REVIEW

What have single-molecule studies taught us about gene expression?

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The production of a single mRNA is the result of many sequential steps, from docking of transcription factors to polymerase initiation, elongation, splicing, and, finally, termination. Much of our knowledge about the fundamentals of RNA synthesis and processing come from ensemble *in vitro* biochemical measurements. Single-molecule approaches are very much in this same reductionist tradition but offer exquisite sensitivity in space and time along with the ability to observe heterogeneous behavior and actually manipulate macromolecules. These techniques can also be applied *in vivo*, allowing one to address questions in living cells that were previously restricted to reconstituted systems. In this review, we examine the unique insights that single-molecule techniques have yielded on the mechanisms of gene expression.

Single-molecule experiments are now pervasive in biology. What started out as an experimental approach for characterizing ion channels in the 1970s (Neher and Sakmann 1976) has now become a fixture in hundreds of laboratories addressing fundamental questions in biochemistry, cell biology, genetics, and development. The methodology is nearly as diverse as the problems that are addressed and encompasses imaging, optical tweezers, atomic force microscopy, electrophysiology, and cryo-electron microscopy (cryo-EM), to list a few. The unifying principle behind these approaches is straightforward: the ability to observe the heterogeneous, rare, or fleeting behavior of macromolecules that is normally masked by ensemble techniques. In this review, we focus on the role that single-molecule approaches have played in advancing our understanding of the early steps in gene expression.

In general, transcription by RNA polymerase (RNAP) in bacteria or RNA polymerase II (Pol II) in eukaryotes begins when transcription factors (TFs) are recruited to the promoter. This leads to the assembly of the preinitiation complex (PIC) that contains a semicompetent polymerase. The PIC is necessary for unwinding duplex DNA and setting the stage for processive elongation by the polymerase. After conformational changes in the PIC, the

polymerase escapes the promoter region and enters into productive elongation. In eukaryotes, the nascent RNA undergoes further modifications such as addition of a 5' cap, synthesis of a poly-A tail, and splicing before the mature mRNA is formed. These early steps of gene expression are uniquely suited to elucidation through single-molecule methods. For example, single-molecule experimental approaches allow one to visualize the order of assembly for molecular complexes (i.e., the PIC) and observe the variety of pathways that can result in initiation of RNAP. The ability to observe kinetics in unperturbed systems can provide clues to the mechanisms of transcription. RNAPs can also be manipulated by single-molecule optical trapping to reveal the inner workings of force generation by this enzyme. Furthermore, single-molecule imaging has also revealed the heterogeneity of gene expression that exists among cells in a population, the understanding of which has broad implications for emerging single-cell genomic techniques. Finally, single-molecule approaches seem to be one emerging route for connecting precise *in vivo* measurements with *in vitro* experiments of increasing complexity.

Advances in single-molecule biology have been spurred by technological innovations in the physical sciences occurring over decades. As there have been many excellent studies that review the diverse single-molecule techniques like optical tweezers (Greenleaf et al. 2007), fluorescence (Piston and Kremers 2007; Joo et al. 2008; Li and Xie 2011; Liu et al. 2015), and superresolution imaging (Huang et al. 2010; Schermelleh et al. 2010), we refer the reader to these references for technical details. Instead, we chose to focus on the observations that could have been made only with single-molecule techniques and the insights on gene expression that we have gained from them.

TF search dynamics

The first step of transcription occurs when TFs are recruited to the promoter and begin the assembly of the PIC. The

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classical biochemical model posits a stepwise assembly aided by cooperative interactions, with different subunits associating in ordered sequence (Orphanides and Weinberg 2002). Such a model carries an implicit notion of energy consumption and directionality (Coulon et al. 2013) and opens up many avenues where regulation of initiation can take place. There has been intense interest in understanding how TFs find their way to their targets, particularly because some factors exist in limiting quantities in the nucleus. Early biochemical studies measured an in vitro association rate of $10^{10} \text{ M}^{-1} \text{ sec}^{-1}$ for the Lac repressor on its target DNA (Riggs et al. 1970). This rate was 100 times faster than the collision rate predicted based on simple three-dimensional (3D) diffusion and 1000 times faster than any known protein–protein interactions. To explain the unexpectedly fast search times, theoretical models loosely termed “facilitated diffusion” were proposed, the most popular of which describes proteins colliding with DNA during 3D diffusion in the nucleus, binding nonspecifically, and then “rolling” or “hopping” along the DNA strand until they find their correct promoter targets (Richter and Eigen 1974; Berg and Blomeberg 1976; Berg et al. 1981).

Single-molecule studies, with the unique capability to track individual TF molecules in space and time, have provided most of the evidence for or against facilitated diffusion. Wang et al. (2006) imaged GFP-labeled LacI repressor proteins and found that they bound nonspecifically to tethered DNA templates. The bound LacI molecules were observed to slide along the DNA in a random walk fashion for distances of up to $\sim 3 \mu\text{m}$. Based on measurements of the one-dimensional (1D) diffusion coefficient, the investigators estimated that the LacI repressor could find its target sequence 90 times faster if it used the “bind-and-slide” mechanism in addition to 3D diffusion. Similarly, p53, a protein known to interact with DNA nonspecifically, was also shown to slide on tethered naked λ -phage DNA (Tafvizi et al. 2008), with a velocity that indicated minimal protein–DNA friction or few energetic barriers to sliding. A direct observation of EcoRV interacting nonspecifically with linear DNA showed that, in addition to sliding, EcoRV could hop or jump between sliding events (Bonnet et al. 2008).

If TFs do indeed use a bind-and-slide mechanism to aid in their target search, then we would predict that the length of contiguous DNA available for sliding on should affect the kinetics of target search. In fact, Riggs et al. (1970) had originally discounted the bind-and-slide mechanism because they observed that shearing of DNA by sonication did not affect the rate of Lac finding its target sequence. Other in vitro single-molecule studies have also found that binding of bacteriophage λ repressor CI to its operator DNA (Wang et al. 2009) and *Escherichia coli* RNAP binding to a promoter sequence (Friedman et al. 2013) both occur with kinetics that are independent of the length of flanking DNA sequence, thus arguing against the model of facilitated diffusion. In contrast, it was also observed that binding times of Sox2 to nonspecific DNA templates increased with the length of the template (Chen et al. 2014).

Another prediction of the bind-and-slide mechanism is that once a TF is bound to DNA, the time it takes to find its correct target by sliding will not depend on its concentration in the nucleus. In contrast, a search mechanism based only on free 3D diffusion will always be dependent on concentration. Thus, in the limit of high concentrations, the probability of finding the correct target by free 3D diffusion increases, eventually dominating over sliding because proteins will simply arrive at the target first through 3D diffusion. To distinguish between these two mechanisms, Wang et al. (2013) measured the association rates of *E. coli* RNAP to promoter sequences on λ -phage DNA curtains as a function of RNAP concentration. They observed that at 50 pM RNAP, facilitated diffusion did indeed accelerate promoter search by a factor of 3. Since this concentration amounts to 0.05 molecules of RNAP per bacterium, it cannot be physiologically relevant. They also calculated that 0.5 molecules of RNAP per bacterium was the concentration limit above which facilitated diffusion is expected to be ineffective. Furthermore, the investigators saw no instance of RNAP sliding on DNA in any of their time-lapse images. Thus, it appears that facilitated diffusion was not likely to be a mechanism used by RNAP in *E. coli*. Ultimately, the specific mechanism of target search may depend on the TF, its concentration in cells, and its binding properties on DNA (Fig. 1).

Moving beyond in vitro measurements, an important biological question is whether facilitated diffusion takes place in the crowded milieu of a living cell. Sophisticated imaging systems now allow us to track the motions of single molecules of fluorescently labeled TFs over time. Elf et al. (2007) followed single YFP-labeled LacI proteins in living *E. coli* cells. The investigators measured an apparent diffusion rate that is slower than simple 3D diffusion but faster than 1D sliding on DNA. Thus, the investigators inferred that LacI spends $\sim 87\%$ of its time nonspecifically bound and sliding along DNA and undergoing 3D diffusion in between these binding events. This partition between 3D and 1D diffusion would enable LacI to find its target on the genome in no more than ~ 270 sec even though there are only ~ 20 copies of the protein in a cell. In an innovative follow-up study, the Elf laboratory was able to confirm the existence of facilitated diffusion by observing the effect of DNA “roadblocks” on gene activation kinetics (Hammar et al. 2012). In eukaryotes, facilitated diffusion has been observed by single-particle tracking of Tet repressors in human U2OS cells (Normanno et al. 2015), with a broad distribution of nonspecific binding times. Although there are not many data points, it is interesting to note the striking difference in nonspecific binding times measured in prokaryotes (a few milliseconds) and eukaryotes (~ 1 sec). Single-molecule tracking of TFs have allowed the measurement of K_{on} and K_{off} of binding to DNA, but these measurements have often been confounded by technical challenges due to fluorophore photobleaching and photophysics (Elf et al. 2007). However, with the advent of improved fluorophores (Grimm et al. 2015) and new imaging and computational methods (Mazza et al. 2012; Gebhardt et al. 2013),

Figure 1. TF target search in an increasingly complex in vivo environment. To reconcile unexpectedly fast TF search times, facilitated diffusion was proposed. In this model, TFs bind unspecifically when they collide with DNA while diffusing within the nucleus and then slide along the DNA until they arrive at the correct site or fall off. At low protein concentrations, sliding is expected to speed up the search times, but at high protein concentrations, this is not expected to be the case. Furthermore, the crowded environment within the nucleus, where DNA-bound obstacles or higher-order chromatin architecture exist, is expected to complicate TF search modes. Reprinted by permission from Macmillan Publishers Ltd.: *Nature Structural and Molecular Biology* (Wang et al. 2013) © 2013.

one will soon be able to measure TF kinetics with greater accuracy.

In eukaryotic cells, the presence of higher-order chromatin architecture and packaging by nucleosomes is expected to complicate target search and may engender a larger diversity of search mechanisms. For example, the proto-oncogenic c-Myc and the positive transcription elongation factor complex (P-TEFb) display different modes of motion (Izeddin et al. 2014). While c-Myc moved by free 3D diffusion, P-TEFb appeared to undergo anomalous subdiffusion, thought to be due to spatial or temporal obstructions. An analysis of single-molecule tracks showed that while c-Myc was equally likely to move in any direction at each step regardless of the direction of the previous step, P-TEFb was more likely to move in the opposite direction from the previous step. This finding was consistent with P-TEFb diffusing in a space where it

often encounters obstructions and has to return back to previously visited locations. Thus, it appears that even within the same nuclear compartment, different TFs experience different local environments, which give rise to vastly different outcomes in target search: c-Myc would take ~ 70 times longer than P-TEFb to find a target located at a distance of 250 nm away, while that difference would be reduced to only eightfold longer if the target was located 5 μm away. Finally, alternating between sliding (1D) and jumping (3D) would also allow TFs to bypass obstacles like protein factors or nucleosomes that pose a barrier to sliding (Bonnet et al. 2008).

The mobility and binding kinetics of TFs can have profound implications on the regulation of transcription and development. For example, it has been observed that even before distinct lineages have been determined, Sox2 binding dynamics differ between four-cell blastocytes, and those cells with more long-lived Sox2 binding contribute more pluripotent progeny downstream (White et al. 2016). Single-molecule tracking of fluorescently tagged p53 and glucocorticoid receptor (GR) show that, at transcriptionally active domains, TFs bind transiently (<1 sec dwell time on DNA), with only a small fraction ($<8\%$) engaged in productive binding (~ 5 sec dwell time on DNA) (Morisaki et al. 2014). Based on the classical biochemical view that the transcription complex is assembled in a stepwise ordered fashion, assembly of a productive transcriptional complex within the short residence times of TFs and activators is expected to be very inefficient. However, recent dynamic measurements do in fact indicate that factors show cooperativity. The pluripotency factors Sox2 and Oct4 interact such that Sox2 “assists” the Oct4 target search (Chen et al. 2014). This observation is similar to that of Hager and colleagues (Voss et al. 2011) about assisted loading of steroid receptors on response elements. The opposite phenomenon—assisted “unloading”—has also been observed: When binding sites overlap with nucleosomes, the presence of the nucleosome speeds up the dissociation (decreases dwell time) of the TF (Luo et al. 2014). Interestingly, a symmetric relationship in which steroid receptors can induce the loading of FoxA1 and vice versa has also been described (Swinstead et al. 2016). However, even with cooperative interactions between components, the assembly of >70 protein subunits for a eukaryotic PIC seems like an impossible task. Thus, it is no surprise that only one in 90 collisions of Pol II with the DNA template is thought to result in productive elongation (Darzacq et al. 2007). Notably, even though RNAP in bacteria requires fewer accessory factors, it still forms an open complex relatively inefficiently, once every 30 interactions with the promoter (Friedman and Gelles 2012). The difficulty in fully activating a gene could help to prevent spurious undesired transcription and has also been suggested as a possible cause of transcriptional bursting.

Nuclear architecture

Another way to increase the efficiency of target search is if transcription sites were not randomly dispersed

throughout the nuclear volume but instead were organized in a way that reduces the time it takes for low-copy-number factors to find their targets. The notion that the nonrandom structure and arrangement of chromosomes within the nucleus—transcription factories, topological domains, chromosome territories, etc.—might aid in this process is a recurring theme in gene regulation. “Transcription factories” have been proposed, in which Pol II molecules congregate at specific fixed foci within the nucleus and work together to transcribe the DNA template that is brought to the foci (Cook 1999). Early evidence for this model came from fixed cell images that show newly synthesized RNA concentrated in specific foci within the nucleoplasm (Cook 1999) and that widely separated genes colocalize at Pol II foci in a transcription-dependent manner (Osborne et al. 2004). More recently, Cisse et al. (2013) used advanced single-molecule imaging techniques and observed a nonhomogeneous distribution of fluorescently labeled Pol II in live U2OS cells. However, the Pol II clusters appeared to form and disassemble transiently with an average lifetime of ~5 sec, and the dynamics of clustering was sensitive to reagents that stimulated or inhibited transcription. Thus, the transcription factories would not be stable in any sense of the word. Moreover, a similar study by Zhao et al. (2014) labeled and imaged close to 72% of all RNA Pol II molecules in the nucleus of fixed U2OS cells and found that >85% of the molecules exist in singular form, unassociated with other like molecules, thus arguing against the transcription factories model. Recent advances in imaging techniques use single-plane illumination (Gebhardt et al. 2013; Liu et al. 2014) and better fluorophores (Grimm et al. 2015) to improve signal to noise ratios significantly and will enable better measurements of transcription dynamics.

Recently, multiple genome-wide studies have proposed the existence of topologically associated domains (TADs) on the order of 1 Mb as one of the fundamental building blocks of nuclear architecture (Dixon et al. 2012; Nora et al. 2012). Within TADs, gene regulatory clusters are kilobase-size nuclear domains created by functional interactions between promoters and enhancers (Li et al. 2012; Kieffer-Kwon et al. 2013). This spatial architecture also varies from cell to cell (Nagano et al. 2013) and changes in response to gene activation (Therizols et al. 2014), spurring a wave of imaging studies seeking to better understand the nature of these compartments (Chen et al. 2013; Williamson et al. 2014; Beliveau et al. 2015; Shachar et al. 2015; Boettiger et al. 2016). In one study, the “first passage time” (FPT) was determined for two regions of genomic DNA in the context of V(D)J recombination at the mouse IgH locus (Lucas et al. 2014). The FPT is the time it would take for these two regions of the chromosome to come into contact and is analogous to the time it would take a single TF to find its target. The FPT for the V_H region to encounter the D_HJ_H elements (spanning ~1–2 Mb and located within a 1- μ m confinement radius) is ~30 min. For c-Myc, the FPT over this same distance is 8 min, and for P-TEFb, it is ~10 sec (Izeddin et al. 2014). The previously described hindered diffusion that P-TEFb undergoes, possibly due to nuclear compartmentaliza-

tion, may prevent it from straying too far away from its target. Importantly, these time scales all scale nonlinearly with the spatial dimension (Izeddin et al. 2014; Lucas et al. 2014). For example, by decreasing the confinement radius twofold, the FPT for the IgH locus decreases 16-fold, but a twofold increase in diffusion gives only a fourfold decrease in FPT. Thus, the compartment size—by whatever means it is established—is a highly effective means of increasing on rates.

Polymerase initiation

After the transcription machinery assembles at the promoter, polymerase goes through several conformational steps during initiation, before becoming elongation-competent. In prokaryotes, RNAP forms the closed complex (RP_c) upon initial recruitment to the promoter. It then transitions to the RNAP–promoter open complex (RP_o) and begins to unwind ~14 base pairs (bp) around the transcription start site. In the next step, the RNAP–promoter initial transcribing complex (RP_{itc}) undergoes repeated cycles of abortive synthesis, transcribing and releasing short RNA products before returning and restarting again. Finally, RNAP breaks out of abortive synthesis only when it manages to synthesize ~9–11 nucleotides (nt), allowing it to escape the promoter and enter into productive synthesis as a processive RNAP–DNA elongation complex (Lee et al. 2012). X-ray crystallography has provided a wealth of information about the structures and mechanisms of each intermediate (Sainsbury et al. 2015), but single-molecule techniques have been particularly useful for elucidating the kinetics of each step in vitro.

It is now possible to reconstitute RNAPs in vitro and characterize all of the major steps in initiation at the single-molecule level. In one such method, DNA templates are labeled with Alexa488 (donor) and tethered onto a coverglass. These molecules appear as diffraction-limited spots when imaged on a wide-field microscope. When Cy3-labeled (acceptor) RNAP is added, it assembles on the template to form the closed complex. Close proximity of the two fluorophores results in Förster resonance energy transfer (FRET) and produces emission in both donor and acceptor channels when only the donor fluorophore is excited. With this method, formation of the closed and open complexes can be visualized by the colocalization of spots from different fluorescent channels. In addition, short oligos labeled with Cy5 can also be included that will hybridize to nascent RNA, adding yet another colocalized spot in a third channel to track elongation. This technique, termed colocalization single-molecule spectroscopy (CoSMoS), can be used to observe all of the major steps of transcription initiation at the single-molecule level. With this method, Friedman and Gelles (2012) were able to measure the kinetics of RNAP closed complex formation on σ_{54} -dependent promoters. They observed two distinct closed complex intermediates: an unstable form that quickly dissociates and a stable long-lived form that is a required precursor for formation of the open complex. Successful progression into the open

complex was relatively infrequent, occurring, on average, only once every 30 times RNAP binds the template, again highlighting the stochastic and rate-limiting nature of the transition from closed complex to productive elongation. Once in the open complex form, synthesis of nascent RNA begins, and σ_{54} dissociates shortly after.

Other single-molecule studies have provided even more detailed mechanistic understanding of transcription initiation. Despite clear evidence that RP_{itc} was engaged in synthesis of short RNA products, DNA footprinting data showed that the 5' boundary of DNA occupied by RP_{itc} remained unchanged from the previous RP_o state, as if it was stationary. Thus, three different models were put forward to explain this inconsistency. In the "transient excursions" model, it was thought that RNAP translocates forward and springs back when synthesis is aborted and the RNA product is released (Carpousis and Gralla 1985). This excursion happens so quickly that the motion is not detected by a time-averaged bulk measurement such as DNA footprinting, and hence it appears to be stationary. In the "inchworming" model, RNAP was proposed to be composed of two modules connected by a flexible element (Straney and Crothers 1987; Krummel and Chamberlin 1989). While the upstream module remains stationary at its promoter position, the downstream module containing the catalytic active center detaches, translocates downstream, and returns when synthesis is aborted. Finally, in the "scrunching" model, it was proposed that RNAP remains at its promoter position and instead unwinds and pulls downstream DNA into the catalytic center for RNA synthesis (Brieba and Sousa 2001; Pal et al. 2005). In this scenario, RNAP has to accommodate up to ~9–11 bp of unwound DNA within itself, which it eventually extrudes when synthesis is aborted.

Two different single-molecule studies were able to show clear evidence for the "scrunching" model. FRET measurements from fluorophores labeled at different sites on RNAP and the promoter DNA showed that both ends of RNAP remained stationary relative to promoter DNA, whereas downstream DNA appeared to translocate toward RNAP, consistent with the "scrunching" model (Kapanidis et al. 2006). A different study that measured changes in positive or negative supercoiling induced by RP_{itc} was able to show that RP_{itc} unwinds and pulls in a length of template DNA that is dependent on the RNA synthesis (Revyakin et al. 2006). Scrunching was observed in ~80% of transcription cycles regardless of whether they were productive or abortive, leading the investigators to propose that the scrunched state is an obligatory intermediate and that the energy accumulated during scrunching is used to drive full promoter escape into productive elongation. It has also been shown that scrunching in RNAP helps to determine the exact DNA base from which to begin transcription (Robb et al. 2013; Winkelman et al. 2016). Recent cryo-EM structures of human PICs show breaks in electron density on the nontemplate DNA strand in the RP_{itc} , and this was proposed to be disordered due to possible scrunching within RP_{itc} (He et al. 2016). Thus, it appears that scrunching could be a universal scanning mechanism in both prokaryotes and eukaryotes that

helps position the correct starting base in the catalytic center of polymerase.

For a while, single-molecule studies had not been able to provide the same level of mechanistic detail for eukaryotic transcription initiation because of the difficulty in assembling the full transcription machinery in vitro. Revyakin et al. (2012) were able to reconstitute human Pol II on a DNA template tethered to a glass slide and observe transcription using a technique similar to CoSMoS. Eukaryotic in vitro transcription reactions were known to produce <0.1 transcription per template per hour, far slower than the actual in vivo rates, but, by imaging thousands of tethered molecules simultaneously on a wide-field TIRF microscope over several hours, the investigators were able to observe several rounds of transcription reinitiation. Thus, the investigators were able to probe the effect of different promoter mutations and activator sequences on transcription rates. Connecting protein dynamics to a real-time measure of RNA synthesis will allow us to construct a full kinetic model of transcription (Zhang et al. 2014).

More recently, the 32-protein, 1.5 MDa PIC from *Saccharomyces cerevisiae* has been assembled on promoter DNA in vitro that included all of the general TFs (Murakami et al. 2013). This PIC was also functional, with rates that approached in vivo transcription rates. Using optical tweezers to follow single PICs in real time, the PIC was observed to unwind a remarkably large tract of downstream DNA (~85 bp) to form the transcription bubble with the help of TFIIF (Fazal et al. 2015). Similar to RNAP in prokaryotic transcription, the polymerase repeatedly translocates and synthesizes RNA products up to the length of the open transcription bubble, scanning for a transcription start site. When the bubble collapses, the PIC returns to the closed or open complex back at the promoter. Occasionally, Pol II is successful at escaping the promoter region to continue into productive elongation. The investigators also saw evidence of "scrunching," where downstream DNA is drawn into the catalytic active center, but did not explain where the unwound DNA is accommodated within Pol II.

Transcriptional bursting

In cells, RNA synthesis for a single gene has been observed to occur in irregular spurts that are separated by long periods of transcriptional inactivity. These "transcriptional bursts" amount to "memory" between transcripts: The synthesis of one transcript is likely to be accompanied by the synthesis of another over certain time intervals. Transcriptional bursting has now been observed in yeast (Zenklusen et al. 2008; Lenstra et al. 2015), slime mold (Chubb et al. 2006; Muramoto et al. 2010; Stevense et al. 2010), fly (Garcia et al. 2013), mouse (Lionnet et al. 2011), and human (Yunger et al. 2010) cell lines and is a significant source of expression variation between cells. In fact, subsequent steps of gene expression such as RNA export, RNA decay, translation, etc. have been shown to act as dynamic "buffers" that help to smooth

out the effects of transcriptional bursting (Little et al. 2013; Stoeger et al. 2016). Thus, although heterogeneity at the single-cell level has been recognized for decades (Ko et al. 1990; White et al. 1995), progress in recent years has solidified the view that this heterogeneity is also a dynamic property: The expression state of the cell depends on when it is observed. By and large, the physiological effects of this dynamic behavior likely depend on the gene or the organism and resist general classification. However, the underlying cause of transcriptional bursting is an important area of investigation because there is the potential to gain mechanistic insight into the process of gene regulation at the molecular level, and single-molecule techniques are well-suited for this purpose.

The first evidence of transcriptional bursting came from early EM images of Miller chromatin spreads, showing nascent transcripts splayed out on either side of the DNA strand. While highly transcribed *rRNA* genes in *Xenopus* oocytes give rise to the beautiful “Christmas tree” structures shown in biology textbooks with closely and regularly spaced polymerases (Miller and Bakken 1972), chromosomal RNA from nonribosomal transcription units in fly embryos appear irregularly spaced on the active gene (McKnight and Miller 1979). Although it is possible that the polymerase spacing only appears irregular because some of the transcripts and associated polymerase were lost during preparation, this technique provided the first hints that the dynamics of transcription were not constant. The concept of transcriptional bursting re-emerged in light of new findings from measuring RNA (by PP7/MS2 or fluorescence in-situ hybridization [FISH]) and protein content in single cells (Femino et al. 1998; Golding et al. 2005). In FISH, the number of RNA transcripts in each cell within a population is imaged and counted, and the distribution of transcripts over the entire population of cells can shed light on the underlying dynamics of bursting (Raj et al. 2006). However, bursting parameters can only be inferred by fitting the data to theoretical models (Paulsson 2004; Shahrezaei and Swain 2008). Moreover, cell-to-cell variations (e.g., cell size)

(Padovan-Merhar et al. 2015) contribute extrinsic noise that can complicate the study of intrinsic transcription dynamics. While measuring protein concentrations is several steps removed from the act of transcription, it does have the benefit of reading out the entire gene expression process (Newman et al. 2006). Live-cell single-molecule visualization of transcription using the MS2 or PP7 system comes the closest to capturing the actual transcriptional dynamics of the gene (Janicki et al. 2004), but the system relies on exogenous stem loops inserted into the gene of interest.

Using the language of transcriptional bursting—burst size, frequency, and duration—allows one to state more precisely what aspect of transcription is changed during regulation (Fig. 2). Work from many laboratories indicates that all quantities appear to be regulated. Burst size ranges from about two RNA per burst (Lenstra et al. 2015) to hundreds (Raj et al. 2006), and burst frequency ranges from minutes to hours. Some genes (such as housekeeping genes in yeast) do not appear to show bursting at all, and their expression levels are well approximated by a Poisson distribution (Zenklusen et al. 2008; Gandhi et al. 2011). In general, for a given average expression level, a gene that has a large burst size and low frequency will have greater expression variation than a gene that has a small burst size and high frequency of activation. In addition to the oft-used two-state description of transcription (Peccoud and Ycart 1995), more exotic models have also emerged recently that describe transcription as a continuum of possible states (Corrigan et al. 2016; Featherstone et al. 2016). Thus, transcription dynamics are a signature of the underlying behavior.

There is not one mechanism for transcriptional bursting, and, as the experimental methods improve, it seems likely that many processes will be unearthed. In bacteria, it has been proposed that bursting is gene-independent (So et al. 2011), and recent work from the Xie laboratory (Chong et al. 2014) suggests that the general mechanism is related to DNA topology. However, there is conflicting evidence that the same gene can be expressed with both

Figure 2. Transcriptional bursting visualized with direct measurement of nascent RNA. (A–D) Time-lapse microscopy of single-copy reporter gene expression in U2OS cells. Nascent RNA was visualized by the binding of the high-affinity MS2 protein to RNA stem loops. (E,F) Integrated fluorescence intensity, which reflects nascent RNA, was plotted as a function of time for two individual genes in two different cells. On and off periods of the transcriptional burst are indicated. Reprinted from Larson et al. 2013.

large and small bursts (Choi et al. 2008). In eukaryotes, bursting behavior has been observed to vary widely and be more gene-specific. In yeast, promoter sequences have been shown to have a strong effect on bursting behavior (Hornung et al. 2012), and mutations in the TATA box could change burst size (Blake et al. 2006). These results reinforce the connection to earlier work on transcription reinitiation (Hawley and Roeder 1987; Yudkovsky et al. 2000), although it is not yet clear that these phenomena are the same in vivo. In addition, mutations in chromatin remodelers affected both burst size and frequency. In an elegant single-molecule study that used EM to map nucleosome conformations of the *PHO5* promoter on DNA plasmids isolated from single cells, Brown et al. (2013) observed a distribution of nucleosome conformations that corresponded to the dynamic activity states of the gene (Fig. 3).

Work on synthetic reporters in mammalian cells indicates that the same reporter showed vastly different bursting properties depending on whether that gene was integrated into a chromosome or was present as a circular plasmid (Larson et al. 2013). Related to this observation is the recent finding that bursts may be related to the interaction between enhancers and promoters. Blobel and co-workers (Bartman et al. 2016) visualized nascent RNA production from the β -globin and γ -globin genes in primary adult human erythroid cells and observed that the transcription of these genes, both of which are controlled by the same distal enhancer (locus control region), is mutually exclusive. The interpretation of this finding is that a burst of RNA synthesis from either gene can happen only as a result of a promoter–enhancer contact, and this enhancer can contact only one promoter at a time. In contrast, two genes driven from a single enhancer showed coordinated bursting, challenging the view that every burst

arises from a stable enhancer–promoter contact (Fukaya et al. 2016). Finally, TFs (both sequence-specific and general factors) show temporal variability in occupancy that is consistent with their role in controlling bursting dynamics. For example, the *CUP1* array in yeast showed different cycles of Ace1p binding, correlating with a slow cycling of transcription (Karpova et al. 2008). Another *trans*-acting factor, Pol II, which is, of course, essential for RNA synthesis for most genes, shows temporal clustering behavior that occurs on the same time scale as the ensuing burst (Cho et al. 2016). In summary, there is evidence that multiple processes—including DNA topology, TF binding, nucleosome occupancy, chromatin state, and enhancer–promoter interaction—all contribute to the bursting behavior. The actual dynamics of each gene may reflect the combinatorial interaction of these processes, but it is important to emphasize the potential of single-molecule approaches for unraveling this behavior.

What started out as a peculiarity of single-molecule biophysics is now a pressing issue in the era of single-cell genomics. For example, looking for correlations or subpopulations in single-cell RNA sequencing (RNA-seq) data will be confounded by the intrinsic dynamics of transcriptional bursting (Trapnell 2015). Reconciling the stochastic nature of transcriptional bursts with the greater use of time-resolved genome-wide approaches and/or single-cell analysis is thus an active area of research.

Transcription elongation

The step of transcription where single-molecule studies have historically yielded the most information is elongation. Since single-molecule spectroscopy provides unparalleled spatial and temporal information, it is particularly

Figure 3. EM analysis of *PHO5* plasmids isolated from *S. cerevisiae*. The nucleosome position is inferred from the position of single-stranded loops stabilized through psoralen cross-linking. The stochastic partitioning between different nucleosome occupancy states can be directly determined from the electron micrograph. (Left diagram) Structure of the *PHO5* gene, with ovals representing nucleosomes. The arrow indicates the transcription start site. Reprinted from Brown et al. 2013.

suites for observing the physical translocation of molecules. In a ground-breaking single-molecule study of transcription, Schafer et al. (1991) assembled stalled RNAP: DNA complexes and immobilized them onto a coverglass. When transcription was restarted, RNAPs were observed to transcribe steadily at rates of 6.2–14 nt/sec, with different molecules transcribing at different characteristic rates. Furthermore, the distribution of rates was much larger than would be expected from measurement error. This observation runs counter to the traditional biochemical view that enzymes transcribe at an “average rate” and highlights the advantage of single-molecule studies over bulk measurements.

What could be the cause of heterogeneity in RNAP elongation rates? In a follow-up study, the wider than expected distribution was again observed despite careful elimination of possible causes such as temperature and mechanical perturbations (Tolić-Nørrelykke et al. 2004). This result led the investigators to speculate that RNAP existed in several different long-lived conformational states that have different kinetic rates. Furthermore, there was a wide distribution of instantaneous velocities even at the same position on the template, indicating that heterogeneity was not a result of sequence but was perhaps because RNAP was slowly switching between more or less competent states (Davenport et al. 2000). It is worth noting that, in contrast, using a different single-molecule approach, Adelman et al. (2002) found that RNAP has relatively homogenous elongation rates but was subject to short stochastic pauses. Depending on the time window used for averaging, the calculation of instantaneous velocities can be confounded by pauses.

It is now recognized that, in prokaryotes, pausing during transcription is widespread even in the absence of known pause sequences on the DNA template. Single-molecule studies showed that RNAPs that were transcribing faster were less likely to pause (Davenport et al. 2000) and that pauses occurred stochastically in time with no apparent long-term memory of previous pauses (Adelman et al. 2002). Since then, single-molecule techniques were greatly improved and were able to achieve single-base-pair spatial resolution (Abbondanzieri et al. 2005). The results so far suggest that RNAP can stochastically switch to an off-pathway paused state that exists in kinetic competition with the active translocating state. This kind of pausing is different from sequence-specific or promoter-proximal pausing seen by chromatin immunoprecipitation (ChIP) (Jonkers and Lis 2015).

In general, pauses appear to separate into two types: Approximately 5% of pauses were sequence-nonspecific and long (20 sec to >30 min), and the other ~95% were short, ubiquitous (approximately one per 100 bp), and dependent on DNA template sequence. During the long pauses, RNAP appears to stop abruptly and then slowly backtrack ~5 bp before stopping again completely (Shaevitz et al. 2003). The duration and frequency of these long pauses could also be reduced by the addition of GreA and GreB TFs that are known to stimulate cleavage of nascent RNA. These observations suggested that long pauses are involved in transcription proofreading, where RNAP

backtracks to allow the wrongly added base to be cleaved off before elongation can be restarted again. On the other hand, for short pauses, RNAP did not appear to backtrack (Neuman et al. 2003). The duration or frequency of the short pauses was not affected by an assisting or resisting force on RNAP. Thus, a model was proposed in which the paused RNAP state is an off-pathway intermediate that competes kinetically with forward translocation. From this intermediate, it can transition to other paused states, such as backtracking or termination, or return to the on-pathway translocating state.

While the early single-molecule studies of elongation and pausing have been performed on prokaryotic RNAP, more recent studies have observed the same pausing behaviors in eukaryotes, which can be accounted for by backtracking and/or nucleosomes. Galburt et al. (2007) observed that backtrack pause durations of Pol II from *S. cerevisiae* followed a power law behavior, which can be explained by a model in which, during a pause, Pol II diffuses along the template in discrete base-pair steps and recovers from the pause only when the 3' end of the nascent chain is aligned once more with the active site. Two general TFs, TFIIS or TFIIF, were independently able to rescue Pol II from paused states and could also work synergistically to rescue Pol II that had undergone large backtracking (Ishibashi et al. 2014; Schweikhard et al. 2014).

The causes of pausing or backtracking are unclear, but supercoiling has been shown to be involved. During transcription, as polymerase unwinds DNA, it generates positive supercoiling ahead (downstream) and negative supercoiling behind (upstream). While torsional stress is relieved in vivo by DNA rotation or topoisomerases, polymerase is still predicted to experience fluctuating torsional stress. Using magnetic tweezers to wind up the DNA template along the cylindrical axis and observing the elongation speed of RNAP on it, Ma et al. (2013) showed that resistive torque can induce pausing and increase both the duration and frequency of pause. As resistive torque builds up, RNAP will eventually stall and even backtrack (Ma et al. 2013). The velocity of RNAP between pauses depended on the amount of positive or negative torque, providing direct evidence that supercoiling can regulate the kinetics of transcription elongation. In a similar vein, in both in vitro and live-cell experiments, Chong et al. (2014) showed that buildup of unrelieved positive supercoiling could slow down and eventually halt transcription initiation or elongation. This stall could be rescued by the addition of gyrase, which works by relieving positive supercoiling. Furthermore, the investigators showed that mRNA copy number distribution of a highly transcribed gene in *E. coli* was directly affected by gyrase concentration in vivo, suggesting that fluctuations in supercoiling are responsible for transcriptional bursting of induced genes in prokaryotes.

In eukaryotes, another cause of pausing or backtracking might be the encounter between the polymerase and a barrier such as a nucleosome. Hodges et al. (2009) used optical tweezers to measure Pol II elongation rates on DNA templates with preloaded nucleosomes and showed that Pol II was more likely to pause. The investigators

concluded that, during forward translocation and backtracking, Pol II does not actively unwrap DNA. Instead, Pol II advances opportunistically when local fluctuations unwrap DNA from the nucleosome, likely through a ratcheting mechanism. These results provided a mechanistic explanation for previous bulk biochemical studies that showed that histones do not fall off the template when Pol II transcribes through. Instead, histones are transferred around the passing Pol II molecule through a mechanism hypothesized to involve looping of the DNA template (Studitsky et al. 1994, 1997). This model was further supported by single-molecule atomic force microscopy (AFM) images of Pol II transcribing on a DNA template that contained a nucleosome bound at a specific position (Bintu et al. 2011). From the images, one could infer the existence of loops (thought to be ~90 bp) forming in the vicinity of Pol II, which had been hypothesized to aid in the transfer of histones around to the upstream side of Pol II. In a different study, it was shown that the DNA sequence, specific histone–DNA contacts, and even modifications in the histone tails could alter the mechanical barrier that nucleosomes posed to a transcribing Pol II (Bintu et al. 2012). These results highlight a mechanism by which transcription elongation rates could be regulated in vivo.

The biological consequences of pausing are still an active area of research. In bacteria, RNAP pausing is a ubiquitous mechanism of gene regulation, with well-studied cases such as the *trp* operon being a paradigmatic example (Landick et al. 1987). A recent study identified thousands of new pause sites in *E. coli* and *Bacillus subtilis* (Larson et al. 2014), suggesting that our understanding is far from complete. In eukaryotes, pauses and/or changes in elongation have also been associated with alternative splicing (de la Mata et al. 2003; Fong et al. 2014) and changes in start site selection (Braberg et al. 2013), both of which will affect downstream expression. However, just because there exists an optimum rate at which these processes occur, it does not necessarily mean that the cell uses this regulatory “knob” to change gene expression (Palangat and Larson 2012). Single-molecule assays might be capable of distinguishing changes in speed in unperturbed systems and correlating such changes to expression outcomes.

Splicing

RNAP was an early showcase for the power of single-molecule biophysical approaches such as imaging and optical trapping. It can be attached to large latex beads on which transcription can be reconstituted from purified components in a highly stable and processive manner (Palangat et al. 2012). The spliceosome shares none of these characteristics. It is a dynamic single-turnover enzyme that assembles on each intron, carries out one splicing reaction, and then disassembles. The canonical pathway for spliceosome assembly and activation is the binding of U1-snRNPs and U2-snRNPs to the 5' splice site (5'-ss) and the branch point, respectively. Next comes the re-

cruitment of the tri-snRNP (U4/5/6) and the multiprotein Prp19 complex known as the nineteen complex (NTC). “Activation” of the spliceosome is followed by RNA splicing, both of which require disassembly of components of the spliceosome. Splicing itself proceeds through a two-step chemical transesterification process. This reaction can be reconstituted from cell extracts but not from purified RNA and protein (Hoskins and Moore 2012). Moreover, only recently have high-resolution cryo-EM structures emerged for this ribonuclear protein complex, which contains >200 macromolecules (Yan et al. 2015; Agafonov et al. 2016; Wan et al. 2016). These same characteristics that have made splicing refractory to other biochemical approaches provide a unique opportunity for single-molecule approaches. In fact, splicing was originally discovered through single-molecule imaging (Berget et al. 1977).

In pioneering work from Hoskins and coworkers (Crawford et al. 2008; Hoskins et al. 2011), this process of splicing was reconstituted from yeast whole-cell extracts and visualized with single-molecule microscopy in vitro. The kinetic picture that emerged revealed a number of important features. First, spliceosome assembly is highly ordered, indicating that, although factors such as the U1-snRNPs and U2-snRNPs bind and unbind on the time scale of seconds to minutes, there is a directionality to the process that is reinforced by the consumption of ATP (Hoskins et al. 2011). Second, commitment to splicing does not occur through a single irreversible step but rather is the cumulative outcome of many coupled reactions. As a consequence, no single kinetic step dominates the reaction, and the net rate of splicing is due to many sequential kinetic steps. For these in vitro studies, the time from U1-snRNP binding to intron removal was measured to be ~12 min (Fig. 4). One of the primary conclusions of this single-molecule analysis is that spliceosome assembly and pre-mRNA splicing are reversible at almost every step, which opens up the possibility of regulation at multiple points. Subsequent work using this same approach indicates that the order of assembly of the spliceosome can follow slightly different routes and still result in the same pre-mRNA splicing outcome. Thus, there is a considerable plasticity to the spliceosome (Shcherbakova et al. 2013).

One way of observing this plasticity at the molecular level is with single-molecule FRET (smFRET), which has been used by several laboratories to examine the first chemical step of splicing. This first chemical step occurs when the adenosine branch point residue carries out a nucleophilic attack on the first nucleotide of the intron at the 5'-ss, which requires bringing the branch site and the 5'-ss into molecular contact. The tri-snRNP complex (U2, U5, and U6) aids in positioning these substrates and is capable of adopting multiple configurations (Guo et al. 2009; Abelson et al. 2010). After binding of the NTC complex, the pre-mRNA adopts a high FRET configuration, indicating that the branch site and the 5'-ss are in proximity (Crawford et al. 2013; Krishnan et al. 2013). In fact, helicases such as Prp16 can remodel the complex to select for certain branch points in the first step of splicing,

Figure 4. Spliceosome assembly follows a highly ordered, reversible pathway. The individual rate constants as determined from single-molecule fluorescence time-lapse recordings of dwell time are indicated. Note the absence of a single rate-limiting step that dominates the kinetics. From Hoskins et al. (2011). Reprinted with permission from AAAS.

which ensures fidelity of splicing (Semlow et al. 2016). However, until the formation of the catalytic complex, the pre-mRNA is configured such that the 5'-ss and the branch point are spatially separated, which is likely to prevent premature catalysis. After the 5'-ss and branch site come into proximity, there is a loss of the intron and NTC fluorescence, indicating that the splicing reaction eventually goes to completion. Krishnan et al. (2013) further proposed, based on the dynamics observed in smFRET studies, that the pre-mRNA samples multiple conformations during the first catalytic step, again suggesting the possibility of regulation at multiple intermediate steps. However, it is the ATPase activity of proteins such as Prp2 that provides directionality to the reaction (Krishnan et al. 2013). Thus, just as in the case of RNA synthesis by RNAP, the spliceosome operates according to a thermal ratchet principle.

How does this model inform our understanding of splicing *in vivo*? In recent years, a number of studies have measured the kinetics of splicing using single-molecule live-cell imaging approaches. One of the primary benefits of such an approach is that one is able to directly visualize the coupling between synthesis and RNA processing for single RNAs made from single genes. Furthermore, these kinetic studies have elucidated the variability in timing of splicing, which provides insight into which steps might be rate-limiting and/or subject to regulation. Using the MS2 RNA-imaging approach, Schmidt et al. (2011) measured a

splicing time of ~ 3 min. Importantly, they determined that splicing kinetics were not determined by a single rate-limiting step but followed a sequential path that results in a kinetic process that is less noisy and more deterministic (Schmidt et al. 2011). It is tempting to assign these sequential steps to the serial transesterification reactions described above. Work from the Shav-Tal laboratory (Brody et al. 2011) measured the accumulation of snRNPs during splicing and demonstrated that the elongation machinery does not “wait” for each splicing event to go to completion but rather moves ahead so that more introns accumulate. Likewise, adding more introns did not measurably change the rate of transcript synthesis, indicating that elongation proceeds independently of splicing (Brody et al. 2011).

Further evidence of the relationship between elongation and splicing rates was obtained by Coulon et al. (2014). Using dual labeling of intronic and exonic RNA, one is able to separate the kinetics of elongation, splicing, and cleavage. For the β -globin reporter gene in that study, splicing of the terminal intron proceeded with a splicing time of ~ 4 min. This rate was determined by a sequential kinetic process, similar to what was shown in previous *in vitro* (Hoskins et al. 2011) and *in vivo* (Schmidt et al. 2011) assays. Notably, the single-molecule approach revealed that transcripts exhibit stochastic processing, with some transcripts being spliced cotranscriptionally and others spliced post-transcriptionally. Another single-molecule study of β -globin transcription and splicing revealed a much faster splicing rate of ~ 30 sec (Martin et al. 2013). The investigators also showed how splice site strength can change the kinetics of intron removal. Similarly, Tyagi and coworkers (Vargas et al. 2011) demonstrated that constitutive and alternative splicing can proceed with different kinetics, with the former occurring predominantly cotranscriptionally and the latter occurring predominantly post-transcriptionally. These data point the way toward a more refined model of splice site selection that is biophysically motivated: Direct measures of splicing kinetics might be a better way of developing sequence-based rules for splice site selection than mRNA isoform abundance.

Overall, the enduring interest in splicing kinetics that has persisted over several decades reflects a broader agenda of understanding the remarkable dynamics of the spliceosome in relation to the enzymatic result. Although it is early days for single-molecule studies of splicing, future studies that rely on simultaneous observation of splicing factors and pre-mRNA in living cells carry much promise for understanding both the mechanism and regulation of splicing *in vivo*.

Conclusion and outlook

Single-molecule approaches are now being used to study processes of increasing complexity. Nowhere is this complexity more evident than the transcribing gene: Megadalton complexes involved in elongation, splicing, termination, and cleavage simultaneously interact on nascent

RNA to control RNA synthesis and processing. Some of these processes have been examined in great depth, while others have not. For example, there are only a few studies of transcription termination in prokaryotes (Yin et al. 1999; Larson et al. 2008) and virtually none in eukaryotes. While it is still a work in progress, single-molecule biophysical methods promise us a future with the ability to observe the totality of events on a single RNA; that is, one can observe the order of events, the sequential assembly of complexes, and the time-resolved behavior of enzymes in a perturbation-free manner. By including techniques such as smFRET, which provides dynamic structural information, and optical trapping and AFM, which allow one to manipulate macromolecules, it is possible to probe the inner workings of an enzyme. One exciting prospect in the field is the convergence of increasingly complex in vitro assays and decreasingly complex in vivo assays. The fact that spliceosome assembly (Hoskins et al. 2011), PIC assembly (Revyakin et al. 2012), and transcription initiation (Fazal et al. 2015) can now be reconstituted and observed at the single-molecule level is inspiring. Single-molecule in vivo imaging is also advancing on parallel fronts and allowing researchers to see these same kinetic processes in the living nucleus (Larson et al. 2011; Chen et al. 2014).

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