

Next-generation sequencing and its potential impact on food microbial genomics

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Abstract Recent efforts of researchers to elucidate the molecular mechanisms of biological systems have been revolutionized greatly with the use of high throughput and cost-effective techniques such as next generation sequencing (NGS). Application of NGS to microbial genomics is not just limited to predict the prevalence of microorganisms in food samples but also to elucidate the molecular basis of how microorganisms respond to different food-associated conditions, which in turn offers tremendous opportunities to predict and control the growth and survival of desirable or undesirable microorganisms in food. Concurrently, NGS has facilitated the development of new genome-assisted approaches for correlating genotype and phenotype. The aim of this review is to provide a snapshot of the various possibilities that these new technologies are opening up in area of food microbiology, focusing the discussion mainly on lactic acid bacteria and yeasts associated with fermented food. The contribution of NGS to a system level understanding of food microorganisms is also discussed.

Keywords Next generation sequencing · Food microbiology · Community profiling · Metagenomics · Genome sequencing

Introduction

DNA sequencing has a profound impact on the advancement of molecular biology (Gilbert 1981). For the past 30 years, the

Sanger dideoxy chain-termination sequencing method has been relied on for determining gene/DNA sequences. This technology reached its zenith in the development of single tube chemistry with fluorescently marked termination bases, heat stable polymerases, and automated capillary electrophoresis; but then reached a plateau in terms of technical development. With the ultimate goal of deciphering complete genomes, the requirement for high-throughput sequencing grew by an unpredicted extent. Several novel approaches evolved to replace the Sanger method as the dominant provider of sequencing data. These approaches fall under a broad definition of “next generation sequencing” (NGS) and provide sequence data around a hundred times faster and cheaper than the conventional Sanger approach. Sequencers from 454 Life Sciences/Roche, Solexa/Illumina and Applied Biosystems (SOLiD technology) are already in production as second generation technologies, and other competitive technologies are likely to appear on the market soon (so-called 3rd generation NGS). The reduction in cost and time for generating DNA sequence data has resulted in a range of new successful applications, such as whole genome sequencing, resequencing, RNA-sequencing to profile the cellular transcriptome, ChIP-sequencing to identify binding sites of DNA-associated proteins, as well as in fields as diverse as ecology (Angly et al. 2006; Edwards et al. 2006; Sogin et al. 2006) and the study of ancient DNA (Poinar et al. 2006).

Food microbiology deals with the study of microorganisms that have both beneficial and deleterious effects on the quality and safety of food products. The fast and low-cost NGS approaches have revolutionized microbial taxonomy and classification and have changed the landscape of genome sequencing projects for food-associated microbial species (Coenye et al. 2005). The NGS-driven advances have been exploited mainly to re-sequence strains and individuals

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for which reference genome sequences are available in order to sample genomic diversity within microbial species. Besides this, NGS technologies have also been employed for de novo sequence assemblage where pre-existing information related to sequence is not required. Such studies have identified individual genome variation in bacterial strains, yeast and filamentous fungi, opening the possibility of constructing “personalized genomics” also for microbial cells. In fact, effort in the direction of developing personalized genomics for humans to predict disease susceptibility and genetic risk factors have already begun (Mardis 2008a; Boguski et al. 2009). Moreover, NGS approaches have also greatly increased the ability of researchers to profile food microbial communities, as well as to elucidate the molecular mechanisms of interesting functionalities in food ecosystems. These applications enable the culture-independent sequencing of collective sets of DNA or RNA molecules obtained from mixed microbial communities to determine their content. An overview of the main applications of NGS technologies, and their integration, in the field of food microbiology is shown in Fig. 1.

In this article, we review various aspects of the impact of NGS technologies on food microbial genomics, with attention focused on the two main microbial groups involved in fermented food production: lactic acid bacteria (LAB) and yeasts. We also address the contribution of NGS in providing DNA/RNA sequence data for constructing a system level understanding of microbial behavior in food ecosystems.

What sets NGS apart from conventional sequencing technology?

The landmark publication in 1977 by Sanger and colleagues described a means of sequencing genes using a chain-termination method, often called ‘Sanger’ or ‘dideoxy’

sequencing (Sanger et al. 1977). Based on capillary electrophoresis using the ABI 3730xL platform, this method remained the most commonly used DNA sequencing technique for more than three decades. This technique was used to sequence the bacterial genome of *Haemophilus influenzae*, which was published in 1995 (Fleischmann et al. 1995). It has been also used to accomplish complete human genome sequencing initiatives undertaken by a group of publicly funded researchers (International Human Genome Sequencing Consortium) in 1990. The 3 billion bases of the entire euchromatic human genome was sequenced in around 13 years at a cost of approximately \$3 billion (Venter et al. 2001) (Fig. 2).

Even if Sanger sequencing is regarded as the foundation of genomics, research in the field of microbial genomics, transcriptomics, and metagenomics was greatly limited by the unavailability of an efficient technology for high-throughput screening and sequencing large sets of genome data, which conventional Sanger sequencing technology was unable to process efficiently and cost-effectively. The limitations associated with Sanger sequencing technology drove the research for more scalable and lower-cost sequencing solutions. These alternative approaches can be grouped in four different categories: (1) microelectrophoretic methods (microfabricated capillary electrophoretic sequencing), (2) sequencing by hybridization (ChIP and Microarray), (3) real-time observation of single molecules (nanopore sequencing), (4) cyclic-array sequencing (discussed below in detail) (reviewed by Shendure et al. 2004; Shendure and Ji 2008). In this review, we will use ‘next-generation sequencing’ (NGS) to refer to the various recently commercialized implementations of cyclic-array sequencing. This method accomplishes sequencing of a dense array of spatially separated nucleotide features by iterative cycles of enzymatic manipulation where each cycle queries only one or a few bases, but thousands to billions of features are processed in parallel (Mitra and Church 1999; Mitra et al. 2003). In order to present a comprehensive overview of cyclic array or NGS, we use the convention of 2nd generation to indicate platforms that require PCR amplification of the template molecules prior to sequencing, and 3rd generation to indicate sequencing platforms that rely on use of a single DNA molecule for sequencing without any prior PCR amplification step. We focus our attention on the main applications of 2nd generation NGS (called simply NGS for brevity).

Second generation NGS technologies were born at the dawn of twenty-first century in the year 2000 with the foundation of 454 Life Sciences (originally 454 Corporation) by Jonathan Rothberg. Concurrently, other sequencing platforms, such as Solexa (Illumina) and SOLid (ABI/Life Technologies), were also introduced into the market (Hert et al. 2008). While 454/Roche pyrosequencing is based on detection of pyrophosphates release during DNA synthesis, Solexa/

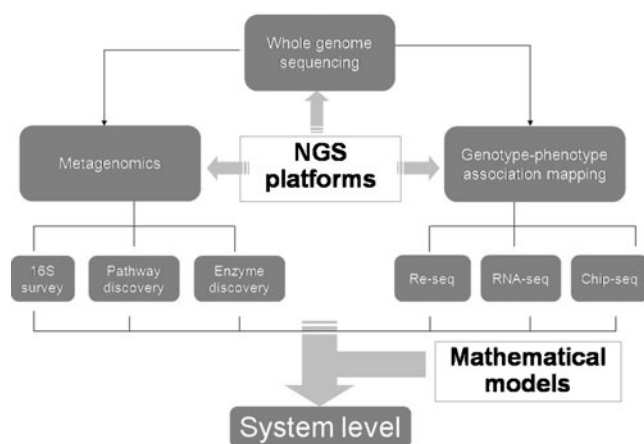


Fig. 1 Main applications of “next generation sequencing” (NGS) to address food microbiology questions

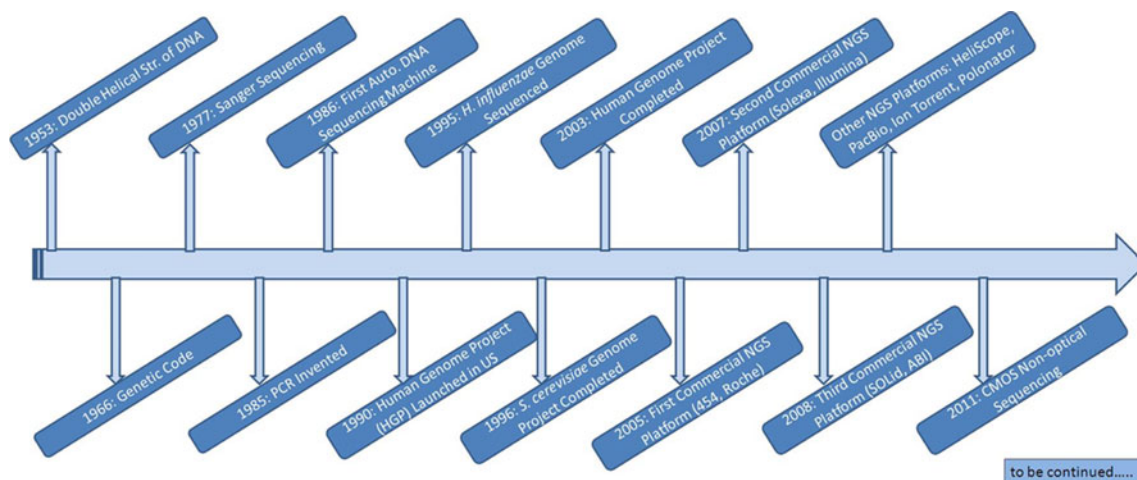


Fig. 2 Timeline of the progress and evolution of sequencing technologies

Illumina relies on detection of single bases as they are incorporated into growing DNA strands and SOLiD /ABI relies on multiple cycles of ligation, detection and cleavage. Despite their technological differences, these three platforms are based on conceptually similar work flows for the production and analysis of sequencing libraries (Shendure and Ji 2008). First, the sample nucleic acids have to be sheared in order to reach a size compatible with sequencing (typically <500 bp). Second, DNA adapters containing unique sequences are attached at both ends of the sheared DNA molecules. These adapters subsequently allow the DNA fragments to be singled out, either on beads or on a slide (“flowcell”), enabling them to be sequenced in parallel.

As most of the imaging systems in NGS instruments were not designed to detect single fluorescent events, amplification of templates is necessary (Metzker 2010). There are many ways by which the clonally clustered amplicons that are to serve as sequencing features can be achieved. These methods include in situ polonies, emulsion PCR (emPCR) or bridge PCR (Table 1). As PCR amplification steps are often associated with PCR bias, the possibilities of introducing base sequence errors or favoring certain sequences over others exist. These biases can have a significant impact on the relative frequency and abundance of the various DNA fragments that existed before amplification. These potential biases can be avoided only if a single DNA molecule is used directly for sequencing without undergoing PCR amplification steps. This category of technologies (referred to as 3rd generation NGS technology) hold great promise in terms of offering rapid and cost-effective sequencing of gene/genome from a single DNA molecule (Schadt et al. 2010), and includes sequencing platforms available commercially from Helicos Biosciences (HeliScope) (Braslavsky et al. 2003) and Pacific Biosciences (PacBio) (Ansorge 2009).

Second and third generation platforms have shown great diversity in terms of sequencing biochemistry, configuration,

as well as in generation of array (Table 1). For more comprehensive information on technical aspects, sample preparation methods and data analysis of the sequence reads generated from NGS technologies, interested readers are directed to some excellent reviews (Ansorge 2009; Mardis 2008a, b, 2009, 2010). One plausible reason for the co-existence of a wide variety of NGS platforms on the market is the distinctive chemistries and functions they possess, and having obvious advantages for particular applications (Table 1). Unlike conventional capillary-based sequencing, which reads only 96 samples at a time (Margulies et al. 2005), NGS technologies rely heavily on automation and high-throughput technologies that are capable of processing millions of sequence reads in parallel fashion in very short time-frames without significant loss of accuracy (Metzker 2010). This massive parallel throughput may require only very few (one or two) instrument runs to accomplish a sequencing experiment (Mardis 2008a; Morozova and Marra 2008; Riesenfeld et al. 2004). Additionally, conventional capillary-based sequencing generates sequence reads produced from fragment ‘libraries’ that have been subjected to vector-based cloning and *Escherichia coli*-based amplification stages that are often associated with cloning biases (Farris and Olson 2007; Mardis 2008a). Owing to absence of vector-based cloning and *E. coli*-based amplification stages, NGS reads are free from cloning-associated biases (Liu 2009; Mardis 2008a).

However, all currently available NGS technologies are associated with inherent weaknesses: they are computationally expensive and produce short read lengths with error rates that prevent assembly software to resolve large structural rearrangements (insertions, deletions, inversions) in re-sequencing and to disambiguate repeat regions in de novo sequencing (Table 1). The implementation of paired-end and mate-paired sequencing into NGS platforms has helped to overcome these problems. In addition to sequence information, these methodologies give information about the

Table 1 A comparison of features, chemistry and performance of first, second and third generation sequencing platforms. *CMOS* Complementary metal-oxide semiconductor, *TH* throughput, *SM* single molecule, *SMRT* single molecule real time

| Platform | Chemistry | PCR amplification | Starting DNA | Read length | Reads/run | TH/run | Run time | Disadvantages | Applications | References |
|-----------------------------|--|----------------------|--|-------------------------|---------------|-------------|----------|---|---|---|
| Sanger sequencing | Asynchronous with base-specific terminator | Standard PCR | 0.5–1 mg | 700 | Few 1,000 bp | 1 Mb | 2 h | PCR biases; low degree of parallelism; high cost of sequencing | Gene/genome sequencing | Sanger et al. 1977; Margulies et al. 2005 |
| Roche 454 | Sequencing-by-synthesis (Pyrosequencing) | EmPCR | 1 µg for shotgun library and 5 µg for pair-end | > 400 | 1,000,000 | 0.4–0.6Gb | 7–10 h | PCR biases; asynchronous synthesis; homopolymer run; base insertion and deletion errors; emPCR is cumbersome and technically challenging | De novo genome sequencing, RNA-seq, resequencing/targeted re-sequencing | http://www.454.com/ ; Mardis 2008a; Metzker 2010 |
| Illumina | Polymerase-based sequencing-by-synthesis | Bridge amplification | <1 µg for single or pair-end | 75/2 × 100 ^a | 40,000,000 | 3–6/200* Gb | 3–4 days | PCR biases; low multiplexing capability of samples | De novo genome sequencing, RNA-seq, resequencing/targeted re-sequencing, metagenomics, CHIP | http://www.illumina.com/technology/sequencing_technology/illumina_mardis_2008a ; Metzker 2010 |
| SOLID | Ligation-based sequencing | Em PCR | <2 µg for shotgun library and 5–20 µg for pair-end | 35–40 | 85,000,000 | 10–20Gb | 7 days | EmPCR is cumbersome and technically challenging PCR biases; long run time | Transcript counting, mutation detection, CHIP, RNA-seq etc. | http://www.appliedbiosystems.com/absite/us/en/home/applications-technologies/solid-next-generation-sequencing.html ; Mardis 2008a; Metzker 2010 |
| HelixScope | Polymerase (asynchronous extension) | SM; no PCR | <2 µg, single end only | 25–50 | 1,000,000,000 | 28Gb | 8 days | Asynchronous synthesis; homopolymer run; high instrument cost; short read lengths; high error rates compared with other reversible terminator chemistries | Resequencing, transcript counting, CHIP, RNA-seq | http://www.helixbio.com/Products/HelixScopeGeneticAnalysisSystem/HelixScopeTradeSequencer/tabid/87/Default.aspx ; Metzker 2010 |
| Polonator | Synchronous controlled synthesis | Em PCR | — | 26 | 160,000,000 | 4.5Gb | 4 days | Low read length; emPCR is cumbersome and technically challenging | Bacterial genome, resequencing, SNPs and structural variants detection | Metzker 2010 |
| PacBio | Phospho-linked fluorescent Nucleotides | SMRT | ~1.5 µg (ideally 2–3 µg) | 1,000–1,200 | 100,000,000 | 100Gb/Hr | 8 h | High instrument cost; low number of sequence read per run; highest error rates compared with other NGS chemistries | De novo genome sequencing, RNA-seq, resequencing/targeted re-sequencing, metagenomics, SNPs and structural variants detection | http://www.pacificbiosciences.com/applications/overview ; http://www.pacificbiosciences.com/products/smt-technology/smt-sequencing-advantage ; http://www.pacificbiosciences.com/partner_products/PartekGenomicsSuite_2.7.12.pdf ; Travers et al. 2010; Metzker 2010 |
| CMOS non-optical sequencing | Template-directed DNA polymerase synthesis | — ^b | — | — | — | — | — | — | De novo genome sequencing | Rothberg et al. 2011; Metzker 2010 |

^a Considering new Illumina HiSeq 2000 sequencing platform

^b Not reported in this review

physical distance between the two reads in the reference genome. Paired ends can be obtained from the ends of random, usually small, DNA fragments and the resulting data allow the scaffolding of contigs (contiguous sequences) in the absence of contiguous coverage of intervening sequences (Bentley 2006). In mate-pair sequencing, random DNA fragments are circularized, thereby combining previously distant ends. This DNA is then sheared to generate linear fragments as templates for sequencing (Korbel et al. 2007). The difference between paired-end and mate-paired is typically that the mate-paired method generates a longer insert size compared to paired-end, with insert sizes measuring between 2 and 20 kb. Besides template preparation, new algorithms and computational analysis tools increase the possibility of handling the large amount of NGS data, but often impose additional costs (Liu 2009). Comprehensive lists of relevant software can be found on the SEQanswers website (<http://seqanswers.com/>). Finally, all the DNA sequencing technologies described here are limited by their requirement for imaging technology, electromagnetic intermediates (either X-rays or light) and specialized nucleotides or other reagents that increase the cost of sequencing still further. For each NGS platform, an accurate costs evaluation has been provided by Glenn (2011). Recently, novel and ground-breaking NGS platforms such as those based on non-optical sequencing technology (Ion Torrent technology) have emerged to overcome these drawbacks and are expected to provide scalable methods for genome sequencing at substantially reduced cost (Rothberg et al. 2011).

De novo sequencing

An important application of NGS is aimed at de novo sequencing of microbial genomes. The total number of completed microbial genome sequences has more than doubled over the past 2 years and, at the time of writing, there were approximately 2,878 publicly listed bacterial and archaeal and 168 eukaryal genome projects in various stages of progress (<http://www.genomesonline.org>). In addition to new species, multiple strains of the same bacterial species are being sequenced (re-sequencing). The huge amount of genomic sequences from closely related organisms has led to significant advances in microbial phylogeny. The impact of genomic on prokaryotic systematics has been explained in several in-depth reviews (Coenye et al. 2005; Klenk and Göker 2010). From an evolutionary point of view, we would highlight here that the significant expansion of the tree of life provided by whole genome sequencing is opening the possibility of assessing the taxonomic relationships between prokaryotic species based on complete genome sequences. A major step in the progress towards a genome-based classification of microorganisms was the creation of a set of

reference genomes that more broadly covers the evolutionary diversity of Bacteria and Archaea (GEBA). This project covers the current lack of completely sequenced genomes for many of the major lineages of prokaryotes and for most type strains (<http://jgi.doe.gov/programs/GEBA/>; Wu et al. 2009).

The availability of complete genome sequences of closely related organisms presents an opportunity to reconstruct events of genome evolution. Using comparative genomics approaches, mobile genetic elements (MGE) and horizontal gene transfer (HGT) were found to have a key role in prokaryotic genome plasticity, adaptation and speciation. For example, comparative genomics has reconstructed the ancestral gene sets of the LAB and highlighted that the origin of *Lactobacillales* involved extensive loss of ancestral genes (600–1,200 genes) during their transition to life in a nutritionally rich medium, which allowed a reduction in catabolic capacity and increased stress resistance (Makarova et al. 2006). Similarly, comparing close and more distant yeast species has led to the reconstruction of the ancestral genome in *Saccharomyces sensu stricto* complex (Sipiczki 2011). This ancestral progenitor has been subjected to whole-genome duplication, followed by massive sequence loss, divergence, and segmental duplication. In addition, subtelomeric regions have been subjected to further duplications and rearrangements via ectopic exchanges (as reviewed by Liti and Louis 2005).

With its long read lengths and high accuracy, capillary electrophoresis-based sequencing has been the gold standard for de novo genome sequencing projects in past decades. Although, the shotgun Sanger approach has been used more frequently to sequence many cultured microorganisms, the application of NGS in the de novo sequencing and assembling of genomes is becoming widespread. The first NGS-sequenced genomes were from bacteria *Mycoplasma genitalium* (580 kbp), *Streptococcus pneumoniae* (2.1 Mbp) (Margulies et al. 2005), *Pseudomonas syringae* pv. *oryzae* (Reinhardt et al. 2009) and *Pseudomonas syringae* pv. *syringae* (6 Mbp) (Farrer et al. 2009), and from yeast *Saccharomyces cerevisiae* (13.1 Mbp) (Qi et al. 2009), due to the small size of their genomes and reduced repeat regions as compared to higher eukaryotic genomes. Currently, the application of next-generation technologies for de novo sequencing of considerably larger, more complex, and often repeat-rich genomes is still laborious and requires elaborate assembly strategies and sophisticated hardware resources. NGS reads contain a high error rate, which can be overcome with high coverage because the higher number of reads effectively “quenches” errors in single reads and leads to overall high accuracy in the final assembly (Ilie et al. 2011; Yang et al. 2010). Another concern is related to short sequence reads (e.g., 35–50 bases), which need 25- to 30- fold coverage of the genome to capture all the genetic

information. Since the mapping process is based on unique short sequence reads within the genome, increasing the number of reads alone would not be able to overcome this problem because of the presence of repeat regions, which cannot be assembled from reads that are shorter than the lengths of the repeats.

Considering that the Illumina/Solexa platform relies on millions of small reads with a high coverage, whereas the 454 generates larger fragments over 400 nucleotides (see Table 1), the 454 has been generally considered more adapted to genomes containing abundant repeated regions. This situation is being improved by (1) the longer read length using better extension reagents and chemistries; (2) the development of paired-end tag (PET) sequencing approaches also for NGS platforms, in which both ends of a fragment of defined size are sequenced to provide more information about the fragment; and (3) novel assembly algorithms that can deal with large numbers of short reads. Due to this continuous upgrading, NGS was applied also for eukaryotic de novo genome sequencing. NGS was first used in combination with Sanger sequencing, for sequencing the genomes of plant *Vitis vinifera* (Velasco et al. 2007), the filamentous fungus *Grosmannia clavigera* (Diguistini et al. 2009) and the cucumber *Cucumis sativus* (Huang et al. 2009). The first two eukaryotic genomes to be assembled solely from NGS reads are those of the giant panda (Li et al. 2010), assembled from Solexa reads, and the filamentous fungus *Sordaria macrospora*, assembled from a combination of Solexa and 454 reads (Nowrousian et al. 2010). Until now, no de novo genome sequencing project from yeasts has been completed using NGS technology alone. However, successful sequencing projects in other lineages have demonstrated the feasibility of NGS for accurate, cost-effective, and rapid de novo assembly of eukaryotic genomes and it is only a matter of time until NGS-based approaches are applied to yeasts on a broad scale (Imelfort and Edwards 2009; Turner et al. 2009).

Genotype-phenotype association mapping

The genetic basis of phenotypes have traditionally been identified by genetic selections and/or screens followed by Sanger sequencing. These approaches include the analysis of plasmid-based genomic libraries and gene-disruption libraries. Other traditional methods have been based on whole-genome array, comparative genome hybridization or single-nucleotide polymorphism (SNPs) arrays to capture causal loci. In these experiments, the ability to probe every gene present in an organism is limited by the number of cells that can be screened and the number of targets that can be sequenced. Therefore, in addition to being labor intensive and costly, these traditional methods are not suitable for

identifying all the relevant genes produce underlying complex traits.

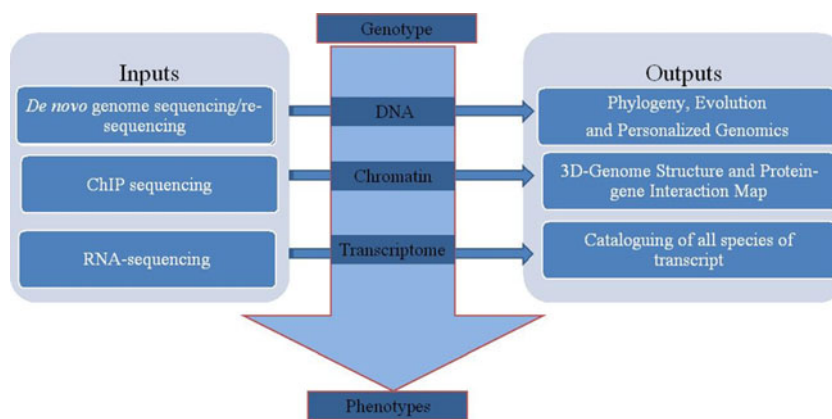
Advances in NGS technologies have lessened the costs of DNA sequencing significantly down to the level that genotype-phenotype association mapping is now feasible also for complex microbial phenotypes. NGS platforms can be applied at three levels to elucidate genotype-phenotype relationships (Fig. 3). The first is the identification of individual genetic variation within a population for which a reference genome is available (re-sequencing). Sequence reads that are mapped to a reference genome were used to detect SNPs, small insertions or deletions (indels), and large-scale structural variations, such as copy number variations (CNV), thereby improving our knowledge on evolutive mechanisms shaping genome and phenotype diversity within a species (Nowrousian et al. 2010). The second and third levels are the adoptions of NGS technologies for high-throughput studies that were previously performed mostly by hybridization-based methods such as microarrays. In this context, it is worth mentioning the use of NGS for transcriptomics (RNA-seq) or the genome-wide analysis of DNA/protein interactions (ChIP-seq) (Fig. 3).

Re-sequencing: getting to individual variants

One genome sequence is inadequate to describe the complexity of species, genera and their inter-relationships. Multiple genome sequences are needed to describe the pan-genome, which represents approximately the genetic variability of a microbial species. Re-sequencing implies sequencing of genomes from species for which a reference genome is already available in public databases, and is currently one of the major areas of application of NGS. NGS-produced short sequence reads can be aligned efficiently to reference genomes. Consequently, mapped sequence reads are very useful in order to detect and evaluate individual genetic variations with a high level of confidence.

As the 454 platform has a read length appropriate for sequence assembly, and a library construction approach that avoids cloning bias, several studies using this method have been published. The most ambitious one involves sequencing over 1,000 individual human genomes in order to map human genetic variation at a fine scale and to support genome-wide phenotypic and disease association studies (<http://www.1000genomes.org/>). For yeasts (Carter 2009), filamentous fungi (e.g., <http://www.jgi.doe.gov/genome-projects/>; <http://www.broadinstitute.org/science/projects/fungal-genome-initiative>) and several LAB species, there is already more than one genome available or sequencing is still in progress (Table 2). Liti et al. (2009) compared the whole genomes of several isolates of *S. cerevisiae* and its closest relative, *Saccharomyces paradoxus*, to find

Fig. 3 Three-levels of contributions of NGS to genotype-phenotype association mapping



a high correlation between phenotypic variation and global genome-wide phylogenetic relationships. This study demonstrated that *S. cerevisiae* wine strains are usually polyclonal and differ significantly in enological performance and genotype. The extent of genetic differences ranges from single-nucleotide substitutions to whole-genome duplication (Sipiczki 2011).

Information collected by resequencing is used to identify individual genetic variations responsible for mutated phenotypes or functional properties involved in food quality, safety and shelf life. Whole genome mutational profiling can be applied, for instance, to mapping the genetic differences between toxin producers and non-toxinogenic variants of food-borne disease pathogens, or between wild-type strains and strains optimized for food and industrial starter applications. Using the Illumina/Solexa platform, Studholme et al. (2010) highlighted virulence factors genes in *Xanthomonas campestris*. Smith et al. (2008) resequenced a mutant strain of *Pichia stipitis* with three NGS technologies: 454 Life Sciences (Roche), Illumina (formerly Solexa), and SOLiD (Applied Biosystems). This yeast has been evolved adaptively over a period of 7 years in order to obtain a more efficient xylose fermenting mutant. With 10- to 15-fold redundant genome coverage, all three sequencing technologies identified the same 17-point mutations, 10 of which resulted in an amino acid change within protein-coding genes.

NGS-driven mutational profiling can also address open questions such as mutation rates in evolving populations and their correlation to adaptation. This topic is of particular interest, considering those microorganisms living in foods are constantly exposed to fluctuating environmental conditions, and many of these conditions are potentially detrimental and stressful. DNA instability was demonstrated to sharply elevate spontaneous mutation rates in a *Lb. plantarum* strain in order to transiently enhance its ability to adapt to environmental changes (Machielsen et al. 2010). Whole-genome sequencing efforts were performed for tracking the regions of the genome that contain genetic variants that affect yeast phenotypes evolved under controlled laboratory

conditions (Araya et al. 2010; Lynch et al. 2008). Finally, NGS technologies have been combined efficiently with traditional genetic techniques for mapping complex quantitative traits in *Drosophila simulans* (Andolfatto et al. 2011) and yeasts (Birkeland et al. 2010).

RNA-seq

Analysis of gene expression has been a primary tool to study cellular mechanisms. For profiling mRNA populations, microarrays have dominated for more than a decade, providing gene expression information at relatively low cost and increased throughput. Although microarrays are now used widely for monitoring transcript expression, hybridization-based technologies have several important limitations. First, low-abundance transcripts cannot be measured accurately. Second, discovery of novel transcripts is limited. Third, direct comparison of transcripts within an individual sample is inaccurate because hybridization kinetics for individual mRNAs are sequence dependent, necessitating ratiometric comparison between paired samples (Croucher and Thomson 2010).

RNA-sequencing transcriptomics (RNA-seq) is an emerging NGS platforms-based approach for comprehensive identification and quantification of transcripts independent of any annotated sequence feature (Pachter 2011). This methodology allows us to (1) catalogue and improve the annotation of all species of transcripts, including protein encoding mRNAs as well as (small) non-coding regulatory, structural or catalytic RNAs; (2) determine the transcriptional structure of genes in terms of start sites and 3' ends, splicing patterns and other maturation processes; and (3) quantify the changing expression level of each transcript under different conditions over the full dynamic range of cellular RNA expression (Zhou et al. 2010).

In microbiology, an integrated RNA-seq and tiling array approach was first applied to characterize transcripts of *Mycoplasma pneumoniae* (Züell et al. 2009). Subsequently, RNA-seq was applied to map transcription start sites in *Helicobacter pylori* (Sharma et al. 2010) and to analyze the transcriptome in the typhoid bacillus *Salmonella typhi*

Table 2 Overview of the major whole genome sequencing projects generated using NGS technologies for some food microorganisms

| Species (strain) | Origin | GenBank accession no. | Size (Mb) | Sequencing platform | Biological role | Reference |
|---|-------------------------------------|--|----------------|---|--|----------------------|
| LAB | | | | | | |
| <i>Lactobacillus casei</i> (BD-II) | Homemade Koumiss, China | CP002618 | 3.1 | Roche 454 and Solexa (Illumina) | Probiotics | Ai et al. 2011 |
| <i>Lactobacillus delbrueckii</i> subsp. <i>bulgaricus</i> (ND02) | Fermented Yak milk, China. | CP002341 | 2.1 | Roche 454 and Solexa (Illumina) | Dairy starter for yoghurt production | Sun et al. 2011 |
| <i>Lactobacillus plantarum</i> (ST-III) | Kimichi | CP002222 | 3.3 | Roche 454 and Solexa (Illumina) | Probiotic supplement for dairy and food products | Wang et al. 2011 |
| <i>Lactobacillus casei</i> (LC2W) | Traditional dairy product, Mongolia | CP002616 CP002617 | 3.0 | Roche 454 and Solexa (Illumina) | Probiotics | Chen et al. 2011 |
| <i>Lactobacillus buchneri</i> (NRRL B-30929) | Ethanol plant | CP002653 CP002654 | 2.5 | Whole-genome shotgun strategy using Roche 454 Titanium pyrosequencing | Prevention of silage spoilage by yeast and molds and anti-bacterial property | Lui et al. 2011 |
| <i>Lactobacillus ruminis</i> (ATCC 27782) | Bovine and human intestine | CP002655 XXYYZZ123 ^a | 2.1 | Roche 454 and Solexa (Illumina) | Probiotics | Fortle et al. 2011 |
| <i>Lactobacillus farciminis</i> (KCTC 3681) | Kimichi, Korea | AEOT0000000 AEOT01000000 | 2.5 | Whole-genome shotgun strategy using Roche 454 Titanium pyrosequencing | Kimichi fermentation | Nam et al. 2011a |
| <i>Lactobacillus coryniformis</i> subsp. <i>coryniformis</i> (KCTC 3167) | Kimichi, Korea | AELK0000000 AELK01000000 | 3.0 | Whole-genome shotgun strategy using Roche 454 Titanium pyrosequencing | Kimichi fermentation | Nam et al. 2011b |
| <i>Weissella koreensis</i> (KACC 15510) | Kimichi, Korea | CP002899 | 1.4 | Roche 454 GS FLX Titanium pyrosequencing | Kimichi fermentation | Lee et al. 2011 |
| Other bacteria | | | | | | |
| <i>Salmonella enterica</i> serovar <i>typhi</i> (CT18 and Ty2) | Contaminated food and water | AL513382 AE014613 AE006468 CP000026 | ^b — | Roche 454 and Solexa (Illumina) | Food spoilage | Holt et al. 2008 |
| Yeasts | | | | | | |
| <i>Saccharomyces cerevisiae</i> : S288C and RMII-1a | — | — | 4.4/5.2 | Solexa (Illumina) | Bakery and beverages | Qi et al. 2009 |
| Lalvin QA23 | Lallemand Inc. Maurivin | ADV000000000 ADVS000000000 | 11.6 11.6 | Roche 454 GS FLX Titanium Roche 454 GS FLX Titanium | Wine | Borneman et al. 2011 |
| Vin13 | Anchor Bio-Technologies | ADXC000000000 | 11.5 | Roche 454 GS FLX Titanium | Wine | |
| FostersO | Fosters Group Ltd. | AEEZ000000000 | 11.4 | Roche 454 GS FLX Titanium | Brewing | |
| FostersB | Fosters Group Ltd. | AEHH000000000 | 11.5 | Roche 454 GS FLX Titanium | Brewing | |
| VL3 | Laffort | AEJS000000000 | 11.4 | Roche 454 GS FLX Titanium | Wine | |
| 13 strains involved in fermentation and 3 in baking | — | — | — | ABI 3730 and Solexa (Illumina) | Bakery and beverages | Liti et al. 2009 |
| <i>Saccharomyces paradoxus</i> 35 strains from different geographical regions | — | — | — | ABI 3730 and Solexa (Illumina) | Bakery and beverages | Liti et al. 2009 |

^a Finished genome sequence of ATCC 27782^b Not reported in this review

(Perkins et al. 2009) and archeon *Sulfolobus solfataricus* (Wurtzel et al. 2010). These studies revealed a high transcriptome complexity and redundancy in both Bacteria and Archaea, where riboswitch elements and chromosomally encoded cis-antisense transcripts are common forms of regulation. Moreover, different promoters appear to be driving expression of the same genes under different conditions, leading to the division of genes into “suboperons” (Croucher and Thomson 2010; Sorek and Cossart 2010; Van Vliet 2010).

Similarly, RNA-seq has led to the discovery of the high complexity of the eukaryotic transcriptional landscape (Nagalakshmi et al. 2008; Wilhelm et al. 2008). The existence of various classes of non-coding RNAs originating from pervasive transcription of eukaryotic genomes suggested new levels of regulation of gene expression and genome plasticity (Berretta and Morillon 2009). Recently, tiling arrays and sequencing were employed in the discovery of widespread bidirectional promoters in *S. cerevisiae* (Neil et al. 2009; Xu et al. 2009). These studies revealed that transcription of the two main classes of non-coding RNAs in yeast initiates predominantly from the promoter regions of protein-coding genes, suggesting that bidirectionality is an intrinsic feature of eukaryotic promoters.

ChIP-seq

NGS technologies offer the potential to substantially accelerate the study of heritable gene regulation that does not involve the DNA sequence itself but its modifications and higher-order structures, including posttranslational modifications of histones, interaction between transcription factors and their direct targets, nucleosome positioning on a genome-wide scale and characterization of DNA methylation patterns (Chung et al. 2010; Fous et al. 2010; Pareek et al. 2011). In particular, architectural proteins drive compaction and organization of genomic material into chromatin, modulating DNA accessibility and consequently numerous cellular processes, including transcription, replication and repair. Understanding how various factors regulate transcription elongation in living cells has been aided greatly by chromatin immunoprecipitation (ChIP) studies, which can provide spatial and temporal resolution of protein-DNA binding events. The coupling of ChIP and high-throughput sequencing technologies (ChIP-seq) has significantly facilitated the whole-genome mapping of DNA-binding protein sites.

Although, ChIP-seq gained rapid support in eukaryotic systems, it remained underused in the mapping of bacterial transcriptional regulator-binding sites. To date, very little is known about DNA folding in Bacteria and Archaea. Even though no relevant literature exists yet for food-related microorganisms, it is expected that ChIP-seq will soon be applied to this field. In comparison to its array-based

predecessor, i.e., ChIP-chip technology, ChIP-seq offers higher resolution, lower noise and better coverage. With the ever-decreasing cost of sequencing, ChIP-seq has become an indispensable tool for studying gene regulation and epigenetic mechanisms (Schmid and Bucher 2007).

Community profiling

The basic goal of community profiling in relation to food microbiology is to understand the relationships among community composition, microbial functions, and their impact on food sensorial properties. Exploring microbial diversity is critical in order to evaluate each introduced or indigenous species in food processing, as well as to ascertain the role of microorganisms as food pathogens, in food spoilage, or as potential starter cultures. Fermented food in particular comprises complex and diverse communities of microorganisms, which are vital in catalyzing desired biochemical transformations and in maintenance of food quality. Since shifts in these populations determine changes in the final composition, in past decades food microbial diversity was explored by both cultivation-dependent and independent methods.

Generally, it is hard to determine entire microbial populations in food using culture-based techniques owing to their resistance to culture under standard laboratory conditions (Riesenfeld et al. 2004). Even traditional culture-independent approaches, including denaturing gradient gel electrophoresis (DGGE), temperature gradient gel electrophoresis (TGGE), terminal restriction fragment length polymorphism (T-RFLP), fluorescence in situ hybridization (FISH), single stranded conformation polymorphisms (SSCP), quantitative PCR (qPCR), and DNA microarray, have inherent pitfalls (as reviewed by Amann et al. 1995; Giraffa and Neviani 2001; Hugenholtz et al. 1998; Jany and Barbier 2008; Wintzingerode et al. 1997).

Alternatively, sequencing of PCR-amplified libraries targeted to phylogenetic barcodes (like 16S rRNA genes) is a culture-free approach that basically relies on (1) PCR amplification of 16S rRNA from DNA bulk-extracted from an environmental or food sample, using universal primers for Eukarya, Bacteria and Archaea; (2) construction of DNA clone libraries; and (3) Sanger sequencing. The recent introduction of NGS techniques eliminates the time-consuming steps of in vivo cloning, colony picking, and capillary electrophoresis, allowing the study of complex microbial communities from global soil (Fierer et al. 2007; Leininger et al. 2006), deep mines (Edwards et al. 2006), ocean (Angly et al. 2006; Sogin et al. 2006), human microbiome (Qin et al. 2010), and fermented food (Table 3). To date, 454 pyrosequencing has been the platform most used for 16S amplicon (16S pyrotags) surveys (Tringe and Hugenholtz 2008),

Table 3 Application of NGS technologies to food microbial community surveys

| Product | Product description | Biological role/application | Origin/country | Platform | Microbes identified | Reference |
|--|---|---|--|--|--|---|
| Nukaoko | Naturally fermented rice bran mash | Pickling vegetables | Japan | 16S-Pyrosequencing | <i>Lactobacillus namurensis</i> and <i>Lactobacillus acetolerans</i> | Sakamoto et al. 2011 |
| Jeotgal 'fermented seafood' | Jeotgal is made of fish or shellfish, such as shrimp, oysters, fish roes, and fish tripes with lots of salt | Consumed as side food or used as ingredient to improve the flavor of other food such as Kimichi | Korea | Multiplex barcoded pyrosequencing | Archaea and Bacteria | Roh et al. 2010 |
| Soft drinks | Beverages | Food spoilage | United Kingdom | 26S rDNA Sequencing | <i>Candida davenportii</i> sp. nov. | Stratford et al. 2002 |
| Danish raw milk cheese | Dairy product | Food product | Denmark | 16S rRNA gene sequencing | <i>Lactococcus</i> , <i>Lactobacillus</i> and <i>Streptococcus</i> spp. | Masoud et al. 2011 |
| Ben-saalga | Fermented food made by cooking pearl millet slurries | Consumed by adults and infants as complementary food to breast feeding | Burkina Faso, West Africa | Tagged 16S rRNA gene | <i>Firmicutes</i> (<i>Lactobacillus</i> , <i>Pediococcus</i> , <i>Leuconostoc</i> , and <i>Weissella</i> genera), <i>Proteobacteria</i> , <i>Actinobacteria</i> , and <i>Bacteroidetes</i> spp. | Humblot and Guyot 2009 |
| Meju | Traditional Korean fermented soybean bricks | For preparation of Korean soy sauce (Ganjang) and soybean paste (Doenjang) | Korea | Barcoded 16S rRNA gene pyrosequencing | <i>Firmicutes</i> (<i>Bacillus</i> and Lactic acid bacteria of <i>Lactococcus</i> genera), <i>Enterococcus</i> and <i>Bacteroidetes</i> spp. | Kim et al. 2011 |
| Fermented shrimp, kimchi, and sauerkraut | Fermented Food | Food products | Asia and Europe (Fermented Shrimp), China, Korea (Kimchi), Eastern Europe and North America (Sauerkraut) | Barcoded 16S rRNA gene pyrosequencing | <i>Pseudomonas</i> , <i>Cupriavidus</i> and <i>Propionibacterium</i> spp. | Park et al. 2011 |
| Fen liquor | Fermented light-fragranced distilled liquor | Beverages | China | 16S rRNA gene sequencing and ITS region pyrosequencing | <i>Lactobacillus acetolerans</i> , <i>S. cerevisiae</i> , <i>Issatchenkia orientalis</i> and of <i>Saccharomycopsidaceae</i> family | Li et al. 2011 |
| Beef meat | Meat product | Food product | Italy | Pyrosequencing | <i>Brochothrix Thermosphacta</i> , <i>Pseudomonas</i> spp., <i>Carnobacterium</i> | Ercolini et al. 2011 |
| Kefir | Fermented milk beverages | Health benefits | Tibet and China Ireland | Pyrosequencing | <i>divergens</i> , and LAB <i>Lactobacillus kefirifaciens</i> ZW3 <i>Lactobacillus</i> spp. | Wang et al. 2011; Dobson et al. 2011 |

although the Illumina/Solexa sequencing platform has been applied recently for sequencing paired-end libraries of 16S amplicons (iTags) from a microbial community (Degnan and Ochman 2011). However, NGS-assisted and clone-and-sequencing 16S surveys are not mutually exclusive. The clone-and-sequence approach provides a valuable reference base or ‘gold standard’ for the high-throughput NGS technologies in order to identify novel and phylogenetically accurate lineages in the life tree (Tringe and Hugenholtz 2008).

Despite their huge potential in microbial community profiling, NGS techniques encounter some pitfalls. Universal primers have demonstrated a bias in the detection of high GC content bacteria (Farris and Olson 2007). Being ubiquitous in nature, 16S rRNA genes may not have enough variability in order to assign taxonomy to genus and species level (Juste et al. 2008). Furthermore, the presence of multiple copies of 16S rRNA genes may also negatively affect microbial identification and characterization (Riesenfeld et al. 2004). Another disadvantage of pyrosequencing-assisted microbial profiling is the short sequence reads ranging from 100 bp on an average for the GS 20 (Genome Sequencer 20 DNA Sequencing System, 454 Life Sciences, Bradford, CT) to 200–300 bp for the newer GS FLX (Genome Sequencer FLX System, 454 Life Sciences). To make pyrosequencing technology suitable for 16S survey, Sogin et al. (2006) first PCR-amplified the short 16S rRNA V6 variable region from eight distinct environments using universal primers, then processed them separately in a single 454 run, producing 118,000 16S pyrotags. A follow-up study, also using GS20 technology, generated more than 900,000 bacterial and archaeal 16S pyrotags (Huber et al. 2007). Subsequently, NGS-assisted community profiling has been employed successfully to different food ecosystems (Table 3), allowing the comparative analysis of population dynamics in relation to altered environmental and processing parameters. For example 16S pyrosequencing and quantitative RT-PCR highlighted the presence of some uncultured mesophilic Crenarchaeota phlyotypes other than *Firmicutes* and *Proteobacteria* in some fermented seafood (Roh et al. 2010). To increase the number of samples that can be analyzed at a time, sample-specific key sequences of few nucleotides, called ‘barcodes’ or ‘tags’, were implemented recently in a pyrosequencing platform to evaluate multiple related samples (e.g., spatial and temporal series) in parallel (Binladen et al. 2007; Hamady et al. 2008; Parameswaran et al. 2007). This multiplex barcoded pyrosequencing was used successfully to simultaneously profile a large number of seafood samples (Roh et al. 2010). Another study revealed that different processing conditions have huge impacts on microbial profile during the course of fermentation of pearl millet slurries (Humblot and Guyot 2009).

Metagenomics: beyond community profiling

Metagenomics (also referred to as environmental and community genomics) is a term first introduced by Handelsman et al. (1998) to describe sequence-based analysis of the collective microbial genomes of uncultured microbes contained in an environmental sample in order to understand their diversity, function, and cooperation/behavior in an ecosystem and how they evolved during the course of evolution (Mitra et al. 2011; Ghosh et al. 2011). In contrast to community profiling, metagenomics efforts aim at sequencing all genes present in a habitat rather than just 16S, thereby providing clues regarding the functionalities of a community rather than just its phylogenetic composition.

Traditionally, metagenomic approaches enabled the cloning of total microbial DNA directly into a large-insert library, without prior amplification of particular genes, to avoid PCR-associated bias. Alternatively, small-insert libraries and Sanger sequencing-derived shotgun sequencing were successfully applied to metagenomic studies (Tyson et al. 2004). Constructing food-based libraries involves the same methods as the cloning of genomic DNA of individual microorganisms; that is, fragmentation of food DNA by restriction-enzyme digestion or mechanical shearing, insertion of DNA fragments into an appropriate vector system, and transformation of the recombinant vectors into a suitable host. Although the generation of food libraries is conceptually simple, the enormous size of food metagenome and the large number of clones that are to be screened by functional and sequence-based approaches make this task daunting. In 2006, the first sequences of two different soil samples generated using pyrosequencing were published (Edwards et al. 2006). Since then, several metagenomic outcomes have relied on 454 pyrosequencing to analyze environmental samples, increasing throughput and avoiding Sanger sequencing-associated cloning steps.

Compared to environmental microbiology, few studies to date have been carried out to identify the pathways or enzymes responsible for significant food processes. Functional analysis has elucidated metabolic pathways (e.g., antibiotic and vitamin biosynthesis) (Entcheva et al. 2001; Eschenfeldt et al. 2001; Rondon et al. 2000), and identified novel antibiotics, degradative enzymes, and bioactive compounds (Henne et al. 2000), and also led to the discovery of biocatalysts (e.g., lipolytic genes and polysaccharide degrading/modifying enzymes) (Rondon et al. 2000). More recently, Jung et al. (2011) used pyrosequencing to analyze metabolic potential of the fermenting microbial community from kimchi—a traditional Korean food produced by fermentation of vegetables such as Chinese cabbage and radish. Similarly, the Illumina/Solexa sequencing technique was employed to assemble a genome map of the human gut

microbiome (Qin et al. 2010). It can be predicted that NGS-assisted food metagenomics will have great relevance to the identification of the genes responsible for characteristic properties and functionalities such as probiotic activity, flavor formation and taste development.

Finally, complementary approaches to metagenomics, e.g., meta-metabolomics (the study of all the naturally occurring molecules in a biological sample) and metatranscriptomic (deep sequence surveys of expressed genes from overwhelmingly complex metagenomes), contribute significantly to clarify microbial behaviors in food ecosystems. An in-depth discussion of the technical and methodological aspects of these meta-“omics” approaches is beyond the scope of this review and can be found in the literature (Morales and Holben 2011; Raes and Bork 2008). Integration among metagenomic, transcript and metabolic information is critical to investigate relationships among metabolite production, metabolic potential, and ecological composition of the food microbial community, connecting this “omic” information in the context of space and time (Raes and Bork 2008). The analysis of microorganisms in different environments and the quantification of metabolic fluxes can be of crucial importance to better understand microbial roles in food.

Practical applications of NGS to food microbiology

Food safety and process optimization

A principal challenge for the food industry is to produce safe foods with the desired functionalities using minimal processing technologies. Whole genome characterization of undesirable microorganisms in food stuff is the first step towards prevention of food spoilage. NGS could have important applications in reducing the risks of food-borne diseases due to the huge improvements in the rate at which the whole genome of food microorganisms from different species and from strains belonging to the same species can be generated. Bacterial whole-genome sequencing was applied to typing *Lysteria monocytogenes* strains associated to meat products (Gilmour et al. 2010), methicillin-resistant *Staphylococcus aureus* (Harris et al. 2010), non-typhoidal *Salmonella* spp. (Andrews-Polymenis et al. 2009) and *E. coli* strains (Brzuszkiewicz et al. 2006). Moreover, the comparison of whole genome data collected by NGS studies has elucidated the role of SNPs in different pathogenic phenotypes and the evolutive mechanisms in emerging pathogenicity (He et al. 2010). Recent outbreaks in peanut butter and peanut paste products associated with *Salmonella* across the United States were monitored by pyrosequencing (Liu 2009). In this regard, inclusion of high-pressure processing steps in peanut product manufacturing reduced the population

of *Salmonella* as confirmed by pyrosequencing (Liu 2009). Pyrosequencing of the variable V3 region of 16S rRNA gene from fermented foods in Nigeria (such as Kuna-zaki and Ogi) revealed the presence of phylotypes corresponding to potential pathogenic microorganisms such as *Clostridium perfringens* and *Bacillus cereus*, and consequently highlighted the need for more controlled and optimized fermentation conditions to ensure the good health and well being of consumers (Oguntoyinbo et al. 2011).

Environmental and processing parameters such as the quality of raw material, selection of bacterial combinations to be used as starter cultures, and controlled fermentation conditions, shape population structures and dynamics in food. These fluctuations should be considered properly during fermentation processes and should be monitored by fast and cost-effective 16S tagged NGS approaches. Accordingly, 16S tagged pyrosequencing in conjunction with qPCR showed that bacteria grew during fermentation of the traditional Chinese fragranced-liquor called fen liquor, while fungi remained stable (Li et al. 2011). This latter study suggested that simultaneous quantification of bacteria and fungi during food fermentation processes can be used for tracking the corresponding variations in biochemical composition. Other NGS-assisted studies have linked microbial composition to environmental and process parameters. For example, meat quality is strictly dependent on storage: the complex shift in microbiota and secreted metabolites (butanoic acid and acetoin) under different conditions was checked by pyrosequencing and gas chromatography/mass spectrometry, respectively (Ercolini et al. 2011). With the increasingly widespread use of NGS, it is reasonable that data generated by NGS and other “omics” techniques (i.e., transcriptomic and metabolomics) will be integrated by mathematical algorithms into a system model at the species and “meta”-species levels, so that environmental and processing parameters will be predictive of species composition in food (Fig. 1).

NGS-assisted starter optimization

Selection and dominance of a starter culture on indigenous population in fermented food can speed up fermentation significantly and increase sensorial properties. Phenotypic investigations compare the metabolic behaviors of different strains to select the most promising strains for further targeted starter optimization (Wittmann and Hinzle 2002). The engineering of microbial cells possessing desired functions for industrial and food production can be greatly improved by massive sequencing coupled with computational techniques to identify genes and genomes related to relevant phenotypes. A rational and whole genome-assisted choice of starter cultures can have a big impact on food safety, quality and recently also on health benefits, for example in

the case of probiotics, which could be rationally designed and developed so as to maintain the correct balance of the microbial community and to ensure good health and well being in humans (O’flaherty and Klaenhammer 2011; Van Hylckama Vlieg et al. 2011). Direct pyrosequencing of oral metagenomes revealed the presence of certain microbes playing a role against cariogenic microbes and suggested the use of these microbes in the formulation of probiotics to prevent dental caries and promote oral health (Rademaker et al. 2006; Belda-Ferre et al. 2011). Moreover, pyrosequencing was used to unravel the genetic basis of improvement in colitis inflammation upon consumption of fermented milk product containing *Bifidobacterium animalis* subsp. *lactis* (Veiga et al. 2010).

Another field in which NGS-assisted starter optimization is maturing is the study of wine yeast. An annotated genome sequence for *S. cerevisiae* is available, which provides a framework for genome-scale metabolic network reconstruction (Borneman et al. 2007). Given the wealth of experimental and computational data available for *S. cerevisiae*, several studies have begun to integrate biological and computational data sources to provide a holistic view of yeast cellular processes (Borneman et al. 2011; Herrgård et al. 2010). Such reconstructions offer biochemical models describing the formation and depletion of each metabolite, and provide simulations of how the metabolic network operates at different conditions on the basis of mass-balance boundary conditions. Thanks to these stoichiometric models, relationships between gene functions can be predicted. For this purpose, whole genome Illumina/Solexa sequencing was used to identify SNPs between strain S288c and an evolved strain obtained after rounds of directed evolution (Otero et al. 2010). This genome-assisted selection can be applied to wine strains in order to understand how differences in fermentation behavior and wine flavor are related to genomic and transcriptional profile differences and, furthermore, how these characteristics can be modulated logically to tailor wine composition.

Future prospects and conclusions

Raes and Bork (2008) wrote that ‘to be successful, however, any systems-biology study requires data on three important aspects of the system: the ‘parts list’; the connectivity between the parts; and the placement of connectivity in the context of time and space’. This holistic knowledge can be translated to food ecosystems to predict the behaviour of microbial cells in silico. By allowing DNA/RNA to be assayed more rapidly than previously possible, NGS technologies promise a deeper understanding of microbial genomes and biology by providing a “part list”. Meanwhile NGS technologies have improved our ability to routinely

profile food microbial ecosystems and to make genotype–phenotype correlations, identifying the genetic basis of complex phenotypes, engineering new phenotypes, and combining beneficial phenotypes in industrial hosts. Hence, high-throughput sequencing can play a key role in whole genome-assisted optimizing of food starter cultures. It is reasonable that future challenges will be aimed at achieving connectivity between data generated by NGS and other “omics” techniques in the context of time and space. This integration will provide comprehensive genetic maps of important food traits, as well as predictive models of the contribution of individual microorganisms in the development of food quality and safety.

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