## **NEWS AND VIEWS**

# Translation's coming of age

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Proteins are the key players in our cells, and their biological concentrations are regulated through an intricate interaction of transcription, translation, as well as mRNA and protein degradation. In a work recently published in Nature, Schwanhausser et al (2011) report one of the first and most comprehensive characterizations of the complete sequence of events producing proteins in mammalian cells. The authors measured concentrations and degradation rates for >5000 mRNAs and proteins, respectively, and tied these data into a mathematical model that, in unprecedented completeness, describes the cellular dynamics that govern protein production. Their analysis confirms, extends, and generalizes what has been suspected before: 'transcription is only half the story' (Plotkin, 2010), and translational control is at least as important in determining the final concentrations of proteins (Figure 1) (reviewed in de Sousa Abreu et al, 2009; Vogel et al. 2010).

When wondering about the impact of a perturbation on gene expression, analysis of mRNA expression levels is often the method of choice. Microarrays present a simple and standardized method to assess mRNA concentrations and are complemented by recent next-generation sequencing technology. For many years and out of necessity, mRNA concentrations were taken as a proxy of protein concentrations, assuming reasonable concordance between mRNA and protein expression regulation. Meanwhile, mass spectrometry-based proteomics methods have matured enough to present a workable solution for direct measurements of protein concentrations. The technology can still not capture the entire mammalian proteome, i.e. > 20 000 genes, and reliable, quantitative measurements of several thousands of protein concentrations require weeks of labor, but instrumentation and software are now available to routinely incorporate proteomics analysis into any gene-expression study.

This technology has opened the scope of traditional proteomics experiments, which for many years comprised the comparison of a perturbed condition with a control. While such comparisons deliver invaluable information on the qualitative nature of the protein response, they have also restricted the types of experiments that were designed. Now, much faster and more sensitive mass spectrometers are available and enable systematic measurements of the cellular *dynamics*, i.e. the speed at which the proteome reacts. As a consequence, kinetic models of cell-scale responses can be built, allowing for the design of time-dependent experiments, and the estimation of genome-wide rates of transcription, translation, and molecule degradation.

Schwanhausser et al's (2011) work is a landmark among such efforts to break into these new frontiers. The authors use next-generation sequencing, large-scale proteomics based on mass spectrometry, and mathematical modeling to define the dynamics of protein production for 5000 genes in mouse fibroblasts. The work represents the largest of such studies available today, covering close to a quarter of the mouse genome. The authors focused on unperturbed, exponentially growing cells. mRNA concentrations and concentration changes were measured by next-generation sequencing; mRNA degradation rates were estimated through labeling of newly synthesized mRNA with a nucleoside analog (Friedel et al, 2009). Conceptually similar, the authors use isotopically labeled proteins (Doherty et al, 2009) to estimate protein degradation over 13.5 h. While comparison of heavy and light peptides delivers information on changes in protein concentrations, the authors also estimate absolute protein concentrations from the collected mass spectra.

In a simple mathematical model, changes in mRNA concentrations over time can be described as a function of rates of transcription and mRNA degradation. Similarly, protein concentrations are determined by rates of translation and protein degradation. Given that concentrations and degradation rates had been experimentally measured, Schwanhausser *et al* used this model to estimate the remaining, unknown rates, i.e. those of transcription and translation. The authors also incorporated rates of cell division into the model and estimated the relative contribution of these processes to cellular energy usage.

Do not underestimate translation, as its role may even be bigger than that of transcription—says the model by Schwanhausser *et al* (Figure 1). The correlation between mRNA and protein concentrations in mouse fibroblasts is 0.37–0.41, which is largely consistent with previous studies (Vogel *et al*,

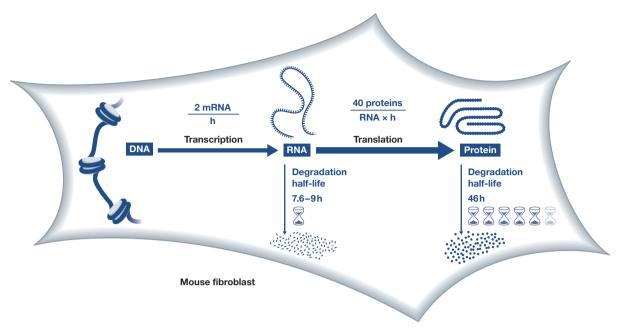


Figure 1 Francis Crick's central dogma of biology revolves around the transcription of mRNA from DNA, the translation of proteins from mRNA, and the degradation of the respective molecules. A new study by Schwanhausser *et al* (2011) measures concentrations of mRNAs and proteins as well as the corresponding degradation rates for >5000 genes in mouse cells, and with the help of a mathematical model they are able to deliver a complete description of the dynamics governing mammalian protein production. The thickness of the arrows indicates the relative importance of the processes in defining protein concentrations. The values indicate median rates or half-lives for those genes observed by Schwanhausser *et al.* 

2010). This correlation implies that  $\sim$ 40% of the variation in protein concentrations is defined by mRNA concentrations, i.e. the results of transcription and mRNA degradation. Using their model, Schwanhausser *et al* show that another 41–54% of the variation in concentration across proteins can be attributed to differences in translation rates—while the rates of degradation have surprisingly small roles. The model holds up even when analyzing an entirely different cell line. In sum, the 'second half' of the central dogma of biology has a role much bigger than that has been recognized to date.

How surprising are these results? The mammalian genome encodes not only  $\sim 2000$  transcription factors but also >600RNA-binding proteins (de Lima Morais et al, 2011), presenting an enormous pool of potential post-transcriptional regulators. While discrepancies between mRNA and protein expression are known from many anecdotal examples, large-scale measurements of mRNA and protein concentrations usually also report low correlations between the two measures (de Sousa Abreu et al, 2009). Recent computational analyses have indicated that the correlation doubles when incorporating post-transcriptional regulation (Vogel et al, 2010). Further, several studies, including that by Schwanhausser *et al* (2011), report that protein concentrations cover a larger dynamic range (at least six orders of magnitude) than mRNA concentrations (about four orders of magnitude)-again suggesting substantial regulation following transcription. Finally, recent evolutionary analyses examining the concentrations of orthologs across different organisms reported that protein concentrations appear to be more conserved than mRNA concentrations (Schrimpf et al, 2009; Laurent et al, 2010). Together, a picture has formed that emphasizes the significance of post-transcriptional gene expression regulation-and

the study by Schwanhausser *et al* very timely demonstrates this for a mammalian system.

Such work raises entirely new questions. First of all, our understanding of the mechanisms underlying posttranscriptional regulation is still poor. It also remains to be seen how the contribution of translation regulation varies across cell types, and how it affects individual genes versus the entire proteome. We do not know how the differential contributions of transcription, translation, and degradation react to perturbations of the system—and whether the comparatively simple mathematical model will still hold true. Further, the measurements in Schwanhausser et al's study are averages across an unsynchronized population of cells-single-molecule methods will have to complement the data. Nevertheless, Schwanhausser et al's work highlights a shift in paradigm, a shift toward the routine incorporation of protein measurements, and a shift toward a holistic characterization of all cellular processes leading to functional proteins.

### **Conflict of interest**

The author declares that he has no conflict of interest.

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