# Ribosome-omics of the human ribosome

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#### **ABSTRACT**

The torrent of RNA-seq data becoming available not only furnishes an overview of the entire transcriptome but also provides tools to focus on specific areas of interest. Our focus on the synthesis of ribosomes asked whether the abundance of mRNAs encoding ribosomal proteins (RPs) matched the equimolar need for the RPs in the assembly of ribosomes. We were at first surprised to find, in the mapping data of ENCODE and other sources, that there were nearly 100-fold differences in the level of the mRNAs encoding the different RPs. However, after correcting for the mapping ambiguities introduced by the presence of more than 2000 pseudogenes derived from RP mRNAs, we show that for 80%–90% of the RP genes, the molar ratio of mRNAs varies less than threefold, with little tissue specificity. Nevertheless, since the RPs are needed in equimolar amounts, there must be sluggish or regulated translation of the more abundant RP mRNAs and/or substantial turnover of unused RPs. In addition, seven of the RPs have subsidiary genes, three of which are pseudogenes that have been "rescued" by the introduction of promoters and/or upstream introns. Several of these are transcribed in a tissue-specific manner, e.g., RPL10L in testis and RPL3L in muscle, leading to potential variation in ribosome structure from one tissue to another. Of the 376 introns in the RP genes, a single one is alternatively spliced in a tissue-specific manner.

Keywords: ribosome; ribosomal protein; RNA-seq; alternative splicing; pseudogene

## **INTRODUCTION**

As the central element in the production of proteins, the ribosome is key to the regulation of growth and development. Molecular structures from yeast (Ben-Shem et al. 2011) and humans (Anger et al. 2013) demonstrate that the ribosome is a fixed, unique arrangement of proteins and RNA molecules, mostly conserved over geological time scales. Yet recent work suggests that there may be more flexibility in both the structure and function of the ribosome than has been appreciated (for review, see Xue and Barna 2012).

The eukaryotic ribosome is composed of four RNA molecules and 80 ribosomal proteins (RPs), assembled through a complex series of steps requiring the participation of nearly 300 RNA and protein cofactors (for review, see Thomson et al. 2013; Woolford and Baserga 2013). Although much of the detailed analysis of this process has been carried out in *S. cerevisiae*, genome comparisons and recent experimental work suggest that much the same process occurs in mammalian cells, although with additional complexities (Tafforeau et al. 2013). The assembly process requires the nearly simultaneous presence of an equimolar amount of nearly all the 80 RPs. There are two types of exceptions: (1) In yeast, eight of the 79 RPs are not essential for reasonable growth (Steffen

et al. 2012), and in mammals, a few RPs, such as L22 (O'Leary et al. 2013) and L40 (Lee et al. 2013) seem to be dispensable for ribosome assembly and for cell growth; none are known to be dispensable for the development of an intact animal; and (2) the stalk proteins, P1 and P2, are present in two copies per ribosome and exchange between a cytoplasmic pool and mature ribosomes (for review, see Gonzalo and Reboud 2003).

Ribosomes are abundant. An efficient cell would synthesize equimolar amounts of each of the RPs. Is that in fact the case? Indeed some evidence suggests that the cell produces far more of each of the RPs than needed, rapidly degrading any molecules not selected to form the complete ribosome (Lam et al. 2007). However, accumulating examples of pathological effects due to haploinsufficiency of genes encoding RPs (for review, see Raiser et al. 2014) question that notion. The discovery that Diamond-Blackfan anemia can be caused by haploinsufficiency of *RPS19* (Draptchinskaia et al. 1999) or a number of other RP genes (Farrar et al. 2011), that 5q myelodysplastic syndrome is caused by the loss of one copy of *RPS14* (Ebert et al. 2008), and that haploinsufficiency for *RPSa* can lead to congenital asplenia (Bolze et al. 2013) suggests that adequate supplies of the RPs can be limiting.

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Finally, increased focus on the role in disease of the ribosome and its synthesis has come from the realization that ribosome assembly is carefully monitored by the cell, when defective ribosome assembly due to imbalance in the production of RPs can lead to accumulation of p53, and in some cases to apoptosis (for review, see Vlatković et al. 2014).

These considerations prompted us to exploit the massive amount of information now available through genomic initiatives to ask three specific questions about human ribosomes and their synthesis:

- 1. What genes are used to produce RPs? Are they the same in all tissues?
- 2. Is there equimolar representation of mRNAs encoding the 80 RPs?
- 3. To what degree does alternative splicing of RP gene transcripts lead to alternative RPs? Is there tissue specificity?

As will be evident below, the answers to these questions (partially summarized in Table 1) not only reveal limitations to conventional genomic analysis but also provide intriguing insights into potential ribosome heterogeneity.

#### RESULTS AND DISCUSSION

## Proteome analysis of the ribosomal proteins

Can proteome analysis reveal whether the cell, indeed, has equimolar amounts of the 80 RPs? These are difficult experiments, but the Aebersold and Mann laboratories (Beck et al. 2011; Nagaraj et al. 2011) have used advanced mass spectrometry methods to measure the abundance of many thousands of individual proteins in two human cell lines. The results for RPs, extracted from their Supplemental Files, are shown in Supplemental Table S1. Two points are clear: RPs are abundant, and there remains a substantial scatter between the proteins and between the laboratories. Within one laboratory, however, the data are more consistent, allowing Geiger et al. (2012) to conclude that the ribosomal proteins are expressed at about the same levels in the 11 cell lines they studied. Nevertheless, these data are far from sufficient to confirm that cells have equimolar amounts of the 80 RPs.

## Genes encoding ribosomal proteins and their derivatives

As in most mammals, the human genome carries a single copy of a gene encoding each of the 80 ribosomal proteins (Uechi et al. 2001), with the few exceptions to be described below. A valuable compilation of data on the ribosomal proteins and their genes in many organisms is available at http ://ribosome.med.miyazaki-u.ac.jp (Nakao et al. 2004).

The exceptions include S4, which is encoded by one gene on the X chromosome, RPS4X, and two on the Y chromosome, RPS4Y1&2. Another is the dual copies of RPS17 due

TABLE 1. Summary of data on ribosomal protein genes				
DD	Number of active	Number of	Tissue- specific	Alternative splicing
RP	genes	pseudogenes	expression	>1%
L10	<b>2</b> a	33	YES	YES
L10A	1	14		
L11	1	5		
L12	1	49		YES
L13 L13A	1 1	14 29		YES
L13/A	1	9		ILS
L15	1	23		
L17	1	55		
L18	1	14		
L18A	1	19		
L19	1	22		
L21	1	145		
L22	2	25		
L23 L23A	1 1	14 82		
L23A L24	1	10		YES
L26	2	40		123
L27	1	15		YES
L27A	1	8		
L28	1	6		
L29	1	38		
L3	2	14	YES	
L30	1	19		
L31	1	66		
L32 L34	1 1	39 40		
L34 L35	1	9		
L35A	1	37		
L36	1	24		
L36A	<b>2</b> a	55		
L37	1	25		
L37A	1	9		
L38	1	6		
L39	<b>2</b> a	47	YES	
L4 L40 <sup>b</sup>	1	9		
L40° L41	1 1	11 22		
L41 L5	1	40		YES
L6	1	32		ILS
L7	1	64		
L7A	1	77		
L8	1	6		
L9	1	36		
P0	1	11		YES
P1	1	15		YES
P2	1	5		YES
S_RACK1	1	3		
S10 S11	1 1	33 8		
S12	1	34	YES	
S13	1	11	120	
S14	1	10		
S15	1	13		
S15A	1	40		
S16	1	11		
S17	2	18		
S18	1	14		
				(continued)

TABLE 1.	Continued			
RP	Number of active genes	Number of pseudogenes	Tissue- specific expression	Alternative splicing >1%
S19	1	7		
S2	1	63		
S20	1	35		
S21	1	9		
S23	1	9		
S24	1	30		YES—tissue
				specific
S25	1	10		
S26	1	61		
S27	2	30	YES	
S27A <sup>b</sup>	1	22		
S28	1	11		
S29	1	32		
S3	1	7		
S30 <sup>b</sup>	1	3		
S3A	1	60		
S4	3	24		
S5	1	8		YES
S6	1	24		
S7	1	18		
S8	1	10		
S9	1	4		
SA	1	75		

Bold highlights RPs encoded by >1 functional gene.

all ndicates the second gene is a rescued pseudogene.

to a ~300 kb tandemly duplicated region of chromosome 15. Neither S4 nor S17 has multiple genes in the mouse. In addition, there are several interesting variations on the canonical RP genes. *RPL3L*, *RPL22L*, *RPL26L*, and *RPS27L* are duplicated copies of the original gene, carrying introns in nearly identical positions. All but *RPL26L* have similar duplicates in the mouse. For convenience, we term these the "Like" genes, as indicated in their genetic names. *RPL7L* and *RSL24D1* are related to *RPL7* and *RPL24*, respectively, but are more likely to be involved in ribosome assembly and not present in the mature ribosome (Dunbar et al. 2000; Kappel et al. 2012; Babiano et al. 2013).

The human genome is not lacking for RP sequences, however. It carries more than 2000 pseudogenes derived from processed RP mRNAs (Zheng et al. 2007; Balasubramanian et al. 2009). Perhaps the abundant production of ribosomes in the developing oocyte provides the opportunity for reverse transcribed mRNAs to enter the germ line. Three of the pseudogenes have been rescued, in both man and mouse. These can be defined as pseudogenes because they have lost their normal introns and promoters. Yet they are active. *RPL36aL* is transcribed from a site some 1545 bp upstream, within <100 bp of the divergent initiation site of the *MGAT2* gene. Since it is now clear that most promoters drive divergent transcription (Seila et al. 2009), we suggest that *RPL36aL* has been "fixed" in the "on" position, an example of a recent prediction

(Wu and Sharp 2013). Excision of a 1422 nt intron from the 5′ UTR leaves the translation initiation site intact. *RPL39L* is similar except that there is no apparent gene to provide a transcription origin. Its two introns in the 5′ UTR total nearly 18,000 nt. Most intriguing is *RPL10L*, a processed pseudogene that has been activated without the help of either introns or external transcription start sites. Is it coincidence that each of the three activated pseudogenes is derived from a gene on the X chromosome?

# Mapping RNA-seq output for RP genes

One aim of this study is to determine the level of mRNAs derived from each of the RP genes and to ask whether there is equimolar representation of the different mRNAs to yield the equimolar amount of RPs needed to construct ribosomes. However, examination of the data provided in a number of publications proved problematical due to enormous variability in the read counts for different RP genes from different sources. Many essential genes had few if any reads, whereas others had tens of thousands. An example is shown in Supplemental Table S2, from which a portion is excerpted for Table 2. Columns B and E of Supplemental Table S2 show read counts taken from the mapping (*bam*) file of RNA-seq analysis of HeLa and of H1hESC cell long PolyA+RNA. It is evident that there is a >100-fold range in the read counts for different RP genes, a range that is not consistent

<b>TABLE 2.</b> Read counts for selected genes					
Gene	HeLa GSM765402 CSHL <i>bam</i> file read count	HeLa GSM765402 Masked <i>bam</i> file read count			
RPL6	67,130	192,948			
RPL7	5054	295,472			
RPL7A	88,097	232,501			
RPL19	69,936	95,341			
RPL21	4065	125,046			
RPL22	41,413	86,645			
RPS16	39,859	52,177			
RPS17	993	216,538			
RPS18	127,362	217,466			
RPS27A	97,442	244,093			
RPS28	2923	21,472			
RPS29	43,492	55,998			
ATP5B	324,660	325,827			
PKM	452,235	456,232			
TPT1	249,643	261,038			

Fastq files representing the sequencing data for HeLa cells, as well as *bam* files representing the mapped fastq files, were obtained from the ENCODE website (GSM765402 replica 1). Read counts extracted from the *bam* files using the hg19 coordinates of the UCSC genome browser (http://genome.ucsc.edu/) are shown in column 2. The fastq file was also mapped to the "masked" genome as described in Materials and Methods; read counts derived from this mapping are shown in column 3. See Supplemental Table S2 for a complete set of the data for both HeLa and H1 hESC cells.

<sup>&</sup>lt;sup>b</sup>Indicates an RP gene with an N-terminal ubiquitin fusion.

between the two cell lines of Supplemental Table S2. Although it is possible that this wide range is a biological phenomenon, we suggest that it is due to mapping difficulties caused by the presence in the human genome of the numerous pseudogenes described above. Indeed, for some cases the original *bam* files attributed a larger fraction of the RP reads to pseudogenes than to the original gene.

Several mapping programs have been devised to identify a region of the genome from which a specific sequencing read originated: TopHat (Trapnell et al. 2012), GSNAP (Wu and Nacu 2010), Bowtie2 (Langmead and Salzberg 2012), and STAR (Dobin et al. 2013), among others. However, the sequence of most of the pseudogenes is almost identical to that of the authentic mRNA. Thus, many reads derived from RP mRNAs will map to multiple locations in the genome, especially considering that most programs allow for two to three errors per 100 base calls. Although different programs deal with this problem in different ways, none has a failsafe way of linking a read to the authentic gene.

As an attempted solution to this problem, we mapped reads from selected data sets to a "masked" genome: the complete human genome (hg19), in which all the RP pseudogenes (derived from the list at http://pseudogenes.org/psidr/) as well as one of the duplicate copies of *RPS17*, were masked as N's (see Materials and Methods). Discrepancies between read counts, and identification of the sites to which "missing" reads had mapped, led to the identification of 46 additional pseudogenes, which have been added to the list (Supplemental Table S3). Since any individual read is limited to one "hit" in the genome, any read corresponding to an RP transcript will be credited to the original gene.

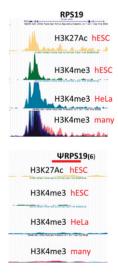
Read counts using our analysis compared to the read counts originally reported by The ENCODE Project Consortium (2011) are shown in Supplemental Table S2, with excerpts in Table 2. Mapping against the masked genome yields between 45% and 80% more reads for the RP genes, but the same number of reads for the control genes. The "lost" reads are not distributed uniformly. When mapped against the whole genome, genes such as *RPL7* have lost practically all their reads; others have almost the same number. Since our interest is in the molar ratio of the mRNAs encoding RPs, we conclude that mapping with the masked genome provides more reliable estimates of the actual mRNA levels. We suggest that it is unwise to rely on the mapping data for ribosomal protein genes as provided in the *bam* files of many of the sequencing consortia.

Is it justified to mask the pseudogene sequences? Are any of the pseudogenes active? Since many of the pseudogenes derived from RP genes lie within the introns of expressed genes, they are being transcribed, but presumably not in a way that would provide functional mRNAs encoding RPs. As a general approach, we examined the RP pseudogenes for the chromatin signs of actual or potential transcription, H3K4me3 and H3K27Ac, using the ENCODE data (Djebali et al. 2012) displayed in the UCSC browser. Although each of the authentic

RP genes has a robust signal for both histone marks, the pseudogenes for the most part have no signal or a very weak one. A typical example, comparing *RPS19* with one of its pseudogenes, is shown in Figure 1. The only cases with substantial amounts of these chromatin marks over a pseudogene are when the pseudogene is within an intron near the transcription start site of another gene. On the other hand, for the cases described above in which a pseudogene has been "rescued," such as *RPL36aL1* and *RPL39L*, the chromatin marks are clearly evident. These chromatin marks are remarkably uniform from one cell type to another. In the case of *RPL10L*, the H3K4me3 and H3K27Ac chromatin marks are negative for cell lines but are robust in mouse testis, where the gene is transcribed.

In the end, any analysis of sequencing data requires some compromises. It is possible that some pseudogenes are marginally active, at least in some tissues. However, using the masked genome, their transcripts are likely to be counted as coming from the mother gene; such an attribution will still provide a measure of the coding capacity for a given RP. Only if the pseudogene has diverged sufficiently to encode a protein with different function will it be missed when using the masked genome.

Once the number of reads has been determined, the conventional measure of the relative number of mRNAs derived from different genes is the RPKM (Reads Per Kilobase of mRNA per Million mapped reads). An additional compromise is necessary for the appropriate value of K. The RefSeq mRNAs for a number of RP genes have long 3′ UTR sequences, increasing the length used for K. However, in some cases, we find few if any reads within the extended 3′ UTR. Therefore, based on such analysis of a number of data sets,



**FIGURE 1.** Chromatin signatures of authentic and pseudo RP genes. A snapshot from the UCSC browser showing the ChIP analyses of H3K27Ac and H3K4me3 from several cell lines at *RPS19* and at the *RPS19* pseudogene on chr6: 110,883,378–110,883,818. "Many" refers to a number of cell lines that have been overlaid.

we have corrected the K values for a few RP mRNAs (Supplemental Table S4). A recent analysis of polyadenylation sites largely confirms these corrections and provides interesting examples of tissue-specific differences in 3' termination sites for some RP transcripts (Lianoglou et al. 2013).

Finally, to facilitate comparison of the data on RP transcripts over many data sets, we have normalized most of the data. The normalized value for RPx is RPKMx\*80/ΣRPKM for any given data set. In this way, if all the 80 RPs were represented by equal numbers of mRNAs, then each would have a value of 1.0. The extent to which the actual value differs from 1 is a measure of the deficiency or excess mRNA for that RP.

## Stoichiometry of mRNAs encoding RPs

As an example of the protocol, the analysis of data sets of three tissues from the Illumina Human Body Map (GSE30611), heart, liver, and testis, is shown in Supplemental Table S5, with a more complete analysis in Supplemental Table S6. A number of points are clear.

The read counts are substantial, consistent with ribosomal protein genes being among the most active in the cell. In this case, they make up from 1.2% to 3.3% of the total reads, depending on tissue. Consistently, brain and heart have less representation of the RP genes, with more active tissues and cell lines usually approaching 5% of the total (Supplemental Tables S2, S6).

From the normalized RPKM columns, it is clear that mRNAs encoding most of the RPs are within a fairly small spread, between  $\sim 0.5$  and  $\sim 1.5$ . Thus, there is about a threefold variation in the relative numbers of the mRNAs encoding the different RPs, but with a few outliers. In any individual data set, however, the range can be much larger, perhaps five- to sixfold. Overall, there is substantial consistency between the Body Map data and other comparable tissue data (Supplemental Table S6, indicated in red; Brawand et al. 2011) (GSM752691). Comparison of these data sets with a number of others, mostly from a variety of tissue culture cells, shows substantial uniformity. Certain proteins such as L41and S27 have two- to threefold more mRNAs than the average (see far right columns of Supplemental Table S6, where the RP genes are sorted according to overall abundance of their mRNAs). Surprisingly, S17, in spite of its gene being present at twice the copy number because of a duplicated chromosome fragment, has nearly the average level of mRNA. Other proteins, such as L36, S26, S5, and S30, have less than half the average number of mRNAs. Interestingly, S19 mRNA is consistently low in both of these data sets but not in some others. Nevertheless, this is a provocative finding in light of the effects of haploinsufficiency of RPS19 in Diamond-Blackfan anemia (Draptchinskaia et al. 1999). Finally, P1 and P2 are represented by above average mRNA as might be expected for genes encoding proteins found in more than one copy per ribosome.

These results are at significant odds with the report that there can be 100-fold differences in the levels of the various RP mRNAs in several tissues of the developing mouse embryo (Kondrashov et al. 2011). Whether this represents differences in experimental protocol or intriguing aspects of tissue differentiation remains to be seen.

Unfortunately, differences in RNA and/or library preparation between different laboratories can lead to inconsistent results. Thus, for a number of genes, one data set consistently records higher read counts than the other, e.g., *RPL15*, *RPL22*, *RPL34*, *RPL9*, and *RPS3a* are higher in the Body Map than in the Brawand et al. (2011) data, whereas *RPL13*, *RPL28*, and *RPL36* are lower in the Body Map data (Supplemental Table S6). We observed a similar situation in comparing data on the same cell line generated by different laboratories. An additional cause of potential variation may arise from the observation that RP mRNA abundance is subject to circadian rhythm (Jouffe et al. 2013), rarely recorded for RNA-seq data sets.

The scatter in the data from different sources is sufficiently large that it is generally not possible to identify tissue-specific differences in the abundance of mRNAs derived from individual RP genes. One clear exception is the low level of mRNA from *RPL3* in both skeletal and heart muscle, which is somewhat offset by the increased transcription of *RPL3L* in those tissues (Supplemental Tables S3, S4). Perhaps this is another example of autoregulation as has been reported for the *RPL22*/*RPL22L* pair (O'Leary et al. 2013).

The three tissues shown in Supplemental Table S5 are all from males. The one functioning RP gene on the Y chromosome, *RPS4Y1*, generally contributes ~20%–25% of the total mRNA encoding S4. *RPS4Y2* appears silent, although other analyses suggest it is active in testis and prostate (Lopes et al. 2010). Comparing the data across the tissues represented in the Body Map (Supplemental Table S6), the expression of *RPS4X* is consistently greater in female than in male tissues. Surprisingly, a data set from Xist negative cells (Vallot et al. 2013) showed no increase in the expression either of *RPS4X*, or of *RPL36A* and *RPL39*, both of which are on the X chromosome.

As mentioned above, there are seven "Like" genes, from second copies of RP genes or from rescued pseudogenes derived from RP genes. Contributions of these "Like" genes are summarized in Supplemental Table S7. Although this table represents only the Body Map data set, similar values and tissue specificities were observed in a variety of human as well as mouse data sets. Although the "rescued" pseudogene RPL36AL contributes ~40% or more to the supply of L36a in most tissues, other "Like" genes make only a low, relatively tissue-nonspecific contribution to the supplies of that protein. Nevertheless, RPL22L has some key function in hematopoietic stem cell development (Zhang et al. 2013), and its expression is substantially increased in RPL22-/- mice (O'Leary et al. 2013). There are several cases of tissue specificity: RPL39L is highly expressed in testis, somewhat in brain.

RPL10L is expressed almost exclusively in testis, as has been observed biochemically (Sugihara et al. 2010). RPL3L is highly expressed in heart and skeletal muscle, but barely at all elsewhere. This partially makes up for a substantial reduction in transcripts of RPL3 in those tissues. Because of the overall similarity of the "Like" proteins with their parents, we assume that they can take their place in the ribosome, as has been shown directly for L10L, L22L, and L39L (Sugihara et al. 2010; Stadanlick et al. 2011). Thus, one of the most intriguing results from the tissue comparisons in Supplemental Tables S6 and S7 is that there are clearly distinct tissue differences in ribosomes, e.g., L3L has likely replaced L3 in ~25% of the ribosomes of muscle tissue. Since about a quarter of the amino acids differ between the two proteins, the effects on the structure of the ribosome could be significant. Testis, which seems to be the most active in expressing the "Like" proteins, could have a variety of different ribosomes. Aside from the case of L38, whose absence appears to affect the translation of a specific class of mRNAs (Kondrashov et al. 2011), we know basically nothing about the influence of RPs on the translation of specific cellular mRNAs.

To ask whether the differences in mRNA level encoding the different RPs are reflected, or compensated, in translation, we have analyzed several sets of data from ribosome profiling experiments (Hsieh et al. 2012; Loayza-Puch et al. 2013; Stumpf et al. 2013). In general, the relative amount of mRNA encoding each RP that is protected by ribosomes is similar to that in the total transcriptome. This is interesting because RP mRNAs are the original members of the "tracks of pyrimidine" (TOP) mRNA class whose translation is regulated under the influence of growth conditions (Meyuhas and Dreazen 2009), yet there is no evidence for the specific suppression of translation of those mRNAs that appear to be in excess. Regulation of translation can occur through upstream ORFs (Hinnebusch and Lorsch 2012). Only two of the RP gene transcripts, those encoding L3 and L29, have an AUG upstream of the authentic translation initiation site; neither of these has an unusually high level of mRNA. Although it is clear that many factors influence the rate of translation, such as specific initiation factors (Mahoney et al. 2009) or the secondary structure near the initiation codon (Gu et al. 2010), as yet there is insufficient data to establish whether there is control of the translation of individual RPs at this level.

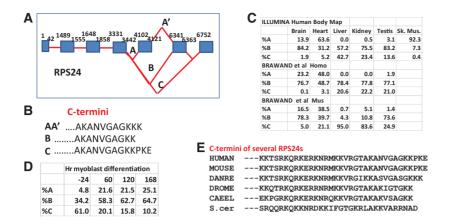
One mRNA about which we can speculate is that encoding L41, which consistently has substantially more mRNA than any of the other RP genes and also has by far the highest value in ribosome profiling experiments. L41 is a unique protein, with only 25 amino acids, of which 17 are arginine or lysine, highly conserved throughout the eukaryotes, and occupying an intimate location at the interface between the 60S and 40S subunits (Jenner et al. 2012). With such a short ORF, the mRNA encoding L41 is translated by only one ribosome at a time (Yu and Warner 2001). Furthermore, stretches of basic amino acids are translated inefficiently, perhaps because of their difficulty in traversing the ribosome "tunnel" (Charneski and Hurst 2013). For these two reasons, it is likely that the efficiency of translation of L41 mRNA is lower and the need for L41 mRNA is greater than for the other RPs. Presumably specific features of many RPs or their mRNAs contribute to influencing their rate of translation.

In summary, our analysis of these data sets suggest that RP mRNAs are highly abundant, each representing >0.03% of total mRNA number. Although there are not large differences in the numbers of mRNAs for the different RPs, the reproducible differences that are apparent imply either that there are substantial variations in the efficiency of translation of different mRNAs and/or that there are differences in the amounts of proteins actually produced. Although there is substantial evidence of nonribosomal functions for a limited number of RPs (for review, see Warner and McIntosh 2009), it seems likely that such functions would require only a small fraction of the abundant output of those RPs. Thus, such functions could be markedly affected by small fluctuations in the amounts or the translation of RP mRNAs.

# Splicing of ribosomal protein gene transcripts

It has been suggested that >95% of human genes undergo alternative splicing (Pan et al. 2008; Wang et al. 2008). On the other hand, ribosomal proteins are conserved across highly diverged species, a necessity for their positioning in the compact, complex structure of the ribosome. We approach alternative splicing of RP gene transcripts with two questions: To what degree does alternative splicing affect the nature and the structure of the ribosome? Are there situations in which alternative splicing of transcripts of an RP gene yields a protein with an RNA binding motif fused to peptide element that provides a nonribosomal function?

Most mapping programs provide a "junctions" file in which are specified the locations and number of splicing reads that span two exons. Thorough examination of the mapping data from both cell lines and tissues reveals that among all the RP transcripts, there is only a single case of tissue-specific alternative splicing. As shown in Figure 2A, the transcripts of RPS24 are spliced in three alternative ways, including or excluding microexons of 19 or 22 nt, and yielding predicted proteins that differ in their C-terminal amino acids (Fig. 2B). Muscle and heart tissue largely splice AA', whereas liver and kidney are evenly divided between B and C. The tissue specificity is reproducible not only between data sets but also between species (Fig. 2C). Remarkably, it is possible to observe the shift in splicing pattern as mouse ESC cells differentiate into myoblasts (Fig. 2D; Trapnell et al. 2010). There is also a significant difference between HeLa and H1 hESC cells (see Supplemental Table S8). The S24 protein products due to alternative splicing differ rather little, and the C terminus of S24 is not highly conserved (Fig. 2E). Unfortunately, the recent cryo-EM structure of human ribosomes (Anger et al. 2013) does not include the C terminus of S24, and the



**FIGURE 2.** Alternative splicing of *RPS24* transcripts: (*A*) A cartoon representing the alternative splices observed for transcripts of *RPS24* (not to scale). (*B*) The predicted C termini of S24 resulting from the three alternative splicing variations. (*C*) The percentage of splicing in each of the three variations as a function of tissue and organism. (*D*) The percentage of splicing in each of the three variations as myoblasts differentiate (data from Trapnell et al. 2010). (*E*) The C termini of S24 in a number of organisms.

structure of the yeast ribosome (Jenner et al. 2012) is uninformative because of the differences in sequence (Fig. 2E). Is the alternative splicing of *RPS24* transcripts functional or is it simply a by-product of the splicing factors characteristic of skeletal muscle (Llorian and Smith 2011)?

Of the 376 introns in the RP genes, we have identified only 14 that exhibit alternative splicing at a >1% level (Supplemental Table S8). If the cutoff is lowered to  $\sim 0.2\%$ , a number of additional introns demonstrate alternative (erroneous?) splicing. Although, as described above, mRNA quantitation often exhibits substantial scatter between data sets generated by different laboratories, there is far better agreement on the presence and the level of alternative splicing events. With the exception of RPS24, there does not appear to be significant tissue specificity to the alternative splicing, but in most cases the data is insufficiently deep to lead to confident conclusions. There may, however, be some underlying regulation, since a longitudinal study of one individual over a long time span (Chen et al. 2012) shows substantial variation in some splicing variants (Fig. 3). Initiation of transcription at different sites is often followed by different splices that lead to the same exon2, which contains the initiating ATG. Thus, for RPL17 there are reproducibly six 5' splice sites that all splice to the same 3' site, upstream of the initiator ATG. We have not considered these as alternative splices.

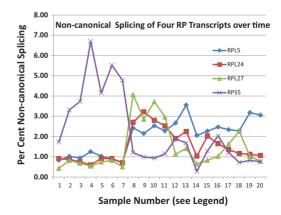
The alternative splices usually involve exon skipping, although some involve aberrant 5' or 3' sites. Supplemental Table S8 shows there are six cases—RPL10, RPL12, RPL13a, RPLP0, RPLP1 and RPS12—in which the predicted mRNA would encode a protein made up of a portion of a RP fused to a substantial number of downstream amino acids. Although these alternatively spliced transcripts represent only 1%–2% of the level of the RP mRNAs, the fused proteins

should have significant abundance since RP mRNAs themselves are so abundant. Thus, transcripts of *RPS12* are spliced, at about a 1%–3% level with no apparent tissue specificity, to form an mRNA encoding a protein with 41AA of the RP fused to 33 additional AA. This is conserved in mouse tissues. Is this RNA binding region used to carry the C-terminal sequences to a target?

However, we have been unable to identify any of the novel peptides predicted in Supplemental Table S8, either in the *gpmdb* proteome database (http://gpmdb.thegpm.org), or among the more than 150,000 human peptides analyzed in Geiger et al. (2012). If synthesized, they must be rapidly degraded. What is unknowable at present is whether some, or all, of these aberrant splice events are truly "alternative splicing" with a biolog-

ical function or "erroneous splicing" due to noise in the splicing process.

Since many of the aberrant splicing events lead to termination codons within the open reading frame, the degree of aberrant splicing may be somewhat masked by nonsensemediated decay (NMD). Indeed, a regulated alternative splice of intron 3 of the transcripts of *RPL3* leads to rapid degradation by NMD (Cuccurese et al. 2005). Nevertheless, while data sets from mouse cells in which NMD has been abolished by deletion of either *SMG1* (McIlwain et al. 2010) or *UPF2* (Weischenfeldt et al. 2012) clearly show the accumulation of the alternative splice junction in the *RPL3* transcript, they fail to show any substantial change in the amounts of noncanonical splice junctions of RP genes described above.



**FIGURE 3.** Alternative/aberrant splicing of transcripts of several RP genes: Junction files were obtained from mapping of the fastq files obtained in the analyses of the leukocytes of a single individual over many months (Chen et al. 2012). The proportion of the noncanonical splice events are indicated as a percentage. The time points are erratic (see Chen et al. 2012).

#### **Conclusions**

The analyses described above lead to several conclusions regarding the products of the genes encoding human ribosomal proteins.

There is a roughly fivefold difference between the most and least abundant mRNAs. This difference is reasonably consistent over many data sets but can be exceeded in any individual data set. Since each ribosome contains a single copy of each RP, this variation implies that there is unequal translation of the different mRNAs and/or that there is significant degradation of unassembled RPs. Note that either overexpression or underexpression of individual RPs can lead to accumulation of p53 and apoptosis, and in some cases to tumorigenesis (for review, see Raiser et al. 2014). It is interesting that one of several breast tumor lines, BT474, has a 10-fold amplification of a segment of chromosome 17 that includes RPL17 and RPL23, accompanied by a 10-fold excess of the mRNA for each (Sun et al. 2011). It would be interesting to know if such an excess has any effect on the cell.

There seems to be little tissue specificity for the major RP genes, except that muscle has reduced transcripts from RPL3, perhaps in compensation for the presence of transcripts from RPL3L. On the other hand, there is substantial tissue specificity for some of the "Like" RP genes (Supplemental Table S7). Thus, there clearly are different populations of ribosomes in different tissues. Whether this leads to differences in the translation of specific mRNAs is not known.

The presence of so many pseudogenes derived from RP genes is intriguing. Although we have shown that very few of them contribute to the formation of ribosomes, there are arguments that they may to serve to modulate the activity of their parental genes (Muro et al. 2011; Li et al. 2013).

With S24 the single product of tissue-specific alternative splicing, it seems clear that transcripts of RP genes are far less subject to alternative splicing than those of the average gene. It remains to be seen whether the several instances of different splices at the 1%-3% level and the many more at the <0.5% level represent splicing errors or encode functional proteins. Indeed, because RP mRNAs are among the most abundant of the cell, alternate splicing of even a very small proportion, yielding the fusion of an RNA binding domain to some functional domain, could lead to enough product to carry out important functions.

## **MATERIALS AND METHODS**

Fastq files were downloaded from the Gene Expression Omnibus (GEO). Because several of the RP mRNAs are quite short, we only analyzed data from sources where the insert size was <300 bp.

Mapping of reads was carried out using STAR (Dobin et al. 2013), with the parameters: outFilterMismatchNmax :1 mismatch per 25 bases read, and *outFilterMultimapNmax*:1 hit per read. The output from STAR not only provides read count but also junction files that identify the endpoints of splicing events.

The presence of many pseudogenes derived from RP mRNAs complicates the task of mapping RNA-seq reads to authentic RP genes. To avoid this problem, we constructed two artificial genomes: an RP genome containing only the RP genes and some controls and a masked genome for which the maskFastaFromBed utility from BEDtools was used to mask, with Ns, all the pseudogenes listed in the database http://pseudogenes.org/psidr/. On comparing the read counts obtained from mapping against the masked and the RP genomes, it was clear that some reads were lost using the masked genome. To resolve this issue, we used the FilterSamReads utility from PICARD to identify locations in the masked genome that mapped to RP genes in the RP genome. In this way, we identified an additional 46 processed pseudogenes (Supplemental Table S3), which were then masked to generate the final masked genome against which the fastq files were mapped. We also selected a set of control genes on the basis of abundant, relatively non-tissue-specific transcription. Pseudogenes derived from the set of control genes were also masked. Masked FASTA files for human (hg19) and mouse (mm9) genomes are available upon request.

## **SUPPLEMENTAL MATERIAL**

Supplemental material is available for this article.

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