



Genomic methods for measuring DNA replication dynamics

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Abstract Genomic DNA replicates according to a defined temporal program in which early-replicating loci are associated with open chromatin, higher gene density, and increased gene expression levels, while late-replicating loci tend to be heterochromatic and show higher rates of genomic instability. The ability to measure DNA replication dynamics at genome scale has proven crucial for understanding the mechanisms and cellular consequences of DNA replication timing. Several methods, such as quantification of nucleotide analog incorporation and DNA copy number analyses, can accurately reconstruct the genomic replication timing profiles of various species and cell types. More recent developments have expanded the DNA replication genomic toolkit to assays that directly measure the activity of replication origins, while single-cell replication timing assays are beginning to reveal a new level of replication timing regulation. The combination of these methods, applied on a genomic scale and in multiple biological systems, promises to resolve many open questions and lead to a holistic understanding of how eukaryotic cells replicate their genomes accurately and efficiently.

Keywords DNA replication · replication timing · replication origin · genomics · single cell

Abbreviations

MFA	Marker frequency analysis
ORC	Origin recognition complex
MCM	Mini-chromosome maintenance
ChIP	Chromatin immunoprecipitation
ARS	Autonomous replicating sequence
SNS-seq	Short nascent strand sequencing
NSCR	Nascent strand capture and release
HU	Hydroxyurea
ini-seq	Initiation site sequencing
TSS	Transcription start sites
G4	G-quadruplex
LCL	Lymphoblastoid cell line
ESC	Embryonic stem cell
FISH	Fluorescence in situ hybridization
SMARD	Single-molecule analysis of replicating DNA
WGA	Whole-genome amplification
DOP-PCR	Degenerate-oligonucleotide-primed PCR
MALBAC	Multiple annealing and looping-based amplification cycles
LIANTI	Linear amplification via transposon insertion

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Introduction

The replication of genomic DNA is mediated by the sequential activation of DNA replication origins along chromosomes. Different origins are activated at different times during the S phase of the cell cycle to mediate bidirectional DNA synthesis that continues until the ensuing replication forks merge with opposing forks that originated from nearby origins. Ultimately, this process leads to the duplication of the entire genomic material, with different regions of the genome replicating at different times (Fig. 1). DNA replication origins are located at specific sites along chromosomes and are activated at characteristic and reproducible times, prompting questions regarding both the mechanisms and function of this spatiotemporal regulation. The “program” of replication origin activation and resulting replication timing has been linked to chromatin structure, chromosome conformation, gene activity, and genome stability and development. On average, early-replicating genomic regions tend to reside within

open chromatin regions in the “A” compartment and contain a high density of active genes, while late-replicating regions tend to be gene-poor and are more susceptible to accumulating mutations during evolution or somatic cell divisions. The replication program has been shown to be extensively remodeled during embryonic development and cellular differentiation, while disruption of the normal replication program can lead to cell lethality, developmental defects, and cancer (reviewed in (Aladjem and Redon 2017; Gaboriaud and Wu 2019; Rhind and Gilbert 2013)).

Not with standing the central role of DNA replication and its temporal regulation in cellular and organismal biology, several fundamental questions remain incompletely resolved despite many years of intensive research. For instance, the locations of replication origins in higher eukaryotic genomes remain to be unequivocally established, as does the actual nature of replication initiation sites as single origins, clusters of nearby origins, or a combination thereof. Similarly, although the replication timing of different genomic regions appears to be highly

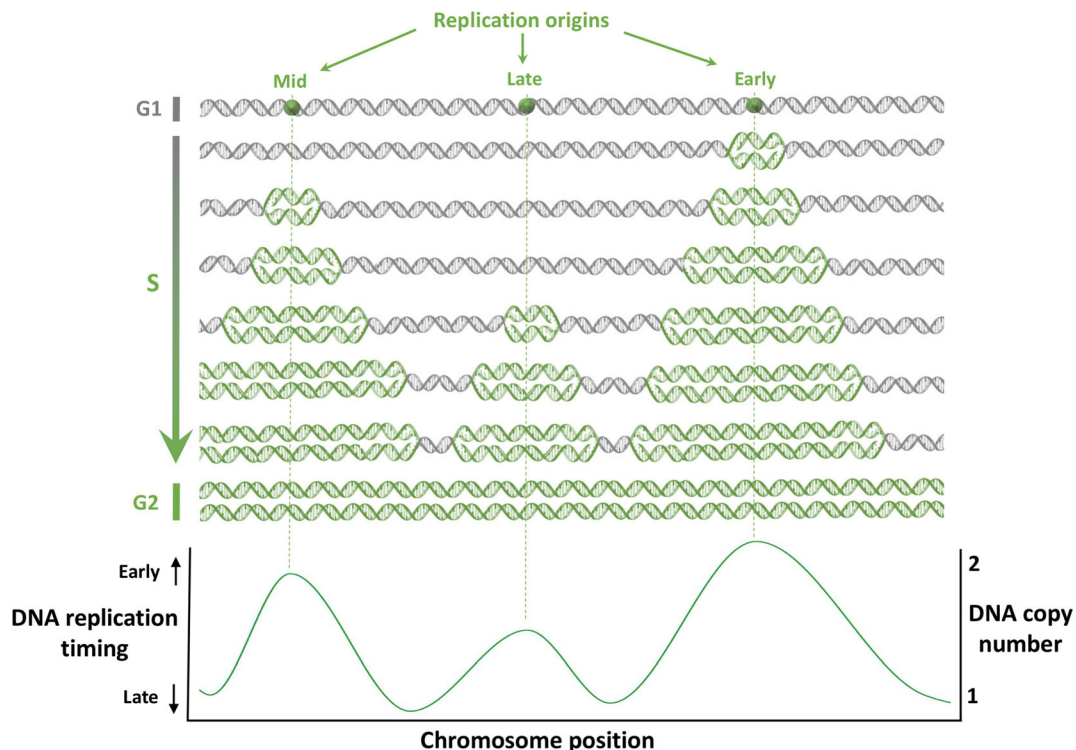


Fig. 1 DNA replication timing. DNA initiates at replication origins, each of which is activated at a characteristic time during S phase. Replication continues bidirectionally until all replication forks converge and the entire genome is replicated. The DNA replication timing program can be represented in the form of a replication profile (bottom), in which the amplitude of the profile

represents the replication timing along the chromosome and peaks correspond to the locations of replication origins. These replication profiles also correspond to the average DNA copy number in a population of replicating cells, in which earlier-replicating regions will have a greater DNA content compared to later-replicating genomic regions

reproducible, there is compelling evidence for substantial heterogeneity in origin activation timing among individual cells. The molecular mechanisms determining the activation times of different replication origins are another fundamental yet unresolved aspect of DNA replication. Last, while replication timing has been linked to cellular and organismal development, it remains unclear to what extent that different functional aspects have driven the evolution of the replication timing program. For example, is a specific replication program required in order to support particular patterns of gene expression (Muller and Nieduszynski 2012) or for maintaining the stability of specific parts of the genome (Gaboriaud and Wu 2019)? Or perhaps are there other “functions” for the replication timing program?

For several decades, a plethora of genetic, molecular, biochemical, and cellular assays have been applied to study DNA replication dynamics. These studies have revealed the existence of a replication timing program, the locations and nature of replication origins in bacteria and in budding yeast, and a great deal of detail regarding the mechanisms of replication initiation and DNA synthesis. Classical studies have also started to point out the intricacies of DNA replication timing, including the complexity of metazoan replication origins and their regulation. These studies set the stage for the current era of DNA replication research, where replication dynamics are studied predominantly on a genomic scale. A genomic approach has proven particularly important for studying DNA replication: not only does it provide the advantage of scale, but it also enables a much deeper interrogation of the concerted process of genome replication.

DNA replication encompasses the entire genome in a single “mega-reaction” in which replication of one genomic region affects that of other genomic regions. This is due to several reasons. First, since replication is continuous along chromosomes, replication initiation from one locus affects the replication timing of adjacent loci. These dynamics also lead to a form of replication origin interference, in which incoming replication suppresses the activity of replication origins that have yet to fire. Thus, replication timing is best interpreted in the context of the activity of all surrounding origins and, by extrapolation, of all origins on a chromosome. Second, replication origins compete for limited amounts of initiation factors (Lynch et al. 2019; Mantiero et al. 2011; Tanaka et al. 2011; Wong et al. 2011). Thus, replication activity in one part of the genome can in principle influence the replication of other parts (Yoshida et al. 2014). Last, replication timing is relative: in some

instances, an entire chromosome can be generally replicated before or after the replication of another chromosome (Koren and McCarroll 2014). By extension, a region that replicates relatively early compared to the rest of the genome may actually be late-replicating in the context of its chromosomal region. Thus, a full account of replication timing necessitates a genome-wide perspective.

Here, we review genomic approaches to studying DNA replication dynamics. We separate our discussion into three parts. First, we review genomic methods for measuring DNA replication timing itself and how these have evolved over the past few years. We then describe developing methods that aim to map the actual locations of DNA replication origins in higher eukaryotes. We end by discussing recent approaches for genome-wide replication profiling in single cells. Throughout, we focus on recent developments and challenges for the future, while we point the reader to several excellent reviews that provide more detail about various methods and approaches (Hyrien 2015; Prioleau and MacAlpine 2016; Raghuraman and Brewer 2010; Urban et al. 2015).

Measuring DNA replication timing in eukaryotic genomes

The first measurement of replication timing of a eukaryotic genome used a clever genomic implementation of the classic Meselson-Stahl experiment. *Saccharomyces cerevisiae* (budding yeast) cells were cultured in isotopically dense media, after which cells were transferred to light media and synchronously released into S phase. Replicated (heavy-light) DNA was separated from unreplicated (heavy-heavy) DNA at several time points, and genomic tiling microarrays were used to reveal the locations of replicated DNA, generating a genome-wide profile of replication timing (Raghuraman et al. 2001). The genomic scale of this first replication timing measurement revealed the locations of replication origins in the form of peaks that replicated before their adjacent regions, as well as the activation times of replication origins as indicated by the height of each peak. Similarly, troughs in the profile represented the locations and timing of replication termination events, while the slopes between peaks and valleys were interpreted to correspond to the rate of replication fork progression (see Fig. 1). This study revealed several important principles that were largely inaccessible with pre-genomic analyses. For instance, origin activation times appeared

to lie on a continuum rather than being bimodally distributed to early and late. In addition, replication was earlier near the centromeres and later near telomeres, a property that had been alluded to with locus-specific studies yet is best evaluated with chromosome-level data. Notwithstanding the transformative impact of this first genomic analysis of replication timing, several limitations of such an approach also became clear. For instance, not all replication origins can be detected, in particular locally weak or inefficient origins that may be undetected or missed in data analysis (e.g., over-smoothed). Similarly, the inferred locations of replication origins are not precise, and single origins cannot be discriminated from tight clusters of several nearby origins. Replication fork progression inferred from replication timing profiles can be confounded by integrating information from multiple, often superimposed replication forks (de Moura et al. 2010). To a large extent, these limitations are due to the ensemble cell-population-level measurement of replication timing in bulk cultures. Heterogeneity between cells has emerged as an important layer of complexity and a missing source of information in such genomic studies (see further below).

Following the first characterization of the replication dynamics of a eukaryotic genome, a branching-out of techniques ensued. Notable among those are the probing of replicating DNA via detection of single-stranded DNA (Feng et al. 2006), immunoprecipitation of nucleotide analogs (specifically, the thymidine analog BrdU) incorporated into replicating DNA (Knott et al. 2012; Peace et al. 2016), and detection of Okazaki fragments by DNA ligase inactivation and genomic analysis of short single-stranded DNA fragments (McGuffee et al. 2013; Smith and Whitehouse 2012). Another approach, which was used in parallel to the first characterization of the yeast replication program, is based on DNA copy number *per se*: the doubling of DNA can be followed along chromosomes as cells traverse through S phase (Yabuki et al. 2002).

All of the above techniques proved consistent and highly informative with regard to the replication of the budding yeast genome. However, interrogating the genomes of metazoan species introduced further challenges, most notably the greater difficulty of obtaining synchronized cell cultures and of genetic manipulation of the cells. While specialized techniques to synchronize mammalian cells have been implicated in genomic replication timing measurements (Farkash-Amar et al. 2008; Jeon et al. 2005), two complementary approaches

ultimately became the current mainstay of mammalian replication timing profiling. Both of these are genomic versions mirroring (or following) yeast techniques or locus-specific molecular techniques (Gartler et al. 1999; Hansen et al. 1995; Hansen et al. 1993; Koren et al. 2010a; Yabuki et al. 2002). The first approach is immunoprecipitation of BrdU-labeled DNA from cells flow-sorted into different fractions of S phase. Cells are incubated with BrdU for a certain amount of time (typically 30 min to 2 h) to allow incorporation into actively replicating DNA. This is followed by sorting of S phase cells, immunoprecipitation of BrdU-labeled DNA, and genomic analysis of the DNA by either microarrays or, more recently, next-generation sequencing. This approach obviated the need for synchronization and enabled genome-wide replication timing measurements in higher eukaryotes such as flies (Schubeler et al. 2002), mice (Hiratani et al. 2008), and humans (Chen et al. 2010; Hansen et al. 2010; Rivera-Mulia et al. 2015). Retrospective synchronization achieved by flow sorting enables a more native experiment without chemical perturbation of live cells. On the other hand, the reliance on analog-labeled DNA prevents the ability to use non-replicating G1 cells as a direct control. Accordingly, some experiments compare cells in late S phase to cells in early S phase (Hiratani et al. 2008; Rivera-Mulia et al. 2015; Ryba et al. 2010). Alternatively, several studies have used up to six fractions of cells within S phase (Chen et al. 2010; Du et al. 2019; Hansen et al. 2010) to measure replication timing. The use of multiple S phase fractions in particular reveals loci that replicate at different times between the two chromosomal copies (asynchronously replicating regions) (Hansen et al. 2010). This family of approaches is typically referred to as “Repli-seq.”

Repli-seq provides a highly reproducible assay and has led to the emergence of the “replication domain” model, in which long regions of 400 Kb to 1.2 Mb with consistent replication timing manifest as relatively flat plateaus on replication profiles (Hiratani et al. 2008; Pope and Gilbert 2013). Two limitations of Repli-seq are, however, notable: the use of BrdU requires continuous incubation with the analog which therefore labels long stretches of DNA as single units. These stretches are similar in length to replication domains. A second potential shortcoming is the sorting of sub-S phase fractions. This is expected to limit resolution, particularly at the beginning and end of S phase, if not all S phase cells are included in the sorting gates. In addition, the

use of one S phase fraction in comparison to another, instead of relative to a non-replicating G1 control, could also compromise the accuracy of the replication timing measurements. It remains an open question whether these restrictions account for some of the global properties of replication timing profiles measured using Repli-seq, such as broad domains.

A second general approach for measuring replication timing is based on assaying DNA copy number (see Fig. 1), similar to the original yeast experiment (Yabuki et al. 2002), yet by using sorted S phase cells instead of synchronized cells (Koren et al. 2010a; Woodfine et al. 2004). The quantitative nature of copy number measurements and the ability to assay G1 cells in parallel enable sorting a single, entire S phase fraction instead of several sub-S fractions. This offers a more complete and uniform representation of the replication profile, while G1 cells serve to correct for any technical deviation from euploid copy number. The power of this technique lies in its independence from *in vivo* manipulation of cells and in its experimental simplicity. It has accordingly been applied to various systems, from yeast where it enabled scaled-up experiments in many strains (Gispan et al. 2014, 2017; Koren et al. 2010a) and species (Agier et al. 2018; Koren et al. 2010b; Liachko et al. 2014; Muller and Nieduszynski 2012), to model organisms such as zebrafish (Siefert et al. 2017) and mice (Gdula et al. 2019; Gitlin et al. 2015; Yaffe et al. 2010; Yehuda et al. 2018), and to humans (Brody et al. 2018; Desprat et al. 2009; Koren et al. 2012; Massey et al. 2019; Mukhopadhyay et al. 2014; Yaffe et al. 2010). The more uniform representation of cells in S phase provides higher-resolution replication profiles than Repli-seq techniques, especially with deeper sequencing (Koren et al. 2014; Koren et al. 2012; Mukhopadhyay et al. 2014). However, the reliance on cell sorting means that resolution may still be lost in some very early or very late-replicating regions, since the corresponding cells may reside within the G1 or G2/M cell cycle fractions.

A more recent development of the copy number approach has eliminated the need for cell sorting. While direct measurement of DNA copy number in proliferating cells has been used for detection of replication origins in bacteria (referred to as MFA, marker frequency analysis; (Rudolph et al. 2013; Sueoka and Yoshikawa 1965; Yoshikawa and Sueoka 1963)) and also suggested in yeast (although stationary phase cells were still used as a reference; (Muller et al. 2014)), this

approach has more recently been used to probe the replication profile of entire human genomes (Koren et al. 2014). Proliferating cell cultures include a fraction of cells in S phase that enables detection of subtle fluctuations in DNA copy number along chromosomes by whole-genome sequencing. As little as 5–10% of cells in S phase are sufficient in order to generate high-resolution replication profiles. This approach is the least manipulative of all and for the same reason also the easiest to implicate. It does, however, require high-quality (and deeper coverage compared to other techniques) whole-genome sequence data and is more computationally challenging. The extra computational processing steps account for the lack of an empirical control sample (such as a G1 cell sample). Instead, the sequence data in combination with the reference genome is used to *in silico* simulate copy number profiles in non-replicating cells (Koren et al. 2014). Ultimately, this sequencing-only, copy number-based method is proving to yield the most accurate replication timing profiles, with sharp peaks and valleys even in mammalian genomes (Fig. 2).

Overall, genome-wide replication timing has by now been measured in various yeast species, plants, flies, zebrafish, mice, ape species, and normal and cancer human cells (Concia et al. 2018; Farkash-Amar and Simon 2010; Rhind and Gilbert 2013; Yang et al. 2018). It has been applied to cultured cells as well as *in vivo* animal specimens and low-input samples (Rivera-Mulia et al. 2019; Siefert et al. 2017; Yehuda et al. 2018). It has been performed in an allele-specific manner by relying on polymorphisms in offspring of genotyped family trios and quartets (Koren and McCarroll 2014; Mukhopadhyay et al. 2014) and of mouse strain crosses (Rivera-Mulia et al. 2018). Most recently, it has been advanced to the level of single-cell measurements (see below).

Mapping DNA replication origins genome-wide

While replication timing profiles provide a comprehensive account of a genome's replication dynamics, they only indirectly inform of the locations and activation times of replication origins. Accordingly, peaks in replication timing profiles of yeasts correspond to replication origins but can nevertheless be located several kilobases away from the actual initiation sites (due to resolution limitations). In higher eukaryotes, Repli-seq

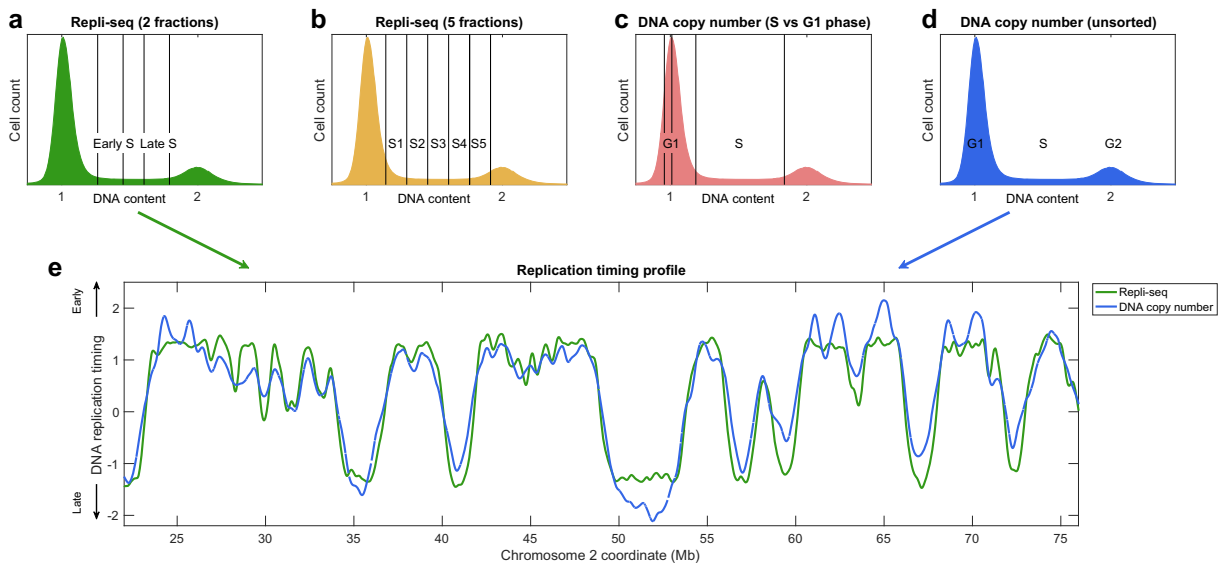


Fig. 2. DNA replication timing. (A–D) Different cell isolation schemes for measuring DNA replication timing. In Repli-seq (A–B), cells are incubated with BrdU, two to six fractions of S phase cells are sorted (five fractions are shown in B), and BrdU-containing DNA is sequenced. The choice of gate locations varies from one experiment to another, with some experiments using wider gates that together span most of S phase. Alternatively, the entire S phase fraction as well as G1 cells can be sorted and DNA sequenced without BrdU incorporation (C); DNA copy number is analyzed directly to infer replication dynamics. The control G1 cells are sorted from the left side of the G1 peak, in order to avoid inclusion of contaminating S phase cells (which would distort the

replication pattern in early S phase). G2 cells could also be used as controls instead of G1 cells. (D) Last, DNA can be sequenced from proliferating cells without any sorting. This reduces technical influences and avoids arbitrary choices of gate locations. (E) Representative DNA replication timing profiles for the lymphoblastoid cell line GM12878 generated by either two-fraction Repli-seq (Pope et al. 2014) or DNA copy number without sorting (Koren et al. 2014). Replication profiles from multi-fraction Repli-seq and from S-/G1-sorted cells (not shown) typically fall in between the other two approaches. Greater dynamic range and sharper peaks may be obtained by avoiding FACS sorting of S phase cells

approaches are typically thought to reveal replication domains rather than individual initiating sites, while copy number approaches can reveal distinct peaks yet cannot resolve single origins from origin clusters nor predict the precise locations of initiation sites. In parallel to studies of DNA replication timing, methods that directly identify replication initiation sites are therefore instrumental in understanding eukaryotic DNA replication.

Eukaryotic replication origins have originally been identified in budding yeast using several elegant techniques, some of which were later adapted to the genomic level. Originally, DNA sequences that confer autonomous replication ability to plasmids were isolated, which was later followed by functional 2-D gel assays in which locus-specific replication bubble structures were identified in their native chromosomal location (reviewed in (Fangman and Brewer 1991)). Such experiments opened the way to comprehensive genetic and biochemical characterization of yeast replication origins

and ultimately led to the uncovering of the origin recognition complex (ORC), the mini-chromosome maintenance (MCM) complex that forms the core of the replicative helicase, and other factors essential for replication initiation ((Bell and Stillman 1992; Diffley and Cocker 1992; Maine et al. 1984); reviewed in (Raghuraman and Brewer 2010; Tye 1999)). Subsequently, ORC and MCM binding were used to probe for origin sequences by chromatin immunoprecipitation (ChIP), which was later used on a genomic scale to reveal active as well as inactive origins genome-wide (Wyrick et al. 2001). The autonomous replicating sequence (ARS) assay has also been applied on a genome-wide level in budding yeast (“ARS-seq”), which revealed new ARSs, enabled identification of essential ARS sub-sequences, and tested the influence of sequence alterations on ARS function (Liachko et al. 2013). ARS-seq also enabled the identification of replication origins in other yeast species, such as *Pichia pastoris*, in which two different ARS elements were

identified (Liachko et al. 2014). Last, the identification of replication origin sequences in *S. cerevisiae* enabled their further refinement and dissection by studying their conservation among closely related *Saccharomyces* species (Nieduszynski et al. 2006). Together, the combination of focused and genome-scale assays has led to a detailed understanding of the locations, nature, and mechanisms of yeast replication origin activation.

While the biochemistry of replication initiation turned out to be highly conserved throughout eukaryotic evolution, the specification and regulation of replication origin sites are not. For instance, DNA sequences that are essential for mammalian replication origin activity have not been found, and the ARS assay has not been successful in higher eukaryotes (Gilbert 2004; Hyrien 2015; Prioleau and MacAlpine 2016). Instead, metazoan ORC binds DNA promiscuously throughout the genome (MacAlpine et al. 2010; Vashee et al. 2003), suggesting that a conserved sequence is not a primary determinant of replication origins in higher eukaryotes. Currently, searches for mammalian replication origins rely mostly on the molecular and biochemical rather than genetic properties of origins. Many of these methods are extensions of earlier yeast techniques for origin mapping. For instance, ChIP-seq has been applied to map human replication origins (Dellino et al. 2013; Miotto et al. 2016; Sugimoto et al. 2018). An alternative, ChEC-seq, fuses a protein of interest – for example, MCM subunits – to micrococcal nuclease, and uses DNA sequencing to examine the patterns of DNA cleavage reflecting the native binding region of the protein (Foss et al. 2019; Zentner et al. 2015). Bubble-seq extracts DNA bubble structures trapped in electrophoretic gels followed by next-generation sequencing to map their locations (Mesner et al. 2013). Another technique, short nascent strand sequencing (SNS-seq), size-selects and sequences short single-stranded DNA fragments that represent the early products of DNA replication (Besnard et al. 2012; Cadoret et al. 2008; Cayrou et al. 2011). In order to prevent false signals arising from random chromosomal breaks that occur during DNA isolation, SNS-seq makes use of another biochemical property specific to nascent DNA strands: the presence of short RNA primers upstream of newly replicated DNA. In yet another translation of a classic yeast technique to the genomic era, lambda exonuclease, an enzyme that digests DNA but is blocked by RNA (Bielinsky and Gerbi 1998), has been implicated to enhance the specificity of SNS-seq to replicating DNA. Alternatively, RNA primers can be used to positively

select for nascent DNA strands by binding short DNA molecules to a column and then using RNase I to specifically release RNA-primed DNA fragments (“nascent strand capture and release,” NSCR; (Kunnev et al. 2015)).

Instead of relying on RNA primers, nascent DNA can be isolated by pulse-labeling cells with BrdU or EdU, followed by isolation and sequencing analog-containing short double-stranded DNA fragments (Li et al. 2014; Mukhopadhyay et al. 2014; Smith et al. 2016). This approach has also been applied to cells arrested in early S phase using hydroxyurea (HU) in a technique called EdUseq-HU (Macheret and Halazonetis 2018; Tubbs et al. 2018). Alternatively, ini-seq (initiation site sequencing) uses isolated G1 nuclei that initiate replication in a cell-free system with soluble human cell extracts in the presence of digoxigenin-dUTP (Langley et al. 2016). The cell-free system used in ini-seq supports much slower replication than normal, facilitating the labeling of short DNA strands. Of note, the incubation periods with nucleotide analogs differ among these various techniques, which could potentially affect the resolution of origin calling.

Okazaki fragment sequencing (Smith and Whitehouse 2012) has also been applied to mammalian genomes. In OK-seq, cells are briefly pulse-labeled with EdU, after which short DNA fragments are isolated and EdU-containing DNA is enriched and sequenced in a strand-specific manner. Shifts in the ratios of DNA content between the two strands identify the locations of replication origins or, reciprocally, termini (Chen et al. 2019; Petryk et al. 2018; Petryk et al. 2016; Tubbs et al. 2018; Wu et al. 2018). Another approach based on the asymmetry of the replication fork uses bioinformatic sequence analysis to predict the locations of replication origins, adopting classical work in bacteria. The differences in DNA polymerase usage and DNA synthesis kinetics between the leading and lagging strands lead to a mutational signature – nucleotide composition skews – that reverses sign exactly at replication initiation sites (Huvet et al. 2007; Touchon et al. 2005). This principle has also been applied to particularly stable centromeric origins in certain yeast species (Koren et al. 2010b) and has been used to link somatic cancer mutations to replication direction shifts and, by inference, initiation sites (Haradhvala et al. 2016; Shinbrot et al. 2014; Tomkova et al. 2018). Interestingly, mutational patterns reminiscent of bidirectional replication around origins have been observed at CpG islands, which are associated with transcription start sites (TSS;

see further below (Polak and Arndt 2009)). The asymmetrical usage of DNA polymerases within the eukaryotic replication fork can also be used to experimentally map replication initiation sites and overall replication dynamics. This has been achieved by modifying different DNA polymerases so that they incorporate an excess of ribonucleotides into the sites and strands that they replicate, which can then be assayed by DNA sequencing (Clausen et al. 2015; Daigaku et al. 2015; Reijns et al. 2015).

Naturally, these diverse techniques each have strengths and limitations. For instance, bubble-seq is generalizable and unobstructive to replication since it does not require any *in vivo* modification or manipulation of DNA. In addition, the low background signal in bubble-seq could enable the identification of rare origins that might be lost in methods that rely on signal averages (reviewed in Prioleau and MacAlpine 2016)). However, bubble-seq relies on restriction enzymes that generate the target lengths of DNA fragments to be assayed by 2-D gels; this limits the resolution of origin identification and also which origins can be identified. The use of two restriction enzymes in parallel has been proposed to at least partially overcome these limitations (Mesner et al. 2013). While bubble-seq has generally shown low reproducibility, possibly requiring far more input to reach full saturation of origin calling, SNS-seq has proven reproducible among different cell types and labs and has been applied in various species and systems, under replication stress, as well as for allele-specific origin mapping (Almeida et al. 2018; Bartholdy et al. 2015; Besnard et al. 2012; Cayrou et al. 2015; Cayrou et al. 2011; Comoglio et al. 2015; Jodkowska et al. 2019; Lombrana et al. 2016; Martin et al. 2011; Massip et al. 2019; Mukhopadhyay et al. 2014; Picard et al. 2014; Sequeira-Mendes et al. 2019; Smith et al. 2016; Yudkin et al. 2014). SNS-seq boasts a finer resolution compared to bubble-seq as the reads are not limited by restriction cut sites. However, because replication origins are identified by calling peaks of sequence read coverage, SNS-seq will primarily detect frequently used origins within a population of cells. Another concern that has been raised with regards to SNS-seq is that lambda exonuclease may have lower efficiency for digesting not only RNA-primed DNA but also other species such as single-stranded DNA, GC-rich DNA, and G-quadruplexes (G4s; (Foulk et al. 2015; Perkins et al. 2003)). This has been suggested to explain the enrichment of these genomic features in SNS-seq libraries, although further

controls may argue against that ((Prioleau 2017) and see further below). Similarly, ribonucleotides, which are abundantly embedded in genomic DNA (reviewed in (Jinks-Robertson and Klein 2015; Williams et al. 2016)), may also create false-positive origin calls by directly blocking DNA degradation or by distorting the DNA helix (Klein 2017). A comparison with nucleotide skew patterns even suggested that some sites called by SNS-seq and bubble-seq may correspond to sites of replication termination, not just initiation (Langley et al. 2016).

High resolution of origin calling has also been suggested to be obtained by methods such as ini-seq and EdUseq-HU, although these methods by design will only identify the earliest replication origins in the genome. In fact, part of the signal in nucleotide analog-based short nascent strand sequencing may come from enriching early-replicating DNA *per se*, independently of replication origins. For example, normalizing by a control of newly replicated (input) DNA without immunoprecipitation of labeled DNA actually decreased the reproducibility of ini-seq (Langley et al. 2016). Similarly, BrdU-seq sites correspond significantly to sites enriched in input DNA (Li et al. 2014). ChIP-seq techniques identify active as well as inactive, dormant origins, which is a strength but also a limitation without the ability to functionally discriminate the two. A common potential source of bias in virtually all origin mapping techniques to date is the need to amplify the small amounts of DNA that are obtained. Single-molecule approaches (see below) may circumvent this need for DNA amplification (Fig. 3).

More fundamental, however, is the lack of consistency among different origin mapping techniques. Specifically, different human replication origin maps reveal initiation sites that show only partial overlap and sometimes not much more overlap than those obtained with random sets of loci (Dellino et al. 2013; Hyrien 2015; Langley et al. 2016; Miotto et al. 2016; Petryk et al. 2016; Picard et al. 2014; Urban et al. 2015). Some techniques, such as EdUseq-HU (Macheret and Halazonetis 2018; Tubbs et al. 2018) or OK-seq (Petryk et al. 2016), map several thousand sites, while SNS-seq and BrdU-seq often map several hundreds of thousands of sites (Bartholdy et al. 2015; Besnard et al. 2012; Massip et al. 2019; Mukhopadhyay et al. 2014). Different techniques reach different and sometimes opposing conclusions with regard to whether origins are discrete sites (e.g., SNS-seq, ini-seq), broad initiation

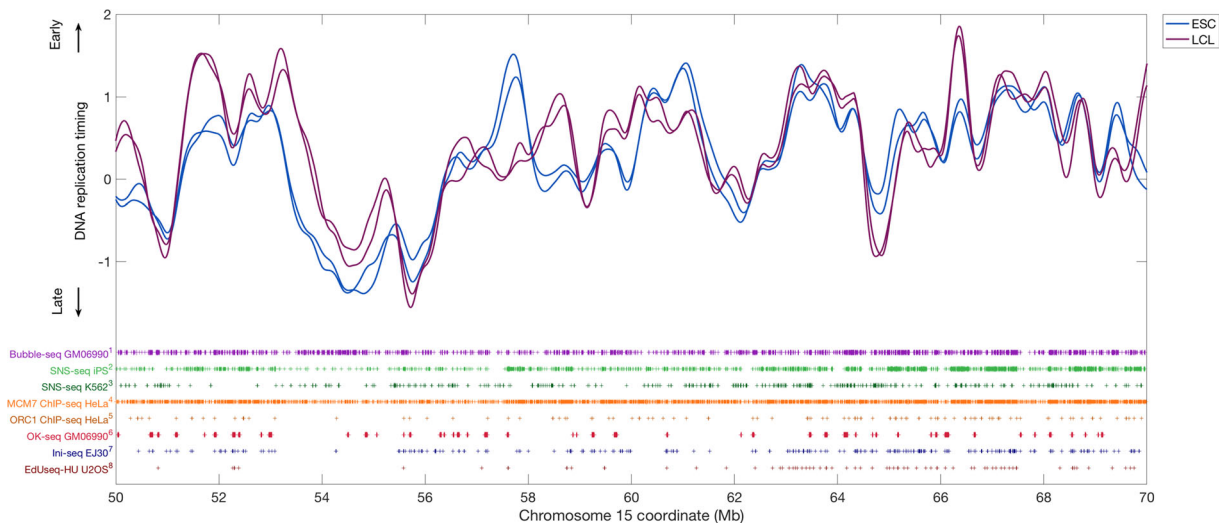


Fig. 3 DNA replication origin mapping. Various techniques have been used to map the locations of DNA replication origins in the human genome. Shown are the mapped origin locations in several of these techniques, together with replication timing profiles in human lymphoblastoid cell lines (LCL) and embryonic stem cells (ESCs, two cell lines each) measured by DNA copy number sequencing. Replication origin or initiation zone locations are based on the mapping used by each respective study and are represented as plus signs with widths that correspond to the size of the initiation sites or zones. At some locations, replication

origins are consistent between techniques and also correspond to peaks in the replication timing profiles. However, there are also fundamental differences among origin mapping methods in the number of initiation sites along chromosomes, their widths (precise sites vs broader initiation zones), and the actual locations of predicted origins.¹ (Mesner et al. 2013); ² (Smith et al. 2016); ³ (Picard et al. 2014); ⁴ (Sugimoto et al. 2018); ⁵ (Dellino et al. 2013); ⁶ (Petryk et al. 2016); ⁷ (Langley et al. 2016); ⁸ (Macheret and Halazonetis 2018). GM06990 is an LCL

zones (bubble-seq, OK-seq), or peaks that may themselves organize into larger zones (EdUseq-HU). It is almost inevitable to conclude that at least some of the current origin maps contain a substantial fraction of false negatives and/or false positives. One approach to circumvent this has been to look at the intersection of sites mapped by more than one technique (Karnani et al. 2010; Mukhopadhyay et al. 2014). While intersecting origin maps would reduce false positives, it also entails the risk of increasing the burden of false negatives (i.e., true origins not called by one method) and cannot substitute for a more complete understanding of the potential biases of the various techniques.

Notwithstanding inconsistencies between techniques, several genetic and epigenetic features are consistently emerging as associated with replication origins. For instance, various techniques have provided evidence for the association of origins with transcribed genes or transcription start sites (Besnard et al. 2012; Cadoret et al. 2008; Cayrou et al. 2015; Chen et al. 2019; Dellino et al. 2013; Langley et al. 2016; Picard et al. 2014; Sequeira-Mendes et al. 2009; Sugimoto et al. 2018); but see (Macheret and Halazonetis 2018; Martin

et al. 2011)). One of the most intriguing findings that has emerged from origin mapping techniques is an association with G4s. Although it remains possible that this association is a side effect, for example, of lambda exonuclease being blocked by G4s and not just RNA primers (Foulk et al. 2015); see further below), evidence is accumulating for G4s being directly associated with mammalian replication origins. This association is observed in SNS-seq even when including control G1 cells (Smith et al. 2016); but see (Foulk et al. 2015)) or an RNase-treated control that accounts for background signals of lambda exonuclease and replication-independent short nascent strands (Cayrou et al. 2015). In addition, BrdU nascent strands and ini-seq have also linked G4 sequences to replication initiation independently of lambda exonuclease (Langley et al. 2016; Mukhopadhyay et al. 2014). Experiments in chicken DT40 cells showed directly that G4 sequences are required (although they are not sufficient) for replication origin activity (Valton et al. 2014). A recent comprehensive study of the effect of G4s on DNA replication provided compelling evidence for the importance of G4s for origin activity, their ability to drive origin

activity *de novo*, and their ability to drive the autonomous replication of episomal vectors in frog egg extracts (Prorok et al. 2019). The involvement of G4s in DNA replication is also suggested by their binding to ORC (Hoshina et al. 2013) and the replication factors RecQL4 (Keller et al. 2014), MTBP (Kumagai and Dunphy 2017), and Rif1 (Masai et al. 2018).

Still, different studies report varying levels of association of G4 sequences with replication origins, and several have suggested that G4s are not necessary for origin activity (e.g., (Comoglio et al. 2015; Dellino et al. 2013; Foulk et al. 2015; Mesner et al. 2013; Miotto et al. 2016; Sugimoto et al. 2018)). G4s are highly abundant across the genome and tend to occur in promoters and untranslated regions (Prioleau 2017); origins that are enriched for G4s are often found at TSSs; thus, it remains possible that G4s are not an independent signal of replication origins (Langley et al. 2016). In addition, origins mapped by EdUseq-HU have not been reported to associate with G4s and instead appear to be linked to long asymmetrical poly(dA:dT) tracts (Tubbs et al. 2018). Similarly, OK-seq initiation zones were enriched for active genes and CpG islands at their borders but were not enriched for G-quadruplex structures nor CpG islands within the initiation zones. There is also evidence that G4s cause replication fork stalling, as opposed to directly driving initiation ((Comoglio et al. 2015; Tubbs et al. 2018); reviewed in (Prioleau 2017)). Replication restart at G4 sites or other sites of replication stalling could in principle produce strong SNS signals that do not represent canonical replication origin sites. Allele-specific SNS-seq (Bartholdy et al. 2015) has suggested that G4 sequences do not contribute to origin firing efficiency. Specifically, SNP alleles that disrupt G4 sequences increased origin activity more often than they decreased origin activity. In addition, the enrichment of G4 sequences at origin sites was suggested to be secondary to the high GC content of these sites rather than being specific to G4s. Instead, origins correlated with asymmetric G/C and A/T sequences which were suggested to be the actual drivers of origin activity by means of facilitating origin unwinding (Bartholdy et al. 2015). Taken together, it remains to be settled whether G4s or other sequence elements and DNA structures contribute to replication origin activity or are side effects of technical manipulations or simply correlative findings driven by other genomic features.

Going forward, the locations, nature, and genetic and epigenetic associations of metazoan replication origins remain to be fully established. A useful benchmark for understanding the outputs of different methods would be to map origins in model organisms in which their locations are already well known and finely mapped. For instance, SNS-seq has never (to our knowledge) been applied to budding yeast or even bacteria, although the expectation would be that it will uncover the known initiation sites in these species or alternatively reveal non-origin elements that are enriched by SNS-seq (of note, one study that utilized lambda exonuclease to enrich for Okazaki fragments in yeast was unable to link them to known replication origins (Yanga and Lib 2013)). Zebrafish would also be a useful model species, since replication timing and origins are well mapped and, in contrast to many other species, are not correlated with GC content (Siefert et al. 2017). In addition, it is important to systematically include controls such as non-replicating DNA and DNA specifically subject to (or excluded from) the same enzymatic reactions used in any given technique. Another important aspect of any genomic method is rigorous statistical analysis. For instance, not all current studies control for confounding correlated factors when looking for genetic and epigenetic enrichments at replication origins. These would include sequence composition, gene density, open chromatin, replication timing, nucleosome positioning, and other factors that tend to correlate with each other along chromosomes. An association with one of these factors may not always point to a biologically relevant mechanism.

Last, it remains possible that unexpected aspects of DNA synthesis may be at the basis of some of the apparent discrepancies between studies. For instance, some initiation events may not lead to productive DNA synthesis but instead result in aborted replication forks, extrachromosomal circular DNA (also known as “microDNA”), or other outcomes (Artemov et al. 2019; Moller et al. 2018; Shibata et al. 2012; Urban et al. 2015). Other replication-independent DNA synthesis events such as repair intermediates may also be detected by some techniques that attempt to map replication origins. For instance, transcription-associated DNA damage at highly transcribed genes can lead to DNA repair synthesis that results in high rates of ribonucleotide incorporation into DNA (Owiti et al. 2018). Similarly, several studies have shown that RNA can prime DNA replication outside of replication origins, typically

as a result of collisions between RNA and DNA polymerases or the formation of RNA-DNA hybrids (R-loops) (Pomerantz and O'Donnell 2008; Ravoityte and Wellinger 2017; Stuckey et al. 2015; Xu and Clayton 1996). Such processes, to the extent that they influence origin mapping techniques, might be more readily detectable by some methods compared to others. They may also themselves be biased to certain genomic features, such as G4 structures (Hoshina et al. 2013). In that respect, assays such as replication timing, nucleotide composition skews, OK-seq, and polymerase usage are useful readouts of DNA replication that do not directly depend on measuring replication origin activity but nonetheless represent the outcomes of productive initiation events at canonical origin sites. With higher-resolution replication timing profiles, it may prove beneficial to consider the locations of replication timing peak sites as bona fide markers of initiation events.

Toward single-cell genomics of DNA replication

While genome-wide replication timing assays have proven highly reproducible and informative, a clear limitation of these assays is that they rely on ensemble population analyses and do not provide information about replication progression in individual cells. Similarly, replication origin mapping techniques rely on many cells, largely masking heterogeneity that might be present among cells. This could potentially also underscore some of the discrepancies between techniques, for example, if some techniques have a greater propensity to reveal replication origins that are only active in a subset of cells.

It has long been argued that DNA replication is stochastic, in the sense that different cells (or the descendants of the same cell in different cell cycles) activate different subsets of replication origins. From the perspective of studying replication origins, the manifestation of this stochasticity is that a given origin may or may not fire in a given cell cycle. Thus, origins are characterized by a genomic location and a preferred time of activation but also by the probability of being activated. Importantly, many DNA replication assays measure a combination of these factors, and it may be difficult to disentangle what is actually being measured. For instance, an origin that fires frequently in late S phase may appear similar in an ensemble analysis to an origin that fires early but only in a subset of cells. In

addition, if origins are clustered along chromosomes, the firing of different origins within the same region in different cells will give the impression of an extended initiation zone, masking the activity of the individual origins.

The inefficiency of replication origins has been observed early on with techniques such as 2-D gels. Another line of evidence in support of stochastic activation of replication origins came from DNA combing experiments, which assay nascent DNA replication in single molecules (Bensimon et al. 1994; Michalet et al. 1997; Norio and Schildkraut 2001) and are extensions of earlier DNA fiber autoradiography analyses (Huberman and Riggs 1968). In these experiments, replication is allowed to proceed in the presence of a succession of labeled nucleotide analogs, followed by stretching of individual DNA fibers on glass slides. The location and orientation of replication forks are inferred from immunofluorescent detection of the incorporated nucleotides. Combing-based analyses of DNA replication have been performed in frog cell extracts (Blow et al. 2001; Herrick et al. 2000; Labit et al. 2008), yeasts (Czajkowsky et al. 2008; Patel et al. 2006), flies (Cayrou et al. 2011), mice (Cayrou et al. 2011; Norio et al. 2005; Piunti et al. 2014), and human cells (Bester et al. 2011; Frum et al. 2009; Guilbaud et al. 2011; Lamm et al. 2015). These studies have shown that firing of an origin in one cell is not correlated to its firing in other cells (Czajkowsky et al. 2008) or in a subsequent cell cycle (Labit et al. 2008; Patel et al. 2006). However, at scales larger than an individual origin, single-molecule replication is conserved: averaging data across all single molecules recapitulates the population-level replication profile (Czajkowsky et al. 2008), and broad regions appear to have consistent replication timing across cell cycles (Cayrou et al. 2011; Labit et al. 2008). Thus, stochastic firing of individual replication origins, parameterized by differential firing potential (Rhind et al. 2010; Yang et al. 2010), still predicts overall replication timing profiles that are consistent with observed ensemble measurements.

A main limitation of DNA combing, however, is throughput: a typical experiment involves two nucleotide analog pulses, each of which requires a distinct antibody detection step. In addition, combing alone cannot determine where the observed replication initiation events are located within the genome. Approaches that combine DNA fiber analysis with fluorescence in situ hybridization (FISH) of sequence-specific probes

(Lebofsky et al. 2006; Pasero et al. 2002), most notably a technique called SMARD (single-molecule analysis of replicating DNA; (Norio et al. 2005; Norio and Schildkraut 2001)), overcome this last restriction yet introduce further experimental challenges.

Recently, two strategies have been put forward for single-molecule replication timing analysis on a genomic scale. The first, optical mapping with microfluidic nanochannels, attempts to alleviate the bottlenecks that reduce the throughput of traditional DNA combing experiments. The use of fluorescently tagged nucleotides instead of nucleotide analogs dramatically speeds up detection of nucleotide incorporation (i.e., nascent DNA replication), obviating the need for antibody detection steps prior to imaging (De Carli et al. 2016; Lacroix et al. 2016). In addition, fluorescent tag locations can be mapped to the genome by treating stretched DNA molecules with a nicking endonuclease and identifying restriction patterns (De Carli et al. 2016; Xiao et al. 2007). Together, these innovations make it practical to automate DNA combing for higher throughput: DNA fibers can be imaged as they are flowed (and stretched) through a microfluidic nanochannel and retrospectively mapped back to the reference genome by their endonuclease fingerprints (De Carli et al. 2018; Lacroix et al. 2016). This strategy has been employed to develop a high-coverage single-molecule map of origins in *Xenopus* egg extracts (De Carli et al. 2018) and to study early-firing origins in synchronized, aphidicolin-treated HeLa S3 cells (Klein et al. 2017). The vast majority of origins detected in single molecules by optical mapping overlap with origins called by OK-seq and are enriched for ORC1 binding. Additionally, origins can be identified that are used by as few as 1% of the cells in a population (Klein et al. 2017). However, this approach requires specialized equipment, and, more fundamentally, resolution is inherently limited by the distribution of endonuclease cleavage sites in the genome.

The second strategy for single-molecule origin detection uses DNA sequencing, which enables direct genomic mapping. The Oxford Nanopore Technologies sequencer produces reads that can reach upward of 100 Kb in length from single DNA molecules without the need for DNA amplification. Within the sequencer, a single strand of DNA is translocated through a protein nanopore by electrophoresis. As the DNA traverses the nanopore, characteristic changes in ionic current can be detected and interpreted as sequence readout (Clarke

et al. 2009). It has been shown that nanopore sequencing can distinguish BrdU from thymidine and, thus, replicated from unreplicated DNA. This strategy has been used to map BrdU tracks to early-replicating origins in yeast (Hennion et al. 2018; Muller et al. 2019). Intriguingly, ~20% of origins observed at the single-molecule level were *not* detected in population-scale sequencing (Muller et al. 2019). The long-read approach generates large amounts of contextual information, making it easier to map reads to the genome and providing information on how neighboring origins may impact one another. However, it remains technically challenging to distinguish nucleotide analogs from canonical nucleotides. For instance, nanopore base calling relies on the shifts in ionic current characteristic of *k*-mers, rather than single nucleotides – and BrdU can only be distinguished from thymidine in certain 6-mer contexts (Muller et al. 2019). Another concern is that this strategy compares BrdU-labeled DNA to non-labeled DNA; biases in base calling and mappability between BrdU and the native thymidine must be accounted for (Muller et al. 2019). The recent demonstration that 11 different thymidine analogs can be detected using Oxford Nanopore Technologies sequencing provides a promising avenue for using analog combinations to identify the location and direction of DNA synthesis events (Georgieva et al. 2019).

Finally, recent advances have extended DNA copy number-based replication timing assays (that use short-read sequencing depth) to single cells. Measuring genome-wide replication timing in single cells is appealing: direct measurements can be made without cell synchronization or other perturbations, and the set of possible copy number values is theoretically limited to integers. Single-cell replication timing requires isolation of individual cells, which has so far been done using flow cytometry. A greater challenge is that, unlike with nanopore sequencing, short-read DNA sequencing requires whole-genome amplification (WGA), and there is rightful concern that even small biases in amplification will be exponentially magnified given the paucity of starting material. To date, several WGA strategies have been developed (reviewed in (Blainey 2013; Gawad et al. 2016)). Some, like degenerate-oligonucleotide-primed PCR (DOP-PCR; (Arneson et al. 2008; Telenius et al. 1992)), amplify the genome exponentially. Other methods like multiple annealing and looping-based amplification cycles (MALBAC; (Zong et al. 2012)) combine reduced amplification bias from the low-temperature isothermal MDA polymerase

with the higher amplification efficiency of traditional PCR once the amount of input template has been increased sufficiently. More recently, an approach called linear amplification via transposon insertion (LIANTI) was developed, which uses in vitro RNA transcription to linearly amplify the genome (Chen et al. 2017).

The possibility that single cells contain sufficient copy number variation between early- and late-replicating regions to be detected on a genomic level was first proposed by analyzing microarray data of single lymphoblastoid cells in S phase (Van der Aa et al. 2013). Much higher resolution, however, has been obtained using LIANTI and DNA sequencing of 11 single human BJ fibroblast cells in early S phase (Chen et al. 2017). Although replication profiles were correlated between cells and the average replication timing correlated well with a Repli-seq ensemble profile, there was also strong evidence of discrepant local copy number between cells, suggesting stochasticity of replication timing. In contrast, more recent studies that used DOP-PCR to amplify DNA from hundreds of mouse embryonic stem cells found limited heterogeneity between cells (Dileep and Gilbert 2018; Miura et al. 2019; Takahashi et al. 2019). This heterogeneity may be non-uniformly distributed in the cell cycle: Dileep and Gilbert reported that variability in replication timing was comparable between early- and late-firing regions, while Takahashi et al. claim that heterogeneity peaks in mid-S phase with lower levels observed in early and late S phase. These studies also showed that single-cell replication timing profiling can distinguish between different cell types and even between the two copies of each chromosome. It cannot, however, identify individual replication initiation events. Future improvements in data resolution, which will likely require minimally biased amplification regimes such as LIANTI, may enable high-resolution single-cell replication timing analysis that could explicitly examine the activity of replication origins.

At present, the primary drawback of short-read sequencing for single-cell replication analysis is scalability: applying standard library preparation methods to single cells is laborious. This limits the size of available datasets, constraining the conclusions that can be drawn from them. We anticipate that further improvements in barcoding strategies (e.g., Vitak et al. 2017; Yin et al. 2019; Zahn et al. 2017) will allow larger numbers of cells to be pooled during time-consuming steps of library preparation and that increased accessibility of

microfluidic devices will enable further automation of this process (Davis Bell et al. 2019; Laks et al. 2019; Zahn et al. 2017).

Conclusion

Recent years have brought about many exciting developments in the genomic interrogation of DNA replication. Replication timing profiling is becoming more accurate and comprehensive and is being applied evermore broadly. Innovative techniques for mapping replication origin sites are constantly being developed and improved. And single-molecule and single-cell approaches are adding a new dimension of DNA replication exploration. Together, these approaches promise to resolve decades-long questions regarding the regulation of DNA replication progression in eukaryotes. In parallel, similar developments are being made in measuring DNA damage and repair on a genomic scale (e.g., (Biernacka et al. 2018; Bryan et al. 2014; Canela et al. 2016; Hu et al. 2015; Mao et al. 2017)) as well as in ensemble and single-cell epigenomic methods. Combined analyses of these vast emerging data with DNA replication dynamics would enable to answer additional key questions regarding the molecular causes and consequences of the spatiotemporal replication timing program.

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