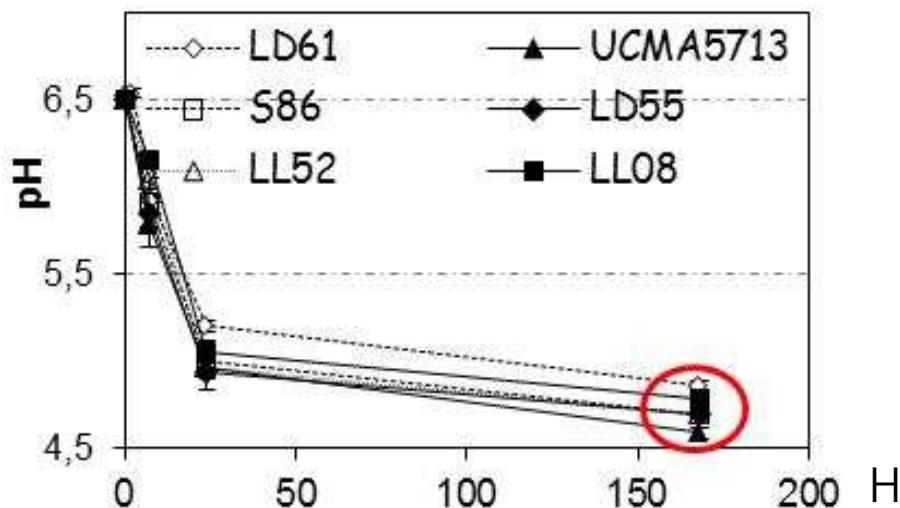


Ultra-filtered cheese

Six different phenotypes:  
pH of the cheese at 7 days varies from 4.1 to 4.6

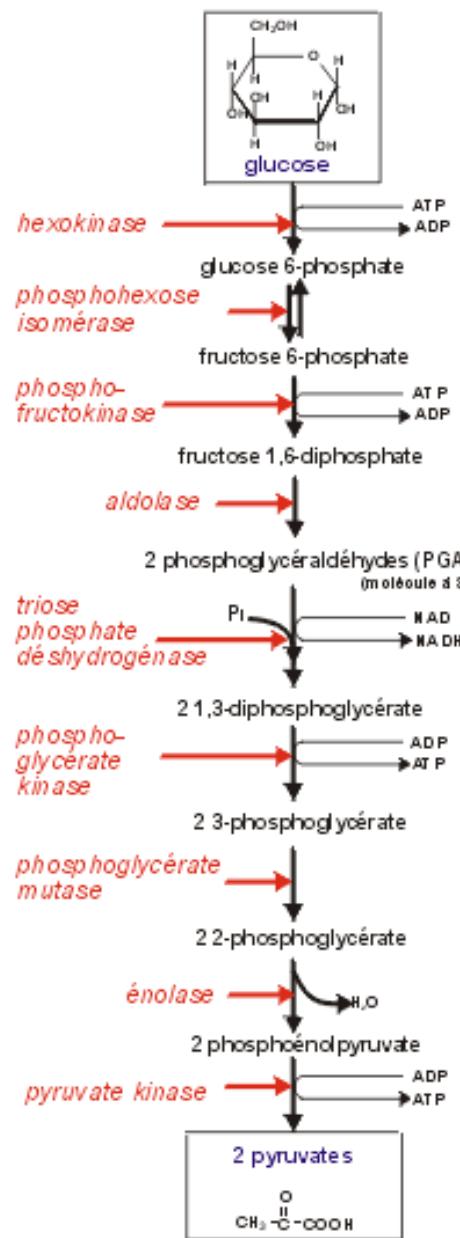


Significant differences in properties (texture, flavor) and bacterial viability



Tan-a-Ram et al., AEM 2011

# Metabolic and energetic analysis of *L. lactis* subsp *lactis* strains



## Metabolic analysis:

- enzyme activities all along the culture
- In vivo enzyme characterization : effect of external factors (pH, T°C, cofactors...)
  - Kinetic analysis of these factors
- In vivo carbon flux measurement

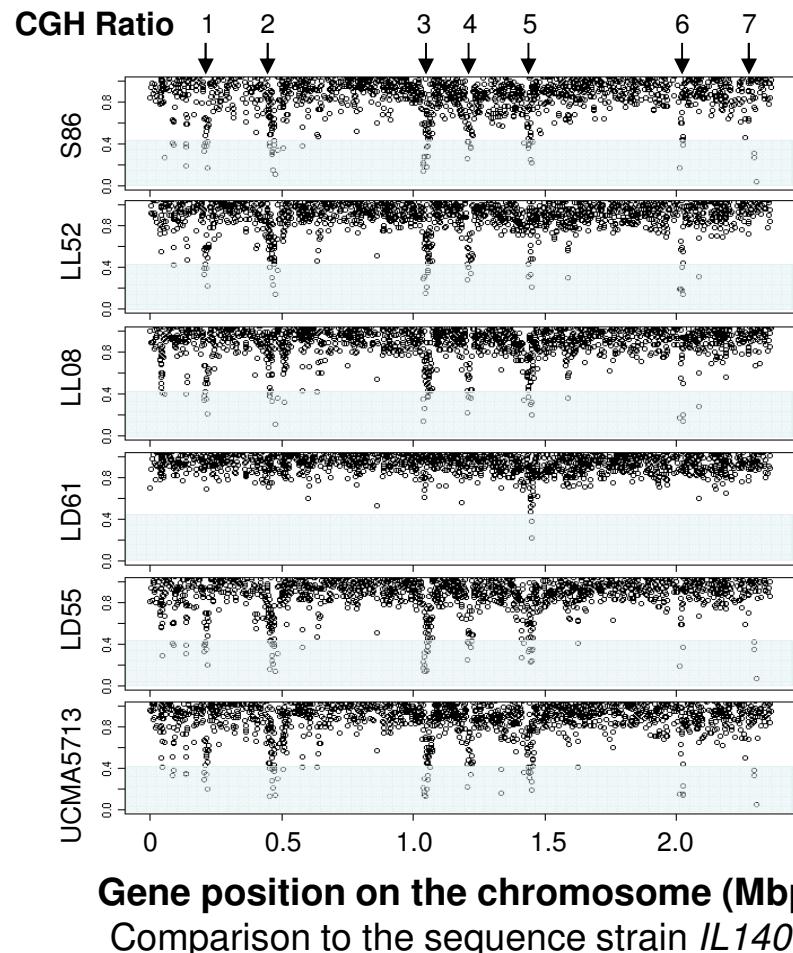


Modelisation of glycolysis in the culture, during growth, at growth arrest, and at post-acidification arrest

= identification of limiting enzymes, inhibited by low pH (PFK, PK)

# Functional diversity of *L. lactis* subsp *lactis* strains

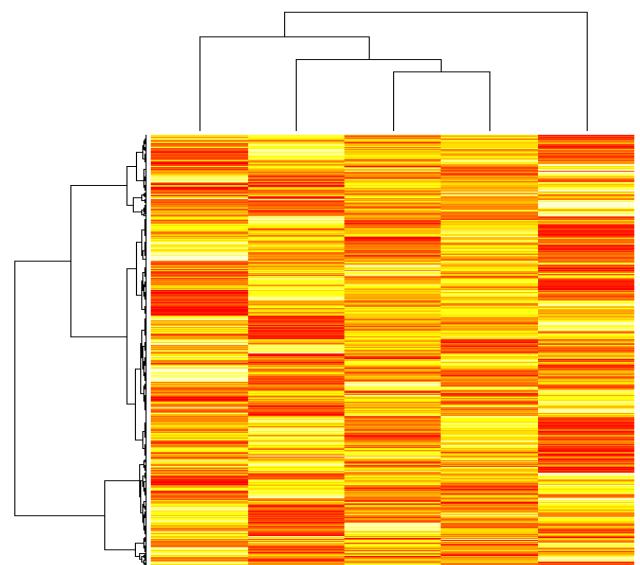
Core genome of 1915 genes  
between the 6 strains.  
Few genetic differences by CGH



Tan-a-Ram et al., AEM 2011

## Dynamic transcriptome of *L. lactis*

Wide expression changes in the core genome,  
between 250 and 600 genes differentially  
expressed vs LD61



Differential expression in:  
Response to acidic or oxidative stress,  
Carbon limitation,  
Carriers,  
Some metabolic features (cit, arg, glu, ATPase...)

# Functional analysis of *L. lactis* subsp *lactis* strain

## Kinetic transcriptome of *L. lactis* LD61 in UF-cheese

| Genes involved  | Positive | Negative |  |
|---|----------|----------|--|
| <b>Growth rate response</b><br><i>rplB,M,Q,U,V rpmGB,J rpsA,B,C,J,K,L,N,N2</i>                                |          |          |  |
| <b>General stress response</b><br><i>clpE, clpP, groES, hrcA-grpE-dnaK regulon, ytgH</i>                      |          |          |  |
| <b>Amino acid starvation response</b><br><i>oppA,B,C,D,F optC,D,S pepO,N,C,XP, pepXP,O,N,C</i>                |          |          |  |
| <b>Acidic response</b><br><i>atpG,D, atpA,B,E,F,H arcC1 arcD1,D2</i>  |          |          |  |
| <b>Carbon starvation response</b><br><i>lacC,Z galM,K,T msmK rbsB celB ptbA ptcA,B,C,N,D scrK xylA bglA..</i> |          |          |  |

↓

**Growth arrest and stress**

**Moderate acidic stress**

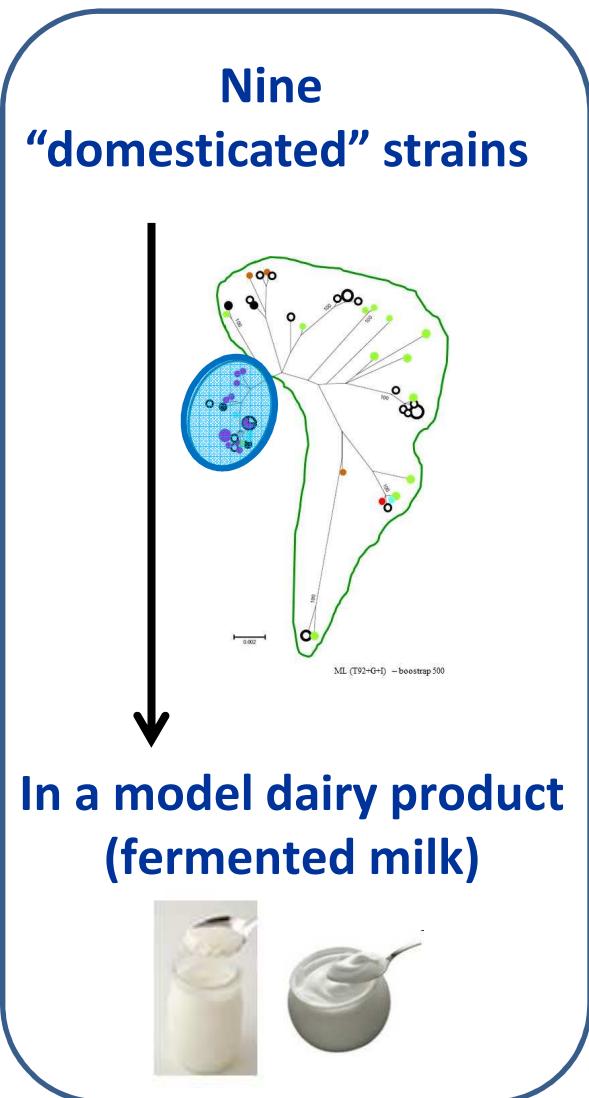
**Carbon limitation**



Low diffusion  
of lactose  
inside the cheese

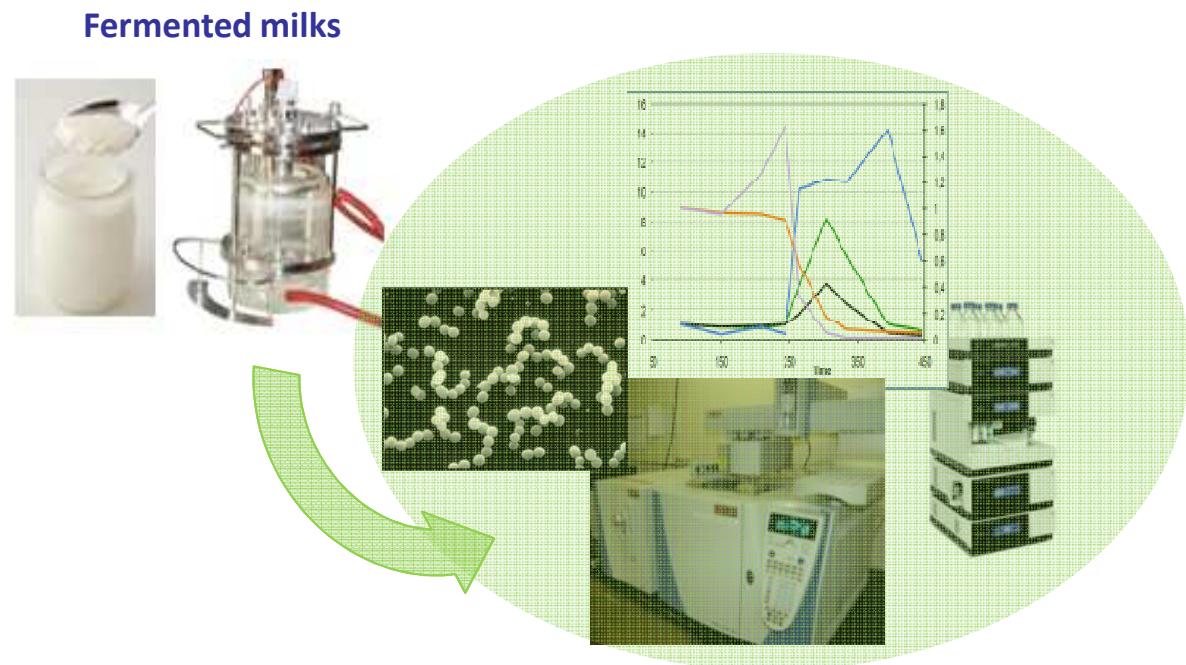
Laroute et al, AEM, 2011

# Functional diversity of *L. lactis* ssp *lactis* strains



Dhaisne et al., AEM, 2013

## Deep phenotype investigation of *L. lactis*



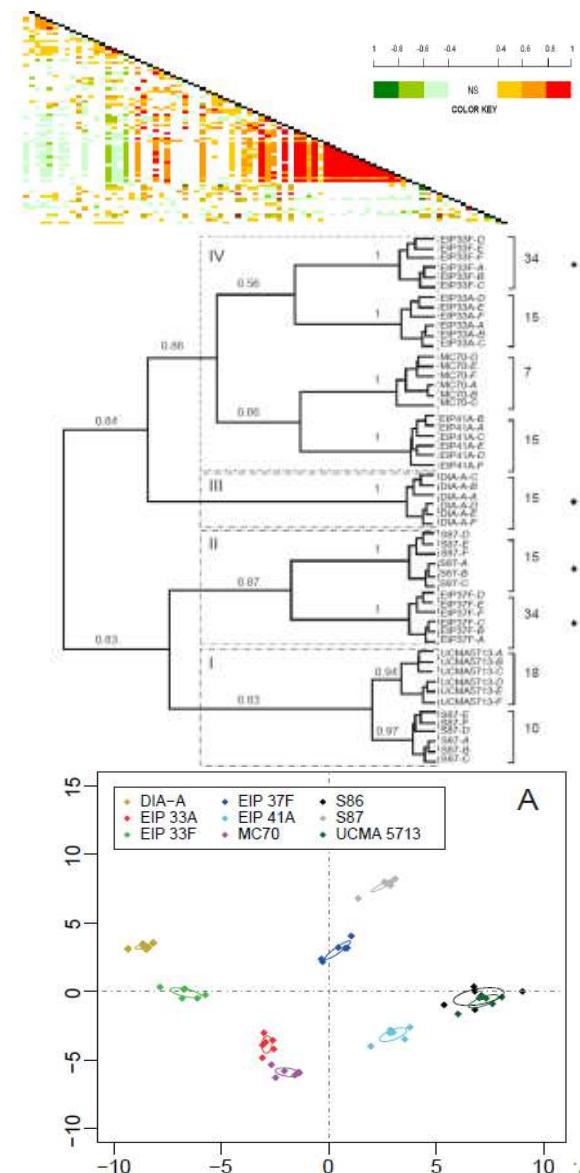
Physiological descriptors and metabolite concentrations  
in dynamic and at 14 Days

# Functional diversity of *L. lactis* ssp *lactis* strains

82 variables  
selected as important  
features in dynamic  
during 24h and at 14 Days

- Sugars,
- Organic acids  
(lactate, acetate, formate,  
acetaldehyde),
- Amino Acids ,
- 36 VOCs: Volatile Organic  
Compounds,
- Growth rate, acidity & redox  
activity

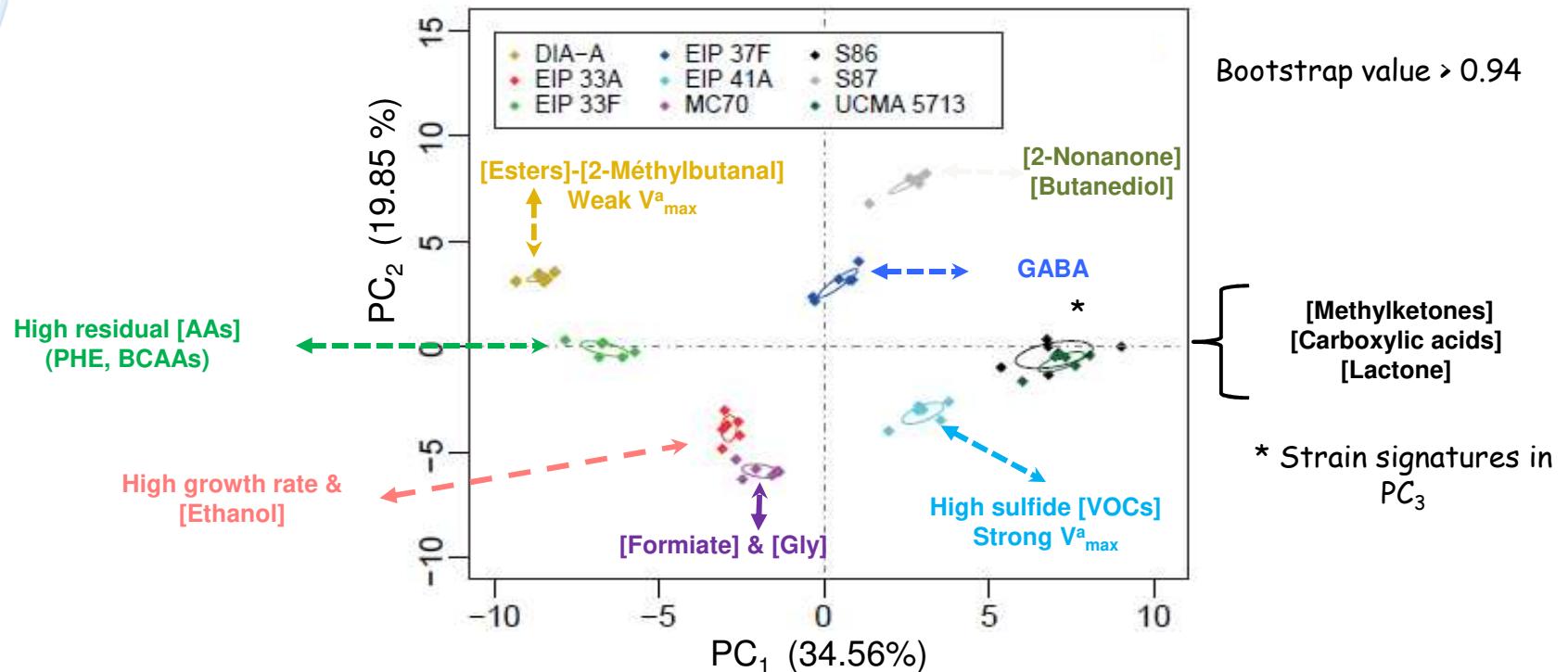
Statistical analysis  
**Unsupervised: PCA, HAC**  
**Supervised: PLS-DA,  
Random Forest**



# Functional diversity of *L. lactis* ssp *lactis* strains

Nine strains = nine signatures

→ Accurate strain identification



Principal Component Analysis of the 82 phenotypic variables.  
Ellipses show strain category at a 95% confidence level.

# Functional diversity of *L. lactis* ssp *lactis* strains

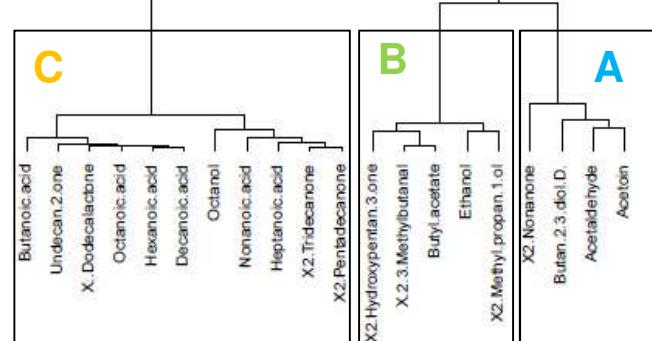
82 variables

Earn time & money:  
variable selection

20 variables

Variable clustering

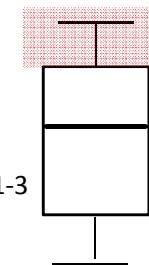
20 variables = 20 VOCs



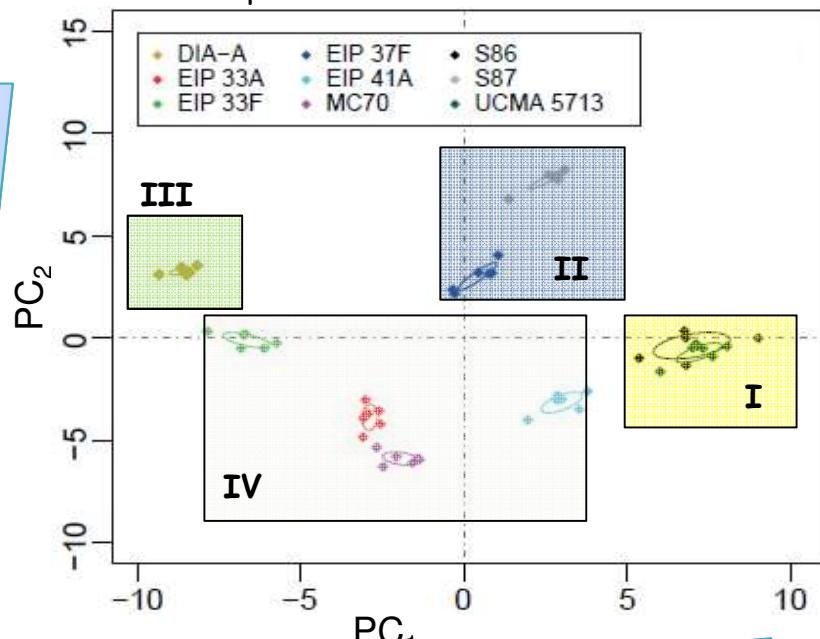
Lypolysis

Glycolysis  
Proteolysis

Variable selection :  
25% of the most  
con contributive variables on PC<sub>1-3</sub>



Bootstrap value > 0.86



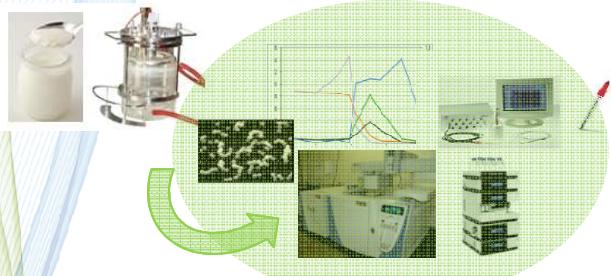
Four robust strain clusters

# Functional diversity of *L. lactis* ssp *lactis* strains

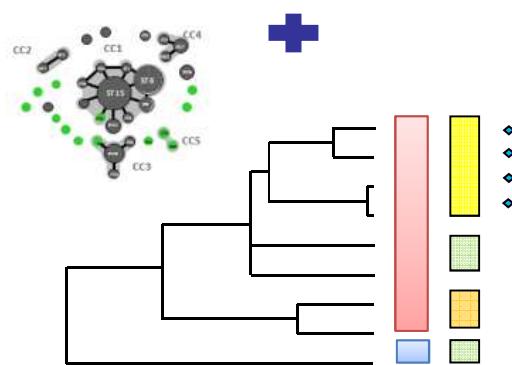
## Integration..... towards prediction

Dhaisne et al.  
AEM 2013

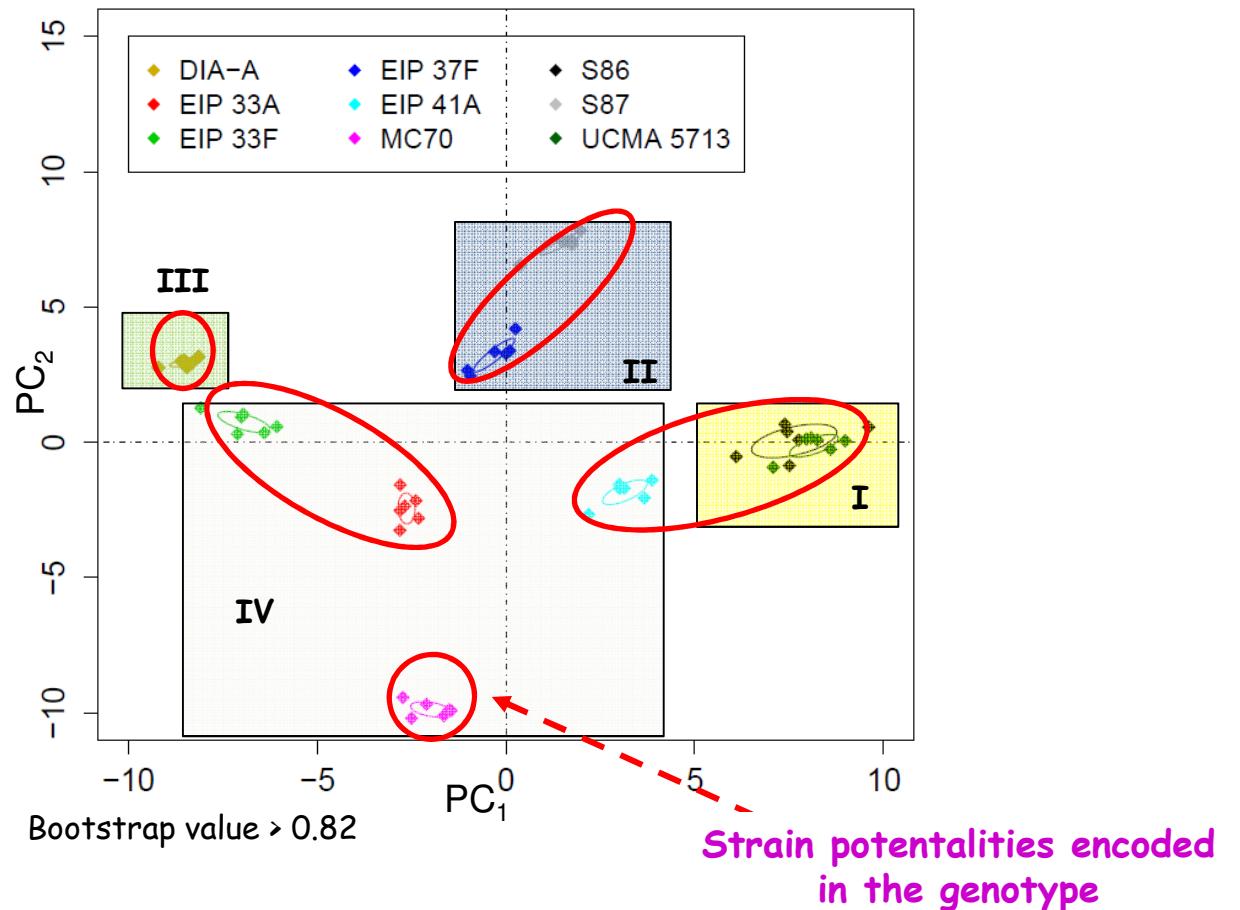
### Phenotype



### Genotype



Inclusion of genotypic diversity led to 5 rather than 4 clusters



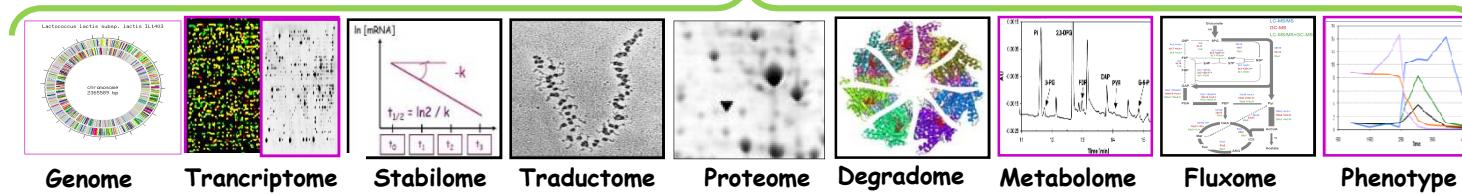
## Fermented Food product



Natural strain diversity  
and/or Starter addition

functional  
responses

Data



Tools

**INTEGRATION**

Real understanding of bacterial potentialities to  
strain/starter selection & phenotype prediction

# Acknowledgements

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### Génie du métabolisme des procaryotes

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Pascal Le Bourgeois



### Génétique des bactéries lactiques

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Michèle Coddeville  
Paul Ritzenhalar



Catherine Fontagné-Faucher  
Valérie Gabriel  
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Hélène Tormo  
Christel Couderc

## Methodological & analytical support



### Transcriptomics

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Lidwine Trouilh



### Metabolomics

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S Massou



Sébastien Déjean  
Philippe Besse



Valentin Loux



Gilles De Revel

