

Review

The Dimensions, Dynamics, and Relevance of the Mammalian Noncoding Transcriptome

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The combination of pervasive transcription and prolific alternative splicing produces a mammalian transcriptome of great breadth and diversity. The majority of transcribed genomic bases are intronic, antisense, or intergenic to protein-coding genes, yielding a plethora of short and long non-protein-coding regulatory RNAs. Long noncoding RNAs (lncRNAs) share most aspects of their biogenesis, processing, and regulation with mRNAs. However, lncRNAs are typically expressed in more restricted patterns, frequently from enhancers, and exhibit almost universal alternative splicing. These features are consistent with their role as modular epigenetic regulators. We describe here the key studies and technological advances that have shaped our understanding of the dimensions, dynamics, and biological relevance of the mammalian noncoding transcriptome.

Appreciating Transcriptome Diversity

Mammals possess roughly the same number and a similar repertoire of protein-coding genes as nematode worms. By contrast, the intergenic and intronic regions of the mammalian genome are far greater. Indeed, while the number of protein-coding genes is largely static across the animal kingdom, noncoding genome content increases in size with developmental complexity [1].

Initial studies of the mammalian transcriptome were prefaced on the assumption that most genes encode proteins and that mRNAs constitute the bulk of non-ribosomal RNA in cells. It was therefore a surprise to discover that there are many transcripts, albeit usually of lower abundance, that are not protein-coding. In mammals, almost the entire genome is pervasively transcribed to generate not only mRNAs but many small and large non-protein-coding RNAs that are antisense, intronic, or intergenic to protein-coding genes [2]. The mammalian transcriptome is further diversified by prolific alternative splicing of both protein-coding and noncoding RNAs.

The breadth and complexity of mammalian transcription was not obvious before scalable cDNA hybridization [3] and sequencing [4], and the subsequent incorporation of next-generation sequencing to create modern RNA sequencing (**RNA-Seq**, see [Glossary](#)) [5]. The proliferation and evolution of RNA-Seq, including the advent of methods for targeted [6], single-molecule [7,8], and single-cell sequencing [9], continues to enlarge our understanding of transcriptional diversity. Nevertheless, the true dimensions of the mammalian transcriptome remain unknown and the spatiotemporal dynamics of gene expression and splicing demand further attention.

Trends

The mammalian transcriptome is hugely diverse owing to pervasive transcription and alternative splicing. Advances in RNA-Seq (e.g., targeted, single-molecule, and single-cell techniques) continue to shape our understanding.

lncRNA diversity remains under-appreciated, and the dynamics of lncRNA expression, splicing, and functional roles remain poorly characterized.

High-resolution and single-cell studies show that lncRNAs are not poorly expressed but are expressed with heightened spatiotemporal precision. lncRNAs are also enriched for splicing, with near-universal alternative splicing of noncoding exons.

The emergence of high-throughput forward-genetic screens utilizing CRISPR/Cas9 targeted genome manipulation and precise, scalable methods for resolving RNA structure and RNA-protein interactions has accelerated lncRNA characterization.

Precise, dynamic expression and complex splicing fit with central role of lncRNAs in the mammalian developmental program.

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This is especially true for the noncoding transcriptome. **Long noncoding RNAs** (lncRNAs) constitute a large portion of the mammalian transcriptome but are mostly poorly cataloged and characterized. Moreover, the relatively weak evolutionary constraint on their primary sequences, compared to protein-coding genes (noting enigmatic exceptions, such as transcribed **ultraconserved elements** [10,11]), their low abundance in tissue samples, and their incompatibility with a purely protein-centric model of gene regulation has caused many to question the biological relevance of lncRNAs.

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The rapid evolution of lncRNA sequences has been reviewed extensively elsewhere [12,13] and is not necessarily indicative of non-functionality because it is also consistent with plastic structure–function relationships in regulatory molecules and positive selection for phenotypic variation during **adaptive radiation** [14]. Likewise, accumulating evidence shows that lncRNAs are not simply uncommonly expressed but are transcribed in highly-specific patterns [15,16]. This, in addition to their complex alternative splicing [17], suggests that many lncRNAs may fulfill regulatory roles in the mammalian developmental program.

While the number of well-characterized lncRNAs is relatively small (but growing), the rise of **clustered regularly interspaced short palindromic repeats** (CRISPR)/Cas9 targeted genome manipulation, the development of high-throughput **forward-genetic** screens based on this technology [18], and the proliferation of precise, scalable methods for resolving RNA structure and RNA–protein interactions [19] are enabling the community to address longstanding challenges in lncRNA biology.

The Reality of Pervasive Transcription

The first clear evidence that the mammalian transcriptome included large numbers of non-protein-coding intergenic and antisense RNAs, as well as many stable intron-derived RNAs, came from genome-wide **tiling arrays** [20–22] and sequencing of cloned cDNAs [4,23–25]. These unexpected findings garnered controversy, and when very few reads obtained in early RNA-Seq experiments aligned outside known protein-coding genes the evidence for ‘pervasive transcription’ was questioned [26].

However, such claims stemmed from misinterpretation: the reason RNA-Seq reads from intergenic regions were scarce in the relatively low-depth assays of that time is because sequencing fragments are competitively sampled from a common pool, wherein transcripts of varied abundance are proportionally represented [27,28]. Highly-abundant mRNAs dominate the pool and obscure noncoding transcripts, which are generally less abundant [29] (or rather, more precisely expressed; see below). To detect uncommonly expressed genes and rare isoforms, and, even more so, to accurately resolve their spliced architectures, a sample must be sequenced deeply (Box 1).

As increasing numbers of cell types and tissues have been profiled at increasing depth it has become clear that the majority of the mammalian genome is dynamically transcribed [4,24,30–33]. Activity was recorded at 75% of genomic bases in a survey of 15 human cell lines by the ENCODE consortium [30]. Moreover, only around half of this activity was observed in any individual sample, implying that further activity would be observed in additional samples [30]. Comparable results were obtained for mouse [34].

The advent of **targeted RNA-Seq** has allowed the noncoding transcriptome to be surveyed at higher resolution [6]. This technique has unearthed widespread, regulated transcription in intergenic regions (previously considered to be **gene deserts**) below the limit of detection for genome-wide RNA-Seq [6,17]. Hence, even the detailed transcriptional profiles generated by ENCODE are incomplete.

Nonetheless, in the 27 years since the first documentation of a discrete and biologically relevant lncRNA, H19 [35], the catalog of known lncRNAs has rapidly grown [36–39]. Mammalian lncRNA loci now comfortably exceed protein-coding genes in number, with the **MiTranscriptome** annotation alone listing 58 648 lncRNA loci, compared to 21 313 protein-coding genes [11]. Moreover, the descriptors ‘gene’ and ‘locus’ are not entirely appropriate for lncRNAs because the mammalian transcriptional landscape is largely continuous, containing densely interleaved clusters of noncoding and protein-coding transcripts [4,22].

The Similar Life Histories of mRNAs and lncRNAs

Aside from several minor idiosyncrasies (reviewed elsewhere [40]), many if not most lncRNAs are regulated, transcribed, and processed in a similar fashion to mRNAs [41].

lncRNAs and mRNAs are roughly comparable in size and structure [37,42], although some lncRNAs are very large, in excess of 100 kb [43]. Similarly to mRNAs, many lncRNAs are transcribed by RNA polymerase II, regulated by **morphogens** and conventional transcription factors, dysregulated in disease, capped at their 5'-ends, and polyadenylated at their 3'-ends

Box 1. A Matter of Length and Depth – Limitations and Advances in RNA-Seq

RNA-Seq provides an unbiased global snapshot of transcription. Sequencing fragments are sampled from a pool in which transcripts of different abundances are proportionally represented. Crucially, this enables quantitative measurements of expression and/or splicing.

However, owing to the immense size of the transcriptome and its wide range of expression levels, competitive sampling means that highly expressed transcripts obscure uncommonly expressed transcripts. The structure of the transcriptome is such that, in a typical human sample, the top 1% most highly expressed protein-coding genes commonly soak up ~40% of sequencing reads (Figure 1A) [27]. For this reason, RNA-Seq carries an inherent expression-dependent bias that affects the detection, quantification, and assembly of RNA transcripts.

This is best illustrated by analysis of spike-in controls for RNA-Seq which are formulated into a staggered mixture spanning the quantitative range of the human transcriptome [27,28]. Typically, spike-in transcripts at high and moderate abundance are robustly quantified. However, among spike-ins of lower abundance, stochastic sampling leads to quantitative variability and, ultimately, loss of linearity between expected and observed abundances (Figure 1B). Because of their low abundance compared to mRNAs, lncRNAs are detected with lower sensitivity and quantified with lower accuracy [28].

Targeted RNA-Seq may be used to alleviate this issue. By magnifying coverage in specific genomic regions, targeted sequencing enables more-sensitive gene/isoform discovery and more-precise measurements of expression than is feasible with conventional RNA-Seq. This enables improved detection and quantification of uncommonly expressed genes and lncRNAs [6,85].

Another limitation of traditional RNA-Seq is the reliance on computational assembly of full-length isoforms from short (~100–150 nt) sequencing reads. This is a difficult task, particularly when alternative splicing generates multiple partially-redundant isoforms at an individual locus. Because saturating coverage is required for high-quality assembly, the expression-dependent bias of RNA-Seq strongly affects this process [28], ensuring that rare transcripts, such as lncRNAs, are often poorly resolved (Figure 1C). Targeted RNA-Seq [85] and coupling of sequencing to rapid amplification of cDNA ends (RACE-Seq) [42] have both been used to better resolve the spliced architecture of specific lncRNAs.

However, even with saturating coverage, long-range exon connectivity within an alternatively spliced locus cannot be established unambiguously using short-read RNA-Seq. Short reads may be used to designate individual exons as constitutive or alternative, but the relationship between distant exons cannot be judged because these are never represented on the same sequenced fragment (Figure 1D, upper).

With the emergence of technologies for long-read sequencing it is now possible to read full-length isoforms as single molecules, negating the challenges posed by transcript assembly [7,8]. Single-molecule techniques have been used to resolve complex, organized alternative splicing events, such as mutually exclusive or inclusive relationships between distant exons (Figure 1D, lower) [8]. However, these techniques are currently expensive, meaning that depth remains a constraint and rare transcripts may fall below the limits of sampling.

Glossary

Adaptive radiation: an evolutionary process in which organisms diversify rapidly from an ancestral species into a multitude of new forms.

Branch point: a genetic element involved in splicing located near the 3' end of the intron and immediately upstream of the poly-pyrimidine tract.

Clustered regularly interspaced short palindromic repeats

(CRISPR): a genetic element found in prokaryotes, which forms the basis of a recent genome engineering technology (CRISPR/Cas9) that enables permanent modification of genes *in vivo*.

Ectopic expression: abnormal gene expression in a cell type or developmental stage.

Forward genetics: an approach used to identify genes responsible for a particular phenotype of an organism (as opposed to reverse genetics, which studies the phenotype of an organism following disruption of a known gene).

GENCODE catalog: the reference human genome annotation for the ENCODE project (www.encodegenes.org).

Gene deserts: genomic regions thought to be transcriptionally silent.

Intron retention: a mode of alternative splicing in which a sequence that is normally intronic is retained in the mature mRNA transcript.

Long noncoding RNA (lncRNA): an RNA molecule longer than ~200 nt that does not contain a substantial open reading frame.

MiTranscriptome: a catalog of human long poly-adenylated RNA transcripts derived from computational analysis of high-throughput RNA sequencing (RNA-Seq) data from over 6500 samples spanning diverse cancer and tissue types (<http://mitranscriptome.org>).

Morphogens: signaling molecules that control cell fate specification in developing tissues.

Nonsense-mediated decay: a surveillance pathway in eukaryotes whose function is to reduce errors in gene expression by eliminating mRNA transcripts that contain premature stop codons.

Paraspeckles: relatively recently discovered subnuclear bodies formed by the interaction of the lncRNA *NEAT1* and various proteins.

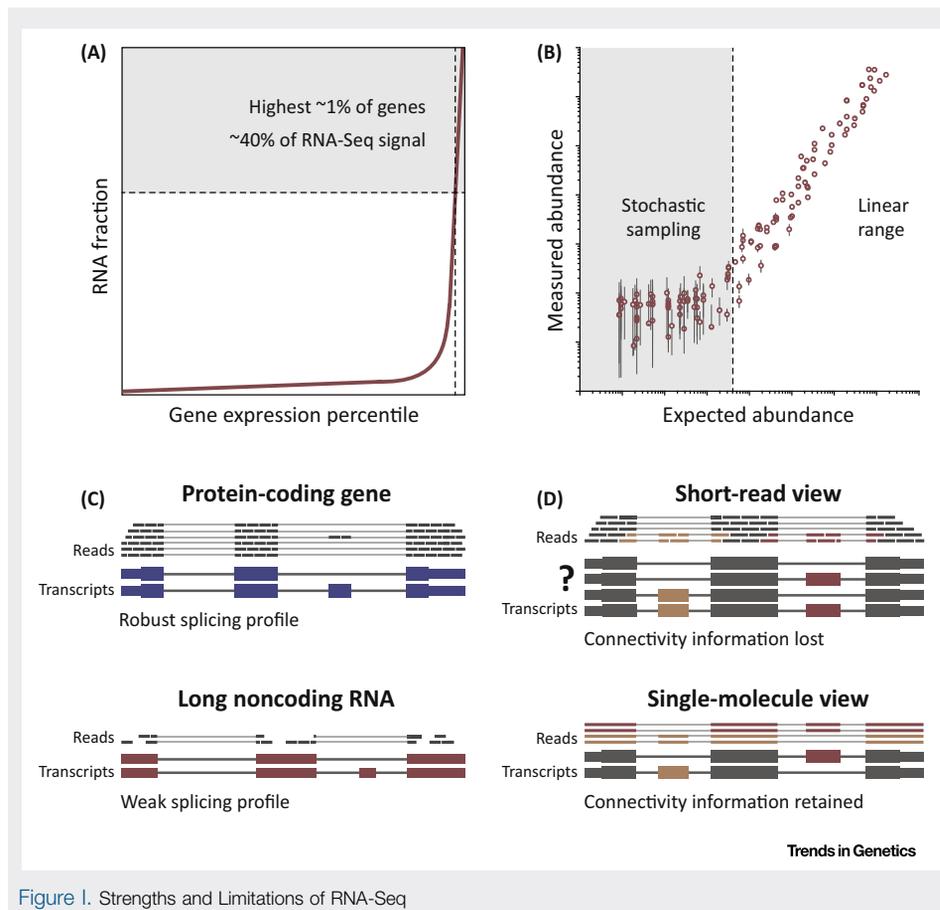


Figure 1. Strengths and Limitations of RNA-Seq

RNA-Seq: massively parallel sequencing of cDNA molecules (typically fragmented into short sequencing fragments) derived by global reverse transcription of RNA transcripts.

Targeted RNA-Seq: also known as CaptureSeq, the sequencing of cDNA molecules (as per RNA-Seq) selected by hybridization to specific oligonucleotide baits. Allows enriched coverage of specific genes or genomic regions.

Tiling array: a subtype of microarray chips which probe intensively for sequences known to exist in a contiguous region.

Transcript assembly: the process of reconstructing full-length RNA transcripts from short sequencing reads.

Ultraconserved element: a region of DNA that is identical in multiple different species. Some ultraconserved elements have been found to be transcriptionally active.

[12,41], although some lncRNAs are transcribed by RNA polymerase III [44] or processed from intronic sequences [22]. Like protein-coding genes, lncRNA transcription arises from recognizable promoters which show strong sequence conservation in many cases [4]. lncRNA promoters are enriched for transcription factor binding sites [45,46] and the canonical marks of active gene expression, trimethylated (me3) and acetylated (ac) forms of histone H3 (H3K4me3, H3K9ac, and H3K27ac) [36,37,47].

Expressed lncRNA promoters are also enriched for the repressive H3K9me3 mark and exhibit lower transcription factor binding densities than protein-coding gene promoters [46,48]. This may be consistent with a recent report suggesting that many intergenic lncRNAs originate from enhancer-type transcription start-sites rather than from conventional promoters [39].

HuR and U1 short nuclear ribonucleoprotein (snRNP), regulators of transcript stability, associate with similar frequency to lncRNAs and mRNAs at matched expression levels, and these also exhibit comparable stabilities in human cell lines following transcriptional inhibition [46]. Other studies have shown that lncRNAs have a lower average but a similar range of half-lives as mRNAs [49,50].

lncRNA Expression Is Highly Precise and Dynamic

One of the key concerns about the biological relevance of lncRNAs has been their low abundance in tissue samples, sometimes argued to be simply a manifestation of 'transcriptional noise' [51]. However, accumulating evidence suggests that this reflects heightened spatiotemporal precision rather than low background expression.

It is clear that, while some lncRNAs such as *MALAT1* and *NEAT1* are widely expressed [52], most lncRNAs are highly tissue-specific, more so than protein-coding genes [4,30,36,37,53]. For example, one survey classified 78% of detectable lncRNAs as tissue-specific compared to only 19% of mRNAs [36]. Importantly, this difference was observed for lncRNAs and mRNAs at matched expression levels, and highly expressed lncRNAs in fact displayed the strongest tissue specificity [36].

In this survey, lncRNAs were detected at around an order of magnitude lower, on average, than mRNAs [36]. Expression measurements from homogenized tissue (analogous to analyzing a smoothie) report a population average among pooled cells, regardless of differences between, or even within, specific cell populations (Box 2). Such heterogeneity might be biologically relevant, especially in tissues where well-defined substructures exist.

The brain is the most complex organ and harbors the largest transcriptional diversity of any somatic tissue. Using *in situ* hybridization to visualize the spatial distribution of transcription in mouse brains, an early study showed that lncRNAs are highly abundant in specific cells but are spatially precise, often being restricted to particular brain regions, structures, or cell types [15]. The authors proposed, therefore, that the low abundance of lncRNAs observed in bulk tissue sequencing experiments reflects their highly cell-specific expression.

With the emergence of single-cell RNA-Seq [9], this matter has been scrutinized in more detail (Box 2). In one recent investigation, individual transcriptional profiles were obtained from 276

Box 2. Averages Lie – Transcriptomic Insights from Single-Cell RNA-Seq

Until recently all RNA-Seq experiments were performed on bulk tissue or cell samples. These experiments have been instrumental in advancing our understanding of mammalian transcription and have generated hugely valuable resources such as the ENCODE [32] and Genotype-Tissue Expression (GTEx) [115] transcription catalogs.

However, the analysis of a homogenized tissue can be likened to the analysis of a smoothie: measurements of gene expression or alternative splicing report a single population average among pooled cells, ignoring heterogeneity between cells (Figure 1A, left). For instance, a measurement from bulk tissue cannot discriminate between the possibilities that *Gene X* is expressed at a moderate level in all cells or, alternatively, that *Gene X* is expressed in only a subset of cells but at a high level. Likewise, an observed increase in the expression of *Gene X* could be attributed either to a uniform increase in its transcription across all cells or, alternatively, an increase in the number of cells expressing *Gene X*.

Single-cell RNA-Seq, by contrast, provides information about the population structure of gene expression within a sample and can simultaneously measure the proportion of cells expressing *Gene X* and the magnitude of its expression in each (Figure 1A, right panel). Single-cell RNA-Seq commonly reveals bimodality in gene expression and alternative isoform usage within cell populations, which is overlooked in pooled experiments. For instance, Shalek *et al.* used single-cell RNA-Seq to resolve bimodal responses in the expression of key immune genes among mouse dendritic cells stimulated with lipopolysaccharide [75].

Heterogeneity in gene expression within a sample might be biologically relevant. Most obviously, it might reflect diversity of cell types or indicate that unresolved subtypes are present in a seemingly homogenous population (as speculated in the study mentioned above [75]). These might be intermixed (e.g., in blood), spatially organized (e.g., among cortical layers), or temporally organized (e.g., among differentiating cells) (Figure 1B). Partnering single-cell RNA-Seq with modern histology and microscopy provides powerful insight into the physical and transcriptomic architecture of complex tissues [116,117].

Long before the advent of single-cell RNA-Seq, highly-precise spatial organization of lncRNAs had been observed by *in situ* hybridization, which showed that the expression of many lncRNAs is restricted to individual brain regions, structures, or cell types (Figure 1C) [15].

Evidence from single-cell RNA-Seq supports this hypothesis. Profiling individual human neocortical cells, Liu *et al.* recently found that lncRNAs are expressed at comparable levels to mRNAs in individual cells, but are expressed in fewer cells overall. This explained parallel measurements from pooled cells, in which mRNAs were considerably more abundant (Figure 1D) [16].

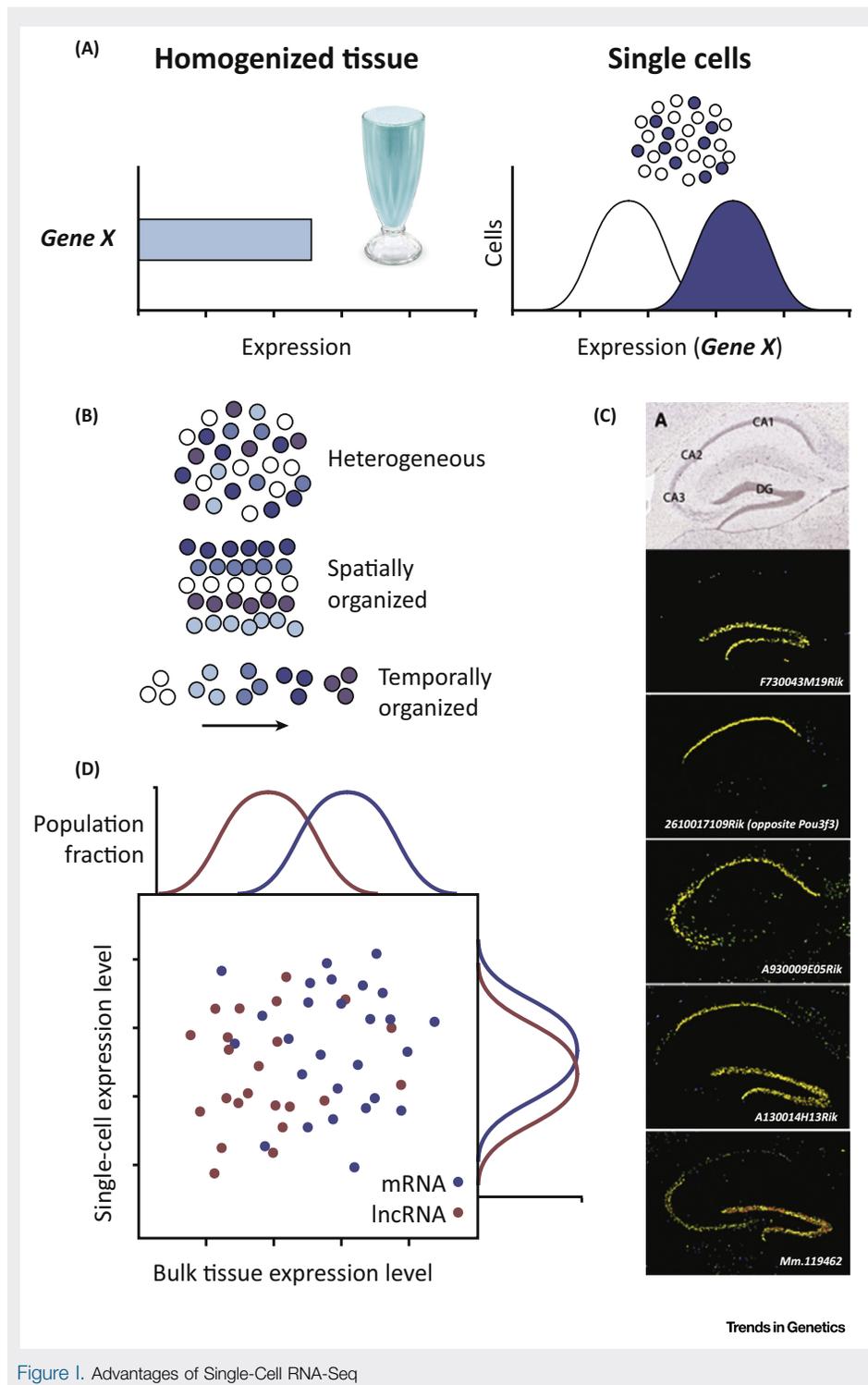


Figure 1. Advantages of Single-Cell RNA-Seq

cells in developing human neocortex [16]. On average, detectable lncRNAs were lower in abundance than mRNAs by an order of magnitude, consistent with measurements from whole tissue [36]. However, the median lncRNA/mRNA ratio in single cells among detectable transcripts exceeded 1.0 (i.e., lncRNAs were present at greater median abundance than mRNAs) in

one-third of the cells, even approaching the levels of housekeeping genes in some instances [16]. Hence, many lncRNAs were expressed at low levels in pooled cells but at high levels in a subset of individual cells.

This phenomenon was not recapitulated in cultured K562 cells, which are more uniform [16]. Similarly, 61 lncRNAs profiled by RNA fluorescence *in situ* hybridization showed no more heterogeneity than mRNAs within any of three cell lines [54]. That lncRNAs and mRNAs exhibit equivalent cell-to-cell heterogeneity in cultured cell lines suggests that the heightened heterogeneity of lncRNA expression in the neocortex reflects biological differences between cells therein rather than sporadic expression among homogenous cells.

Even more so than mRNAs, lncRNAs also show precise patterns of subcellular localization (reviewed elsewhere [55]). *NEAT1*, for instance, can be found in nuclear **paraspeckles** (and is essential for their formation) [56,57], while *XIST* localizes to the inactive X-chromosome (and is essential for its silencing) [58]. As a population, lncRNAs show stronger nuclear localization than mRNAs: 17% of lncRNAs and 15% of mRNAs show relative enrichment in the nucleus, compared to 4% and 26%, respectively, in the cytoplasm [37]. lncRNAs that are retained in the nucleus may accumulate at their own sites of transcription or localize elsewhere. *HOTAIR*, for instance, is transcribed from the mammalian *HOXC* locus but accumulates *in trans* at the *HOXD* locus (where it facilitates gene silencing) [59].

lncRNA expression is also highly dynamic during development. This has been demonstrated in differentiating embryonic stem cells [60], muscle [57], T cells [60], mammary gland [61], and neurons [62–64], among other systems. One recent study leveraged single-cell RNA-Seq to resolve the transcriptional repertoire of early human embryo development [65]. Compared to mRNAs, lncRNA abundances were found to be higher within individual cells than in pooled data from multiple cells and developmental stages. However, at the four-cell or eight-cell stage, when the cells of an embryo are highly similar, a large proportion of detected lncRNAs were expressed in every cell, further indicating that lncRNA expression was not simply ‘leaky’ [65].

Prolific Alternative Splicing Diversifies the Transcriptome

Extensive alternative splicing of human mRNAs was recognized many years ago [66,67], but the scope of its influence on the mammalian transcriptome was not fully appreciated before the advent of RNA-Seq. Early systematic analyses of alternative splicing with RNA-Seq showed that 92–94% [68] or 92–97% [69] (i.e., probably all) multi-exon human protein-coding genes undergo alternative splicing. Unique isoforms may be deployed in specific contexts, remolding the transcriptome during development and evolution [70–72].

Most genes express a dominant spliced isoform that accounts for ~80% of transcription in an individual tissue, and multiple minor alternative isoforms [30,73]. In the ENCODE survey of 15 cell lines, an average of 10–12 isoforms were detected per gene, per cell line [30]. However, because high sequencing coverage is necessary to resolve low-level alternative isoforms (Box 1), this is a conservative estimate of isoform diversity. Targeted RNA-Seq highlights this limitation, in one instance unearthing novel isoforms encoding up to three new open reading frames (ORFs) of *TP53*, which is among the most extensively studied of all human genes [6].

An additional limitation is imposed by RNA-Seq read-length because the computational assembly of full-length alternative isoforms from short reads is difficult. With the emergence of long-read sequencing technologies it is now possible to read full-length isoforms as single molecules, negating the challenges of **transcript assembly** (Box 1). Leading studies in this space have resolved complex and precisely organized alternative splicing events, including the

coordinated inclusion/exclusion of distant exons and allele-specific isoform expression [7,8,74].

Early evidence from single-cell RNA-Seq experiments suggests that such features reflect the organization, as opposed to random distribution, of alternative isoforms within a heterogeneous tissue, potentially reflecting biological differences between cells [75–78]. In one example, a single alternative splicing event in *NINEIN* is sufficient to trigger differentiation of individual human neural progenitors from a purified population into neurons [78]. We anticipate that the confluence of single-cell and single-molecule sequencing, now feasibly executed in tandem [79], will profoundly advance our understanding of splicing organization.

Many alternative splicing events at protein-coding loci generate isoforms that lack an extended ORF. For example, one survey found that the major isoform for up to 20% of protein-coding genes was noncoding (though we note that this result is highly dependent on the quality of transcript assembly) [73]. Noncoding isoforms are often the product of **intron retention**, a regulated process that may dampen gene expression by inducing **nonsense-mediated decay** [80,81] or nuclear transcript detention [82]. However, noncoding (or even coding) RNAs derived from protein-coding loci can also transact regulatory functions. For instance, the human β -globin mRNA can convey epigenetic information independently of its translation [83], and a UV-induced noncoding isoform of *ASCC3* facilitates transcriptional recovery after DNA damage in a manner independent of, and antagonistic to, the protein-coding function of this gene [84].

Near-Universal Alternative Splicing of Noncoding Exons

lncRNAs also undergo alternative splicing, although their relatively low abundance in homogenized tissues hinders accurate resolution of these events. The **GENCODE catalog** (v7) of noncoding RNAs lists alternative isoforms for only around a quarter of lncRNA loci, and indicates that lncRNAs generally have fewer exons and shorter mature transcripts than mRNAs [37]. However, a subsequent detailed characterization of 398 lncRNAs from the same catalog by rapid amplification of cDNA ends and long-read sequencing showed these to be at least equivalent to protein-coding genes in splicing complexity, indicating that insufficient coverage was the reason for the previous underestimate [42].

Targeted RNA-Seq has been similarly applied to obtain more-complete models of lncRNA architecture. By targeting exons of annotated lncRNAs, many previously unassembled exons were incorporated into existing lncRNA loci and many were shown to be fragments, with splicing unifying multiple annotated loci [85]. Even the extensively studied lncRNA *HOTAIR* exhibited alternative splicing events that were undetected by conventional RNA-Seq [6].

The splicing of lncRNAs and mRNAs is regulated by local sequence elements that are highly similar, with canonical splice donor (GT) and acceptor (AG) dinucleotides demarcating intron–exon boundaries in both [37,85]. The binding motif for U1snRNP, which initiates spliceosome recruitment [86], also has the same density and positional distribution in both [46]. Canonical poly-pyrimidine enrichments upstream of splice acceptor sites tend to be slightly weaker in pre-lncRNAs than in pre-mRNAs, and **branch-point** nucleotides are slightly more distant [46], features that correlate with heightened alternative over constitutive splice site selection. CLIP-Seq data also show a relative depletion of U2AF65, which promotes branch point selection [86], near lncRNA splice acceptor sites, compared to those in nascent mRNA [46].

The latter features may explain, at least in part, a global reduction in splicing efficiency [46,87] and/or splice site selection [79] that more clearly distinguishes lncRNAs from protein-coding genes. Retarded splicing kinetics observed in lncRNAs similarly distinguishes spliced exons in

untranslated regions (UTRs) of protein-coding genes from those within ORFs [87]. In this context it is interesting that many protein-coding loci also express their 3'-UTRs separately from their normally associated protein-coding sequences, in highly cell-specific patterns, and with clear genetic activity in *trans* [88].

Recently, a high-resolution transcriptional cross-section of human and mouse chromosome 21 was generated by targeted transcript enrichment, followed by single-molecule and saturating short-read RNA-Seq [17]. This approach revealed that lncRNAs are, contrary to the impression from shallower surveys, enriched for alternative splicing, with internal exons being near-universally classified as alternative. Human splicing profiles were recapitulated in the Tc1 mouse strain (which carries a copy of human chromosome 21), indicating that they are robustly encoded in the local chromosome sequence, and are not the manifestation of non-specific splicing activity. Extensive alternative splicing was also observed for untranslated exons at protein-coding loci, suggesting that this is a general feature of noncoding regulatory RNA [17].

lncRNAs therefore exhibit a highly modular or exon-centric architecture; unlike protein-coding genes, whose central exons are constrained by the requirement to maintain continuous ORFs, lncRNA exons behave as discrete units that are recombined with maximum flexibility. It is currently unclear whether this reflects precisely organized cell-to-cell heterogeneity (as for mRNAs; above) or uniformly promiscuous usage of alternative isoforms. Single-cell (probably in conjunction with single-molecule) approaches will be required to resolve this dichotomy.

Functional Characterization of lncRNAs: Unique Challenges and Emerging Solutions

Many well-characterized lncRNAs function as regulatory molecules in the epigenetic control of gene expression, and fulfill roles in differentiation and development [2,89]. These roles are easily reconciled with the distinctive features of lncRNA biology described above, namely their precise expression and complex alternative splicing, providing a conceptual framework to guide further discovery and characterization.

We owe much of what we know about lncRNA function to the characterization of flagship examples, such as *XIST* and *NEAT1*, whose biological roles and modes of action are now relatively well understood. While the knowledge garnered has been vital to the development of the field, it should be borne in mind that many of these well-known representatives are atypical. *XIST*, for instance, is more highly conserved than most [13], partly reflecting its derivation from an ancestral protein-coding gene [90], and both *XIST* and *NEAT1* are highly and constitutively expressed, unlike most lncRNAs.

This consideration is important because the characteristic aspects of lncRNA biology described above, in addition to their mechanistic diversity and the subtle and/or context-specific phenotypes that many lncRNAs exhibit, pose challenges to their functional characterization. Strategies that have worked well for protein-coding genes are often inapplicable for lncRNAs (reviewed elsewhere [91]), and the relatively small number of examples for which clear biological roles have been determined probably represent the lowest-hanging fruit.

Knockdown of lncRNAs in culture, using si/shRNAs, has frequently resulted in altered cell growth or behavior [41], suggesting that perturbation of lncRNAs disturbs the epigenetic state of the cells.

Several studies have generated lncRNA deletions *in vivo*, with varied success (e.g., [92]). Using classical gene replacement techniques, and targeting mouse lncRNAs with identifiable human orthologs, one investigation reported developmental defects for five of 18 knockout mice [93].

The relatively low frequency of gross phenotypes observed (even for conserved lncRNAs) may reflect a combination of dispensable exons, redundancy in regulatory systems, and/or more subtle phenotypes, especially cognitive phenotypes, which are not usually polled [94]. Indeed, because most lncRNAs are expressed in the brain and many are primate-specific [37], it may be that much of the lncRNA-mediated genetic information in mammals is devoted to brain function, and not easily detectable in developmental screens. For example, knockout of the lncRNA *BC1* causes no visible anatomical consequences but leads to a behavioral phenotype that would be lethal in the wild [95].

We anticipate that the key to rapidly expanding our understanding of lncRNA biology lies in high-throughput **forward genetics**. However, until recently there has been no robust, scalable strategy for agnostic phenotype-to-genotype interrogation of lncRNAs (Box 3).

Recently, two breakthrough investigations have answered this call [96,97]. Both did so by pairing the CRISPR/Cas9 system with large guide-RNA libraries (Box 3). In one approach, paired guide-RNAs were used to induce large genomic deletions in 700 individual lncRNA loci, of which 51 had a positive or negative influence on cancer cell growth [96]. Reasoning that genomic deletions may affect local regulatory elements, the second study instead used CRISPR interference (CRISPRi; wherein transcription is locally inhibited at targeted sites) to

Box 3. High-Throughput Forward Genetics for lncRNA Characterization

Until recently there has been no robust, scalable strategy for the genetic interrogation of lncRNA functionality. Traditional mutagenic screens generate frameshift mutations to knockout protein-coding genes and are therefore inappropriate for lncRNAs. Likewise, RNA interference is plagued by off-target activity (exacerbated in instances of low target stoichiometry), incomplete knockdown, and the difficulty of targeting nuclear-localized, highly alternatively spliced lncRNA transcripts [18,91].

Therefore, it is noteworthy that several laboratories have recently developed high-throughput phenotypic screens that utilize the CRISPR/Cas9 system, rather than mutagens or si/shRNAs, to interrogate putative functional elements in the genome [18].

The Cas9 nuclease is delivered to a specific genomic location by a single guide RNA (sgRNA) based on the complementarity of the latter to the target (Figure 1A). By introducing a large library of different sgRNAs to a pool of cells expressing Cas9, with different cells taking up different sgRNAs, many genomic sites may be independently targeted in parallel (Figure 1B–D).

Cells are cultured and may be subject to particular selective conditions. The frequency of sgRNA markers in the pool can then be measured using deep sequencing, revealing biases in cell survival/proliferation specific to individual sgRNAs. Most sgRNAs should not change in relative frequency; however, deleterious sgRNAs will be relatively depleted and those that have a positive influence will be enriched. In this fashion, transcripts or genomic elements whose perturbation has functional consequences relevant to the selection paradigm may be identified.

CRISPR/Cas9 introduces double-stranded DNA breaks at precise genomic locations, often generating small indels at these sites (Figure 1A, left). This is effective for the perturbation of functional protein-coding genes or noncoding elements (e.g., enhancers), which have been identified agnostically by tiling sgRNAs across noncoding regions (Figure 1B) [118].

However, this approach is not well suited to lncRNAs because the small indels generated by Cas9 rarely have a strong effect on their function. One strategy [96] that can be used to overcome this is to use paired guide RNAs (pgRNAs) to induce large genomic deletions between the two targeted sites, thereby removing entire lncRNA domains and/or loci (Figure 1C). An alternative [97] is to use CRISPR interference (CRISPRi), wherein a catalytically-inactive Cas9 enzyme (dCas) is fused to a transcriptional repressor (e.g., KRAB) so as to inhibit gene expression at genomic target sites (Figure 1A, right). The initial success of these approaches implies widespread lncRNA functionality, and that the design of elegant and well-directed paradigms for phenotypic screening will lead to further success.

Recently, pooled CRISPR screens have been combined with single-cell RNA-Seq, directly linking sgRNA expression to transcriptome responses in thousands of individual cells, and thereby enabling more subtle and context-specific effects to be polled [119–121].

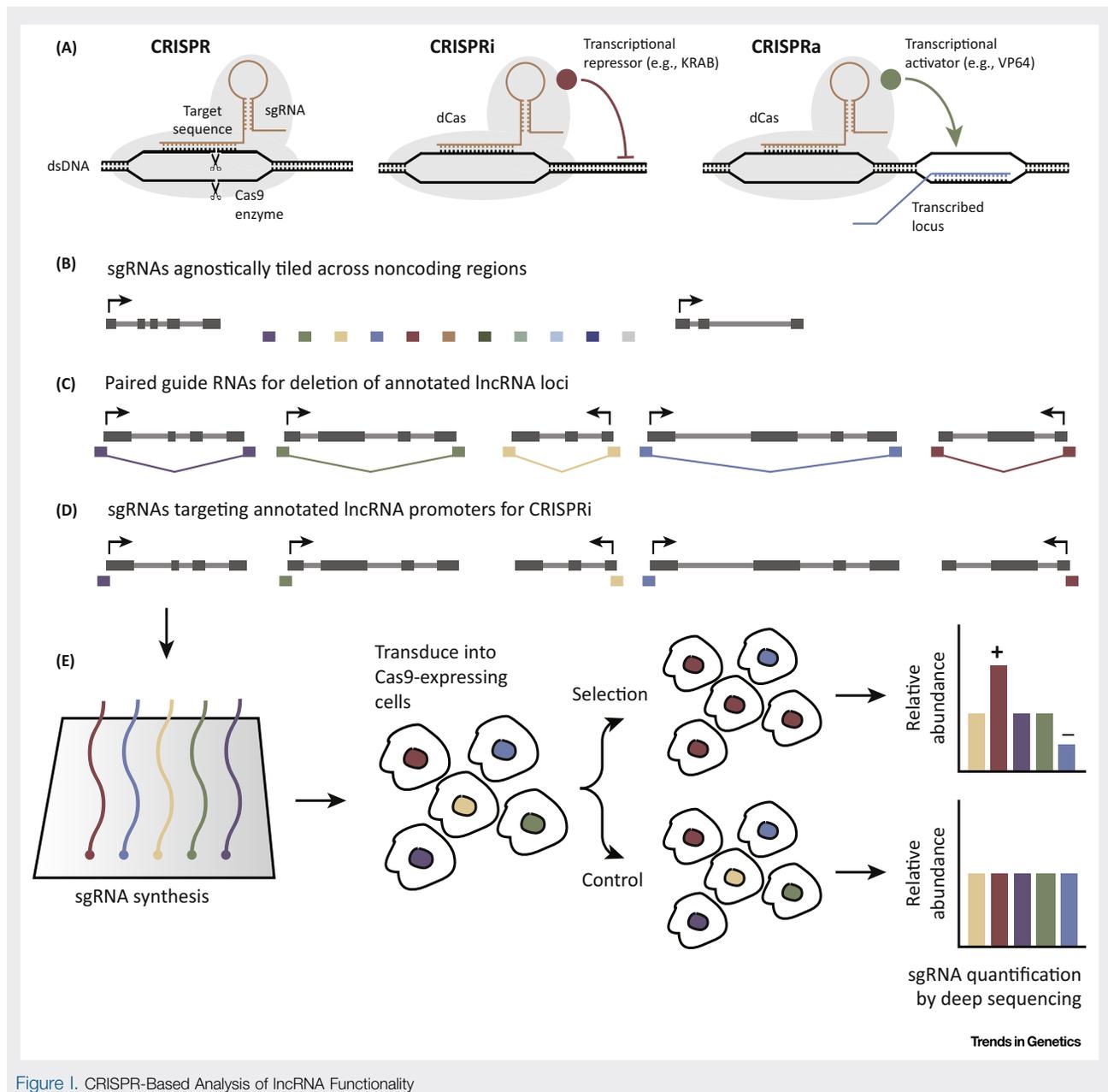


Figure 1. CRISPR-Based Analysis of lncRNA Functionality

knockdown 16 401 lncRNA loci across seven human cell lines. Perturbation of 499 of these targets affected cell growth, and the overwhelming majority (89%) of these expressed a phenotype in only a single cell type, emphasizing the context-specificity of lncRNA activity [97]. Both results imply widespread lncRNA functionality, and that the design of elegant, well-directed paradigms for phenotypic screening will lead to further success (Box 3).

The CRISPR/Cas9 system also enables detailed examination of individual lncRNAs by targeted genomic manipulations and/or transcriptional perturbation. The removal or modification of specific promoter elements, splice sites, sequence motifs, or RNA domains is now relatively simple. In addition, CRISPRi (and related techniques) can be used to clearly distinguish between regulatory effects enacted in *cis* and *trans*. In a recent investigation, 12 lncRNA loci

were dissected, individually deleting promoters, exons, and introns, or inserting premature polyadenylation signals to prevent transcript elongation. The effects of each modification on local gene expression were assessed [98]. Illustrating the power of the CRISPR/Cas9 system for lncRNA characterization, this approach identified instances in which (i) the act of transcription but not the mature lncRNA molecule itself, and (ii) DNA sequences in the lncRNA promoter but not the act of transcription, were sufficient to elicit a *cis*-regulatory effect on a neighboring gene. While these examples highlight the ability for lncRNAs to enact *cis*-regulatory effects, we note that these do not preclude independent *trans*-regulatory functions.

The community also now possesses increasingly precise and scalable methods for resolving RNA structure as well as RNA–protein and RNA–chromatin interactions (reviewed elsewhere [19]). Advances in the biology of *XIST*, for which the secondary structure [99], protein binding partners [100–102], and sites of chromatin localization during X-inactivation [103,104] are now known, demonstrate how these techniques could be used to help to resolve the structure–function relationships and the mode of action for any lncRNA.

lncRNAs as Modular Epigenetic Regulators

The phenomena interrogated by the techniques mentioned above are central to understanding lncRNA functionality – namely, the ability of lncRNAs to form specific and multilateral RNA–protein, RNA–DNA, and RNA–RNA interactions. Their diverse binding properties and flexibility in size and structure means that lncRNAs are ideally suited to facilitate interactions between other biomolecules, and thereby organize and regulate cellular processes [105].

It is unsurprising then that many lncRNAs participate in the epigenetic regulation of gene expression. lncRNAs commonly interact with chromatin-remodeling enzymes/complexes, including PRC2 [106] and MLL/TrxG [107] complexes, histone demethylase LSD1 [108], DNA methyltransferase DNMT1 [109], and demethylation regulator GADD45a [110]. These possess enzymatic activity to alter chromatin state but lack the capacity for site-specific DNA/chromatin-binding. In numerous examples, lncRNAs confer this site-specificity, guiding effector complexes to appropriate genomic targets. lncRNAs may select genomic targets by interacting with additional protein binding partners (e.g., [111]), via direct interaction between lncRNA and DNA/chromatin (e.g., [52]), or in *cis* at the site of lncRNA transcription (e.g., [112]).

Consistent with guidance of epigenetic processes, many lncRNAs play roles in cell-fate determination (reviewed elsewhere [89]). However, the more profound challenge for the genetic programming of complex organisms is to organize the growth and differentiation of trillions of cells into precisely structured organs and tissues, including bones, muscles, and the brain. While protein factors clearly play a role, epigenetic remodeling, guided by regulatory RNAs, appears to be increasingly important to the developmental program [2,89]. The fact that the native program can be trumped by **ectopic expression** of transcription factors is not inconsistent with this model; indeed, developmental programs can also be changed by ectopic expression of regulatory RNAs [113].

We are far from understanding how the mammalian developmental program operates, but one can imagine a scenario in which every cell (or local group of cells) expresses a unique molecular profile that defines its identity and position during ontogeny and at maturity (see Outstanding Questions). This fits with the observations of ordered, not random or sporadic, cell-specific lncRNA expression [15,16]. Indeed, recent data from single-cell RNA-Seq suggest that few (if any) cells in a mammalian tissue express a lncRNA population that is redundant with a neighbor (see above).

The exon-centric architecture of lncRNAs, in which exons are recombined into a dizzying diversity of isoforms, can also be reconciled with an RNA-driven developmental program. This

Outstanding Questions

The true breadth and complexity of the mammalian transcriptome remains unrealized. Targeted RNA-Seq experiments continue to unearth widespread transcription below the limit of detection for RNA-Seq. Single-molecule technologies reveal complex, organized patterns of alternative splicing that cannot be resolved with short reads. A genome-wide single-molecule transcriptome survey at saturating depth has yet to be achieved, even for a single tissue or cell-line.

Although in relative infancy, single-cell RNA-Seq has shown instances of organized and biologically relevant heterogeneity of gene expression between, and even within, cell populations. Further experiments are necessary to resolve the distribution of alternative isoforms between cells. Are alternative isoforms distributed uniformly or in an organized fashion, potentially reflecting biological differences between cells? This question is especially pertinent for lncRNAs, which exhibit highly cell-specific expression and enriched alternative splicing.

High-throughput forward genetic screens utilizing the CRISPR/Cas9 system have yielded initial success in identifying functional lncRNAs. However, selection has been limited to relatively crude (cell growth) phenotypes. The challenge now is to design elegant, well-directed paradigms for phenotypic screening that are appropriate for the subtle and highly context-specific roles enacted by many lncRNAs.

The ultimate challenge for developmental genetics is to understand not only how cell identity is defined but how cells are organized into precisely structured organs and tissues. It appears increasingly that the developmental program in complex organisms is epigenetically orchestrated and guided by regulatory RNAs. To reconcile the characteristic aspects of lncRNA biology (precise expression, near-universal alternative splicing and rapid evolution) with their proposed role in this program remains a key challenge for the community.

implies that exons may act as discrete functional domains, each with a unique and specific affinity for external biomolecules (specific protein domains, DNA motifs, etc.). Modular recombination of lncRNA exons may enable diverse and dynamic interactions, for instance by delivering a particular chromatin remodeler to particular sites in the genome at specific moments in development.

Moreover, the evolution of RNA modification and editing, which expands markedly in mammalian and especially primate evolution, may have provided the means to superimpose epigenetic plasticity on an otherwise hardwired genome and transcriptome, enabling physiological and cognitive adaptation [114].

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