A Shotgun Metagenomic Sequencing Exploration of Cabernet Sauvignon Grape Must Reveals Yeast Hydrolytic Enzymes

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Shotgun sequencing was employed to explore the community structure (phylotyping of rRNA genes) and functional potential of Cabernet Sauvignon grape must microbiome. A metagenomic library, representing 92.6 Mb of genetic information, was generated from DNA obtained from Cabernet Sauvignon grape must.. Fungi were identified as the dominant domain (59.5%) followed by Streptophyta (39%). Among the 84 fungal species, 22 were yeasts of various genera. Additionally, grapevine endophytes such as *Davidiella* sp., *Botryotinia fuckeliana, Alternaria* sp., and *Cladosporium* sp. were identified. An unusually high prevalence of *Mucor* spp. was evidenced. Functional annotation revealed sequences of genes involved in metabolism (35.6%), followed by poorly characterized categories (28.3%), cellular processes and signalling (18.4%), and finally information storage (17.8%). Among the former, glycosidases were abundant followed by glycogen debranching enzyme, 6-phosphofructokinase and trehalose-6-phosphate synthase. Furthermore, the taxonomic analysis of the functional sequence data exhibited the eukaryotic gene pool that predominantly contains sequences derived from Streptophyta (mainly *Vitis vinifera*) 60% > Ascomycota (32%) > Basidiomycota (5%) > Bacteria (2.5%). Finally, sequences of a variety of hydrolytic enzymes of potential oenological relevance were retrieved, thereby confirming that grape juice is a rich reservoir for valuable biocatalysts that should be explored further.

INTRODUCTION

The grape and wine ecosystem is a complex environment that encompasses different species of filamentous fungi, yeasts and bacteria The epiphytic filamentous fungi mainly comprise species of the genera Aspergillus, Botrytis, Alternaria, Penicillium and Cladosporium (Diguta et al., 2011) while the endophytes consist of Alternaria spp., Epicoccum nigrum, Leptosphaerulina chartarum, Aureobasidium pullulans, Botryosphaeria spp. amongst other species (Pancher et al., 2012). In the vineyard, the occurrence frequency and intensity of these populations depend on the developmental stages of the grape. Indeed, it has been reported that the frequency of filamentous fungi varies from $10^4 - 10^6$ cfu/g berry (Da et al., 2002;Diguta et al., 2011). The yeast population comprises both basidiomycetous and ascomycetous species. The basidiomycetous yeasts, such as Cryptococcus spp., Rhodotorula spp., Sporobolomyces spp. and the yeastlike ascomycetous fungus A. pullulans, are predominantly present on intact unripe grape berries. In contrast, ascomycetous yeasts such as Candida spp., Hanseniaspora

spp., *Metschnikowia* spp. and *Pichia* spp. mostly occur on ripe berries. Both highly, *Zygosaccharomyces rouxii*, and weakly fermentative yeast such as *Zygoascus hellenicus*, is also occurred (Fleet, 2003;Loureiro and Malfeito-Ferreira, 2003;Barata et al., 2008;Barata et al., 2012b;Bokulich et al., 2016). Surprisingly, the principal wine yeast, *Saccharomyces cerevisiae* is rarely detected on undamaged grapes (Barata et al., 2012b). The unripe berries typically harbour a yeast population of 10³ cfu/g berry while ripe berries may contain 10⁴-10⁶ cfu/g berry (Parish and Caroll, 1985;Fleet and Heard, 1993;Barata et al., 2012a;b). This population may increase up to 10⁸ cfu/g berry on damaged grapes (Fleet, 2002;Barata et al., 2012b).

The most predominant bacterial populations are lactic acid bacteria (LAB) and acetic acid bacteria (AAB). Many LAB such as *Lentilactobacillus hilgardii* (formerly *Lactobacillus hilgardii*, *Lactiplantibacillus plantarum* (formerly *Lactobacillus plantarum*), *Lacticaseibacillus casei* (formerly *Lactobacillus casei*), *Oenococcus oeni*,

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Leuconostoc mesenteroides, Pediococcus damnosus and Pediococcus parvulus have been isolated from grape surfaces (Renouf et al., 2008; Barata et al., 2012b; Martins et al., 2012;Salvetti et al., 2016). Few acetic acid bacteria, e.g. Gluconobacter spp., Acetobacter spp. have also been reported from intact as well as damaged grapes at 10²-10³ cfu/g and 10⁶- 10⁸ cfu/g berries, respectively (Barata et al., 2012a). Other bacterial species such as Enterobacter spp., Bacillus spp., Burkholderia spp., Serratia spp. and Staphylococcus spp. have also been occasionally reported to be present on the surface of grape berries in lower levels (Barata et al., 2012b).

Upon crushing of the grape bunches, all the microorganisms described above end in the grape must to various degrees, depending on their ability to survive the environmental conditions occurring in grape must. Ultimately, these microorganisms contribute to the final composition of wine through their biochemical activities that include their extracellular hydrolytic enzyme activities. Although filamentous fungi and the yeast-like fungus A. pullulans do not participate in the wine fermentation, they have been reported to possess enzymes of oenological interest such as pectinases and glucanases (van Rensburg and Pretorius, 2000;Bozoudi and Tsaltas, 2018). Among the yeasts, the non-Saccharomyces species produce an array of extracellular hydrolytic enzymes as previously reviewed (Jolly et al., 2014;García et al., 2016;Mateo and Maicas, 2016; Padilla et al., 2016). For instance, Hanseniaspora spp., Debaryomyces spp., Candida spp., Pichia spp. and Torulaspora spp., Hansenula sp., have been reported to produce extracellular hydrolytic enzymes like glucosidases, pectinases and proteases (Charoenchai et al., 1997;Strauss et al., 2001;Bueso et al., 2012;Maturano et al., 2012;García etal., 2016; Mateo and Maicas, 2016; Padilla et al., 2016). These extracellular enzymes catalyse different types of reactions in must and during fermentation. For instance, glycosidases hydrolyse the non-volatile precursors from grapes releasing certain volatile compounds (e.g. monoterpenes), thereby improving the wine flavour and aroma (Charoenchai et al., 1997). Pectinases (polygalacturonases, pectin lyase, pectinesterase, acetylesterase) facilitate the juice extraction from grapes by lowering the viscosity of the grape juice, improving wine clarification and facilitating filtration (van Rensburg and Pretorius, 2000;Claus and Mojsov, 2018b). Some of the non-Saccharomyces yeast species are reported to exhibit proteolytic activities. The enzymes catalyzing these activities are mainly involved in hydrolysis of proteins and they have been proposed as additives to prevent protein haze formation, although their application is not yet effective (Lagace and Bisson, 1990;Pocock et al., 2003;Jolly et al., 2006).

Most studies of these enzymes have been conducted on the individual microbial isolates (Charoenchai et al., 1997; Strauss et al., 2001). However, these approaches only allow access to enzymes from a few selected organisms derived from the culturable microbiota (Lorenz et al., 2002) thus making metagenomic approaches more desirable to increase the chances of retrieving enzymes derived from other microorganisms that might be excluded through culture-dependent methods. Metagenomic techniques have

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biotechnologically relevant microbial enzymes including chitinases, dehydrogenases, proteases, oxygenases, lipases, nitralases, esterases, amylases, xylanase and polyketide synthases both from extreme and non-extreme environments (Yeh et al., 2013;Schroder et al., 2014). However, these approaches have never been employed to mine the wine microbiome.

The focus of the present exploratory study was to explore of the grape juice microbiome and its functional potential with a specific focus on hydrolytic enzymes of oenological interest. Direct DNA shotgun sequencing and sequencebased screening for enzymes of oenological relevance were performed.

MATERIALS AND METHODS

Metagenomic Sample collection and DNA extraction

Cabernet Sauvignon grapes (5 kg) were collected from a biodynamic vineyard (33°57'39.33" S 18° 45'13.46" E elev 183 m) located in the Stellenbosch wine producing region of South Africa. The grapes were hand destemmed and crushed in a pre-sterilized beaker. A 50 mL sample of the fresh must was collected and centrifuged at 5000 rpm for 10 min. The pellet was washed three times with EDTA-PVP solution containing 0.15 M NaCl, 0.1 M EDTA and 2% (w/v) Polyvinylpyrolidone (Jara et al., 2008) followed by three washes with TE buffer (pH 7.6). DNA extraction was carried out according to (Wilson, 1997) with minor modifications as follows. The pellet was re-suspended in 2.3 mL TE buffer, followed by the addition of proteinase K, SDS and 500 µL of fine glass beads. The mixture was vortexed for 3 min. Twenty microlitres of a 10 mg/mL lysozyme solution, were added and the mixture incubated at 37°C for 50 min. Thereafter, 400 µL of 5 M NaCl and 240 µL CTAB (2%) (5M) /NaCl solutions were added, and the mixture was incubated for 10 min at 65°C, followed by phenol/chloroform/isoamyl alcohol extraction and precipitation with isopropanol as described in Wilson (2001).

Pyrosequencing and sequence data quality control

Approximately 500 ng of genomic DNA with a 260/280 ratio ≥ 1.8 was used as a template for shotgun pyrosequencing on a Genome Sequencer (GS) FLX system (Roche Applied Science, Manheim, Germany) using Titanium chemistry, which was performed by Inqaba Biotec (Pretoria, South Africa). Two independent libraries were prepared. The DNA libraries were constructed according to the GS FLX Rapid Library Preparation kit (Roche Applied Science) and the optimal DNA copy per bead ratio was determined by emulsion PCR titration using the GS FLX Titanium SV emPCR kit (Lib-L; Roche Applied Science). The final emulsion PCR for sequencing production was performed suing the GS FLX Titanium LV emPCR kit (Lib-L, Roche Applied Science).

Data analysis

Raw 454 sff files were uploaded on the MetaGenome Rapid Annotation Subsystems Technology (MG-RAST) server (Meyer et al., 2008). The shotgun sequencing reads are available to the public on MG-RAST under the project Bio IWBT1 with the following IDs mgm4512887.3 and mgm4519241.3 (https://www.mg-rast.org/linkin.cgi?project =mgp3298). The data underwent quality control (QC) analyses including quality filtered, length filtered, and dereplication. Taxonomic analysis was done by comparison of the metagenome data with the M5RNA database available on MG-RAST using a minimum identity cut-off of 97% and a minimum alignment length of 150 bp. To characterize the gene content of the grape must, all reads were functionally annotated by means of the Clusters of Orthologous Groups of proteins database (COG) (Tatusov et al., 2001;Tatusova et al., 2014). Organism and functional identifications were performed using a BLAT [Basic Local Alignment Search Tool (BLAST)-like alignment tool] search of the integrative MG-RAST M5NR database, which is a non-redundant protein database that combines sequences from multiple common sources. Identifications were made using a maximum e-value of 1e-8, a minimum identity cut-off of 60% and a minimum alignment length of 50 amino acids. The relative abundance of each gene or species was determined by dividing the number of hits of that particular gene or species by the total number of hits.

RESULTS

A metagenomic library was generated from total DNA extracted from a Cabernet Sauvignon grape must. Two sequencing runs (datasets A and B) generated a total of 175,616 reads accounting for 92,570,157 bps of sequence information (Table 1). A total of 148,845 reads were designated as high-quality sequences post QC.

Analysis of grape must-associated microbiota

Only 2.59% of the total sequence data represented rRNA genes, mostly distributed within the SILVA (Latin silva, forest, http://www.arb-silva.de)-LSU (Large subunit ribosomal) and SSU (Small subunit ribosomal) databases. The MG-RAST classification tool revealed that eukaryotes were the dominant domain (Fig. 1) with Streptophyta accounting for

TABLE 1

Statistical analysis of the sequence reads of two GS FLX Titanium pyrosequencing runs of the metagenomic DNA from Cabernet Sauvignon grape must.

Statistical parameter	Dataset A	Dataset B
Number of reads	54,473	121,143
Total number of bases (bp)	30,199,920	62,370,237
Mean read length (bp)	554 ± 89	514 ± 81
Number of reads post QC	41,917	106,928
Total number of bases post QC (bp)	5,929,171	24,505,706
Mean read length post QC (bp)	141 ± 73	229 ± 116
% G + C	$42\pm7\%$	$39\pm7\%$



FIGURE 1 Phylum distribution of the grape must eukaryotic genes

39% of the sequences and fungi for 59.5%. Further analysis of the fungal composition revealed a high diversity with 84 fungal species comprising 22 yeast species including known wine yeasts such as members of the genera *Hanseniaspora*, *Candida, Lachancea, Metschnikowia, Pichia, Torulaspora, Saccharomyces, Zygosaccharomyces, Saccharomycopsis* and *Kluyveromyces* (Fig. 2). In addition, typical grapevine endophytes including *Davidiella* sp., *Botryotinia fuckeliana*, *Alternaria* sp., as well as *Cladosporium* sp. were also detected. Notably, it has been observed that there is an incidence of *Mucor* spp.

Functional analysis

To gain insight into the biological processes represented in the wine metagenome, sequences were annotated according to Clusters of Orthologous Groups (COG) of proteins categories thus assigning predicted functions to coding sequences. As depicted in Fig. 3 genes related to metabolism accounted for the majority of the sequences (35.6%), followed by poorly characterized categories (28.3%), cellular processes and signalling (18.4%), and information storage (17.8%). Within the metabolism category, genes encoding proteins required for energy production and conversion were most abundant. Specifically, genes encoding glycosidases were the most abundant within the carbohydrate transport and metabolism gene pool, followed by glycogen debranching enzyme, 6-phosphofructokinase and trehalose-6-phosphate synthase encoding genes (Table 2). In addition, genes involved in the Calvin-Benson cycle, nitrogen and sulphur metabolism were also abundant. Degradation of benzoate, toluene and

TABLE 2

Carbohydrate related proteins detected through alignment with Clusters of Orthologous Genes (COG)

ID	function	# Hits	avg eValue	avg % identity	avg align length
COG0366	Glycosidases	26	-13	75,76%	46
COG4284	UDP-glucose pyrophosphorylase	7	-28	72,66%	79
COG0057	Glyceraldehyde-3-phosphate dehydrogenase/erythrose-4-phosphate dehydrogenase	2	-30	83,66%	79
COG0649	NADH:ubiquinone oxidoreductase 49 kD subunit 7	8	-24	97,23%	54
COG1626	Neutral trehalase	6	-17	73,87%	57
COG0443	Molecular chaperone	2	-17	88,92%	48
COG1472	Beta-glucosidase-related glycosidases	12	-24	75,54%	70
COG0205	6-phosphofructokinase	14	-20	76,99%	62
COG0647	Predicted sugar phosphatases of the HAD superfamily	3	-33	77,16%	88
COG3408	Glycogen debranching enzyme	15	-7	74,38%	36
COG2730	Endoglucanase	3	-27	72,58%	78
COG0363	6-phosphogluconolactonase/Glucosamine-6-phosphate isomerase/ deaminase	4	-19	82,17%	55
COG0362	6-phosphogluconate dehydrogenase	6	-34	84,12%	83
COG0061	Predicted sugar kinase	3	-11	73,49%	41
COG0297	Glycogen synthase	2	-13	90,35%	42
COG0380	Trehalose-6-phosphate synthase	13	-18	78,40%	56
COG1877	Trehalose-6-phosphatase	11	-14	79,49%	48
COG0166	Glucose-6-phosphate isomerase	3	-30	80,02%	78
COG0120	Ribose 5-phosphate isomerase	2	-14	71,98%	52
COG0129	Dihydroxyacid dehydratase/phosphogluconate dehydratase	7	-19	88,33%	51
COG0021	Transketolase	2	-29	74,83%	80
COG0383	Alpha-mannosidase	6	-14	67,68%	51
COG0126	3-phosphoglycerate kinase	3	-24	88,79%	64
COG0296	1,4-alpha-glucan branching enzyme	2	-58	84,72%	120
COG0191	Fructose/tagatose bisphosphate aldolase	3	-21	79,25%	62
COG0469	Pyruvate kinase	4	-27	75,95%	78

TABLE 2 (CONTINUED)

ID	function	# Hits	avg eValue	avg % identity	avg align length
COG1501	Alpha-glucosidases, family 31 of glycosyl hydrolases	5	-19	68,58%	63
COG0760	Parvulin-like peptidyl-prolyl isomerase	1	-45	81,48%	108
COG0097	Ribosomal protein L6P/L9E	1	-35	71,13%	97
COG4806	L-rhamnose isomerase	1	-25	89,83%	59
COG1621	Beta-fructosidases (levanase/invertase)	1	-43	73,08%	104
COG3250	Beta-galactosidase/beta-glucuronidase	4	-10	60,11%	51
COG1129	ABC-type sugar transport system, ATPase component	1	-26	83,78%	74
COG0058	Glucan phosphorylase	6	-19	69,94%	67
COG0148	Enolase	3	-28	73,30%	83
COG0176	Transaldolase	1	-40	77,48%	111
COG0638	20S proteasome, alpha and beta subunits	2	-22	90,02%	55
COG3345	Alpha-galactosidase	1	-34	66,02%	103
COG3387	Glucoamylase and related glycosyl hydrolases	3	-17	71,46%	60
COG0171	NAD synthase	2	-22	73,57%	68
COG0388	Predicted amidohydrolase	2	-22	73,57%	68
COG0580	Glycerol uptake facilitator and related permeases (Major Intrinsic Protein Family)	1	-26	81,69%	71
COG4677	Pectin methylesterase	6	-16	73,41%	54
COG0364	Glucose-6-phosphate 1-dehydrogenase	2	-21	69,67%	67
COG4630	Xanthine dehydrogenase, iron-sulfur cluster and FAD-binding subunit A	1	-15	78,43%	51
COG4631	Xanthine dehydrogenase, molybdopterin-binding subunit B	1	-15	78,43%	51
COG3588	Fructose-1,6-bisphosphate aldolase	1	-56	92,98%	114
COG0406	Fructose-2,6-bisphosphatase	3	-13	68,54%	50
COG2723	Beta-glucosidase/6-phospho-beta-glucosidase/beta-galactosidase	3	-21	78,18%	59
COG2301	Citrate lyase beta subunit	2	-21	60,76%	79
COG5309	Exo-beta-1,3-glucanase	1	-22	67,65%	68
COG0852	NADH:ubiquinone oxidoreductase 27 kD subunit	2	-55	95,27%	107

polycyclic aromatic hydrocarbon were the most represented processes in the secondary metabolic processes (Table 2).

Taxonomic analysis of the functional gene sequences showed that 60% of the eukaryotic gene pool was derived from Streptophyta (mainly *Vitis vinifera*), 32% from the Ascomycota, 5% from the Basidiomycota (Fig. 4A). The bacterial genes accounted for 2.5% of the sequence data with Proteobacteria being the most predominant phylum in the bacterial domain, accounting for 62% of the total sequences, followed by the Firmicutes, Bacteroidetes and Actinobacteria, which accounted for 12%, 11% and 10%, respectively (Fig. 4B).

Furthermore, the potential fungal hydrolases were identified from the carbohydrate transport and metabolism gene pool with fragment's length ranging from 400 - 600 bp (Table 3). Notably, most of the fragments were observed to

be derived from the close filamentous fungal homologues (Table 3).

DISCUSSION

The winemaking process is primarily governed by an array of enzymatic activities that drive the fermentation kinetics involved in the bioconversion of grape juice to wine. These enzymes are derived from grapes and the microbiota present on/in the grape/must/wine (van Rensburg and Pretorius, 2000). The current study evaluated the functional potential of the grape must metagenome. Unsurprisingly, the data show that *Vitis vinifera* is the dominant organism detected within the grape must ecosystem followed by fungi of the phylum Ascomycota. Further investigations of the fungal community confirmed the presence of a variety of filamentous fungi, the yeast-like fungus *Aureobasidium*



Distribution of fungal species in grape must based on rRNA marker gene sequences.

TABLE 3

Putative fungal hydrolases identified from the carbohydrate transport and metabolism gene pool. The specific gene fragment lengths for each of the closest relatives are also being denoted.

					Length of the
	Exagmont			0/	specific gene
Sequence ID	length (bp)	Predicted enzyme	Closest relative	identity	relative (bp)
H551VLF01A094D	510	Chitinase	Debaryomyces hansenii	44	1,182
H551VLF01BBMN2	449	Chitinase	Metschnikowia pulcherrima	79	1,080
H551VLF01A6SRB	543	Glucosidase II	Scheffersomyces stipitis	47	2,736
H551VLF01A4E06	395	β-glucosidase	Scheffersomyces stipitis	78	2,214
H551VLF01AMBHY	536	β-glucosidase	Aspergillus clavatus	42	1,326
H551VLF01A4E7Y	491	β-glucosidase	Rhizomucor miehei	57	4,063
H551VLF01AI9Q2	475	β-glucosidase	Cryptococcus neoformans	54	2,573
H551VLF01BWCP7	521	β-1,3-exoglucanase	Ampelomyces quisqualis	69	2,349
H551VLF01ADDS1	447	β-1,3-glucosidase	Pyrenophora tritici-repentis	88	1,992
H551VLF01BIDGN	527	β-1,3-glucosidase	Aspergillus niger	87	2,583
H551VLF01A59K3	505	oligo-1,6-glucosidase	Talaromyces marneffei	73	1,827
HQ7JFPR01BIPL7	499	β-1,3-glucosidase precursor	Talaromyces stipitatus	48	2,023
HQ7JFPR01AIP93	547	β-glucosidase	Talaromyces marneffei	44	2,535
HQ7JFPR01A3AMV	494	β-glucosidase	Aspergillus terreus	69	2,586
HQ7JFPR01AFNUE	706	β-glucosidase	Aspergillus clavatus	69	1,326
HQ7JFPR01AU0VN	418	β-glucosidase	Scheffersomyces stipitis	58	2,214
HQ7JFPR01A7K2B	551	β-glucosidase	Paecilomyces spp.	60	2,968
H551VLF01AK6ZL	524	β-glucosidase	Aspergillus niger	50	1,988
H551VLF01BIW20	467	β-glucosidase	Aspergillus flavus	68	1,794
HQ7JFPR01BFNG8	542	Chitinase	Wickerhamomyces ciferrii	42	1,269

TABLE 3 (CONTINUED)

Sequence ID	Fragment length (bp)	Predicted enzyme	Closest relative	% identity	Length of the specific gene in the closest relative (bp)
HQ7JFPR01BHOWG	533	Aspartic protease	Metschnikowia pulcherrima	52	1,137
HQ7JFPR01ASQKL	497	Endo-1,3(4)-β-glucanase	Talaromyces marneffei	58	2,511
HQ7JFPR01BHN4Z	583	Exo-glucanase	Saccharomyces cerevisiae	55	1,344
H551VLF01A5JYC	405	Endoglucanase	Trichoderma spp.	61	1,257
H551VLF01A1Y8U	484	Hydrolase	Baudoinia compniacensis	79	2,996
H551VLF01BFKJN	544	Endopeptidase	Mucor circinelloides f. circinelloides	66	1,316



FIGURE 3

COG-based annotation analysis of the cabernet sauvignon grape must biome showing the distribution of genes related to cellular processes (CPS), Information storage (IS), Metabolism (MTB) and Poorly Characterized genes (PC). The values immediately next to rectangular horizontal bars represent the relative abundance of each of the genes present in the gene pool.

pullulans and several non-*Saccharomyces* yeast genera such as *Clavispora*, *Metschnikowia*, *Kazachstania*, *Torulaspora*, *Lachancea*, *Candida*, *Pichia* and *Kluyveromyces*. Members of these genera are also often frequently retrieved from grape must either through culture-based methods, DGGE as well as amplicon sequencing (Bokulich et al., 2014;David et al., 2014;Taylor et al., 2014;Pinto et al., 2015;Setati et al., 2015;Wang et al., 2015;Kecskeméti et al., 2016;De Filippis et al., 2017). Analysis of the functional genes revealed that Streptophyta (60%) followed by Ascomycota (32%) and Basidiomycota (5%) contributed the most to the metagenome. Furthermore, the COG based analysis of the coding sequences showed homology to an array of genes encoding hydrolytic enzymes (carbohydrate metabolism). Such observations were reported previously with genes related to amino acid metabolism, transport, transcription and carbohydrate metabolism (Campanaro et al., 2014;Salvetti et al., 2016). As depicted Table 2 and Table 3, in the carbohydrate transport and metabolism gene pool, glycosidases (26 hits) were the dominant enzymes followed by chitinases, endoglucanases, glycogen debranching enzyme and 6-phosphofructokinase encoding genes. The fungal partial sequences of the genes encoding putative hydrolases were found to originate from filamentous fungi and non-*Saccharomyces* yeasts (Table 3), with multiple sequences matching oenologically relevant enzymes from different genera (e.g. glucanases) or from the same genera (e.g. different glucosidases from *Talaromyces*) or from the same species (e.g. an aspartic protease and chitinase from *Metschnikowia pulcherrima*). β -1,3-Exoglucanases such as that of *Ampelomyces quisqualis* and *Trichoderma*





FIGURE 4 Allocation of raw sequence reads to microbial genome sequences A. Fungi and B. Bacteria

spp., to which sequence ID: H551VLF01BWCP7 and ID: H551VLF01A5JYC exhibited homology, respectively, have been implicated in mycoparasitic interactions (Rotem et al., 1999) and are exploited in biocontrol against grapevine powdery mildew disease (Falk et al., 1995) and other diseases (Cabaroglu et al., 2003; Punja and Utkhede, 2003; Sanz et al., 2005). Our metagenomic sequences also revealed a few sequences that showed close homology to β -glucosidase genes from Aspergillus spp. and Talaromyces spp. Aspergillus spp. has been previously reported as potential biocontrol agent (Tiwari et al., 2011;Rosada et al., 2013) and also shown to secrete β-glucosidase (Watanabe et al., 1992;Vaithanomsat et al., 2011) that are beneficial for the wine production (Maicas, 2016). Talaromyces sp. is not a frequent fungus isolated from grape. It has however been reported that this fungus exhibits glucosidase activity (Nakkharat and Haltrich, 2006). Only a few sequences of genes encoding enzymes involved in protein degradation were retrieved. Interestingly, one sequence ID: HQ7JFPR01BHOWG exhibited 52% identity to the aspartic protease from M. pulcherrima (Reid et al., 2012). Addition of enzymes derived from grapeassociated fungi during grape juice and wine processing, has become common practice since these enzymes offer benefits such as increased juice yield, improved colour extraction,

clarification and accelerated settling (Manzanares et al., 1999;Fernandez et al., 2000;Belda et al., 2016;Claus and Mojsov, 2018a). In particular, aspartic proteases have been proposed as potential alternative to other wine stabilisation methods such as bentonite fining (Theron and Divol, 2014).

The functional sequence profile of the prokaryotic population in our study was mainly dominated by Proteobacteria, followed by Firmicutes, Bacteroidetes and Actinobacteria (Fig. 4B). Earlier, high throughput analysis of the grape berry surface, phyllosphere and flowers has also reported such findings (Perazzolli et al., 2014;Pinto et al., 2014;Pinto et al., 2015;Portillo et al., 2016;Portillo and Mas, 2016). Furthermore, a study by Salvetti el al., 2016 which was conducted on both traditional (TW) and accelerated (AW) withering conditions berries using high throughput shot gun sequencing has also reported the presence of the Proteobacteria as the predominant phylum with 97.7% and 86.1% from both TW and AW berries respectively followed by Firmicutes and Bacteroidetes (Salvetti et al., 2016). However, a former study reported that, as the fermentation progresses, the Proteobacteria population declines and that of the Firmicutes increases (Bokulich et al., 2012). When the genetic information were further analysed for genes encoding bacterial proteins/enzymes, the Enterobacter and Bacteroidetes were found to be the predominant ones; however, their exact role in wine has not been elucidated even though they are frequently encountered in grape must (Bokulich et al., 2012;Pinto et al.,2015; Portillo et al., 202016;Salvetti et al., 2016). Previous studies have shown that the enzymes, such as glucosidases (Davis et al., 1985) and glycosidases (Grimaldi et al., 2000) secreted from *Oenococcus oeni* contributed largely to the floral and fruity characteristics of wine by releasing monoterpenes, norisoprenoids and aliphatic compounds. Other bacteria such as *Leuconostoc, Lactobacillus* and *Pediococcus* have also been reported to contribute to wine final aroma (Williams et al., 1982;Ugliano et al., 2003;D'Incecco et al., 2004).

The whole metagenomic sequencing is a valuable technique to reveal biocatalysts that have not yet been retrieved from cultured microorganisms. However, the sequence data obtained from shotgun sequences only provided a snapshot of the functional potential of the wine microbiota since only partial gene sequences were obtained and the sequence coverage/depth was not enough to provide a full representation of the entire metagenome. Indeed, only 92.5 Mb of sequence data were retrieved, representing approximately 7 yeast genome sizes which could be improved if better high throughput sequencing techniques and/or platforms are employed. Nevertheless, the data showed that glucosidases are the most predominant glycosyl hydrolases in the grape must ecosystem. Indeed, most phenotypical screening attempts have similar trends even though the focus tends to be on non-Saccharomyces yeasts (Charoenchai et al., 1997;van Rensburg and Pretorius, 2000;Strauss et al., 2001;Maturano et al., 2012). Moreover, the glycosyl hydrolase-encoding genes showed a percentage similarity ranging from 42 to 88% to known fungal species (Table 3). This finding was not surprising because the lack of fully annotated non-Saccharomyces genomes poses a challenge in gene prediction and annotation of the metagenomes. Many of the genomes of wine related non-Saccharomyces yeasts are still not sequenced and those which are not fully annotated . In conclusion, our study intended to explore if DNA shotgun sequencing could provide a wide, unbiased view of the wine microbial diversity, encompassing both the taxonomical and functional potential, in a single snapshot with high resolution. To the best of our knowledge, this first metagenomic study has accounted for the functional aspects of the grape must microbiome. The study confirms that grape juice is a rich reservoir of valuable biocatalysts. Indeed, hydrolytic enzymes from oenological relevance were successfully retrieved from direct sequencing data sets. Further investigations should include retrieving full gene sequences and thereafter test their expression during the wine fermentation. The activity of the corresponding enzymes under winemaking conditions should also be assessed in order to evaluate their impact of their activities on the sensory properties of wine.

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