



# **Navigating Microbiological Food Safety in the Era of Whole-Genome Sequencing**

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## <span id="page-0-0"></span>**SUMMARY**

The epidemiological investigation of a foodborne outbreak, including identification of related cases, source attribution, and development of intervention strategies, relies heavily on the ability to subtype the etiological agent at a high enough resolution to differentiate related from nonrelated cases. Historically, several different molecular subtyping methods have been used for this purpose; however, emerging techniques, such as single nucleotide polymorphism (SNP)-based techniques, that use whole-genome sequencing (WGS) offer a resolution that was previously not possible. With WGS, unlike traditional subtyping methods that lack complete information, data can be used to elucidate phylogenetic relationships and disease-causing lineages can be tracked and monitored over time. The subtyping resolution and evolutionary context provided by WGS data allow investigators to connect related illnesses that would be missed by traditional techniques. The added advantage of data generated by WGS is that these data can also be used for secondary analyses, such as virulence gene detection, antibiotic resistance gene profiling, synteny comparisons, mobile genetic element identification, and geographic attribution. In

addition, several software packages are now available to generate *in silico* results for traditional molecular subtyping methods from the whole-genome sequence, allowing for efficient comparison with historical databases. Metagenomic approaches using next-generation sequencing have also been successful in the detection of nonculturable foodborne pathogens. This review addresses state-of-the-art techniques in microbial WGS and analysis and then discusses how this technology can be used to help support food safety investigations. Retrospective outbreak investigations using WGS are presented to provide organism-specific examples of the benefits, and challenges,

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associated with WGS in comparison to traditional molecular subtyping techniques.

## <span id="page-1-0"></span>**INTRODUCTION**

**F**oodborne pathogens are major causes of morbidity and mortality throughout the world, and the ability to conduct epidemiological investigations and intervene in foodborne illnesses is a critical part of the existing public health infrastructure. Molecular subtyping of the etiological microorganisms is an important tool for such investigations. At any time, several strains of a given foodborne pathogen may be cocirculating through a population and this redundancy can confound epidemiological investigations. Subtyping strategies are used to identify organisms to a higher phylogenetic resolution than the species level so that cooccurring outbreaks can be differentiated, sources of contamination can be identified, and intervention strategies can be enacted. To be useful, subtyping schemes must be able to clearly and accurately resolve the relatedness of several microbial isolates, so that linked cases are identified and included in the investigation. It is equally important that concurrent, nonrelated, and sporadic cases can be differentiated from outbreak cases so as not to confound the investigation. The latter is becoming increasingly important since the complexity of the modern food supply chain is vast and food products and ingredients can be sourced from locations distributed over entire continents and unrelated outbreaks may geographically and temporally overlap. High-resolution subtyping should result in more cases linked to defined outbreaks and more confidence in the identification of outbreak sources. Second- and third-generation sequencing platforms have advanced microbial whole-genome sequencing (WGS) to the point where it has become available for routine use in research and reference laboratories and etiological microorganisms can be sequenced in real time during an outbreak. The data, once analyzed and interpreted, can then be readily used in investigations. WGS surveillance of foodborne pathogens is already being applied routinely by several national authorities, including the Food and Drug Administration (FDA) in the United States, Public Health England, and the Statens Serum Institut in Denmark [\(1\)](#page-13-2). WGS is fast and cheap and produces subtyping and phylogenetic resolution on a scale that was never before achievable, even when combining the results of several other molecular subtyping schemes. In this review, we examine numerous ways in which WGS can contribute to the management of foodborne microbial hazards.

#### <span id="page-1-1"></span>**SUBTYPING TECHNIQUES**

In outbreak investigations of bacterial foodborne illnesses, culture-dependent methods are generally used to obtain an isolate from the implicated food products, production facilities, and affected individuals—isolation is still critical because of the legal implications associated with any regulatory actions or public health interventions taken. After this initial step for culturable organisms, and as a starting point for nonculturable organisms (e.g., norovirus [NoV]) phage typing, serotyping, or molecular methods can be used to subtype the strain. Molecular subtyping techniques can be divided up into techniques that use amplification, restriction digestion, or DNA sequencing, as deemed appropriate to the pathogen under investigation.

## <span id="page-1-2"></span>**Serotyping**

Serotyping is a method of grouping microorganisms on the basis of the reaction between a given antiserum and cell surface antigens that allows classification to the subspecies level. The serotyping of most bacterial species is based on the detection of flagellar and somatic antigens [\(2\)](#page-13-3), though capsular antigens may also be used [\(3\)](#page-13-4). Serotyping of *Clostridium botulinum*, however, relies on the detection of different types of neurotoxin but also uses serology [\(4\)](#page-14-0).

# <span id="page-1-3"></span>**Phage Typing**

Phage typing has been used as an epidemiologic tool to differentiate isolates of *Salmonella* and *Escherichia coli* O157:H7 beyond the serotype level for several decades [\(5](#page-14-1)[–](#page-14-2)[7\)](#page-14-3). Phage typing relies on the detection of bacterial lysis by a specific standardized phage [\(6\)](#page-14-2). Though of limited discrimination, phage typing has been used in combination with verotoxin typing to identify linked cases of *E. coli* O157:H7 infection [\(8\)](#page-14-4). Highly clonal *Salmonella* serovars require additional subtyping during large-scale surveillance efforts, and phage typing was useful for this [\(9\)](#page-14-5). However, the use of phage typing was ultimately limited because it has poor resolving ability, is expensive, and requires technical expertise [\(10\)](#page-14-6).

## <span id="page-1-4"></span>**Amplification-Based Techniques**

Amplification-based techniques include variable-number tandem repeat (VNTR), amplified fragment length polymorphism (AFLP), and PCR amplification methods. In addition to subtyping, PCR amplification can also be used to identify specific interesting genes, such as virulence factors or antimicrobial resistance (AMR) genes. VNTR utilizes highly repetitive DNA regions in bacterial genomes [\(11\)](#page-14-7). Repetitive regions are highly variable in terms of the number of copies, even in related strains, and differences in the number of repeats can be used to delineate clonal and nonclonal isolates; although to gain increased discrimination, multiple loci must be used for what is referred to as a multiplelocus VNTR analysis (MLVA) [\(12\)](#page-14-8). In this technique, nonvarying PCR primers bind to sequences that flank the repeat array to allow for efficient amplification of the repeat motif, the PCR products are separated, and strains are differentiated on the basis of amplicon size. VNTR/MLVA was commonly used during the early to mid-2000s, and there were several method comparison studies that indicated that VNTR/MLVA produced more discriminatory results than pulsed-field gel electrophoresis (PFGE), which is still widely used [\(13](#page-14-9)[–](#page-14-10)[15\)](#page-14-11). AFLP combines PCR amplification with restriction enzyme (RE) digestion. The bacterial genome is first digested with a RE, and then primers that contain a sequence complementary to the restriction site are used to amplify the restriction fragments. To reduce the number of restriction fragments, primers typically contain one to three additional random nucleotides on the 3' end to interact with nucleotides inside the adapter fragment [\(16\)](#page-14-12). In addition, a feature of amplification profiling is that important genes such as virulence factors or AMR genes can be incorporated into a typing scheme [\(17,](#page-14-13) [18\)](#page-14-14).

#### <span id="page-1-5"></span>**Restriction Digestion-Based Techniques**

Restriction digestion-based techniques include two commonly used techniques based on restriction fragment length polymorphism (RFLP): ribotyping and PFGE. In RFLP subtyping, bacterial genomic DNA is digested with a restriction endonuclease and the DNA fragments are separated by gel electrophoresis. However,

depending on the enzyme, >100 fragments can be produced, making the comparison of strains problematic. There are two ways to deal with this issue: using a rare-cutting enzyme and specialized electrophoresis to separate large fragments (e.g., PFGE) or transferring the DNA fragments to membranes and then hybridizing them with a labeled probe for specific fragments such as ribosomal RNA genes (e.g., ribotyping). PFGE was introduced 2 decades ago and remains the "gold standard" for molecular typing methods for foodborne pathogens by PulseNet International, which is discussed in detail in the next section. Using PFGE, bacterial isolates that differ by a single genetic event (two or three band differences) are defined as closely related, while multiple band differences are indicative of unrelated strains [\(19\)](#page-14-15). In addition, the background history of the isolates under investigation is taken into consideration, for example, organism variability, the prevalence of PFGE patterns, and the length of an ongoing outbreak [\(20\)](#page-14-16). However, since PFGE relies on gel electrophoresis and the resolution of large bands, it is not sensitive enough to detect single nucleotide polymorphisms (SNPs).

Ribotyping relies on differences in the genomic location and number of rRNA genes for genotyping. Unlike PFGE, ribotyping uses a frequently cutting enzyme, but probe DNA is used to label certain bands, making them distinguishable [\(21\)](#page-14-17). Variability in the number of rRNA genes, as well as size variability in the detected bands, leads to discrimination between bacterial strains. It is generally well accepted that the resolution available through ribotyping is not as high as that of PFGE [\(22\)](#page-14-18).

## <span id="page-2-0"></span>**PulseNet**

There are two basic requirements of source attribution; the first is subtyping, and the second is a system that allows for effective communication of typing data so that authorities have access to real-time information on national (or international) outbreak events. This led to the development of PulseNet. BioNumerics (Applied Maths) is a software package that is used to consistently analyze PFGE patterns, and these patterns are then uploaded to PulseNet. The power of the PulseNet system is that all participating laboratories perform analysis with the same algorithm(s), molecular standards, and protocols so that comparisons of genetic profiles across jurisdictions and countries can be easily performed [\(23\)](#page-14-19). Under this model, international databases of the molecular profiles of a variety of foodborne pathogens can be generated and maintained. It is also important to note that the attribution of a particular PFGE molecular profile to an outbreak cluster is weighed against additional evidence such as epidemiological data.

In 1993, >700 people fell ill in the United States after consuming burger patties contaminated with *E. coli* O157:H7. PFGE was used to determine that the bacteria sourced from hamburger matched the strain causing illness in humans, and scientists at the U.S. Centers for Disease Control (CDC) realized that the outbreak could have been identified earlier if public health laboratories had been able conduct PFGE and share results in real time [\(24,](#page-14-20) [25\)](#page-14-21). In 1995, the CDC and the Association of Public Health Laboratories (APHL) selected state laboratories to participate in a network pilot aimed at disease surveillance; this pilot ultimately lead to the beginnings of PulseNet [\(26\)](#page-14-22). Currently, PulseNet USA is headquartered at the CDC in Atlanta, GA, and consists of >83 state public health laboratories in seven regions. PulseNet is able to quickly group individuals that probably consumed the same contaminated food or that were exposed in some way to a foodborne pathogen. Later, it was recognized that food supply globalization could play a major role in foodborne illness and PulseNet International was created to include other countries. Currently, PulseNet International consists of members from Africa, the Asia Pacific region, Europe, Latin America and the Caribbean, the Middle East, the United States, and Canada.

PulseNet generally tracks PFGE patterns but also supplements PFGE with additional MLVA subtyping; it is also currently considering how WGS will be integrated into its platform. *E. coli*, *Campylobacter*, *Listeria monocytogenes*, *Salmonella*, *Shigella*, *Vibrio parahaemolyticus*, and *Cronobacter* isolates are currently characterized through PulseNet.

# <span id="page-2-1"></span>**Sequencing-Based Techniques**

Microbial genome sequences contain variability between isolates because of mutation accumulation and recombination; and the sequence variability that exists can be exploited when developing molecular typing schemes. Each subtyping scheme based on DNA sequencing relies on the detection and cataloguing of SNPs—variations that occur at single base positions when comparing multiple genomes. When a SNP within a gene is found in at least two isolates, the version of the gene with the SNP is described as an allele. Multilocus sequence typing (MLST) is based on allele variance in a small set of housekeeping genes. Alleles typically correspond to phylogeny [\(27\)](#page-14-23). MLST is typically carried out by a lowthroughput technique such as Sanger sequencing, where each of the genes in the typing scheme will be sequenced from end to end. The gene sequences are compared against an established database, such as pubMLST/BIGSdb, to determine the individual alleles and thereafter the multilocus sequence type (ST) of the isolate. It is now cheaper to sequence an entire genome by massively parallel sequencing than to sequence the MLST genes individually [\(Fig. 1\)](#page-3-0); therefore, there are several user-friendly platforms that are able to calculate STs from a whole genome sequence, such as the Center for Genomic Epidemiology [\(28\)](#page-14-24). Isolates having matching STs are defined as clonal— having a common ancestor [\(29\)](#page-14-25).

## <span id="page-2-2"></span>**Single Nucleotide Polymorphism-Based Analysis**

SNPs can occur in genes, in noncoding regions, or in the mobile genetic elements of a genome. SNPs that occur within genes can be synonymous if they do not change the coding sequence or nonsynonymous if a SNP changes the amino acid sequence. If there are more nonsynonymous than synonymous SNPs, the population is said to be under diversifying selection. The term informative SNP, also called parsimony informative SNP, is used to describe a SNP that is shared by two or more strains in an alignment and therefore supports the phylogenetic grouping of two or more isolates [\(30\)](#page-14-26). To detect SNPs, a comparison must be made via a pairwise alignment of two or more genomes or sections of multiple genomes (i.e., all open reading frames [ORFs], MLST genes, or random 1,000-bp fragments) [\(Fig. 2\)](#page-4-2), and several programs are available for this purpose (i.e., BLAST, Mauve, Muscle, ClustalW, FSA, MAFFT). Aligning whole genomes is possible, although it is computationally intensive and minimally informative if the genomes being aligned are not nearly identical. One of the least computationally intensive ways to detect SNPs is referenceguided assembly. After the reads have been mapped to a reference genome, a SNP caller can be used to identify the SNPs between the genomes; however, this introduces the issue of reference bias, and the choice of reference genome is extremely important  $(31)$ . It is



<span id="page-3-0"></span>**FIG 1** First-, second-, and third-generation sequencing platforms are currently available, and each has distinct advantages and disadvantages. First-generation sequencers, including the ABI capillary sequencer, are characterized by high accuracy and a relatively long read length; however, these systems are not amenable to high-throughput sequencing. Second-generation platforms include MiSeq, HiSeq, and NextSeq from Illumina, as well as Ion Torrent from Thermo Fisher Scientific. These platforms use massively parallel sequencing to achieve high throughput and have high base-calling accuracy; however, sequencing reads are short and this can result in split contigs in repetitive regions during sequence assembly. Third-generation sequencers, including PacBio from Pacific Biosciences and MinION, PromethION, and SmidgION from Oxford Nanopore Technologies, are able to sequence single-molecule templates, which results in very long read length at a high throughput. Third-generation sequencers have a very high error rate relative to the other technologies. Currently, the optimal sequencing platform is highly dependent on the desired applications.

also possible to do a SNP analysis of *de novo*-assembled genomes. This approach requires that the assembled contigs are annotated, and then ORFs are compared to related ORFs and screened for SNPs [\(30\)](#page-14-26) [\(Fig. 2\)](#page-4-2).

SNP-based analysis is an accurate way to determine the phylogenetic relationships of two or more genomes. Traditional MLST relies heavily on the presence SNPs among a few conserved genes to assign a ST to a given genome. However, new sequencing technologies now support the development of extended MLST frameworks. Core genome MLST (cgMLST) compares all of the genes present in every genome of microbes of a specific phylotype, known as the core genome, against each other and identifies the presence of SNPs, and then isolates are subtyped on the basis of this larger data set [\(32,](#page-14-28) [33\)](#page-14-29) [\(Fig. 3\)](#page-5-1). SNPs within the accessory genome can also be compared; however, this type of analysis requires that the isolates being compared both contain the accessory genes in question and could only be used to delineate closely related isolates [\(34\)](#page-14-30) [\(Fig. 3\)](#page-5-1).

Extended MLST can provide insight into the phylogeny of a group of isolates. However, it raises an important question: how many SNPs are required to conclude that two strains are related? Although several studies have been done surrounding this topic, the answers are complex and no consensus has been established. For example, epidemiologically linked *L. monocytogenes* isolates examined in one retrospective study differed by  $\leq$  10 core genome SNPs [\(35\)](#page-14-31). In the same study, two isolates recovered a day apart

from the same patient differed by 21 SNPs [\(35\)](#page-14-31). Conversely, a different study reported that two *L. monocytogenes* isolates that originated in the same processing plant but were isolated 12 years apart varied by as little as one core genome SNP, though a phage sequence included in both genomes differed by 1,274 SNPs [\(34\)](#page-14-30). A retrospective study of 183 sequenced *E. coli* O157:H7 isolates with known epidemiological linkages defined linked isolates as having fewer than five SNP differences, and on average, only one SNP difference was found between isolates from patients belonging to the same family [\(36\)](#page-14-32). A precise criterion for ruling isolates in or out of an outbreak on the basis of SNP analysis has yet to be defined and universally accepted. In considering the examples listed above, it is important to note that SNP calling varies on the basis of several factors, including definition of the core genome, species, choice of reference genome, choice of SNP caller and SNP calling parameters, sequencing metrics, how many isolates are included in the analysis, and the nature of the outbreak, so care must be taken when comparing the numbers of SNPs being found through retrospective work across studies because of the variability of the ways in which they are found. Standardization is required. Several questions have also been asked about the reliability and reproducibility of SNP-based analysis, what level of variability is expected from instrumentation error, and how much variation arises during subculturing. Allard et al. tried to address these questions by passaging a single *Salmonella* isolate four times on solid medium, sequencing four colonies from each passage, and finally



• Contigs are annotated, and ORFs are compared against a pool of Reference ORFs

• SNPs are called based on comparing each ORF to a highly homologous ORF from the pool.

<span id="page-4-2"></span>**FIG 2** Analysis of SNP variation within a genome sequence can be used to compare isolates on a phylogenetic basis and draw conclusions about the relatedness of strains. However, there are various methods of detecting SNPs, and different methodologies can result in different conclusions. After sequencing, genomes can be assembled by either a reference-guided or a *de novo* approach. A common method of SNP detection based on a reference-guided assembly is to assemble sequencing reads to the reference genome and then detect SNPs based on nucleotide differences between the reference and the assembly. After *de novo* assembly, a commonly used approach is to use a concatenated sequence of each of the core genes in a genome and call SNPs based on this pseudoreference genome. The optimal SNP detection approach will depend on the desired application of the data. Reference-guided assembly is a much less computationally intensive method. However, in a reference-guided assembly, reads from regions in the genome being assembled that are not present in the reference genome will be discarded. In addition, regions present in the reference genome that are not present in the genome being assembled will result in alignment gaps.

sequencing the same colony four times. No SNP variation was observed in this set of experiments after homopolymeric sequences and SNPs adjacent to breakpoints were removed [\(30\)](#page-14-26).

# <span id="page-4-0"></span>**METHODS OF MICROBIAL WGS**

## <span id="page-4-1"></span>**First Generation—the Sanger Shotgun Approach**

The shotgun approach of WGS and assembly was carried out by Sanger sequencing, which relies on the selective incorporation of chain-terminating dideoxynucleotides by DNA polymerase during DNA replication [\(37\)](#page-14-33) [\(Fig. 1\)](#page-3-0). During the early days of this technology, dideoxynucleotides were radiolabeled to allow for detection and manual determination of the consensus sequence [\(37\)](#page-14-33); however, Applied Biosystems (ABI) later introduced fluorescent base labeling, which allowed automation of the process and subsequently higher throughput [\(38\)](#page-14-34). Automated Sanger sequencing was the sequencing platform of choice for almost 20 years and was used to sequence the first finished human genome. In 1995, the first bacterial genome sequence, for *Haemophilus in-* *fluenzae*, was published, and it was sequenced by the Sanger method [\(39\)](#page-14-35). Specifically, in this approach, genomic DNA from *H. influenzae* was isolated, randomly sheared, and cloned into a plasmid vector. The resulting vectors were transformed into host *E. coli* cells and propagated, plasmid DNA was extracted, and insert DNA from *H. influenzae* was sequenced from both ends (called "random shotgun" sequencing), producing sequence lengths of about 460 bp per clone. This was a monumental task and required the production and sequencing of 9,500 *E. coli* clones to obtain a draft genome with  $5\times$  consensus coverage. This work also knowingly left 37% of the genome unsequenced [\(39\)](#page-14-35). Despite this method's being labor intensive, hundreds more bacterial genomes, including those of *Mycobacterium tuberculosis*, *Yersinia pestis*, *E. coli* K-12, *Bacillus subtilis*, and *Treponema pallidum*, were sequenced this way over the next few years [\(40](#page-14-36)[–](#page-15-0)[44\)](#page-15-1).

The relatively high throughput of automated the Sanger sequencing led to the birth of bioinformatics as a mechanism to assemble the shotgun sequences into genomes and later to help



<span id="page-5-1"></span>**FIG 3** Pangenome, core genome, and accessory genome are commonly used terms in genomics. Pangenome refers to all of the genes that occur in a given phylotype. For example, each gene identified in any *L. monocytogenes* genome is part of the *L. monocytogenes* pangenome. In this visualization, genes 1 to 7 are part of the pangenome. The core genome is defined as all of the genes that are present in all of the members of a given phylotype. In this example, genes 1, 2, and 7 are all part of the core genome. The core genome will always be smaller than the pangenome. The term accessory genome is used to refer to genes present in an organism, or group of organisms, that are unique to that organism or group. Accessory genes are part of the pangenome but not the core genome. In the image, genes 4 and 6 are part of the accessory genome of group 2, gene 5 is the accessory genome of group 1, gene 3 is the accessory genome of group 4, and group 1 does not have any accessory genes.

make sense of rapidly accumulating sequence data. During the first generation of microbial WGS, there was a strong emphasis on closing or finishing genomes and the first software packages were designed to assist in this endeavor [\(45\)](#page-15-2). First-generation assembly programs (Allora, Celera Assembler, and TIGR Assembler) used an overlap-layout-consensus algorithm and were optimized to work with the high-accuracy long reads produced during Sanger sequencing [\(46\)](#page-15-3). The first *H. influenzae* bacterial genome (1.83 Mbp) was closed after initial assembly with the TIGR Assembler into 140 contigs with 98 sequence gaps, and various algorithms were then used to map and fill physical gaps, while sequence gaps were closed by primer walking [\(39\)](#page-14-35).

#### <span id="page-5-0"></span>**Second Generation—Massively Parallel Sequencing**

Massively parallel or next-generation sequencing (NGS) was first introduced by Roche in the form of the 454 GS20 in 2005 [\(47\)](#page-15-4) and was followed by Illumina's genetic analyzer (GA) II in 2007 [\(Fig.](#page-3-0) [1\)](#page-3-0). The early versions of NGS platforms came with several hurdles to routine WGS of microorganisms. For example, short sequencing reads, 110 bp for the 454 GS20 system and 35 bp for the GA II, required the development of novel assemblers optimized for the assembly of short-read sequences. In addition, each of these platforms had a massive footprint and price tag. However, by 2010, benchtop versions of these and other sequencing platforms (454 GS-FLX Titanium and 454 GS-FLX Junior [Roche], MiSeq and HiSeq [Illumina], SOLiD 3 [Life Technologies], and Ion Torrent [Thermo Fisher Scientific]) were available to most microbiology laboratories, leading to an explosion in the number of microbial sequences available for comparative analysis, epidemiological investigations, and ecological studies. Each NGS platform had a slightly different approach to DNA preparation, sequencing, imaging, and analysis (reviewed extensively in reference [48\)](#page-15-5). Variation in approaches resulted in each platform having different strengths and weaknesses. The 454 platforms produced longer reads, which improved mapping in repetitive regions; however, they suffered because of high reagent cost and high error rates in homopolymer regions and produced less data per run than their competitors. By the end of 2013, Roche had announced that 454 Life Science was shutting down and that 454 GS FLX Titanium

system support would stop in mid-2016. As of early 2016, the Ion Torrent S5 platform is able to produce 400-bp reads but produces about half as much data per run (6 to 8 Gb) as the Illumina MiSeq platform, which produces only slightly shorter reads (300 bp) and is now very widely used in the field [\(48\)](#page-15-5).

The major shortcoming of all second-generation sequencing platforms is a relatively short read length, and genome assembly algorithms built for the assembly of Sanger data do not perform well with the short-read data produced by second-generation platforms [\(49\)](#page-15-6). In addition, the closed genomes produced during the first wave of microbial sequencing can now be used as a scaffold on which to guide the assembly of short-read data, for the first time giving scientists the choice between *de novo* and reference-guided genome assembly methods [\(Fig. 2\)](#page-4-2). *De novo* genome assembly can be done by a variety of assemblers that are based on de Bruijn graph assembly [\(50\)](#page-15-7), such as SPAdes [\(51\)](#page-15-8) and Velvet [\(52\)](#page-15-9). Reference-guided assembly maps short sequence reads by assessing the placement of each read against the reference genome and calculating the probability of its match with the reference. These alignments are then used to construct a novel consensus sequence for the sequence data. There are several different reference-guided assemblers, including Burrows-Wheeler Aligner [\(53\)](#page-15-10), Novoalign, MOSAIK, and SMALT, and each uses a different algorithm: Burrows-Wheeler Transform, global Needleman-Wunsch [\(54\)](#page-15-11), banded Smith-Waterman [\(55\)](#page-15-12), and short-word hashing/Smith-Waterman, respectively [\(56\)](#page-15-13). Reference-guided assembly is much less memory intensive and requires less computing power; in addition, more data are provided than when using *de novo* assemblies, particularly when sequence coverage is low [\(57\)](#page-15-14). However, reference-guided assembly introduces large biases toward the reference genome and several types of data are missed, including some SNPs [\(31\)](#page-14-27) [\(Fig. 2\)](#page-4-2), structural variations (rearrangements) [\(58\)](#page-15-15), and repetitive regions, making downstream synteny analysis inaccurate. In response, newer tools (i.e., reference-assisted chromosome assembly [\[59\]](#page-15-16) and Ragout [\[58\]](#page-15-15)) have been designed to reduce bias by simultaneous alignment with multiple reference genomes. Illumina has recently introduced a new library preparation technique combined with a downstream software package that has had success making synthetic long reads up to about 18 kbp in length  $(60)$ , and this may help to counter problems with assembling complex, highly repetitive genomes and help Illumina compete with the newer third-generation sequencing techniques.

Second-generation sequencing gave rise to the proliferation of available draft genomes, where genomes that are sequenced to a high coverage depth but not closed, are submitted to databases, and are used for downstream analysis. This has generated an ongoing debate in the field of microbial genetics about the allocation of resources: is it better to close a lower number of genomes [\(45,](#page-15-2) [61\)](#page-15-18), or should a higher number of genomes be sequenced to draft status [\(62\)](#page-15-19)? Draft genomes are sufficient for the majority of analyses, including virulence factor identification, phylogenetics, and MLST; however, closed genomes are required for genomic island identification [\(63\)](#page-15-20), characterization of repetitive elements, and sometimes structural rearrangements [\(64\)](#page-15-21).

#### <span id="page-6-0"></span>**Third Generation—Single-Molecule Sequencing**

Third-generation sequencing platforms can address the problems inherent to short sequence reads by sequencing long single molecules in real time [\(Fig. 1\)](#page-3-0). Single-molecule sequencing was introduced in 2008 by Helicos BioSciences Corporation and was initially used to sequence a viral genome [\(65\)](#page-15-22) but quickly progressed into parallel sequencing and the sequencing of a human genome [\(66\)](#page-15-23). However, the short reads produced by the Helicos platform (averaging 32 bp) [\(66\)](#page-15-23) did not differentiate this technology from its second-generation counterparts, and it was no match for the single-molecule real-time (SMRT) sequencing platform (PacBio) introduced by Pacific Biosciences in 2009, which was able to regularly produce reads exceeding 1 kb [\(67\)](#page-15-24), and Helicos filed for bankruptcy in late 2012. In 2014, Oxford Nanopore launched the MinION access program. Oxford Nanopore's mission is to allow routine WGS anywhere with minimal reagents and sequencing equipment. The advantages of having real-time sequencing available anywhere, even given limited resources, were demonstrated during the West African 2014-2015 Ebola outbreak, where the Nanopore platform was used to support monitoring and surveillance of the transmission chains and the evolution of the virus at the height of the outbreak [\(68,](#page-15-25) [69\)](#page-15-26).

However, what second-generation sequencing lacked in sequence read length, third-generation sequencing appears to lack in accuracy. In comparison, the second-generation Illumina MiSeq platform has an error rate of 0.58% and the PacBio platform's error rate is 14%. This has led to the development of bioinformatic approaches to appropriately call insertion, deletion, and SNP variations despite the high error rate. Third-generation sequencers rely on high-coverage consensus to correct for sequencing error and correctly call variants. As an example, during the Ebola outbreak, variants were called only on the basis of a log likelihood ratio of  $>$ 200 and a coverage depth of  $>$ 50, and SNPs were called only in regions covered by  $>$  20 nanopore reads where the SNP was seen in at least 20% of the reads [\(68\)](#page-15-25).

Despite the rapid emergence of third-generation technologies for routine studies and surveillance, in 2016, these second- and third-generation technologies should be viewed as complementary rather than successive for several reasons. Short read length limits the ability of second-generation sequencers to successfully assemble highly repetitive regions and closed bacterial genomes. SMRT sequencing is currently more expensive than second-generation sequencing, has high sequencing error, and generates significantly less coverage. However, SMRT sequencing is able to produce long enough reads that even challenging bacterial genomes, with several repeat regions or low GC content, can readily be sequenced to a closed status [\(48,](#page-15-5) [70\)](#page-15-27). Therefore, a potential strategy would be to generate a closed-genome scaffold using a third-generation technology and then generate deep coverage by using a second-generation technique for accurate SNP analysis. This is referred to as hybrid sequencing. Several assemblers have been built to work with hybrid data (i.e., PBcR), and bacterial genomes have been successfully closed by using this approach [\(71\)](#page-15-28). However, using hybrid sequencing requires the added work of preparing two libraries, and when the appropriate amount of data is gathered by SMRT sequencing, these data independently yield better closed assemblies than hybrid data do [\(72\)](#page-15-29). The optimal ways of combining sequencing data may shift in the future if the cost associated with PacBio sequencing declines, if the Nanopore becomes widely adopted by microbiologists, or if a separate technology that can combine high accuracy with long reads emerges.

#### <span id="page-6-1"></span>**Standards for Quality and Quantity**

The field of microbial genetics currently lacks universal standards regarding WGS quality, including acceptable sequencing results, coverage depth, and assembly quality. The National Center for Biotechnology Information (NCBI) has minimum requirements for submission, including that vector and linker DNA be removed from the final assembly and that contigs be at least 200 bp in length, but data that conform to these standards can differ drastically in quality—and the quality of assembly can be hard to judge. The Genomics Standards Consortium is an open-membership group that is helping to drive standardization activities [\(73\)](#page-15-30). The N50, which is similar to the mean of lengths but assigns more weight to larger contigs, is sometimes used to assess assembly quality [\(74,](#page-15-31) [75\)](#page-16-0). However, the practical implications of this value, such as what N50 value is required to yield an assembly with a complete gene for every gene in a core genome, have yet to be determined. Attempts have been made to make recommendations such as the best assembly software and what parameters to use. However, the answers to these questions depend on the species, the sequencing platform, and the assembler; changing any of these parameters can cause the quality of the assembly to vary widely [\(74,](#page-15-31) [75\)](#page-16-0).

## <span id="page-6-2"></span>**EXAMPLES OF WGS IN EPIDEMIOLOGICAL INVESTIGATIONS**

#### <span id="page-6-3"></span>*L. monocytogenes*

*L. monocytogenes* causes serious infections that can result in a range of clinical illnesses, including invasive bacteremia, meningoencephalitis, spontaneous abortion in pregnant females, and potentially death [\(76\)](#page-16-1). Epidemiological investigations of *L. monocytogenes* present several specific challenges. The incubation period of listeriosis is long; while it is approximately 21 days on average, it can be up to 70 days after exposure. This aspect is significant, as it can affect the accuracy of food histories patients are able to provide, as well as the availability of food samples [\(77\)](#page-16-2). *L. monocytogenes* also has the ability to persist in food processing for years, and persistent contamination has been liked to intermittent illnesses that can span years [\(78,](#page-16-3) [79\)](#page-16-4). Outbreaks that include few cases and occur years apart are difficult to link via epidemiological investigation, and PFGE offers little help, since mobile ge-

netic elements, present in the *L. monocytogenes* accessory genome, change frequently and confound analysis through overdiscrimination [\(80\)](#page-16-5). *L. monocytogenes* also has a highly stable core genome, and this means that finding high similarity in a core genome SNPbased analysis does not necessarily establish a link between strains [\(34,](#page-14-30) [81\)](#page-16-6). However, retrospective studies have shown that WGS has clear advantages over all other molecular tools in epidemiological investigations and specific analyses are being developed to overcome existing issues.

Since case fatality rates can be high during *L. monocytogenes* outbreaks, infections are generally monitored by public health facilities [\(82\)](#page-16-7). The resources available to these monitoring systems have, in several instances, been leveraged to conduct several retrospective and prospective surveillance studies that compare the accuracy of SNP-based subtyping to that of traditional methods. The Australian *Listeria* reference laboratory compared the typing results for 97 isolates obtained by WGS to those of PFGE, MLST, MLVA, and PCR serotyping and found that SNP analysis could easily differentiate between epidemiologically linked and unlinked cases with identical PFGE patterns [\(35\)](#page-14-31). In addition, this study verified that *in silico* tools could be used to generate data comparable to PFGE, MLST, and PCR serotyping results from a sequence, but because of the short length of the Illumina MiSeq sequence reads and the highly repetitive nature of MLVA regions, *in silico* MLVA was not feasible [\(35\)](#page-14-31). In Austria and Germany, seven cases of listeriosis occurred between April 2011 and July 2013. Isolates from these cases all shared a serotype (1/2b), a PFGE pattern, and an AFLP pattern that were indistinguishable from those of isolates obtained from five food producers, making it impossible to differentiate linked and sporadic cases or elucidate the source of the outbreak on the basis of traditional techniques [\(83\)](#page-16-8). WGS of each of the seven human isolates, as well as 10 food isolates, was performed. On the basis of cgMLST, four cases were linked to each other, as well as a soft cheese product and a readyto-eat (RTE) meat product, both of which were found on the grocery bills of each of the outbreak patients. Three cases were clearly distinguishable as a separate outbreak [\(83\)](#page-16-8).

Overdiscrimination by PFGE can occur when *L. monocytogenes* isolates with a close ancestor in common differ by three or fewer bands. This shift in PFGE bands can result from a single genetic event, like the movement of a mobile genetic element. WGS has been shown to readily overcome problems associated with PFGE overdiscrimination in *L. monocytogenes*. As an example, in 2008, Canada experienced a large outbreak of listeriosis associated with RTE cold cut meat products. During the outbreak investigation, two distinct AscI PFGE patterns emerged; however, WGS analysis revealed that a 33-kbp prophage and a 50-kbp putative mobile genetic element accounted for the different AscI patterns and led to the conclusion that three distinct but clonal strains were involved in this outbreak and all originated from the same source [\(80\)](#page-16-5). PFGE overdiscrimination also makes differentiating persistent contamination by *L. monocytogenes* from reintroduction in food-associated environments difficult. Different PFGE patterns suggest reintroduction; however, if WGS reveals that the difference in PFGE pattern is caused by a single mobile element, this suggests persistent contamination. A retrospective study examined persistent *L. monocytogenes* contamination in a deli setting and showed several PFGE patterns, suggesting reintroduction. However, cgMLST of the same samples showed that the strains were clonal and secondary analysis of the sequence data revealed

that differing PFGE patterns were due to loss or gain of prophage regions—allowing the authors to conclude that persistent colonization was the likely issue [\(81\)](#page-16-6). Resolving these differences would help food-processing facilities identify problems in their biosecurity and lead to a better understanding of underlying problems to take the necessary steps to prevent future contamination events.

Lack of SNP diversity within the *L. monocytogenes* core genome means that high cgMLST similarity between human and food isolates is not necessarily confirmation of a causal link [\(34\)](#page-14-30). At the same time, horizontal gene transfer (HGT) and mobile genetic elements can make significant contributions to genomic diversity within the accessory genome [\(84,](#page-16-9) [85\)](#page-16-10) [\(Fig. 3\)](#page-5-1). Therefore, WGS results must be carefully analyzed and interpreted. For example, in the United States, a sporadic case of listeriosis in 1988 was linked to an outbreak in 2000, and both originated from the same processing plant. Analysis by cgMLST showed that a single synonymous SNP was the only difference between a 1988 human isolate and a 2000 food isolate, and only 11 SNPs differed among the four genomes sequenced in the study [\(34\)](#page-14-30). However, 1,274 SNPs were observed between the 1988 and 2000 *comK* accessory prophage sequences—which allows the strains to be clearly differentiated [\(34\)](#page-14-30). A separate retrospective study of persistent *L. monocytogenes* contamination in a deli setting also revealed that *L. monocytogenes* isolates from geographically and temporally different delis had identical or nearly identical (0 to 1 SNP difference) cgMLST results, further cautioning against establishing linkages based solely on low SNP variance within the core genome  $(81)$ . Here it is important to note that other analyses that incorporate the whole genome—such as synteny, clustered regularly interspaced palindromic repeat (CRISPR)-associated locus subtype sequences, and the sequences of mobile genetic elements— can be used to supplement cgMLST analysis to interpret WGS. This interpretation, along with epidemiological data, can delineate *L. monocytogenes* strains during outbreak investigations [\(86\)](#page-16-11).

#### <span id="page-7-0"></span>*Salmonella enterica*

The genus *Salmonella* is divided into two species, *S. enterica* and *S. bongori*. *S. enterica*, is one of the most prevalent foodborne pathogens in the world and causes 11% of all food-related deaths globally [\(87\)](#page-16-12). There are six subspecies of *S. enterica* (I, II, IIIa, IIIb, IV, and VI); however, most nontyphoidal salmonellosis is caused by subspecies I, which is additionally divided into  $>$ 1,500 serovars defined by the detection of flagellar and somatic antigens [\(2\)](#page-13-3). The antigen used in serovar typing seems to be reflective of evolutionary relatedness in some serovars but not others. For example, *S*. Newport has at least three distinct lineages and is polyphyletic [\(88\)](#page-16-13), while *S*. Enteritidis [\(89\)](#page-16-14), *S*. Typhimurium [\(90,](#page-16-15) [91\)](#page-16-16), and *S*. Montevideo [\(30\)](#page-14-26) are highly clonal. The genomic homogeneity implicit in highly clonal serovars makes traditional molecular subtyping methods inadequate for differentiation in outbreak investigations and makes WGS particularly attractive for subtyping this pathogen [\(92\)](#page-16-17). As an example, *S*. Enteritidis is the most common cause of salmonellosis [\(93\)](#page-16-18), and 85% of isolates can be classified into just five PFGE patterns. Anecdotally, this means that, for example, the New York State Department of Health receives 350 to 500 *S*. Enteritidis isolates a year,  $\sim$  50% of which are of a single PFGE type (JEGX01.0004); additionally,  $\sim$ 30% are of a single MLVA type [\(89\)](#page-16-14). Subtyping methods that use WGS have been shown to successfully delineate clonal *S. enterica* serovars where traditional techniques cannot; several examples are discussed in

this section. WGS has also been used to link historical cases of salmonellosis to current outbreaks, which was not previously possible through the use of PFGE [\(94\)](#page-16-19).

During an *S*. Enteritidis outbreak in Connecticut and New York in 2010, several isolates were obtained during the defined outbreak period and all had the same PulseNet (JEGX01.0004) PFGE pattern; WGS, followed by SNP-based phylogenetic analysis, was able to produce a well-defined clade for epidemiologically defined outbreak isolates and readily differentiate between outbreak and concurrent sporadic cases [\(92\)](#page-16-17). In Belgium in 2014, there were several cases of infection with *S*. Enteritidis; the isolates were of phage type 4a and had the same MLVA profile, though the epidemiological investigation indicated that there may have been two independent sources. cgMLST analysis placed the isolates into two separate clades and confirmed that two overlapping outbreaks were taking place. A maximum of two SNP difference based on pairwise alignment of human and food isolates was observed in the first clade, no SNP differences were observed in the second, and 53 SNPs between the two were detected [\(95\)](#page-16-20). In a retrospective study, 55 isolates from seven *S*. Enteritidis outbreaks could be accurately grouped into clades by cgMLST; each outbreak had four or fewer SNP differences between isolates, but there was an average of 42.5 SNPs differentiating outbreak clades [\(96\)](#page-16-21). In a different study, 52 *S*. Enteritidis isolates from 16 outbreaks were analyzed by cgMLST, MLVA, CRISPR-MVLST, and PFGE in tandem to compare the effectiveness of cgMLST with that of established techniques. Phylogenetic inference based on cgMLST accurately predicted which strains belonged to each of the 16 outbreaks; in comparison, the next most accurate technique, MLVA, correctly grouped only 6 of the 16 outbreaks [\(97\)](#page-16-22). From the 10 outbreaks that were not correctly grouped by MLVA, 8 grouped with isolates from other outbreaks and in 2 instances isolates from the same outbreak did not form a group with each other [\(97\)](#page-16-22). In 2014, a hospital network in the United Kingdom observed a spike in *S*. Enteritidis infections in several hospitals and within communities serviced by the hospitals. Prospective WGS using the Illumina MiSeq platform was able to determine if cases were part of the outbreak and establish phylogenetic information after only 18 h [\(98\)](#page-16-23). Retrospective analysis of the same samples was done with the Oxford Nanopore to evaluate this emerging technology. Nanopore data were analyzed in real time during sequencing, and identification to the species level was available after 20 min, the serotype was available after 40 min, and within 2 h, it could be determined if the strain was part of the outbreak [\(98\)](#page-16-23).

In a Danish study, 18 isolates from six *S*. Typhimurium outbreaks were compared to 16 unrelated strains. Phylogenetic analysis based on cgMLST retrospectively identified outbreak cases with 100% accuracy, and outbreak clades differed by 5 to 12 SNPs, while unrelated isolates differed by 15 to 344 SNPs [\(99\)](#page-16-24). In a larger study of 57 isolates of *S*. Typhimurium from five outbreaks, cgMLST demonstrated high-resolution subtyping, as all of the isolates from four outbreaks differed by only one or two SNPs, although isolates from the fifth outbreak differed by only 12 SNPs [\(100\)](#page-16-25). cgMLST has also been evaluated for the ability to group outbreak cases from nonrelated isolates within the same phage type—in this case, DT 8. DT 8 isolates were highly clonal, with only 342 SNPs differentiating all DT 8 strains; however, outbreak clades were clearly defined and differed by a maximum pairwise distance of 3 SNPs [\(101\)](#page-16-26). WGS has also been shown to have value for the identification and source attribution of laboratory-acquired salmonellosis, which is complex, given the number of strains to which a technician can be exposed [\(102\)](#page-16-27).

The *S*. Heidelberg serovar is also clonal, and most isolates have the same PFGE profiles. A retrospective study conducted in Quebec, Canada, compared 46 isolates from three outbreaks and found that SNP-based analysis was able to correctly place the outbreak isolates into three clades. Within the outbreak clades, isolates differed by 1 to 4 SNPs, while  $>59$  SNPs were observed among the three previously indistinguishable outbreaks, which had the same PFGE and phage type [\(103\)](#page-16-28).

*S*. Montevideo was the causative agent of a large outbreak in the United States in 2009-2010 that reportedly affected nearly 300 people and confounded conventional epidemiological traceback. On the basis of patient histories, spiced meat appeared to be the causative agent of this outbreak; however, each isolate had a single PFGE pattern (JIXX01.0011) that was also associated with a 2008 outbreak caused by contaminated pistachios [\(104,](#page-16-29) [105\)](#page-17-0). SNPbased analysis was able to readily differentiate clinical, environmental, and foodborne isolates from the spiced meat outbreak from other *S*. Montevideo isolates with the same PFGE patterns, including isolates from the pistachio outbreak [\(30\)](#page-14-26).

*S*. Newport is polyclonal and has a high degree of genomic diversity, and phylogenetically distinct lineages of *S*. Newport can be more closely related to other serovars than to each other [\(106\)](#page-17-1). However, cgMLST had been demonstrated to provide more accurate delineation of *S*. Newport than serovar identification, PFGE, or MLST [\(89\)](#page-16-14). For example, in Europe, the whole genomes of 24 clinical *S*. Newport isolates involved in an outbreak caused by contaminated melon were sequenced. Nineteen were identical after SNP-based analysis, and the remaining five differed by only a single SNP, while nonoutbreak *S*. Newport strains differed by several thousand SNPs [\(107\)](#page-17-2).

Since serotyping remains a gold standard in food safety management of *Salmonella*, several software packages that are capable of accurately predicting *Salmonella* serotypes on the basis of WGS data have been developed. SeqSero is a web application that is able to determine the serotype of *Salmonella* isolates from both raw sequencing reads and whole-genome assemblies with an accuracy of 92 to 99% [\(108\)](#page-17-3). The *Salmonella In Silico* Typing Resource (SISTR) is an online platform that allows users to upload assembled genomic data and then predicts the serotype (with 94.6% accuracy), performs MLST and cgMLST, and allows users to view their sequence in a broad phylogenetic context [\(109\)](#page-17-4). While this software currently provides typing information, it is also being updated to provide AMR profiling and detect virulence genes [\(109\)](#page-17-4). The Metric-Orientated Sequence Typer can also estimate a serovar on the basis of a short-read sequence, but users must download the program from github and run it from a command line interface, making it less accessible [\(110\)](#page-17-5).

### <span id="page-8-0"></span>*E. coli*

*E. coli* can be an innocuous part of the intestinal microbiome, but certain isolates have the pathogenic potential to cause significant illness. Diarrheal *E. coli* can be divided into six major pathotypes: enteropathogenic *E. coli* (EPEC), Shiga toxin-producing *E. coli* (STEC), *Shigella*/enteroinvasive *E. coli*, enteroaggregative *E. coli*, diffusely adherent *E. coli*, and enterotoxigenic *E. coli* (ETEC) [\(111\)](#page-17-6). Pathotypes do not form phylogenetic clades [\(112\)](#page-17-7), but

rather, *E. coli* genomes are particularly plastic and rapid gains and losses of genetic material are associated with equally rapid changes in virulence potential [\(113\)](#page-17-8). The dynamic nature of the *E. coli* genome leads to an exceedingly small core genome but a large pan-genome, relative to other foodborne pathogens [\(114\)](#page-17-9). Most of the definable virulence factors in *E. coli* are on mobile genetic elements and readily travel between *E. coli* strains by HGT. For example, while most toxin genes and colonization factors required for ETEC pathogenesis are carried by plasmids [\(115\)](#page-17-10), the locus of enterocyte effacement, which is required for EPEC pathogenesis and is also carried by some STEC isolates, is located on a pathogenicity island [\(116\)](#page-17-11) and the Shiga toxin involved in STEC pathogenesis is encoded by a bacteriophage [\(117\)](#page-17-12). While WGS and SNP-based analysis are able to delineate *E. coli* outbreaks and rapidly determine if isolates belong to a particularly virulent lineage [\(118\)](#page-17-13), currently, the most valuable role for WGS in *E. coli* management is the rapid and reliable detection of virulence genes.

The detection of virulence genes in *E. coli* typically has, until recently, relied on phenotypic tests such as hemolysis, the cell culture assay for toxins, or PCR-based amplification of virulence genes [\(119\)](#page-17-14). Completion of these typing tests (including PFGE, MLST, PCR, and serotyping) would generally take >5 days, while WGS can provide analogous data in 3 days [\(120\)](#page-17-15). In the latter scenario, a novel approach is used to interpret data during an ongoing Illumina MiSeq run and can correctly identify virulence genes in STEC only 4.5 h after the sequencing run is started [\(121\)](#page-17-16). Studies that compare routine virulence gene typing with WGS and *in silico* typing have found that the two methods produce almost identical results (>90% concordance) [\(120,](#page-17-15) [122\)](#page-17-17). The discordant results that do occur are attributed to limitations in the assembly of short-read sequences [\(122\)](#page-17-17), and this issue will probably be resolved by third-generation sequencing or the improvement of short-read assembly. User-friendly websites are available for automatic detection of virulence gene presence from WGS data; a popular one is VirulenceFinder [\(120\)](#page-17-15). SuperPhy is an online platform that also detects virulence determinants, including Shiga toxin subtypes, in *E. coli* genomes but also goes several steps further and identifies AMR markers and known statistical correlations with geographic source, genotype, host, source, and phylogenetic clade [\(123\)](#page-17-18). Web tools are also available for *in silico* serotyping of *E. coli*, and these tools report very accurate results compared to traditional serotyping (98 to 99% agreement) [\(124\)](#page-17-19). WGS data can also be used in comparative genomic approaches to identify gene clusters that are responsible for changes in virulence in a particular lineage. As an example, a comparison of STEC associated with an outbreak with a high proportion of cases developing hemolytic-uremic syndrome (HUS) and STEC not associated with HUS identified several novel plasmids and fimbrial genes that were later investigated for roles in the observed increase in virulence [\(125\)](#page-17-20).

Beyond the rapid detection of virulence genes, WGS, followed by SNP-based analysis, can also be used to build high-resolution phylogenies that provide insight into the relatedness of strains during outbreak investigations. MLVA has the highest discriminatory power of traditional typing methods for *E. coli*; however, SNP-based analysis had been consistently shown to provide better resolution [\(122\)](#page-17-17). For example, in 2009, the United Kingdom had a large outbreak of STEC serotype O157:H7, which infected 93 people [\(126\)](#page-17-21). Retrospective WGS was able to help determine that

contamination by a single successful strain had spread through an entire farm to several animals before the first human case of EHEC infection [\(127\)](#page-17-22). Each isolate involved in this outbreak was of serotype O157:H7 and ST11; therefore, the resolution necessary to make this conclusion by either of these techniques would not have been possible [\(127\)](#page-17-22). Furthermore, only 9 to 25% of the STEC isolates in the United Kingdom are linked to an identified outbreak, with the rest of the cases assumed to be sporadic, and sporadic cases are rarely attributed to a source [\(36\)](#page-14-32). Each clinical *E. coli* isolate is phage typed in the United Kingdom; however, the majority of isolates are PT8 or PT21/28, and therefore, this technique also provides insufficient resolution to connect sporadic cases [\(128\)](#page-17-23). However, when 242 isolates responsible for apparently sporadic cases were retrospectively subjected to WGS, 136 were shown to be linked to an outbreak and differed by fewer than five SNPs [\(36\)](#page-14-32). These results indicate that WGS can identify *E. coli* outbreaks that occur below the limit of detection by other typing tools. In a different retrospective analysis, SNPs were detected in a sample set of 11 groups of two or more epidemiologically linked isolates. Epidemiologically linked isolates formed phylogenetic clades with 100% bootstrap support that differed by fewer than four core genome SNPs [\(122\)](#page-17-17).

The whole genomes of isolates from the largest *E. coli* O157:H7 outbreak in Alberta, Canada, were retrospectively sequenced, and the results of a SNP-based phylogenetic analysis were compared to those of MLVA, PFGE, and gene profiling of 49 STEC virulence genes. Isolates from the outbreak contained multiple yet closely related PFGE and MLVA patterns, while gene profiling was unable to differentiate outbreak isolates from unrelated sporadic cases [\(129\)](#page-17-24). SNP-based phylogeny was able to place all epidemiologically linked outbreak isolates into one well-defined clade where isolates differed by 0 to 5 SNPs and differed from clades of concurrent but epidemiologically unlinked isolates by 231 to 257 SNPs [\(129\)](#page-17-24).

#### <span id="page-9-0"></span>*Campylobacter*

Campylobacteriosis, caused by *Campylobacter jejuni* (90%) and *Campylobacter coli* (10%), is the most common cause of self-limiting bacterial gastroenteritis globally and is also probably highly underreported [\(130\)](#page-17-25).*Campylobacter*isolates are highly genetically diverse and regularly undergo horizontal genetic exchange; this diversity confounds the development of reproducible typing schemes, which are essential in both epidemiology and disease control [\(131\)](#page-17-26). However, despite high levels of genetic exchange, *Campylobacter* populations are highly structured into clonal complexes of related bacteria that have an ancestor in common and have other properties, like host association range and virulence potential, in common [\(132,](#page-17-27) [133\)](#page-17-28). It is likely that finding ways to intervene in the food chain to reduce the prevalence of *Campylobacter* in food-producing animals is the only way to reduce infections. To assess the effectiveness of interventions, WGS and sub-sequent SNP analysis are invaluable [\(134\)](#page-18-0). Traditional MLST is useful in assigning isolates to clonal complexes, particularly because the same MLST scheme is used for both *C. jejuni* and *C. coli*—which allows comparison of inter- and intraspecies diversity [\(135\)](#page-18-1); however, it is unable to establish relationships within and between clonal complexes [\(134\)](#page-18-0). cgMLST is able to provide resolution within clonal complexes and information on the relatedness of clonal complexes and therefore provides better genetic attribution with respect to the source than MLST does, and this leads to a better understanding of the effectiveness of interventions [\(134\)](#page-18-0).

WGS typing has been repeatedly shown to be more discriminatory than the traditional *Campylobacter* MLST, PFGE, and *flaA* typing methods [\(136\)](#page-18-2). A retrospective study from Finland showed that 80% of *C. jejuni* clinical isolates are associated with only three clonal complexes (ST45, ST283, and ST677), demonstrating that MLST has a limited ability to determine if cases are sporadic or associated with other cases [\(137\)](#page-18-3). However, cgMLST can provide enough resolution to reveal distinct clades within clonal complexes, genetically link apparent sporadic infections, and identify a common infection source [\(137\)](#page-18-3). For example, comparative genomics was used to identify the proportion of human cases originating from chicken consumption versus swimming water. Since only four STs (ST45, ST230, ST267, and ST677) covered most of the isolates, MLST was unable to help identify the source of the human infections. However, WGS was able to link 24% of human cases directly to contaminated chicken slaughter batches and no cases were linked to swimming water  $(138)$ , indicating that other sources of *C. jejuni* infection probably exist. While it was previously thought that epidemiologically linked isolates with the same or similar PFGE profiles were closely related and were expected to be the expansion of a single clone, it is now known that PFGE tends to overestimate the clonal relationships between *Campylobacter* isolates [\(139](#page-18-5)[–](#page-18-6)[141\)](#page-18-7). For example, in a large waterborne outbreak of *C. jejuni* in 1998, several isolates were obtained from patients and the environment that were all of Penner serotype 12 and ST45 and had nearly identical KpnI and ScaII profiles [\(142\)](#page-18-8). However, WGS of these isolates revealed that two patient strains, which were both epidemiologically related to the contaminated water, were genetically distinct enough to be considered different strains, indicating that the water probably harbored multiple contaminants [\(141\)](#page-18-7).

#### <span id="page-10-0"></span>*Vibrio cholerae*

On 12 January 2010, a magnitude 7.0 earthquake, centered near Port-au-Prince, struck Haiti and resulted in infrastructure damage including crippled sanitation systems that contributed to a devastating cholera outbreak starting in October. According to the Pan American Health Organization, this outbreak, which is still ongoing, has sickened >750,000 Haitians and killed 9,068 to date [\(143\)](#page-18-9). In the first few weeks of the outbreak, the U.S. CDC analyzed the strain by PFGE and evidence suggested that the etiological strain originated in South Asia and was probably brought to the region by United Nations (UN) workers; however, several argued that this was not conclusive, as PFGE does not yield a detailed enough fingerprint for such a conclusion [\(144\)](#page-18-10). Independent researchers proposed that, instead of human introduction, the cause was climate change that led to increases in temperature and salinity in the river estuaries around the Bay of Saint Marc in Haiti, leading to the competing climate hypothesis [\(145,](#page-18-11) [146\)](#page-18-12). The main challenge in *Vibrio* outbreak source tracing is that the most common PFGE patterns tend to drift over the course of an outbreak, indicating that multiple concurrent outbreaks may be occurring, a possibility that, in this case, also challenged the singlesource introduction hypothesis [\(147\)](#page-18-13). Given the political and legal ramifications of aid workers being the source of this outbreak, a more detailed analysis of this outbreak by WGS was required.

*V. cholerae* can be classified into serogroups on the basis of the somatic (O) antigen, and at least 155 serogroups have been re-

ported [\(148\)](#page-18-14). Serogroup O1 isolates were responsible for all epidemic and endemic cholera cases until 1993, when serogroup O139 emerged and was linked to a cholera outbreak centering in Bangladesh and India [\(149\)](#page-18-15). These serotypes can be further defined by biotyping into El Tor (hemolytic) and classical (nonhemolytic) [\(150\)](#page-18-16). With only two circulating serogroups of *V. cholerae* responsible for the majority of illness, serotyping is not specific enough to trace outbreaks caused by this species. PFGE has been studied and validated extensively for use in the epidemiological surveillance of *V. cholerae*[\(151\)](#page-18-17). The SfiI PFGE pattern of the Haitian strains was KZGS12.0088, and the NotI pattern was KZGN11.0092; however, from 2005 to 2010, strains with the same PFGE pattern had been isolated in Sri Lanka, India, Cameroon, Nepal, and Pakistan [\(152\)](#page-18-18); therefore, PFGE results could not independently lead to a definitive conclusion about the origin of the cholera outbreak. The use of whole-genome MLST demonstrated that Haitian outbreak strains clearly formed a clade with strains isolated from Bangladesh [\(153\)](#page-18-19). However, the strains used for comparison were isolated in Latin America in 1991 and South Asia in 2002 and 2008 and there was no guarantee that the strains circulating at those times were the same as the strains circulating in 2010. WGS of 24 *V. cholerae* genomes that were circulating in Nepal in the months leading up to the outbreak was performed [\(154\)](#page-18-20). On the basis of a phylogenetic analysis of 184 parsimonyinformative SNPs, three Nepalese isolates were differentiated from the Haitian isolates—which were identical to each other— by a single SNP, providing strong evidence that this clonal group was the source of the 2010 Haitian outbreak [\(154\)](#page-18-20). As the outbreak continued, by 2012, various PFGE pattern combinations, serotypes, and antibiotic susceptibility patterns had been identified in *V. cholerae* isolates from Haiti; which led some investigators to question if multiple simultaneous outbreaks were taking place [\(146\)](#page-18-12). However, the results of a WGS analysis of 23 *V. cholerae* isolates from 2010 to 2012 in Haiti supported the conclusion that the outbreak was clonal and that Nepalese isolates were the closest relatives, despite the presence of multiple PFGE patterns [\(147\)](#page-18-13). This study was also important because WGS was performed in conjugation with bioinformatic analysis and the results were used to infer a molecular clock, which determined that the most recent common ancestor of the Haitian and Nepalese strains was estimated to be between 23 July and 17 October 2010. This aligned the cholera outbreak in Nepal and the arrival of Nepalese soldiers in Haiti with the start of the Haitian outbreak [\(145\)](#page-18-11). WGS provided particularly strong evidence that Nepalese UN peacekeeping troops brought cholera to Haiti [\(154](#page-18-20)[–](#page-18-21)[156\)](#page-18-22). The intricacies of this outbreak could not have been solved and the source of the contamination would not have been conclusively identified without the use of a WGS typing approach.

## <span id="page-10-1"></span>**Foodborne Viruses**

Viruses are the greatest reservoirs of genetic diversity on the planet [\(157\)](#page-18-23), and they are constantly evolving under strong selection pressure [\(158\)](#page-18-24). Viral WGS is now being used to provide information about the total viral population within infected organisms or environmental samples, and because of deep coverage at each position, second- and third-generation sequencing can be employed to identify the source and direction of transmission in an outbreak situation, which can aid in forensic investigation and intervention

[\(159\)](#page-18-25). This became apparent during the 2014-2015 Ebola outbreak [\(68,](#page-15-25) [69\)](#page-15-26).

NoV is a highly infectious and rapidly evolving RNA virus that is responsible for the majority of acute gastroenteritis cases around the world [\(160](#page-18-26)[–](#page-18-27)[162\)](#page-18-28). There is no vaccine or therapeutic intervention available to prevent or control NoV infections. Therefore, the development of a control strategy requires understanding of the sources of contamination and the mechanisms of new transmissions. To investigate the NoV transmission events and to examine interhost dynamics of NoVs, WGS was used to analyze genomic variations among three linked patients [\(163\)](#page-18-29). Each recipient's major nonsynonymous variant was found to be identical to a minor variant isolated from the donor. In other words, a donor's minor variant may become the major variant in the recipient. This finding indicates that a strong bottleneck effect occurs in person-to-person transmission of NoVs. Viral WGS also has been used in source attribution during nosocomial transmission of NoV to immunocompromised patients in a United Kingdom hospital [\(164\)](#page-18-30). Phylogenetic patterns and SNP-based analysis demonstrated that two out of three patients on the same ward were infected with closely related viruses, which indicated either nosocomial transmission or a single source of contamination of these two patients [\(164\)](#page-18-30).

Hepatitis A virus (HAV)-associated foodborne outbreaks are frequently reported worldwide [\(165,](#page-18-31) [166\)](#page-18-32). HAV is a nonenveloped, single-stranded, positive-sense RNA virus that belongs to the *Picornaviridae* family. In 2013, a large outbreak of HAV was reported in Italy that involved 1,202 cases [\(167,](#page-19-0) [168\)](#page-19-1). Further study led to the hypothesis that the outbreak could be linked to frozen berries from two independent sources. To understand the relationship between these two potential sources, viral WGS was used. HAV was propagated on fetal rhesus monkey kidney cells inoculated with each of two samples and then sequenced via amplicon sequencing [\(169\)](#page-19-2). SNP differences were not detected in the variable region (VP1-2A) when the two berry samples were compared to the clinical sequence, strongly indicating that the berries were the source of the outbreak [\(169\)](#page-19-2).

Recently, there has been a suggestion of a correlation of beef consumption with an increased risk of colorectal cancer [\(170,](#page-19-3) [171\)](#page-19-4). A potential explanation for this link is the presence in beef products of oncogenic viruses, such as polyomaviruses, that survive cooking [\(171\)](#page-19-4). The presence of polyomaviruses was investigated by sequencing the metagenome of retail meat products after virion enrichment [\(172\)](#page-19-5). Three polyomaviruses were identified by this study: bovine polyomavirus 1 (BoPyV1), BoPyV2, and BoPyV3 [\(172\)](#page-19-5). BoPyV2 is phylogenetically related to Merkel cell polyomavirus and raccoon polyomavirus, both of which are shown to cause cancer in their native hosts [\(172\)](#page-19-5). BoPyV2 has also been identified in retail meat products in San Francisco; however, it should be noted that neither of these studies has proven a conclusive link between virus infection and cancer [\(173\)](#page-19-6).

Human adenoviruses (HAdVs) are among the most abundant enteric viruses in water. HAdV is a nonenveloped DNA virus with a genome composed of one double-stranded DNA chain containing 35 to 37 kbp, depending on the virus type [\(174\)](#page-19-7). The clinical manifestations of HAdV infections vary from an absence of symptoms in healthy carriers to death in immunocompromised individuals. HAdVs can also be associated with enteric diseases [\(174\)](#page-19-7). In the past, PCR and Sanger sequencing approaches were employed to detect HAdV contaminations in waste and river water matrices. However, these methods identify only a limited number predominant species, while water samples may contain multiple viral strains [\(175\)](#page-19-8). Amplicon sequencing of the nonconserved hexon gene was used to improve the detection and identification of HAdV diversity in wastewater and river water matrices, and this provided high enough resolution to discriminate all 54 subtypes of HAdV [\(176\)](#page-19-9).

#### <span id="page-11-0"></span>**Bridging the Gap with Historical Techniques**

As sequencing-based technologies progress and bioinformatic analyses become commonplace, WGS is set to become the dominant typing method for investigating foodborne outbreaks and microbial contamination. Thus, it will become increasingly important to link WGS data to data in traditional typing databases such as PulseNet and PubMLST. This will allow for new WGS data to be placed into the proper historical context and enhance the capability to respond to outbreak events. One method of accomplishing this is to retrospectively sequence culture collections, as the FDA is doing as part of their GenomeTrakr network [\(177\)](#page-19-10). Another method is to generate *in silico* results for traditional typing methods from WGS data, and several software packages are now available to do this [\(35\)](#page-14-31). As mentioned earlier, MLST data can be readily extracted from assembled WGS data [\(28\)](#page-14-24). The Microbial *In Silico* Typer (MIST) is a highly customizable tool that can be used to yield *in silico* results for one or more typing assays that are user defined. The MIST has been used successfully to generate VNTR and MLVA data for *L. monocytogenes* and to determine the pathotypes of *E. coli* isolates [\(178\)](#page-19-11). Other software packages previously discussed in earlier sections, such as SISTR and SuperPhy, also have functions that can generate serovar/serotype predictions and help to compare current isolates in a historical context [\(109,](#page-17-4) [123\)](#page-17-18). Beyond generating comparable results for historical techniques, several software platforms that attempt to predict if an isolate is pathogenic on the basis of its whole genome sequence are now becoming available and include Pathogen-Finder 1.1 [\(179\)](#page-19-12) and the NCBI Pathogen Detection pipeline [\(http:](http://ncbi.nlm.nih.gov/pathogens/) [//ncbi.nlm.nih.gov/pathogens/\)](http://ncbi.nlm.nih.gov/pathogens/).

#### <span id="page-11-1"></span>**USES OF WGS BEYOND HIGH-RESOLUTION SUBTYPING**

#### <span id="page-11-2"></span>**Microbial Risk Assessment**

Microbial risk assessments support the process of deciding whether to withdraw a food from the market during an outbreak event or assessing the effectiveness of intervention strategies along the farm-to-fork continuum [\(1\)](#page-13-2). Several phenotypic markers, including virulence factors, host adaptation, stress resistance, and AMR, are important to microbial risk assessment, since they focus attention on microbial subpopulations that pose the most risk to human health [\(180\)](#page-19-13). However, the potential uses of WGS in microbial risk assessment, beyond strain identity and clustering, are still unclear. The number of hazards identified by traditional phenotypic methods is dwarfed by those extracted from WGS data [\(181\)](#page-19-14), and determining which information is most useful is difficult. However, for genotypic data to be useful to food safety authorities and policy makers, there must be an established way to use genotypic data to predict a phenotype that can accurately produce a true measure of risk, which is an active area of research [\(1\)](#page-13-2). In addition, appropriate statistical methodology for the

application of complex WGS data in risk assessment must be developed [\(181\)](#page-19-14).

#### <span id="page-12-0"></span>**Geographic Source Attribution**

Globalization of the food supply has created a situation where food- and waterborne outbreaks can take place on an international scale. In addition, the ingredients in a single food product may be sourced from different international locations, making source attribution particularly complicated in these situations. There is, however, substantial evidence that WGS data can be used to help predict the geographic origins of pathogenic isolates—and that this information can aid substantially in outbreak delineation. The idea that geographic source attribution could be successful came in 2012 during retrospective WGS. In that study, a *Salmonella* Bareilly outbreak in the United States was successfully linked by WGS to a scraped tuna product imported from India on the basis of sequence similarity to a 5-year-old historical isolate from the FDA archives that was collected from a processing facility  $8 \text{ km}$  away from the source of the 2012 outbreak [\(182\)](#page-19-15). In addition to this initial observation, later studies have shown that geographic source attribution can be useful as a tool for delineating geographically dispersed outbreaks.

*C. botulinum* represents a group of spore-forming bacteria that are capable of causing fatal foodborne infection/intoxication. A recent study demonstrated that SNP analysis could resolve isolates by the geographic location of the origin of the outbreak [\(183\)](#page-19-16).

On the basis of the evidence that WGS data can be used in geographic source attribution, the FDA has introduced the Genome Trakr network, which is predicated on the idea that the FDA's historical isolate collection could be sequenced, archived, and ultimately used to provide investigators with geographic clues surrounding the sources of large outbreaks [\(177\)](#page-19-10). This would provide faster responses and intervention during large outbreaks. The SISTR platform has also been expanded to provide geographic predictions based on WGS of *Salmonella* isolates [\(109\)](#page-17-4). However, it should be noted that these tools are only as good as the databases, and continual expansion of genome sequences from new and historical isolates is critical to future accuracy.

#### <span id="page-12-1"></span>*In Silico* **AMR Prediction**

In addition to providing high-resolution typing schemes, WGS data are immediately available for secondary analyses. While traditional AMR testing is time-consuming and expensive, foodborne bacterial isolates can now be examined *in silico* for the presence of AMR genes immediately after sequencing. Several online software packages have been created to identify AMR genes in whole or partially assembled genomes, including the Resistance Gene Identifier (RGI) in the Comprehensive Antimicrobial Resistance Database (CARD) [\(184\)](#page-19-17), the Antibiotic Resistance Database (ARDB) [\(185\)](#page-19-18), and the Resistance Gene Finder (ResFinder) database [\(186\)](#page-19-19). These databases vary in size and specificity. The ARDB contains 23,137 known resistance genes from 1,737 bacterial species, the CARD contains 4,221 gene that are responsible for resistance to many antibiotic classes, and the ResFinder database contains 1,800 resistance genes from 12 different antimicrobial classes [\(187\)](#page-19-20). These tools have been reported in additional studies to have high concordance with phenotypic resistance. For example, a Danish study in which 200 foodborne isolates were phenotypically tested for susceptibility to 14 to 17 antibiotics showed that The ResFinder database was 99.7% accurate when predicting AMR and only struggled when predicting spectinomycin resistance in *E. coli* [\(188\)](#page-19-21). AMR gene databases can also be downloaded, and genomes can be searched for resistance markers with custom scripts; this method appears to have good accuracy. For example, a study of *Campylobacter* AMR reported a 95.4 to 100% correlation between phenotypic and genotypic testing results, dependent on which antibiotic was evaluated [\(189\)](#page-19-22). Different work on *E. coli* demonstrated a 97.8% correlation between phenotypic and genotypic testing results, where again the only discordant results were attributed to streptomycin [\(190\)](#page-19-23). In addition to the fact that resistance to some antibiotics is harder to detect via genotypic methods, there are other limitations to WGS for antibiotic resistance prediction that must be addressed. For example, in members of the family *Enterobacteriaceae*, carbapenem resistance can result because of a combination of porin loss and extended-spectrum beta-lactamases enzymes but not because of either separately, and *in silico* detection algorithms struggle with situations like this [\(191\)](#page-19-24). The genes underlying novel resistance mechanisms must also be identified in the laboratory before being added to the databases [\(192\)](#page-19-25), and this represents a substantial amount of work.

#### <span id="page-12-2"></span>**METAGENOMICS AND CULTURE INDEPENDENCE**

Metagenomic analysis, culture-independent analysis of the genetic material of all of the microbial DNA in a given environment, is often used to refer both to 16S rRNA gene amplification and subsequent sequencing and to "true" metagenomics, where all of the DNA extracted from a sample is sequenced. For food safety testing, current 16S rRNA sequencing protocols are not useful, since the short sequence reads provided by current next-generation sequencers are too short to correctly resolve closely related pathogenic and nonpathogenic species (e.g., *L. monocytogenes* and *L. innocua* [\[193\]](#page-19-26)). This may change as third-generation sequencers are optimized for 16S rRNA sequencing or other more phylogenetically informative markers are further developed for amplicon sequencing. However, true metagenomic sequencing is already offering a culture-independent alternative for direct detection of pathogens in food in the case of nonculturable viruses and parasites [\(194\)](#page-19-27). This technique may eventually be extended to culturable bacteria to decrease detection time and cost; however, there are numerous valid concerns about receiving positive signals because of the presence of DNA rather than a viable organism [\(195\)](#page-19-28).

Culture-independent diagnostic testing will introduce major challenges to platforms that allow real-time communication of outbreak information, such as PulseNet. The concern is that as clinical settings switch to the use of rapid, nonculture tests, there will be fewer (or no) isolates from patients with foodborne illnesses. The CDC is currently working with the APHL, regulatory agencies, diagnostic kit manufacturers, and clinicians to ensure that positive test results will be followed by the collection of samples to allow for recovery of the bacterial pathogen.

#### <span id="page-12-3"></span>**CONCLUSIONS**

The molecular landscape in food safety investigation is rapidly changing from the use of traditional molecular subtyping methods to WGS-based typing methods [\(Fig. 4\)](#page-13-5). This change represents a shift from techniques that use discrete categorical indexing



<span id="page-13-5"></span>**FIG 4** Past, present, and potential future workflows of pathogen detection by WGS and traditional subtyping techniques. Although times are approximate and vary according to the pathogen being analyzed, in all instances, WGS offers substantial time savings in comparison to traditional techniques. Future techniques using culture-independent metagenomic and high-throughput RNA sequencing technologies have the potential to offer faster detection times. SNV, SNP variation.

(i.e., a PFGE pattern, multilocus ST, or serotype) to a more continuous, custom-designed, and arguably infinitely flexible index (number of SNP differences) to define the relatedness of two isolates. This has brought about a transition period. This transition period is giving researchers the opportunity to address important issues such as standardization, quality control, methodology, and regulatory use. Currently, interpretation of WGS data requires the judgement of experts in the field such as epidemiologists, bioinformaticians, and microbiologists. It is also noteworthy that WGS has not and will not replace a good epidemiological investigation, but instead, the two must be thought of as complementary data sets for rapid delineation of outbreak events. The increased resolution provided by WGS provides epidemiologists with information that will help to link cases that would have been overlooked as sporadic in the past. WGS data can also be used for secondary analysis such as evaluating the effectiveness of contamination intervention strategies in the farm-to-fork-to-flush continuum, detection of AMR genes, and geographic source attribution. Several software packages are now available to aid in this analysis, and novel ones are continually being developed. In addition, from a strictly technical perspective, we are years away from being able to conduct culture-independent investigations and it is important that sequencing not completely displace culturing, as obtaining an isolate is still an important part of microbiology and secondary analysis. Because of the declining costs, increased resolution, and value-added

secondary analysis NGS approaches offer to food safety, these modern approaches will continue to replace traditional molecular subtyping methods and drive improvements in global food safety.

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