Genome analysis

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# Insights into structural variations and genome rearrangements in prokaryotic genomes

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#### **ABSTRACT**

Structural variations (SVs) are genomic rearrangements that affect fairly large fragments of DNA. Most of the SVs such as inversions, deletions and translocations have been largely studied in context of genetic diseases in eukaryotes. However, recent studies demonstrate that genome rearrangements can also have profound impact on prokaryotic genomes, leading to altered cell phenotype. In contrast to single-nucleotide variations, SVs provide a much deeper insight into organization of bacterial genomes at a much better resolution. SVs can confer change in gene copy number, creation of new genes, altered gene expression and many other functional consequences. High-throughput technologies have now made it possible to explore SVs at a much refined resolution in bacterial genomes. Through this review, we aim to highlight the importance of the less explored field of SVs in prokaryotic genomes and their impact. We also discuss its potential applicability in the emerging fields of synthetic biology and genome engineering where targeted SVs could serve to create sophisticated and accurate genome editing.

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#### 1 INTRODUCTION

The sequencing of a large number of prokaryotic genomes and sequence comparison of closely related species have unraveled a large repertoire of genomic variations (Skovgaard et al., 2011; Srivatsan et al., 2008). A large number of studies focusing on variations in prokaryotic genomes have been majorly concentrated on single-nucleotide variations and small insertion-deletion events (Sun et al., 2012). It is now being increasingly recognized that in addition to single-nucleotide variations, other types of variations that include large genomic rearrangements are not infrequent in bacterial genomes (Darling et al., 2008; Sun et al., 2012). Among the different types of genetic variations found in genomes, structural variants have remained the most difficult to identify and interpret. Structural variations (SVs) encompass a fairly large piece of DNA and can emerge as a result of different cellular mechanisms such as DNA recombination, replication and DNA repair (Hastings et al., 2009b). SVs

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introduce variability in gene copy number, position, orientation and, in several cases, combinations of these events (Freeman *et al.*, 2006). The mechanisms of SV formation appears to be similar in prokaryotes and eukaryotes (Hastings *et al.*, 2009a, b). But, SVs have not been widely explored and studied in prokaryotic genomes as compared with eukaryotes (Kresse *et al.*, 2003; Liang *et al.*, 2010; Skovgaard *et al.*, 2011).

The comprehensive assessment of SVs has been a challenge largely due to the underlying complex mechanisms that gives rise to them. Accurate and precise identification of SVs would require prediction of three features, namely, copy, content and structure (Alkan *et al.*, 2011). Over the years, several approaches have been developed to detect and characterize SVs. Some of the classical methods include ArrayCGH (array comparative genomic hybridization) and single-nucleotide polymorphism (SNP) arrays, which have been extensively reviewed earlier (Alkan *et al.*, 2011; Carter, 2007). ArrayCGH is based on hybridizing fluorescently labeled sample with normal DNA immobilized on a glass surface and analyzing hybridization ratios. SNP arrays on the other hand use single sample per array and measure the intensities of the probe signals on the basis of single base difference.

The major understanding on the genomic landscape of SVs was facilitated by the availability of sequencing technologies coupled with computational algorithms to map and identify SVs at a much higher resolution (Skovgaard et al., 2011; Sun et al., 2012). In sequencing-based approaches, paired-end reads generated with an approximate insert size are mapped onto the reference genome. The pairs mapping at a distance substantially different from expected length or in altered orientation are nominated as structural variants. SVs identified by means of sequencing data offer a strong advantage of detecting 'breakpoints' (i.e. sequence boundaries where an SV begins and ends) (Jiang et al., 2012; Sindi et al., 2009; Ye et al., 2009), which can further aid to unravel the functional impact of a variant and the mechanisms that created it (Bao et al., 2014). Though the high-throughput technologies have significantly contributed to the understanding of the repertoire of SVs in prokaryotic genomes, the problem of SV detection has always remained challenging as none of the methods can appropriately address the complexity of repetitive regions found in genomes.

It is widely believed that the SVs arise as a by-product of illegitimate recombination events (homologous recombination) and also by imprecise non-homologous repair mechanism

during aberrant DNA replication to repair broken replication forks (Hastings *et al.*, 2009a, b). Apart from being the focus of evolutionary analysis (Lim *et al.*, 2012), the phenotypic implications of SVs in bacterial genomes have also been deciphered (Cui *et al.*, 2012; Dobinsky *et al.*, 2002; Nagarajan *et al.*, 2012), which are discussed in detail in the later part of the manuscript.

In this review, we provide a comprehensive overview of the present understanding of SVs in general and in the context of prokaryotic genomes. We briefly describe the various types of SVs, discuss their probable molecular mechanisms of formation, advances in the development of tools and techniques to detect SVs and also their phenotypic consequences in context of prokaryotic genomes. We also discuss currently used methodologies of next-generation sequencing (NGS) and analysis algorithms, which could provide a comprehensive and high-resolution map of SVs and how they could be extensively used for understanding biological phenomena of strain variability and evolution. We also describe their potential applications in the emerging fields of synthetic biology and genome engineering.

#### 2 GENERAL OVERVIEW OF SVS

SVs involve long stretches of DNA that can span from a few kilobases to sometimes up to millions of base pairs in length. Chromosomal rearrangements can result in loss, amplification (Andersson *et al.*, 1998), translocation (Block *et al.*, 2012) and inversions (Johnson, 1991) of DNA fragments. SVs can contribute to evolution of an organism through disruption of an existing gene (Jasin and Schimmel, 1984), creation of a new gene (Nagarajan *et al.*, 2012) or a chimeric gene product through gene fusions (Nogami *et al.*, 1985; Roth *et al.*, 1996). In bacterial genomes, chromosomal rearrangements can change the distance of a gene from the origin of chromosome replication (oriC) leading to altered gene copy number and thereby affecting its expression (Rebollo *et al.*, 1988).

SVs can be broadly classified into five major classes— Deletions. Duplications, Insertions, Inversions and Translocations. Each of these discrete events is caused by a double-strand break involving at least two different locations, followed by a re-ligation of the broken ends to produce a new chromosomal arrangement or context at the ends (Hastings et al., 2009a, b; Roth et al., 1996). The rearrangements could widely vary in their lengths, ranging from a few thousand nucleotides to a few million nucleotides. In some cases, the rearrangement could encompass genes, even operons or a large number of genes depending on the size of the rearranged fragment (Hastings et al., 2009b). The different types of SVs and their genomic contexts are summarized in Supplementary Figure S1. The functional consequences of the SVs could therefore vary widely.

The unbalanced SVs having a net gain or loss of genetic material include deletions, duplications and insertions (Bentley and Parkhill, 2004). Deletions entail loss of a genomic segment, and could be intragenic, wherein they result in inactivation of a gene or the loss of one or more functional domains or an altered gene function. In case of intergenic deletions, they could potentially affect the regulatory regions, thereby affecting the expression of neighboring genes (Angov and Brusilow, 1994). Duplications are marked by the presence of two or more copies of a genomic

region or a genomic segment (Anderson and Roth, 1977). The duplicated regions may either lie adjacent to each other, referred to as tandem duplication (Wang et al., 1982) or could occur at a different genomic location termed as insertional duplication. Duplication generally results in gain of a copy of the DNA segment carrying information (Roth et al., 1996). The functional consequence of the duplication could vary depending on the information content of the duplicated genomic segment and also on the context in which it is inserted (Reams and Neidle. 2004). The third class of unbalanced SVs is the insertions. Insertion involves gain of a genomic segment through a double-stranded break (DSB). The well-studied example of insertions is the Horizontal Gene Transfer (HGT) (Nelson et al., 1999; Ochman et al., 2000). HGT results in the gain of a new genomic segment in a new genomic context. In addition to novel sequence insertion, mobile-element insertion can also lead to SVs (Xing et al., 2009). Mobile elements jump from one position to another within a genome often resulting in duplication. The functional consequences of insertions are governed by the information content of the inserted fragment and the context of the genomic segment of insertion (Dobinsky et al., 2002).

The balanced SVs comprise inversions. Inversions are variations that involve a rearrangement of the orientation of a genomic segment (Johnson, 1991). These are copy-invariant SVs because there is no net gain or loss of genomic information. Typically, inversions involve two breakpoints and realignment of the flipped ends. The functional consequences of inversions are potentially guided by their new genomic contexts (Johnson, 1991).

SVs could also involve exchange of a genomic segment from one context to another within the same chromosome or between chromosomes and are classified as translocations. Translocations can be either balanced with the retention of full genetic functionality or unbalanced with loss or gain of functional elements (Block *et al.*, 2012). This type of SV is particularly more evident and common in multi-chromosomal bacteria, where the smaller secondary chromosomes evolve more rapidly (Morrow and Cooper, 2012).

## 3 MOLECULAR PREDISPOSITION AND MECHANISM OF STRUCTURAL VARIABILITY IN PROKARYOTIC GENOMES

Apart from the above well-defined classes of SVs, complex SVs that include combinations of two or more of these broad classes are not uncommon to observe in real-life situations (Hastings et al., 2009b). A number of studies have highlighted the molecular predispositions that enable SVs to occur. This includes a wide variety of chromosomal contexts such as sequence and structural motifs, repeat elements, insertion sequence (IS) elements and transposon elements (TE) (Mahillon and Chandler, 1998; Treangen et al., 2009). In organisms with repetitive DNA, homologous repetitive segments within one chromosome or on different chromosomes can serve as sites for illegitimate crossing-over. Bacterial DNA consists of an extensive array of repetitive sequences, which significantly underlie genomic instability and contain recombination hotspots (Aras et al., 2003; Treangen et al., 2009). DNA repeats increases the chances of

rearrangement through recombination, amplification and deletion of genetic material, thereby leading to genome plasticity (Aras *et al.*, 2003; Bao *et al.*, 2014). Generic repeats may arise by HGT whereby the incoming DNA fragment contains the information already present in the host genome and integrates seamlessly into the host genome using site-specific recombination (Treangen *et al.*, 2009).

There have been some important functional consequences of repetitive elements in chromosome rearrangements. Naas et al. (1995) suggested that in resting Escherichia coli strain, the spontaneous mutagenesis is IS-specific and the observed genetic polymorphism is a consequence of DNA rearrangements. The effects of deletions are highly irreversible and can be explained by the loss of functions. The effects of large inversions on the other hand result from selection for chromosome organization (Rocha, 2008). The Neisseria species contains an extensive array of repetitive sequences such as tandem repeats and IS elements spread throughout its genome. Comparative genome analysis of Neisseria meningitidis revealed that repeats are involved in three major inversion events (Bentley et al., 2007). Additionally, the bacterial species Neisseria gonorrhoeae, which contains fewer repeat elements than N.meningitidis, also showed that rearrangements are associated with IS elements leading to inversion (Spencer-Smith et al., 2012). In addition to the sequence elements, other structural elements including Z-DNA (Freund et al., 1989) and G-quadruplex motifs have been implicated in predisposing specific genomic loci to recombination (Katapadi et al., 2012).

## 4 PHENOTYPIC IMPACT OF SV AND CHROMOSOMAL REARRANGEMENTS

Genome rearrangements in prokaryotes have also been studied in relation to their phenotypic outcomes. Recent studies suggest that the genomic rearrangements and SVs have a profound impact on the phenotypic outcomes in a number of organisms (Cui et al., 2012; Gaudriault et al., 2008; Okinaka et al., 2011). Both balanced and unbalanced forms of variation have remained difficult to interpret with respect to their functional consequence. Though many variant calling technologies have enabled the identification and characterization of SVs (Skovgaard et al., 2011; Sun et al., 2012), the large size of the SVs and the complexities of their rearrangements have posed challenges in deciphering their functional consequences. In addition, the molecular, cellular and mechanistic insights into their formation and resultant phenotype remain largely obscure (Weischenfeldt et al., 2013). Some important studies emphasizing the functional impact of SVs in prokaryotic genomes have been established (Darling et al., 2008). Large-scale rearrangements in closely related strains of a species, for example, in the case of Yersinia pestis, have shown to significantly contribute to the evolution, divergence and pathogenicity of the organism (Liang et al., 2010).

Deletions and duplications can potentially lead to altered doses of otherwise functionally intact elements. Phenotypic effects of deletions depend on the size and the location of deleted chromosomal segments on the genome. Larger deletions are likely to involve many genes, thereby resulting in more drastically altered phenotypes (Srivatsan *et al.*, 2008). Deletions

encompassing loss of essential genes or gene components may significantly hamper cell viability (Jasin and Schimmel, 1984). On the other hand, gene duplication can have four possible outcomes (Treangen *et al.*, 2009): (i) non-functionalization or loss of the duplicated gene through deletion or degeneration; (ii) subfunctionalization, resulting in adoption of complementary roles; (iii) neo-functionalization, resulting in new functions (Blount *et al.*, 2012); and (iv) differential regulation of duplicated genes allowing spatiotemporal expression. The last possibility has been explored by Nagarajan *et al.* where they show that both the operons of duplicated hik31 are temporally and differentially regulated and share an integrated regulatory relationship (Nagarajan *et al.*, 2012).

Gene deletions could also arise from recombination events involving repeats (Gaudriault *et al.*, 2008). It has been proposed that these deletions arise because these genes are particularly rich in closely spaced repeats (Achaz *et al.*, 2002), for example, the deletion of 54 nt between two 8 nt length direct repeats in the mismatch repair gene, mutS of *Pseudomonas aeruginosa* show close association of the deletion with the repeats at the edges (Oliver *et al.*, 2002). In another study, experimental deletion of the mutS gene of *E.coli* showed that the truncated protein introduces variability in DNA binding, dimerization and its interactions with mutL (Wu and Marinus, 1999).

Large chromosomal inversions were initially considered to be rare in bacteria (Roth et al., 1996), but recent studies show these to be among the major forces responsible for genome evolution (Hughes, 2000). The two closely related species Salmonella typhimurium and E.coli displayed contrasting behavior in terms of permissibility of inversions. Though in E.coli, it was earlier shown that inversions could lead to viable cells with reduced cell growth (Hill and Harnish, 1981) but later it was also demonstrated that the inversions introduced in the non-permissive regions of the chromosome were refractory in nature meaning that they are mechanistically feasible but lethal (Guijo et al., 2001; Rebollo et al., 1988). However, in S.typhimurium no such region was identified and the failure to introduce inversions was suggested to be a mechanistic problem (Miesel et al., 1994; Segall et al., 1988). In yet another supporting evidence, Campo et al. (2004) characterized the two constrained chromosomal regions in gram-positive bacteria (the oriC and ter domain) where they showed that introduction of inversions is mechanistically possible but leads to reduced cell fitness and lethal cell phenotype.

Acquisition of mobile genetic elements through HGT in Staphylococcus aureus contributes to its genotypic and phenotypic diversity (Deurenberg et al., 2007; Diep et al., 2006). Clones of S.aureus are thought to evolve by point mutations instead of genetic recombination, which are considered as rare in this species (Feil et al., 2003). Introduction of mobile genetic elements by site-specific recombinases can bestow epidemiological advantage to the pathogen with traits such as survival under low pH conditions, and stressed environments, or drugresistant strains (Deurenberg et al., 2007; Diep et al., 2006). Genomic rearrangements can confer drug resistance and aid in pathogen evolution such as the evolution of pandemic strains in Y.pestis as a result of accumulation of rearrangements (Liang et al., 2010). Alteration in the gene pool of a genome is central to adaptive evolution. Reconstructing the genome synteny evolution can contribute to understanding of the dynamics of genome evolution. Genome rearrangements can lead to gain or loss of genes and can help to understand the long- and short-term genome evolution (Furuta *et al.*, 2011). Although evolution-ary implications of SVs have been shown at large, few studies have highlighted their functional and biological importance. For instance, the reversible switching on–off of colony variation in *S. aureus* suggest a survival strategy for coping with uncertain and variable environments (Cui *et al.*, 2012). Some key examples highlighting phenotypic changes associated with SVs in bacterial genomes are presented in Supplementary Table S1.

Apart from creating SVs in the genome, TEs and IS elements can also influence the expression of the genes, depending on the context of the gene in relation to the element. TEs can affect the expression of closely placed and nearby genes by either interrupting them or enhancing their expression (Brown and Evans, 1991). SVs involving IS elements have been shown to activate the expression of neighboring genes (Hubner and Hendrickson, 1997; Mahillon and Chandler, 1998). A conceptual overview of the potential functional effects of SVs is summarized in Figure 1.

#### 5 SYMMETRY OF GENOME REARRANGEMENTS

Large rearrangements have been shown to be highly deleterious in prokaryotic genomes (Rocha, 2008). The symmetrical organization of bacterial chromosome along the replichores (Eisen et al., 2000) leads to biased symmetrical genome rearrangements. Three selection forces have been hypothesized by Mackiewicz et al. (2001) for the biased symmetrical genome rearrangements. Firstly, the distance of a gene from oriC has been shown to be a major selection force. This arises from the fact that the copy number of transcripts is significantly variable and dependent on the distance of the gene from the oriC, and a strong positional bias for genes with specific functional attributes have been observed. The selection pressure leads to optimally placed genes with respect to oriC for genes with certain functional attributes. Second, difference in replication associated mutational pressure in leading and lagging strands (Mackiewicz et al., 2001). Symmetrical inversion of genes encompassing the oriC does not change gene location with respect to the leading and lagging DNA strands (Eisen et al., 2000). Thirdly, the constraint of keeping both replichores of same size leads to symmetrical inversions at oriC and ter. Large inversions, which disturb the symmetry around the constrained chromosomal regions, i.e. the oriC and ter domains, have been suggested to result in reduced cell fitness (Campo et al., 2004). Symmetrical inter-replichore inversions are more frequently observed than any other rearrangement. Chromosome breakpoint analysis in naturally evolving population of Yersinia showed that the rate of inversion is three times higher near oriC, thereby, displaying recombination bias and selective forces reducing the inversion rate near ter (Darling et al., 2008).

#### 6 METHODS FOR DETECTING SVS

#### 6.1 Classical approaches

Technological advancements for detecting genomic SVs have facilitated our ability to investigate details of genome structure, patterns and extent of genome organization in various organisms

(Quail et al., 2012; Sun et al., 2012). The classical approaches used to detect SVs include conventional cytogenetic methods of 'chromosome banding', which is staining of condensed chromosomes for precise identification of individual chromosomes or parts of chromosomes, and 'karyotyping', which is the process of pairing and ordering all the chromosomes of an organism. These methods were limited by their low throughput and low resolution (Alkan et al., 2011). High-density genotyping microarrays involved hybridization of nucleic acid sample to a large set of probes to detect variations in genes. Although they were high on throughput, they were limited by detecting only small copynumber variants (Iafrate et al., 2004). The resolution and scalability of SV detection was improved with use of an 'optical mapping' technique, which was based on restriction mapping and allowed identification of fine-scale structural analysis of genomes but on other hand was limited by its dependency on a reference genome (Teague et al., 2010). Other techniques include 'DNA barcoding', which uses a short genetic marker in an

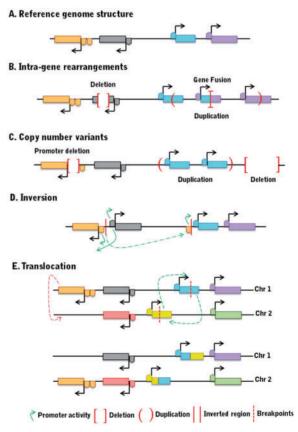


Fig. 1. Conceptual overview of functional consequences of SVs. (A) Genomic region without any SV. The boxes represent genes, and the small connectors beside them represent the promoter of respective gene. (B) Intragene rearrangement depicting deletion and gene fusion as a result of partial gene duplication. Altered coding regions result in aberrant transcripts. Deletion or duplication can lead to altered gene dosage of otherwise functionally intact regions (C) Change in copy number as a result of deletion (altered regulation) and duplication. (D) Inversions affecting gene structure, the gene gets inverted and flipped and rearranges, thereby pushing one of the promoters of first gene (orange) away from it. (E) Translocations affecting genic context

organism's DNA to identify species. It allows detection of balanced rearrangements by making use of fluorescently labeled nano-channel flow cells (Das *et al.*, 2010). The 'emulsion droplet PCR' method generates water-in-oil emulsion droplets containing all polymerase chain reaction components and has been used for estimating absolute copy number (Beer *et al.*, 2007). The major impetus toward understanding genomic SVs sprang from the availability of whole-genome sequences of multiple prokaryotic species and, in many cases, multiple closely related strains of a given species (Tatusova *et al.*, 2014).

### 6.2 Detecting rearrangements by whole genome comparisons

A large number of tools and methods offer information on rearrangements by pairwise comparative analysis of sequences. 'GeneOrder3.0' developed by Celamkoti *et al.* (2004) allows the rapid identification and visualization of gene order and synteny between two bacterial genomes under comparison without any a priori knowledge or information of their phylogenetic relatedness. It has been tested on the smallest bacterial genomes: *Mycoplasma*, *Haemophilus* and few other bacteria of size <2 MB. It is an enhanced version of previous algorithms GeneOrder (Mazumder *et al.*, 2001).

Structural changes in genome are common occurrences during evolution of prokaryotic species. The earlier methodologies for annotating SVs in prokaryotic genomes have been majorly focused on pairwise comparison of genomes. In 2004, Darling et al introduced a multiple genome comparison and visualization method called Mauve, which identifies rearrangements and inversions in conserved regions, small in-dels and the exact sequence breakpoints. When used to align nine enterobacterial genomes it was able to resurrect most of the known inversions (Darling et al., 2004). Comparing rearrangements in multichromosome genomes proved to be a more daunting task. In 2006, Lu et al proposed a novel algorithm called 'FFBI' (Fusion, fission and block interchanges), to compare circular multi-chromosome genomes such as the Vibrio Burkholderia pathogens (Lu et al., 2006). The FFBI algorithm was designed to analyze genome rearrangements arising as a result of chromosome fusion, fission and blocks interchanges. Genome rearrangements detected in the three Vibrio genomes were coherent with earlier studies.

In 2011, a highly computationally efficient whole genome alignment tool called Mugsy was introduced, which detected duplications, rearrangements and large gain/loss in genomes (Angiuoli and Salzberg, 2011). Mugsy's performance was evaluated on 57 *E.coli* and 31 *Streptococcus pneumoniae* genomes. It works without reference genomes.

Recently, Marttinen *et al.* (2012) developed a statistical algorithm called 'BratNextGen' that allows large-scale comparison of recombination events in hundreds of complete bacterial genomes. They compared 241 whole genomes of *S.pneumoniae* to detect ~39k polymorphic sites over the 2 MB genome aligned. BratNextGen functions by creating a Bayesian clustering model, to detect recombination in taxa along with resampling.

Large chromosomal rearrangements studies done using traditional genetic mapping or whole genome comparisons have been challenging in terms of accuracy and throughput. The

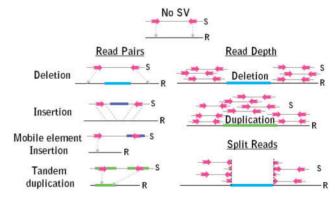
availability of a gamut of new technologies for high-throughput nucleotide sequencing have opened up new opportunities toward understanding genome structure and their variations.

#### 6.3 Detecting SVs using NGS

Whole genome sequencing (WGS) by means of NGS platforms has been used to detect mutations (Srivatsan et al., 2008). Though tools for mapping of paired-end information for SV calling are plenty, however, each may have their own limitations, advantages and overheads of usage. Additionally, most of them have been tested on eukaryotic (specifically humans) genomes and require additional confirmation so as to confidently rely on their output (Chen et al., 2009; Hormozdiari et al., 2009; Korbel et al., 2009; Zeitouni et al., 2010). Nevertheless, as the mechanism of SV formation in both eukaryotes and prokaryotes appears similar (Hastings et al., 2009a, b), the tools and algorithms could essentially be applied to study SVs in prokaryotes as well. Data from short-read sequencing generally lead to incomplete genome assemblies because of the intractable complexities such as long repetitive regions found in genomes (Huddleston et al., 2014). However, with the availability of long reads sequencing technologies with read lengths sometimes extending to tens of kilobases from single molecule sequencing approaches (Quail et al., 2012) to generate finished microbial genomes (Chin et al., 2013), provides a new opportunity toward identifying SVs and genome dynamics at a higher resolution.

A plethora of analytical algorithms and techniques have been developed over the years to precisely detect SV boundaries (Fig. 2) with increased resolution ranging from few mega base pairs to kilo base pairs and recently to even at the single nucleotide resolution (Chen *et al.*, 2009; Medvedev *et al.*, 2009; Zeitouni *et al.*, 2010). A comprehensive list of sequence signatures that can be used to efficiently call SVs is detailed by Alkan *et al.* (2011). In the following section, we review some of these algorithms and techniques with their potential applications and limitations.

6.3.1 Tools and algorithms to detect SVs using NGS data A selected list of available software and resources for detecting and analyzing gene rearrangement and SVs is presented in



**Fig. 2.** Some of the commonly used analytical ways of detecting SVs. Paired-end reads, Read depth and Split reads could be used to call SVs. Read depth refers to the number of reads mapping onto a particular part of the genome. In Split reads, a single read maps to two different parts of the genome that lie far away from each other

Table 1 and a comprehensive list of same is provided in Table S2. In this section, we would discuss some of the algorithms developed in the past 5 years. The algorithm *PEMer* (*Paired-End Mapper*) could process data from several NGS platforms and mapped SVs at a high resolution (Korbel *et al.*, 2009). *PEMer* maps SVs at a higher resolution with a confidence measure and allows storage, display and manipulation of SV data. *PEMer* can detect insertion, deletion and inversions. Despite a few limitations of *PEMer* such as its inability to detect breakpoints in repetitive regions, SNP-based misalignment errors and missing out large insertions, it appears to be a useful method for calling variants.

Next-generation VariationHunter introduced in 2010 (Hormozdiari *et al.*, 2010) was an improved version of previously published combinatorial algorithm VariationHunter (Hormozdiari *et al.*, 2009). It makes use of maximum parsimony algorithm to map paired-end reads obtained from NGS. Compared with its earlier release, the new algorithm could resolve incompatible SV calls and requires no post-processing of results. Besides insertions, inversions and deletion events, it also has the capability to detect mobile element insertions. It has better accuracy than MoDIL, which can detect 20–50 bp indels (Lee *et al.*, 2009) and BreakDancer (Chen *et al.*, 2009).

Skovgaard introduced a novel way of using this technology by combining it with copy-number analysis of template DNA in fast-growing bacterial cultures of *E.coli* (Skovgaard *et al.*, 2011). Instead of mapping reads obtained from stationary culture where copy number is constant, they obtained clear contrasting behavior of reads from DNA of exponentially growing cultures confirming presence of a large inversion.

In 2012, Sun *et al* (2012) used 454 pyro-sequencing combined with a 'split mapping' computational method to detect spontaneously occurring genome rearrangements (SGRs) from fast-

growing culture of *Salmonella sp.*. Breakpoints were determined to base pair resolution, and experimental verification of breakpoints of SGRs was carried out by padlock probe hybridization (Sun *et al.*, 2012).

Detecting SVs accurately from real data can be challenged by limitations in experiment designs, few validated SVs and low resolution of breakpoints. In contrast to this, there is equal probability of imperfections present in the algorithms design rather than the laboratory issues such as reporting of false positives or missing out true positives. In light of this, in 2013, Bartenhagen devised a tool RSVSim, which is a fully simulated approach for detecting SVs (Bartenhagen and Dugas, 2013). It can simulate five types of most common SVs for practically any type of genome. Artificially rearranged genomes from RSVSim can serve as performance evaluators for NGS-based algorithms.

Apart from the above discussed tools and algorithms for SV detection, there are a number of other tools (Supplementary Table S2) as well that can be explored in context of prokaryotic genomes and are worth mentioning such as Pindel (Ye *et al.*, 2009), SegSeq (Chiang *et al.*, 2009), BreakDancer (Chen *et al.*, 2009), SVDetect (Zeitouni *et al.*, 2010), DELLY (Rausch *et al.*, 2012), SVM<sup>2</sup> (Chiara *et al.*, 2012) and PRISM (Jiang *et al.*, 2012). More details about these tools, what they detect and their advantages and limitations are provided in Supplementary Table S2.

#### 7 CONCLUSIONS AND FUTURE DIRECTIONS

The present knowledge and repertoire of SVs in prokaryotic genomes is limited to a handful of examples. Although the phenotypic consequences of many of the SVs are not well understood, the known repertoire of phenotypic consequences suggests their role in a wide spectrum of physiological and phenotypic outcomes (Deurenberg *et al.*, 2007). The lack in the understanding

Table 1. Major computational approaches/tools for detecting and analyzing SVs (also see Supplementary Table S2 for a comprehensive list)

Approach/tool	Description	Detection	Advantages	Limitations
PEMer (Korbel et al., 2009)	Modularized framework for detecting SVs. Includes read mapping, filtering low-quality reads, signature detection and clustering	Insertions, deletions, inversions and more complex events	High resolution and also high sensitivity	Can not detect segmental dupli- cations particularly in repetitive regions; can include SNP-based misalignment errors; large in- sertions (>3 kb) could be missed
Next-generation VariationHunter (Hormozdiari <i>et al.</i> , 2010)	Identifies the most parsimonious mapping of paired end reads. Calculates probability of each SV.	Insertion, inversion, deletion and mobile element insertion	Identifies transposition events and removes ambigu- ity in variation discovery	_ ` ` ´
NGS and copynumber analysis (Skovgaard <i>et al.</i> , 2011)	Combines WGS and copy- number analysis for detecting rearrangements	Inversion, duplication	Detects point mutations, single and dinucleotide in- dels and major genomic rearrangements	Efficient for cultivable and fast-growing prokaryotes.
454 pyrosequencing and 'split mapping' (Sun <i>et al.</i> , 2012)	Identifies unique junction sequences formed by spontaneous genome rearrangements	Deletion, duplication and inversion	Identifies junction sequences at base pair resolution	Efficient for cultivable and fast-growing prokaryotes
RSVSim (Bartenhagen, 2013)	SVs are simulated randomly, based on user-supplied genomic coordinates or associated to various kinds of repeats	Deletions, insertions, inversions, tandem duplications and translocations	Covers a wide range of SVs and considers size of SVs and their mechanism of formation	_

of genomic landscape of structural variability and its phenotypic consequences in prokaryotes was primarily due to the paucity of large-scale genome data for closely related organisms, and recent evidence suggests that this is rapidly changing (Skovgaard et al., 2011; Srivatsan et al., 2008). The availability of high-throughput sequencing technologies (NGS) offers the throughput, scale and cost-effectiveness required to do genome-wide associations for specific traits or phenotypes in prokaryotes. This would require two major gaps in the area to be addressed. The primary one being methodologies to phenotypically screen large populations of prokaryotes and secondly the computational algorithms, which can decipher, map and report genomic variations at large scale for these screens in short time.

Also the availability of longer read lengths that could encompass repeat regions could also provide immense insights into SVs in prokaryotic genomes. The deciphering of the genomic variability in E.coli strain from the German outbreak is worth mentioning (Rasko et al., 2011) where longer read lengths and computational algorithms were extensively used to decipher additional SVs, which were not previously annotated, and could provide new insights into the evolution and pathogenicity of the strain. The availability of datasets in the public domain for a number of prokaryotic species (Tatusova et al., 2014) provides a unique opportunity to understand the structural variability in prokaryotes. Although the phenotypic correlates for many of these strains would not be available, the extent of information could, however, provide enormous insights toward deriving a baseline map of polymorphic SVs in these genomes, a much needed resource toward inferring phenotypic correlates.

The in-depth understanding of SVs and its phenotypic consequences would see its widespread applications in a number of areas. The major area that could benefit from this knowledge is Synthetic Biology (Marguet et al., 2007). The understanding of gene arrangement, organization and positioning could extensively be used to engineer new genes and pathways and contribute to a set of rules for designing and engineering genomes. As interest in engineering bacterial genomes increases, the need for developing efficient tools for their successful manipulation also increases. Site-specific recombination system such as the Cre-lox system has been used to create deletions in E.coli (Fukiya et al., 2004) and large inversions in Lactococcus lactis (Campo et al., 2004). Recently, a new technology called GETR (Genome Editing via Targetrons and Recombinases) has been introduced for genome engineering of practically any bacteria (Enyeart et al., 2013). The technique has been efficiently used to introduce insertions, deletions, inversions and translocations in E.coli, S.aureus and Bacillus subtilis. For efficient genome engineering, it is required to induce DSBs in the DNA to initiate the recombination process. For a long time, it was not possible to induce DSBs owing to the lack of means to target DSBs to specific sites, however, with the introduction of technologies to synthesize and assemble large fragments of DNA (Ellis et al., 2011), and tools capable of accurately editing genomic regions have made it possible. The availability of genome editing tools like ZF-TFs (zinc finger transcription factors; Gommans et al., 2005), CRISPR/ CAS [clustered regularly interspaced short palindromic repeats/ CRISPR-associated (Cas) systems; Cong et al., 2013] and TALENS (Transcription activator-like effector nucleases; Miller et al., 2011) could provide the much necessary

technological prowess to be able to accurately engineer genomes for strain improvements toward specific applications. It may not be excessively optimistic to believe that the rules of genome organization would find extensive application in genome engineering and genome design.

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