

Genotypic and pheno-metabolomic characterization of a *Saccharomyces cerevisiae* strain collection

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XXXIV WORLD CONGRESS
OF VINE AND WINE

"The Wine Construction"
20-27th June 2011 - Porto - Portugal

- 1 - Centre of Molecular and Environmental Biology (CBMA), Braga
- 2 – Institute for Biotechnology and Bioengineering (IBB), Braga
- 3 – Research Center for Agrucultural Technology, Azores
- 4 – Escola Superior de Biotecnologia, Porto
- 5 – Department of Chemistry & QOPNA, Aveiro



INTRODUCTION

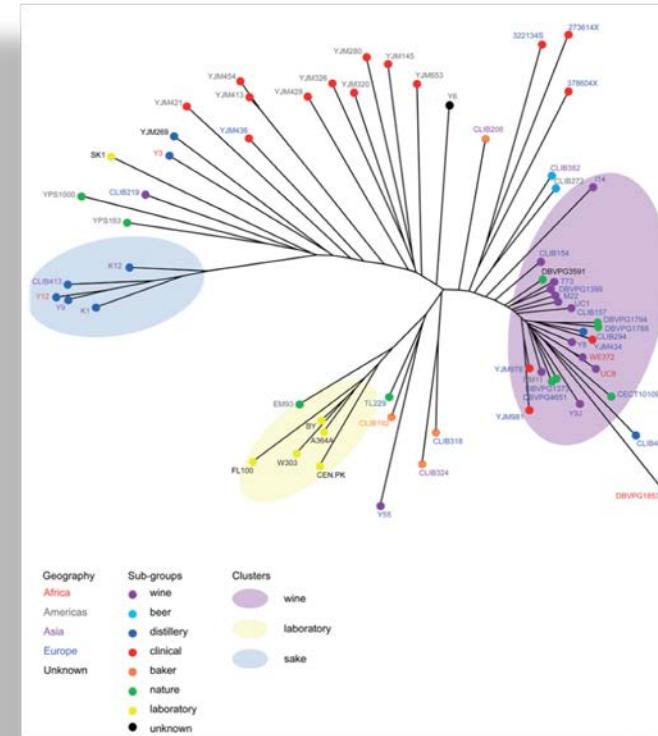
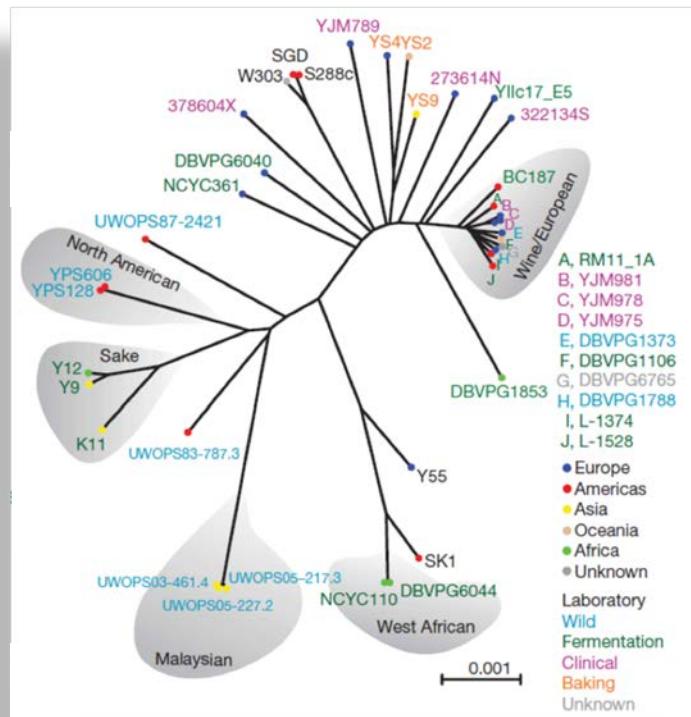
Saccharomyces cerevisiae:



- ❖ World's premier commercial microorganism for biotechnological applications
- ❖ Most of European wine producers use commercial starter yeasts to guarantee the reproducibility and the predictability of wine quality
- ❖ Winemaker has control over the microbiology of a fermentation containing starter cultures, and in these fermentations the inoculated yeast strain predominates and suppresses the indigenous flora

INTRODUCTION

The population structure of *S. cerevisiae*



few well-defined, geographically isolated lineages
many different mosaics of these lineages

INTRODUCTION

Franco-Duarte, et al., 2009

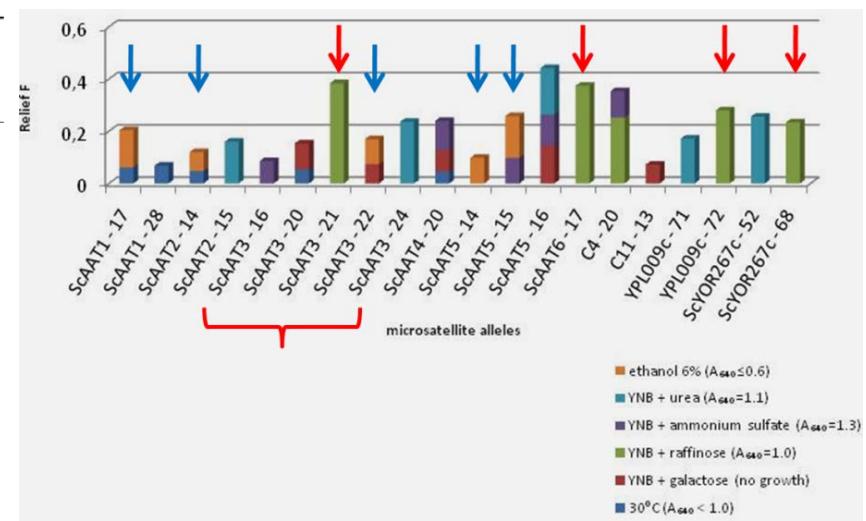
- ❖ Evaluation of phenotypic and genetic variability of *S. cerevisiae* strains from the Vinho Verde region using computational approaches

Strains / phenotypic tests	4 °C	4 °C
$A_{640}=0.1$	$A_{640}=0.1$	$A_{640}=0.1$
$A_{640}<1.0$	$A_{640}<1.0$	18°C
$A_{640}\geq 1.0$	30°C	30°C
$A_{640}\leq 0.2$	45°C	45°C
$A_{640}=0.1$	$YNB + galactose$	$YNB + galactose$
$A_{640}=0.1$	$YNB + galactose$	$YNB + galactose$
$A_{640}=0.8$	$YNB + maltose$	$YNB + maltose$
$A_{640}\geq 1.2$	$YNB + maltose$	$YNB + raffinose$
$0.5 \leq A_{640} \leq 0.6$	$YNB + raffinose$	$YNB + ammonium sulphate$
$A_{640}=1.0$	$YNB + raffinose$	$YNB + urea$
$A_{640}=1.3$	$YNB + ammonium sulphate$	$ethanol 6\%$
$A_{640}=1.1$	$YNB + urea$	$H_2S production$
$A_{640}\leq 0.6$		
classes 1, 2 and 3		

Modelling technique linear linear kNN tree kNN linear linear linear linear linear tree kNN linear linear linear linear linear tree

AUC 0.83 0.77 0.80 0.77 0.76 0.77 0.75 0.75 0.77 0.76 0.90 0.77 0.75 0.75 0.77 0.85 0.80 0.79 0.77 0.77 0.83

Percentage (%) 8.2 8.2 30.0 100 22.3 6.9 7.3 100 30.0 50.0 61.8 23.1 100 90.9 100 79.3 100 21.4



OBJECTIVES

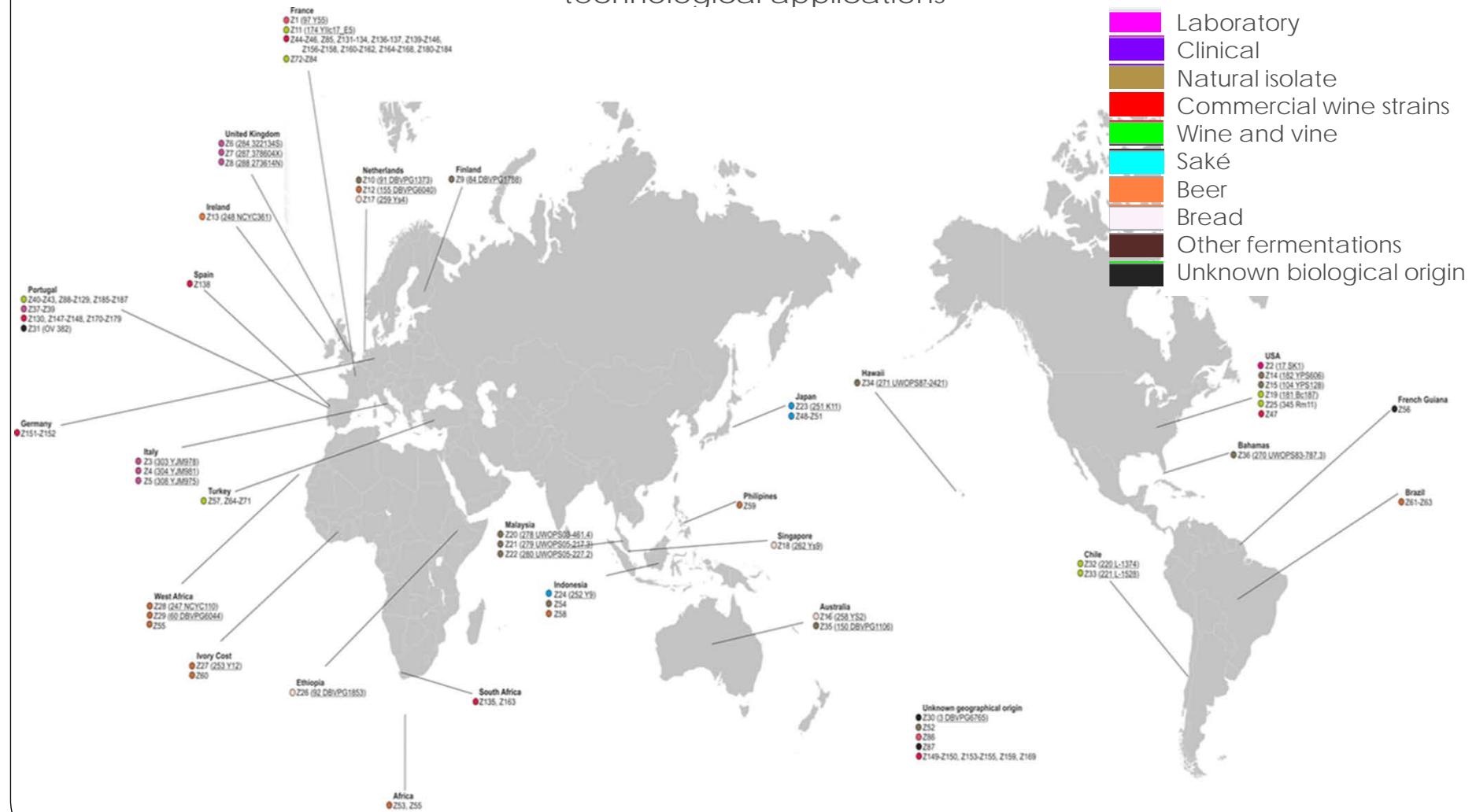
- ❖ To gain a deeper understanding of the phenotypic and genetic diversity of a *S. cerevisiae* strain collection

- ❖ To use high-throughput quantitative and qualitative methods in combination with bioanalytical data

MATERIAL & METHODS

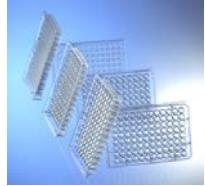
Strain collection

- ❖ *S. cerevisiae* collection comprising 187 strains with different geographical origins and technological applications



MATERIAL & METHODS

Phenotypic characterization



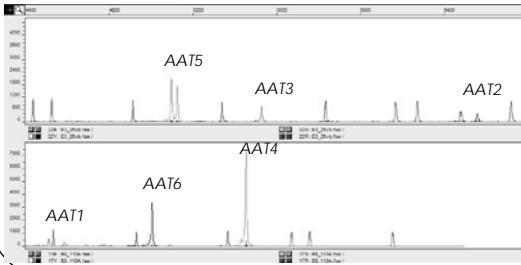
- Wine must + compound
- 30 °C
- 200 rpm
- quadruplicate

Phenotypes tested:

- Temperatures (18, 30 and 40°C)
- Tolerance to stress
 - pH values (2 and 8)
 - Osmotic/saline stress (KCl and NaCl)
 - Growth in finished wines supplemented with glucose
- Growth in the presence of
 - Potassium bisulfite
 - Copper sulfate
 - Sodium dodecyl sulphate
 - Iprodion
 - Procymidone
 - Cycloheximide

Genetic characterization

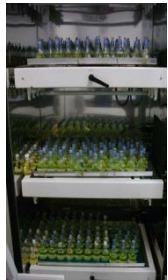
Microsatellite analysis



Microsatellite	Chromosome	Position/Gene	Repeat	Nº of alleles	Ref.
ScAAT1	XIII	86 901 - 87 129	ATT	29	Perez and Gallego, 2001
ScAAT2	II	CDC27	ATT	18	Legras et al., 2005
ScAAT3	IV	SSY1	ATT	19	
ScAAT4	VII	431 334 - 431 637	ATT	17	
ScAAT5	XVI	897 028 - 897 259	TAA	6	
ScAAT6	IX	105 661 - 105 926	TAA	10	
YPL009	XV	NFI1	TAA	13	
SCYOR267C	XV	HRK1	TGT	12	
C4	XV	110 701-110 935	TAA+TAG	9	
C5	VI	210250-210414	GT	19	
C11	X	518870-519072	GT	18	

MATERIAL & METHODS

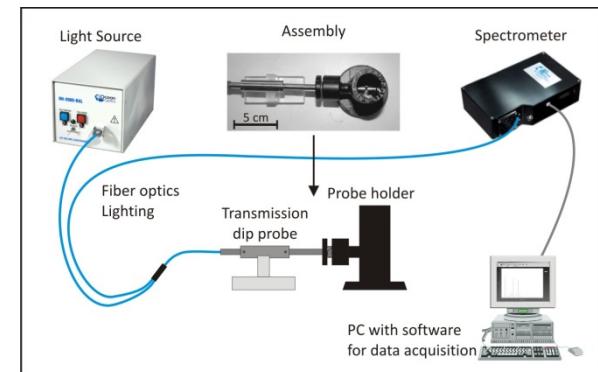
Must fermentations



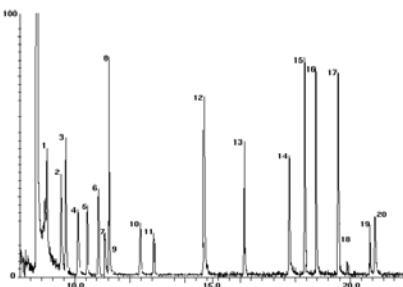
- Wine must
- 18 °C
- Weight loss determination due to CO₂ liberation
- Samples were withdrawn and frozen when a constant weight was recorded

Fiber optics spectroscopy

- Transmittance fiber optics UV-VIS-SWNIR spectroscopy (200 – 1200 nm)
 - Silva et al., 2008
 - Poster #



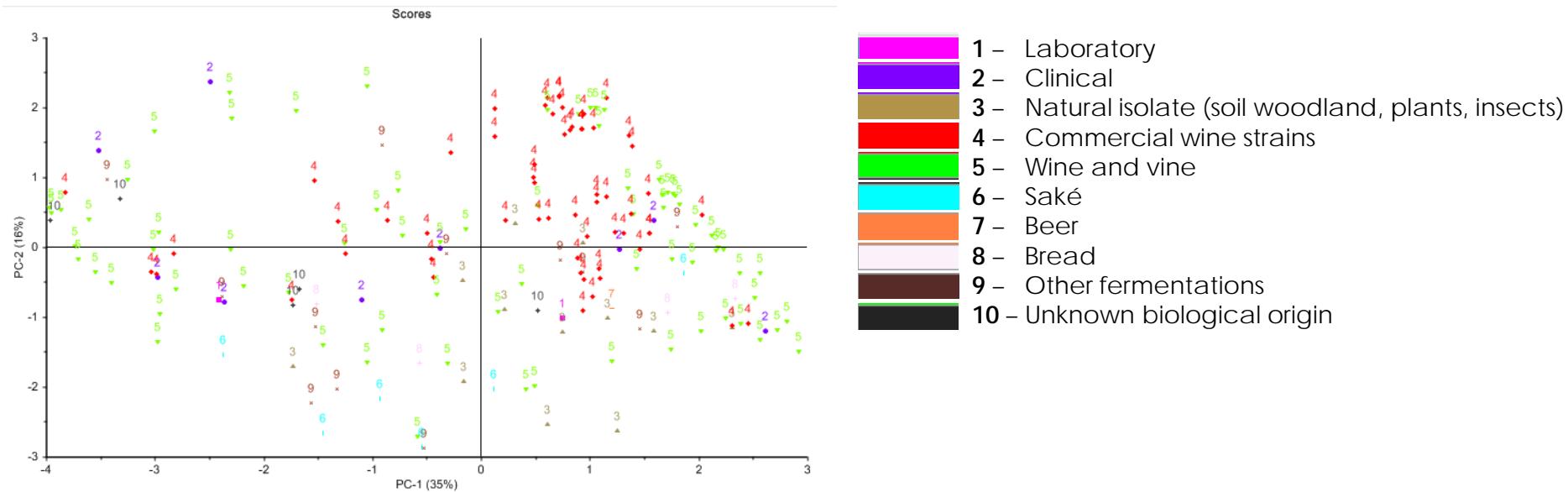
Bioanalytical analysis



- **HPLC-RI** to quantify fructose, glucose, ethanol, glycerol and organic acids (tartaric, malic, acetic, and succinic)
- **GC-MS** analysis performed by solid phase microextraction (SPME), and using 3-octanol as internal standard (Silva Ferreira et al., 2003)

RESULTS

Phenotypic characterization

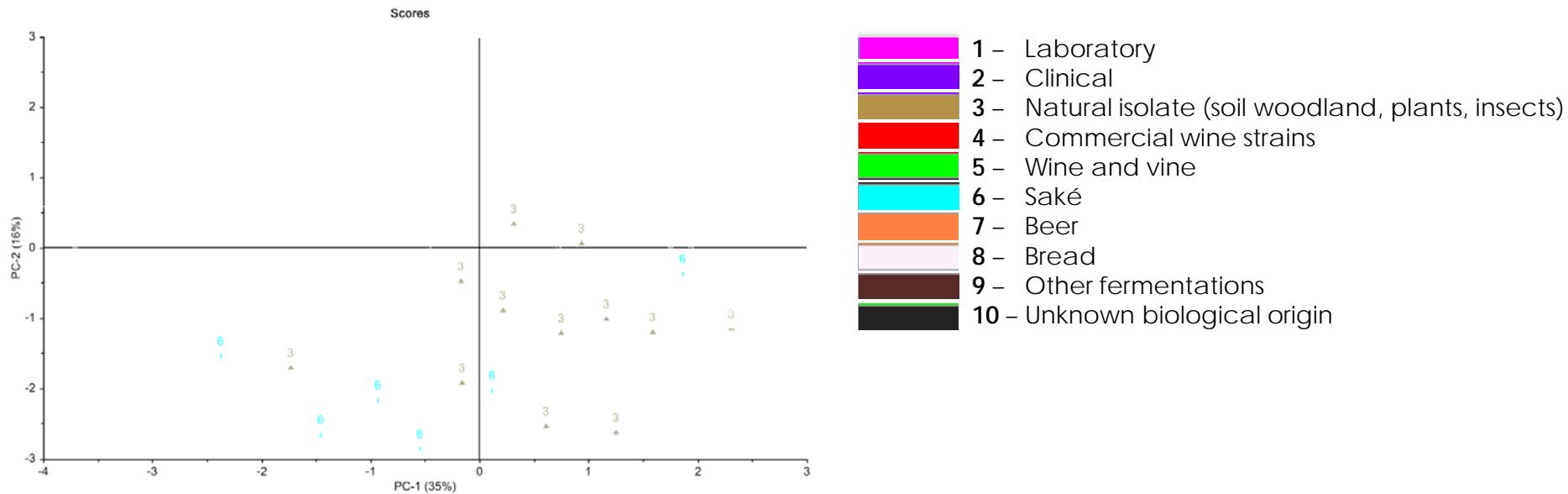


PCA analysis:

- segregation of strains in the first two components

RESULTS

Phenotypic characterization

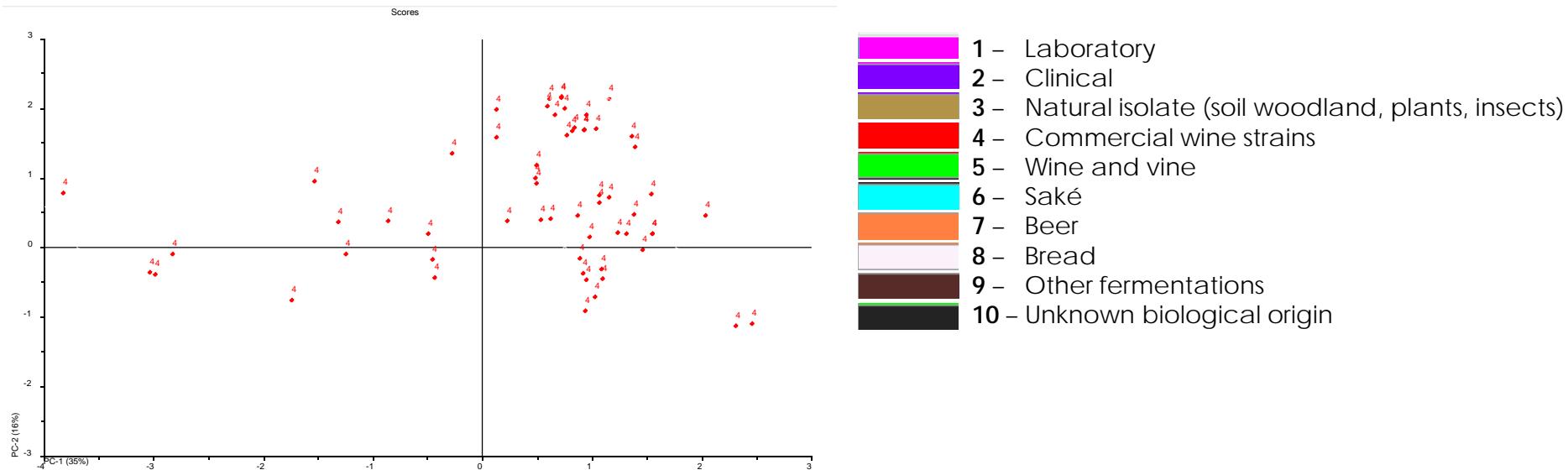


PCA analysis:

- natural isolates (3)
- saké (6)

RESULTS

Phenotypic characterization

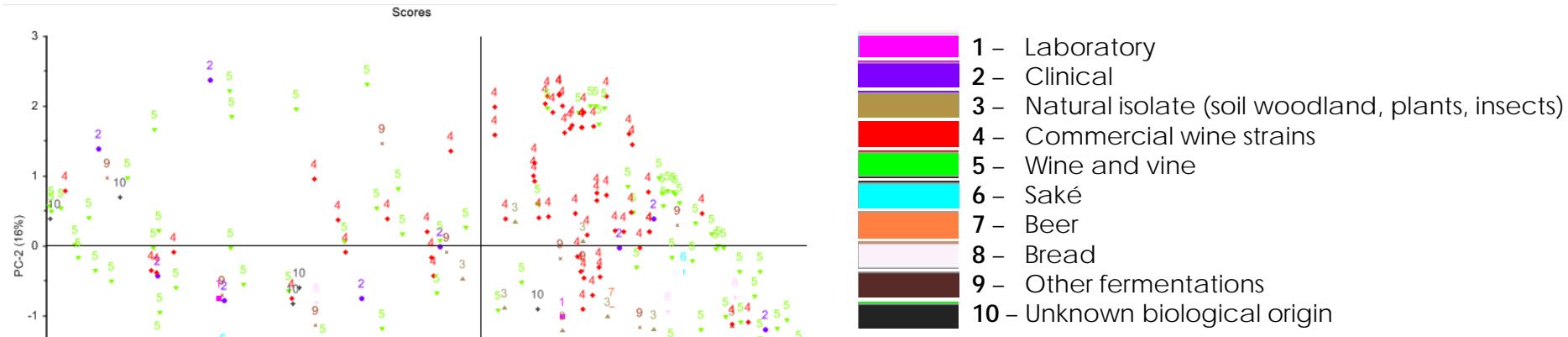


PCA analysis:

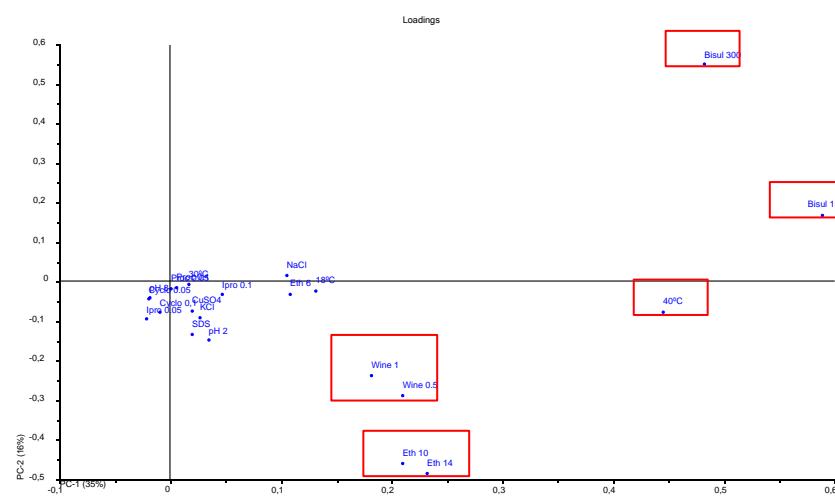
- commercial strains (4)

RESULTS

Phenotypic characterization



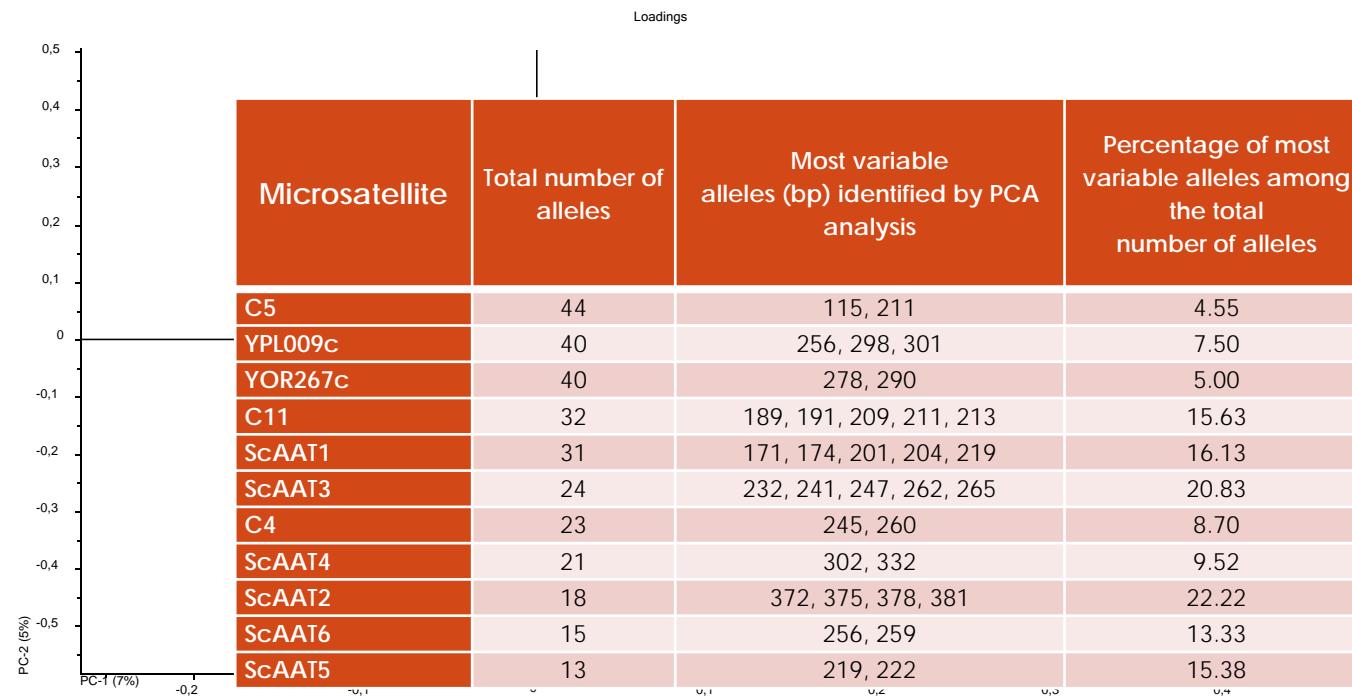
- Potassium bisulfite
 - 40 °C
 - Wine supplemented with glucose
 - Ethanol



RESULTS

Genetic characterization

11 microsatellites → 236 alleles

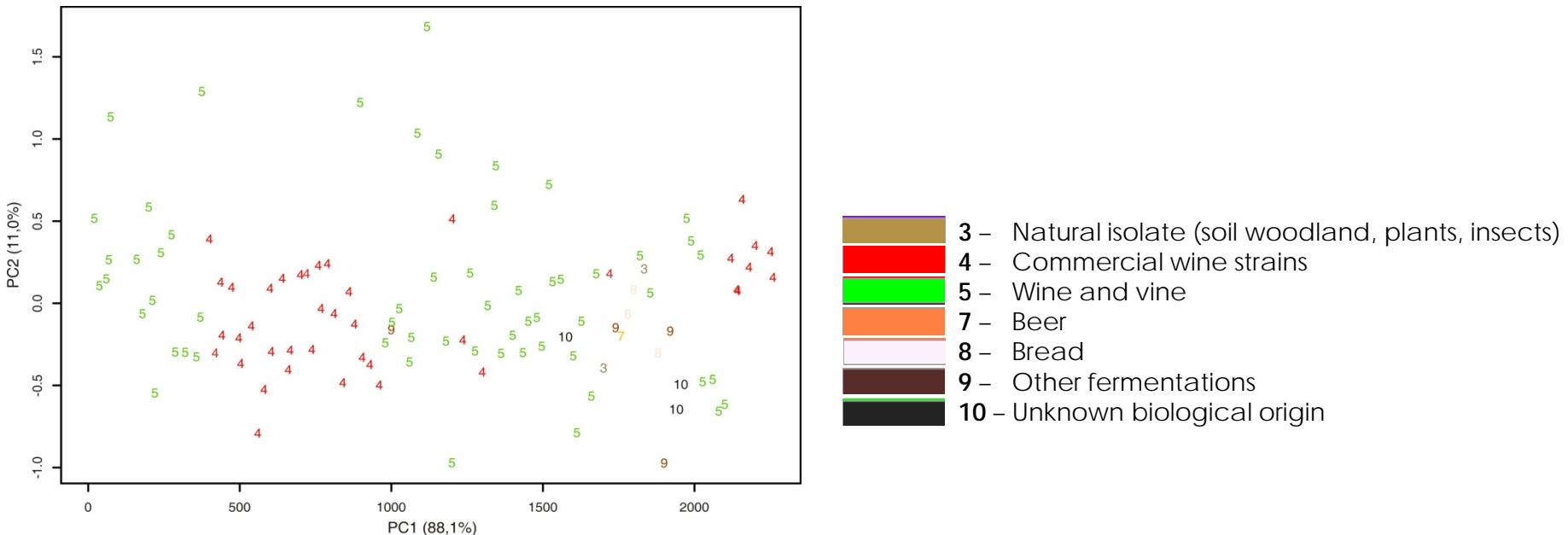


PCA analysis:

- **34 alleles**
 - significant variable between strains

RESULTS

Fiber optics spectroscopy



187 strains → 28 most heterogenous strains

fermentations
(3 replicates)

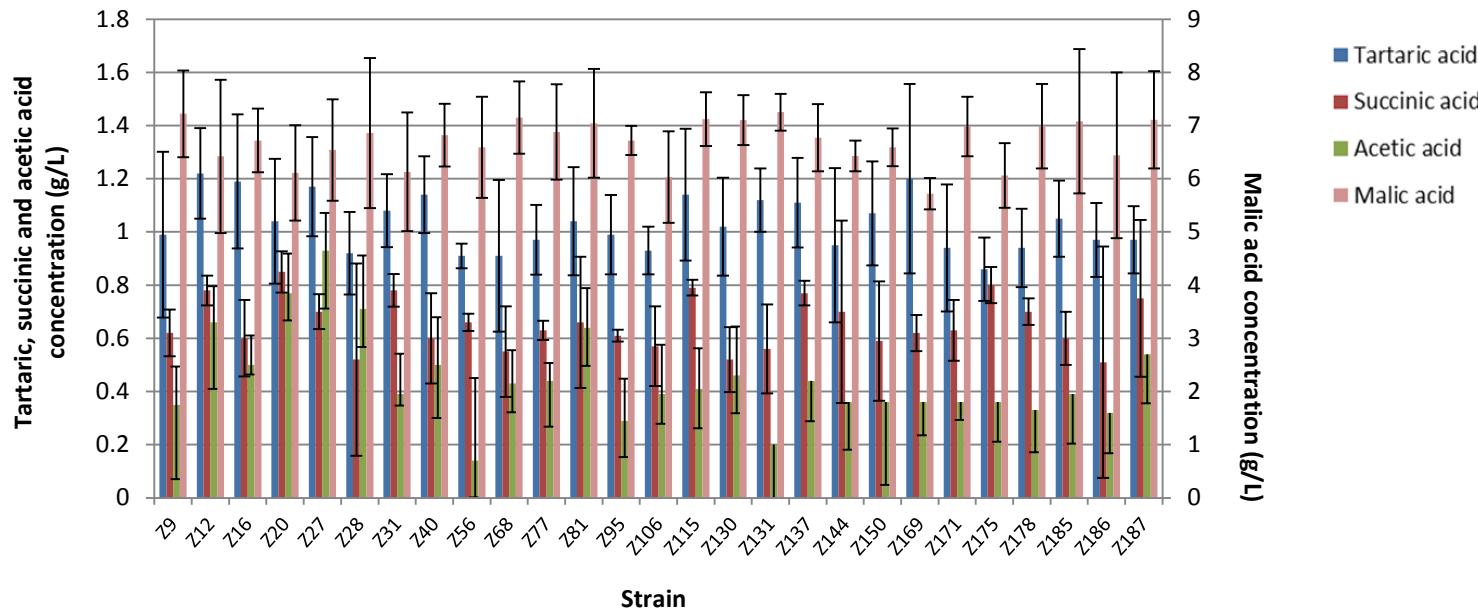
HPLC

GC-MS

RESULTS

HPLC analysis

- Strain-dependent differences were observed



Tartaric acid concentrations: 0.5 – 1.4 g/L

Succinic acid concentrations: 0.3 – 1.3 g/L

Acetic acid concentrations: 0 – 1.2 g/L

Malic acid concentrations: 4.7 – 8.2 g/L

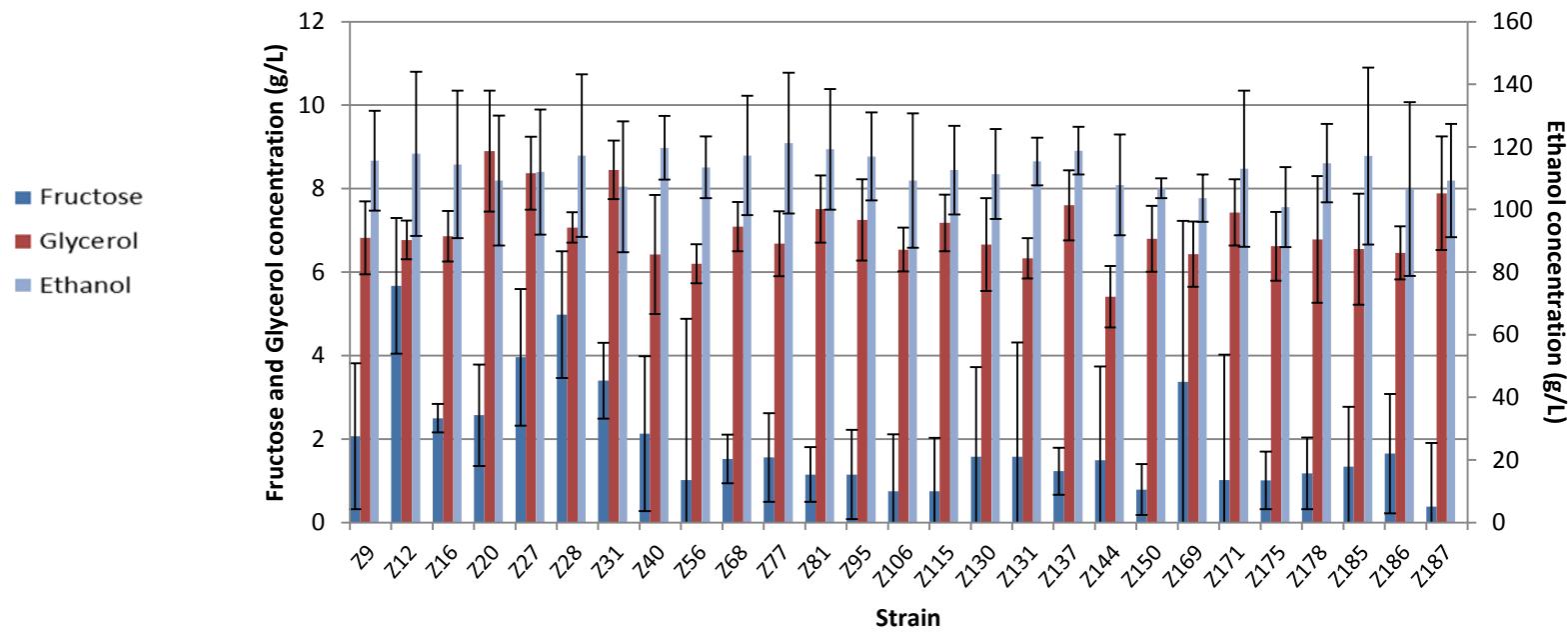
RESULTS

HPLC analysis

Fructose concentrations: 0 – 9 g/L

Glycerol concentrations: 5 – 9.75 g/L

Ethanol concentrations: 80 - 138 g/L



RESULTS

GC-MS analysis

Concentration of the quantified aromatic compounds

Compounds	Ethyl acetate	Isobutyl acetate	Ethyl butanoate	2-methyl-1-propanol	Isoamyl acetate	2-Methy-1-butanol	Ethyl hexanoate	Hexyl acetate	Ethyl lactate	1-Hexanol	cis-hex-3-en-1-ol	2-Phenylethyl acetate	2-Phenyl ethanol
Sensorial threshold µg L ⁻¹ (a) mg L ⁻¹ (b)	12.3 (b)	1.6 (b)	20 (a)	75 (b)	30 (a)	30 (b)	14 (a)	1 (b)	14 (b)	5.2 (b)	400 (a)	650 (a)	14 (b)
Odor description	Solvent, fruity, nail polish	Banana, sweet, fruity	Papaya, butter, sweet, apple, fragrant, fruity	alchool	Banana, apple, solvent	alcohol, banana, sweet, aromatic, cheese	apple, fruity, sweet, aniseed-flavored	sweet, aromatic, fragrant	Strawberry, raspberry	coconut, green leafs	green leafs, banana, sweet, herb	roses, honey, apple, sweet, floral	Roses, sweet, fragrant, flowery, honey-like
Z9	3970.4	1.8	<u>38.9</u>	666.1	<u>260.9</u>	128.9	0.5	14.9	nd	227.1	55.8	6.5	2820.1
Z12	3213.3	2.6	<u>38.2</u>	575.0	<u>266.6</u>	nd	0.6	16.2	nd	188.4	nd	nd	735.0
Z16	4390.1	1.7	<u>41.2</u>	473.9	<u>339.9</u>	nd	nd	11.9	nd	153.8	nd	nd	446.3
Z20	2600.4	nd	16.8	1754.7	<u>65.0</u>	nd	0.6	5.0	nd	181.7	34.4	1.6	965.7
Z27	714.0	nd	13.1	1178.0	27.0	nd	nd	3.4	nd	125.5	nd	6.7	799.2
Z28	2785.5	nd	15.5	337.4	<u>102.9</u>	nd	0.6	10.9	nd	181.4	36.2	1.9	614.9
Z31	3112.6	0.4	<u>24.0</u>	476.0	<u>98.1</u>	nd	0.6	6.8	735.9	135.8	27.4	0.9	810.8
Z40	2614.4	0.8	16.0	789.3	<u>67.4</u>	nd	0.5	10.6	nd	177.1	37.9	nd	606.7
Z63	2430.9	nd	16.6	840.9	24.9	nd	0.7	5.9	nd	209.4	nd	nd	414.6
Z77	3699.9	2.2	<u>43.3</u>	920.9	<u>306.3</u>	nd	0.6	13.0	889.0	105.4	29.2	3.6	555.6
Z81	1583.1	nd	7.4	1086.1	13.2	nd	0.5	2.5	952.0	111.3	34.1	nd	nd
Z89	2008.7	0.9	10.8	284.1	<u>54.9</u>	nd	0.5	10.0	nd	143.0	30.6	1.2	194.9
Z95	2534.8	0.7	<u>23.5</u>	218.9	<u>44.3</u>	96.3	0.5	8.8	nd	150.8	33.7	nd	560.1
Z103	2231.2	nd	<u>29.1</u>	354.7	<u>152.5</u>	nd	0.5	18.3	nd	154.0	33.7	5.2	773.4
Z115	3565.2	2.5	<u>32.3</u>	401.8	<u>242.2</u>	nd	0.6	21.2	nd	192.0	37.1	2.4	454.2
Z127	2949.4	nd	<u>26.4</u>	329.2	<u>154.9</u>	nd	nd	10.3	nd	177.4	34.0	nd	605.1
Z131	nd	2.3	<u>34.7</u>	1790.4	<u>256.9</u>	nd	0.6	15.4	nd	163.8	nd	2.3	897.9
Z137	1462.6	nd	9.7	744.4	<u>44.8</u>	nd	0.6	8.8	1395.0	146.9	36.2	1.7	850.8
Z169	6381.6	1.0	<u>26.6</u>	526.2	<u>105.9</u>	nd	0.7	11.6	1919.6	185.7	36.7	1.1	650.0
Z171	732.3	0.2	6.6	549.3	12.7	nd	0.6	3.5	nd	123.3	31.2	nd	595.8
Z178	1747.6	nd	14.3	467.9	<u>102.9</u>	nd	0.6	12.6	1353.2	127.4	31.8	1.8	909.2
Z185	1097.5	1.2	11.4	609.8	<u>107.8</u>	nd	0.7	12.4	196.9	186.3	37.2	1.5	668.3
Z186	646.5	0.6	9.1	121.0	<u>80.3</u>	nd	0.6	12.9	401.3	151.4	30.8	1.0	364.9
Z187	1821.1	nd	11.5	214.8	<u>106.0</u>	nd	nd	15.5	nd	171.6	nd	nd	502.4
non-fermented must	nd	nd	nd	nd	nd	48.6	0.6	nd	nd	97.8	43.0	nd	nd

nd - below detection limits

RESULTS

GC-MS analysis

- Compounds above sensorial threshold

- Ethyl butanoate (24.0 – 43.3 µg/L)
- Isoamyl acetate (44.3 – 339.9 µg/L)

Compounds			Ethyl butanoate		Isoamyl acetate								
Sensorial threshold µg L ⁻¹ (a) mg L ⁻¹ (b)	12.3 (b) 8	1.6 (b) 8	20 (a)	75 (b) 5	30 (a)	30 (b) 5	14 (b) 5	1 (b) 1	14 (b) 5	5.2 (b) 5	400 (b) 5	650 (b) 5	14 (b) 5
Odor description	Solvent, fruity, nail polish ^{1,2,3}	Banana, sweet, fruity ^{1,2}	Papaya, butter, sweet, apple, fragrant, fruity	alchohol ^{1,8}	Banana, apple, solvent	alcohol, banana, sweet, aromatic, cheese ^{1,5,7}	apple, fruity, sweet, aniseed- flavored ^{1,6}	sweet, aromatic, fragrant ^{1,8}	Strawberry, raspberry ^{1,2,9}	coconut, green leefs ^{1,9,10}	green leafs, banana, sweet, herb ^{1,4,5,11}	roses, honey, apple, sweet, floral ^{1,5,9}	Roses, sweet, fragrant, flowery, honey-like ^{1,2,4,5,6,12}
Z9	3970.4	1.8	38.9	665.1	260.9	28.7	0.5	1.9	nd	227.1	55.8	6.5	2820.1
Z12	3213.3	2.6	38.2	575.0	266.6	nd	0.6	16.2	nd	188.4	nd	nd	735.0
Z16	1390.1	1.7	41.2	473.7	339.9	nd	nd	11.9	nd	154.3	nd	nd	436.3
Z20	2600.4	nd	16.8	1754.7	65.0	nd	0.6	5.0	nd	181.7	34.4	1.6	965.7
Z27	714.0	nd	13.1	1128.0	27.0	nd	nd	3.4	nd	125.5	nd	6.7	799.2
Z28	2785.5	nd	15.5	337.4	102.9	nd	0.6	10.9	nd	181.4	36.2	1.9	614.9
Z31	3112.6	0.4	24.0	476.0	98.1	nd	0.6	6.8	735.9	135.8	27.4	0.9	810.8
Z40	2614.4	0.8	16.0	789.3	67.4	nd	0.5	10.6	nd	177.1	37.9	nd	606.7
Z63	2430.9	nd	16.6	840.3	24.9	nd	0.7	5.9	nd	209.4	nd	nd	414.6
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Z81	1583.1	nd	7.4	1086.1	13.2	nd	0.5	2.5	952.0	111.1	34.1	nd	nd
Z89	2008.7	0.9	10.8	284.1	54.9	nd	0.5	10.0	nd	143.0	30.6	1.2	194.9
Z95	2534.8	0.7	23.5	218.2	44.3	96.3	0.5	8.8	nd	150.0	33.7	nd	560.1
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Z115	1565.2	2.5	32.3	401.7	242.2	nd	0.6	21.2	nd	102.0	32.1	2.4	454.2
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Z131	nd	2.0	34.7	1750.1	256.9	nd	0.6	15.4	nd	103.0	10.0	2.0	897.7
Z137	1462.6	nd	9.7	744.4	44.8	nd	0.6	8.8	1395.0	146.9	36.2	1.7	850.8
Z169	6361.6	1.0	26.6	926.7	105.9	nd	0.7	11.6	1919.6	185.7	36.7	1.1	650.0
Z171	732.3	0.2	6.6	549.3	12.7	nd	0.6	3.5	nd	123.3	31.2	nd	595.8
Z178	1747.6	nd	14.3	467.7	102.9	nd	0.6	12.6	1383.2	127.1	31.8	1.8	909.2
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Z186	646.5	0.6	9.1	121.0	80.3	nd	0.6	12.9	401.3	151.4	30.8	1.0	364.9
Z187	1821.1	nd	11.5	214.8	106.0	nd	nd	15.5	nd	171.6	nd	nd	502.4
non-fermented must	nd	nd	nd	nd	nd	18.6	0.6	nd	nd	97.9	42.0	nd	nd

nd – below detection limits

RESULTS

GC-MS analysis

- Large variance between strains

- Isobutyl acetate (nd – 2.5 mg/L)
- 2-methyl-1-propanol (284.1 – 1790.4 mg/L)
 - Ethyl lactate (nd – 1919.6 mg/L)
 - 2-phenylethyl acetate (nd – 6.7 µg/L)

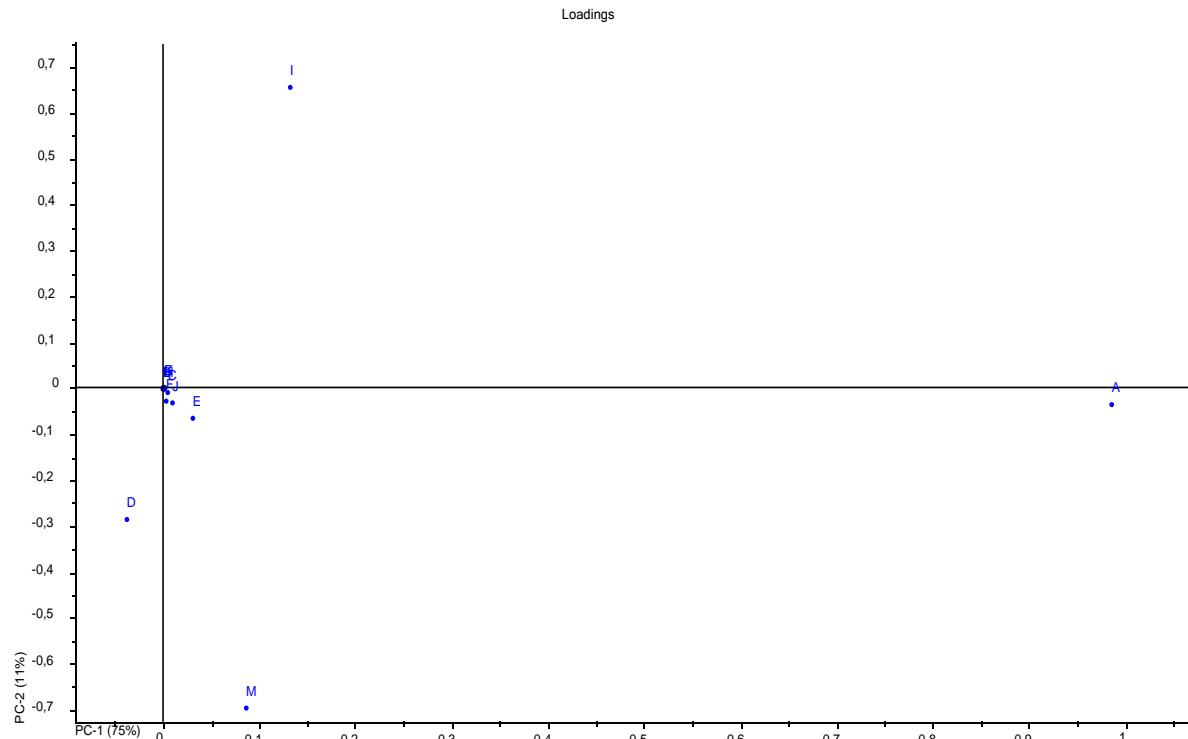
Compounds		Isobutyl acetate		2-methyl-1-propanol					Ethyl lactate			2-phenylethyl acetate	
Sensorial threshold µg L ⁻¹ (a) mg L ⁻¹ (b)	12.3 ¹⁰⁻³	1.6 ^(b) &	20 ¹⁰⁻³	75 ^(b) \$	30 ¹⁰⁻³	30 ¹⁰⁻³	14 ¹⁰⁻³	1 ¹⁰⁻³	14 ^(b) \$	5.2 ¹⁰⁻³	400 ¹⁰⁻³	650 ^(a) \$	14 ¹⁰⁻³
Odor description	Solvent, fruity, nail polish ^{1,2,3}	Banana, sweet, fruity	Papaya, butter, sweet, apple, fragrant, fruity ^{1,4,5,2,6}	alchool	Banana, apple, solvent ^{1,2,4,5}	alcohol, banana, sweet, aromatic, cheese ^{1,5,7}	apple, fruity, sweet, aniseed- flavored ^{1,8}	sweet, aromatic, fragrant ^{1,8}	Strawberry, raspberry	coconut, green leefs ^{1,9,10}	green leafs, banana, sweet, herb ^{1,4,5,11}	roses, honey, apple, sweet, floral	Roses, sweet, fragrant, flowery, honey-like ^{1,2,4,5,6,12}
Z9	3970.4	1.8	48.9	666.1	460.9	128.9	0.5	14.9	nd	227.1	95.8	6.5	2620.1
Z12	3213.3	2.6	38.2	575.0	266.6	nd	0.6	16.2	nd	188.4	nd	nd	735.0
Z16	4290.1	1.7	41.2	473.9	439.9	nd	nd	11.9	nd	153.8	nd	nd	448.3
Z20	2600.4	nd	16.8	1754.7	65.0	nd	0.6	5.0	nd	181.7	34.4	1.6	965.7
Z27	714.0	nd	13.1	1178.0	77.0	nd	nd	3.4	nd	125.5	nd	6.7	799.2
Z28	2785.5	nd	15.5	337.4	102.9	nd	0.6	10.9	nd	181.4	36.2	1.9	614.9
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Z63	2430.9	nd	16.8	840.9	24.9	nd	0.7	5.9	nd	209.4	nd	nd	414.6
Z77	3699.9	2.2	43.3	920.9	306.3	nd	0.6	13.0	889.0	105.4	29.2	3.6	555.6
Z81	1583.1	nd	7.4	1086.1	13.2	nd	0.5	2.5	952.0	111.3	34.1	nd	nd
Z89	2008.7	0.9	10.8	284.1	54.9	nd	0.5	10.0	nd	143.0	30.6	1.2	194.9
Z95	2534.8	0.7	23.5	218.9	44.3	96.1	0.5	8.8	nd	150.8	43.7	nd	560.1
Z103	2231.2	nd	29.1	354.7	152.5	nd	0.5	18.3	nd	154.0	33.7	5.2	773.4
Z115	2565.2	2.5	12.3	401.8	141.2	nd	0.6	21.2	nd	192.0	47.1	2.4	454.2
Z127	2949.4	nd	26.4	329.2	154.9	nd	nd	10.3	nd	177.4	34.0	nd	605.1
Z131	1744.7	2.3	35.1	1790.4	260.5	nd	0.6	15.4	nd	160.0	nd	2.3	897.5
Z137	1462.6	nd	9.7	744.4	44.8	nd	0.6	8.8	1395.0	146.9	36.2	1.7	850.8
Z169	6381.6	1.0	20.0	526.2	104.3	nd	0.7	11.6	1919.6	105.7	36.7	1.1	650.0
Z171	732.3	0.2	6.6	549.3	12.7	nd	0.6	3.5	nd	123.3	31.2	nd	595.8
Z178	1747.6	nd	14.3	467.9	102.9	nd	0.6	12.6	1353.2	127.4	31.8	1.8	909.2
Z185	1097.5	1.2	11.4	609.8	107.8	nd	0.7	12.4	196.9	186.3	37.2	1.5	668.3
Z186	646.5	0.6	9.1	121.0	80.3	nd	0.6	12.9	401.3	151.4	30.8	1.0	364.9
Z187	1821.1	nd	11.5	214.8	106.0	nd	nd	15.5	nd	171.6	nd	nd	502.4
non-fermented must	nd	nd	nd	nd	nd	nd	0.6	nd	nd	91.9	43.0	nd	nd

nd – below detection limits

RESULTS

GC-MS analysis

PCA analysis

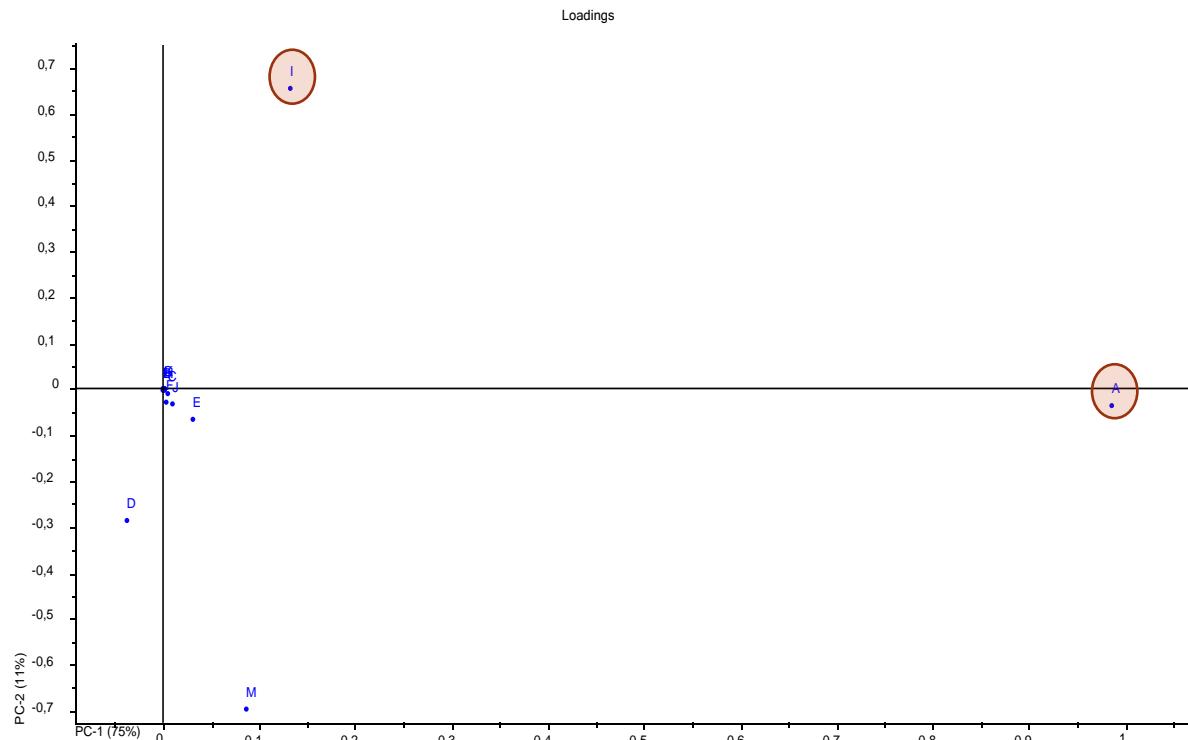


- A - ethyl acetate
- B - isobutyl acetate
- C - ethyl butanoate
- D - 2-methyl-1-propanol
- E - isoamyl acetate
- F - 2-methyl-1-butanol
- G - ethyl hexanoate
- H - hexyl acetate
- I - ethyl lactate
- J - 1-hexanol
- K - cis-hex-3-en-1-ol
- L - 2-phenylethyl acetate
- M - 2-phenylethanol

RESULTS

GC-MS analysis

PCA analysis

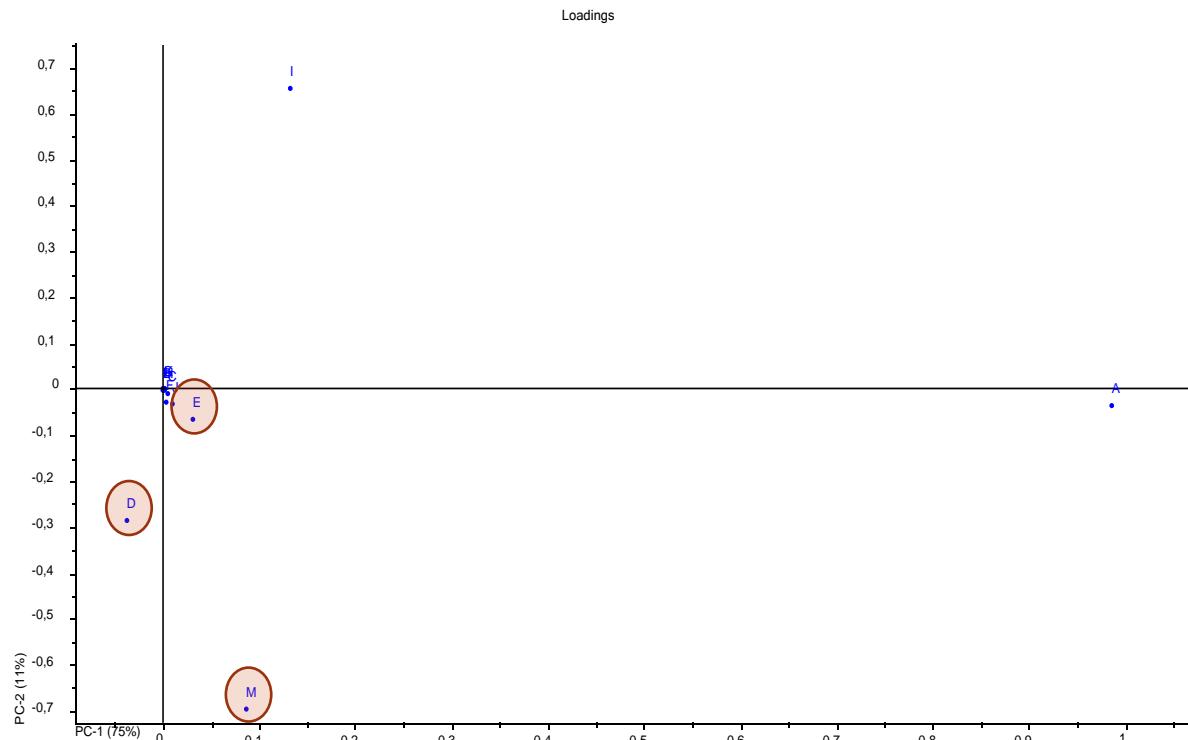


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RESULTS

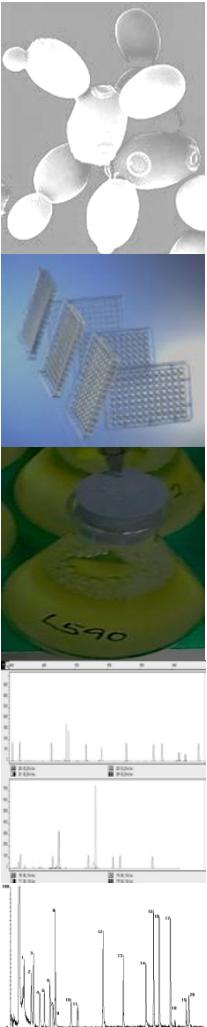
GC-MS analysis

PCA analysis



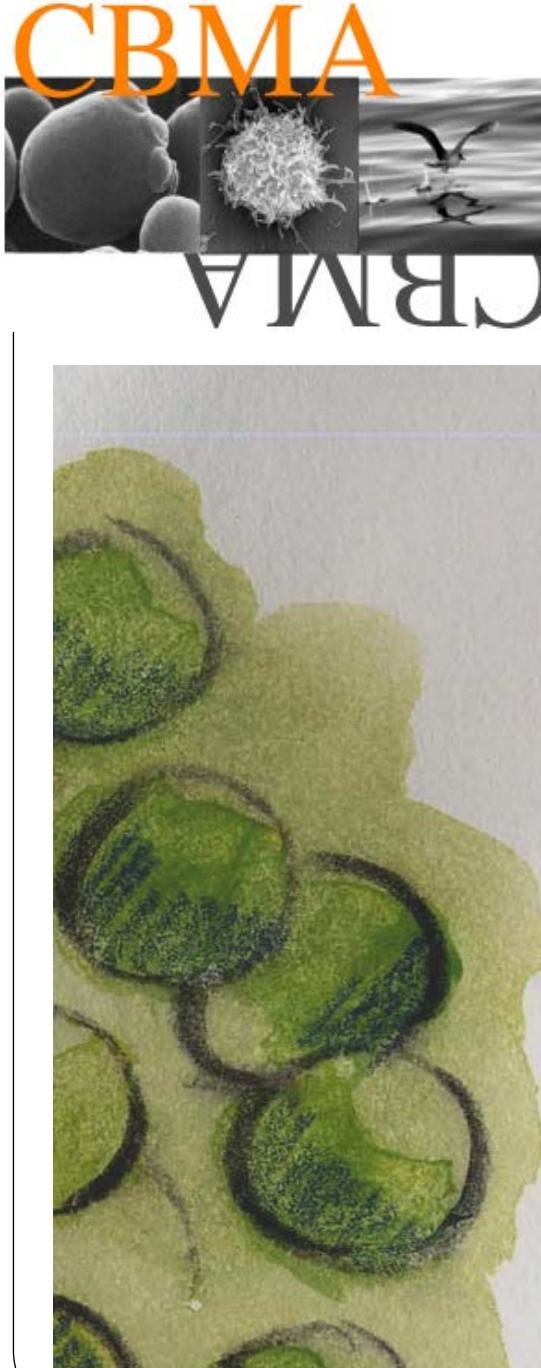
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Summary and Conclusions



- ✓ The present work contributes to a better understanding of intra-strain differences regarding the pheno-metabolomic characterization of *S. cerevisiae* isolates
- ✓ A set of 11 microsatellite markers and 22 phenotypic characteristics explained large part of strain diversity
- ✓ Fiber-optics spectroscopy analysis separated strains according to their geographical origins and technological use
- ✓ Aromatic profiles of final fermentations obtained by GC-MS analysis, and quantification of primary fermentation products by HPLC, revealed a group of relevant compounds that mostly account for inter-strain variability

The acquired data will contribute to obtain a holistic view between molecular biology, analytical chemistry, signal processing and bioinformatics, and using computation approaches, to relate genomics, phenomics and metabolomics



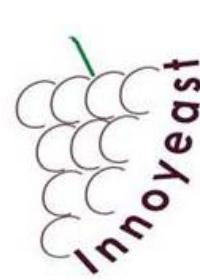
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