

# Quantitating translational control:

mRNA abundance-dependent and independent contributions  
and  
the mRNA sequences that specify them

**Jingyi Jessica Li**

Assistant Professor of Statistics

University of California, Los Angeles

# Nucleic Acids Research

## Quantitating translational control: mRNA abundance-dependent and independent contributions and the mRNA sequences that specify them

Jingyi Jessica Li , Guo-Liang Chew, Mark D. Biggin 

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Guo-Liang Chew

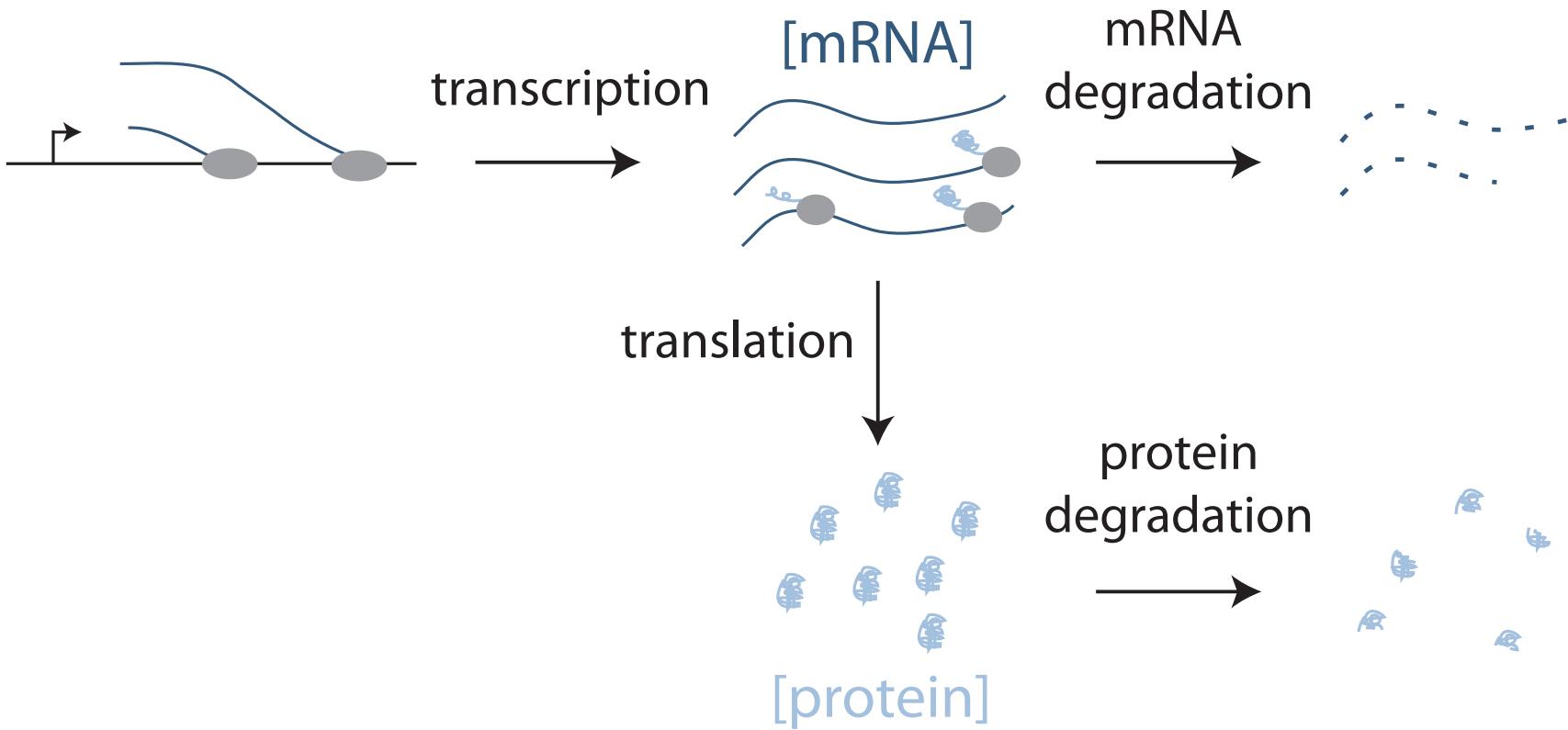
Fred Hutchinson Cancer Research Center



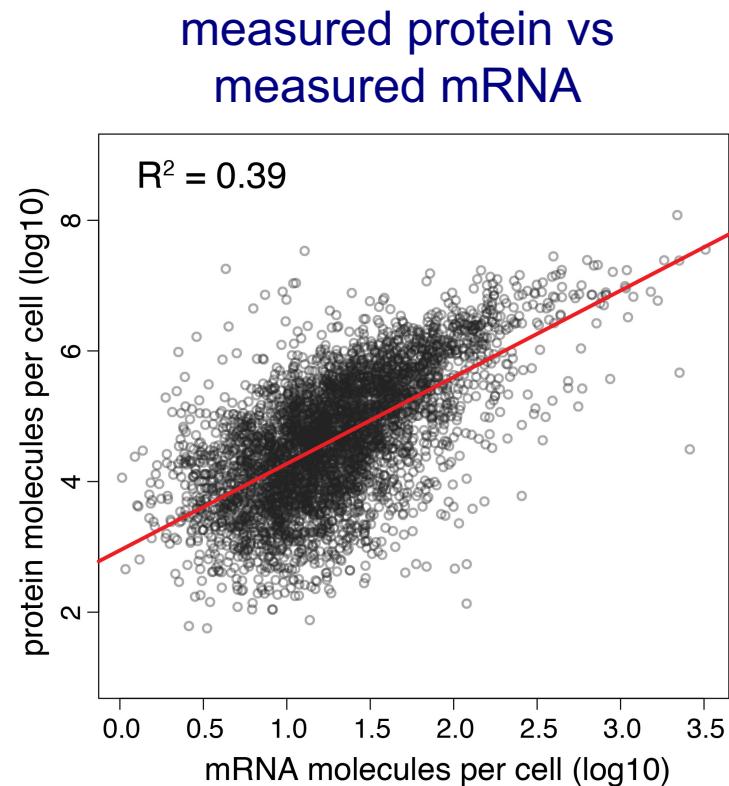
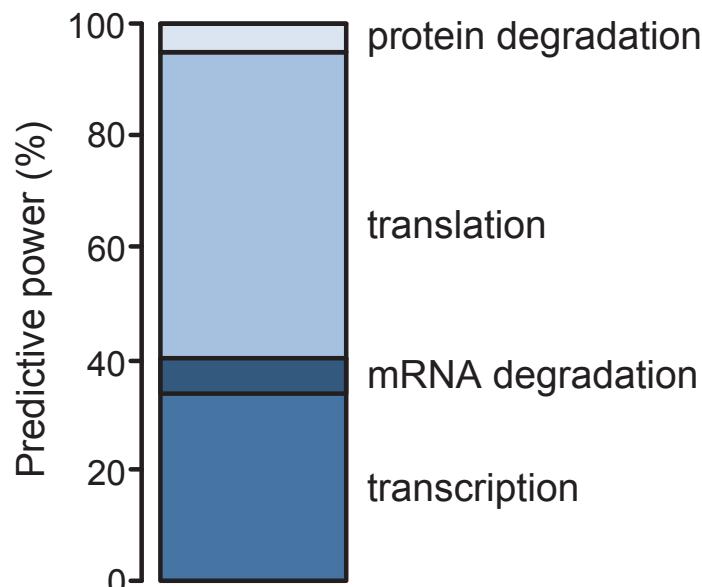
Mark Biggin

Lawrence Berkeley National Laboratory

# Which steps are most important in determining protein levels in animals?

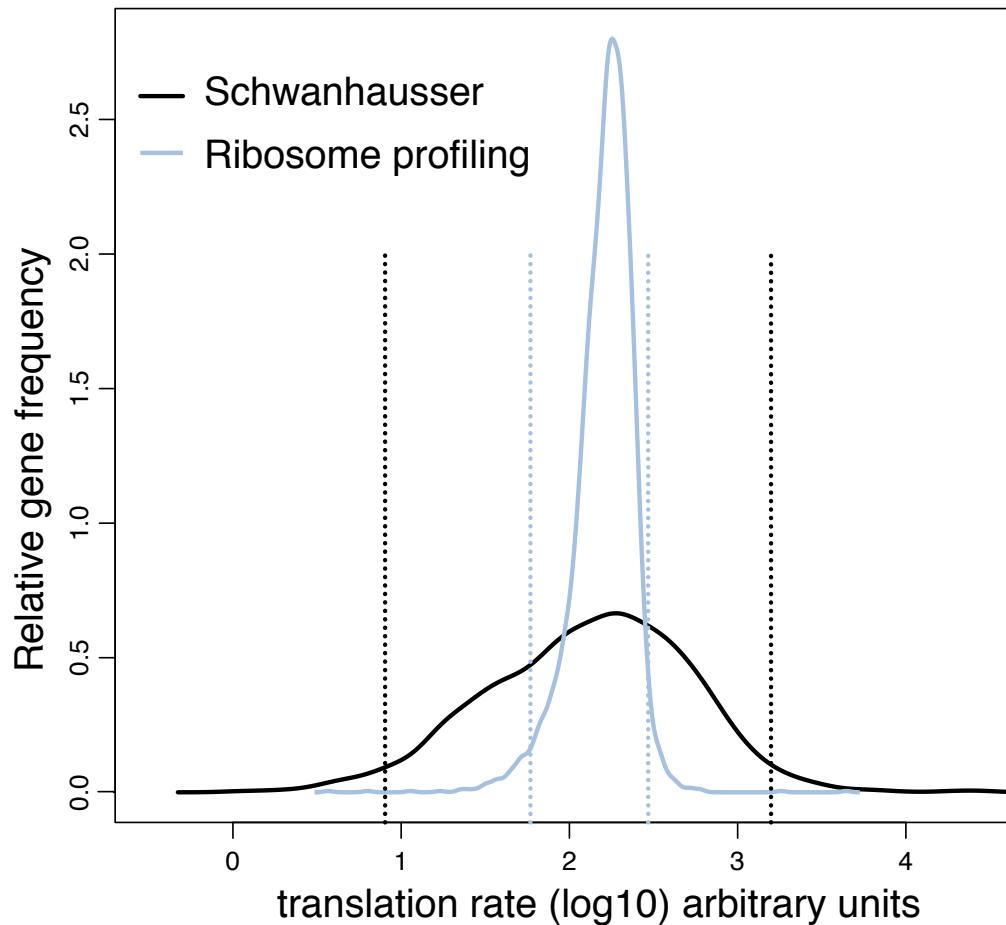


# Schwanhausser et al. suggest that translation rates are the most important



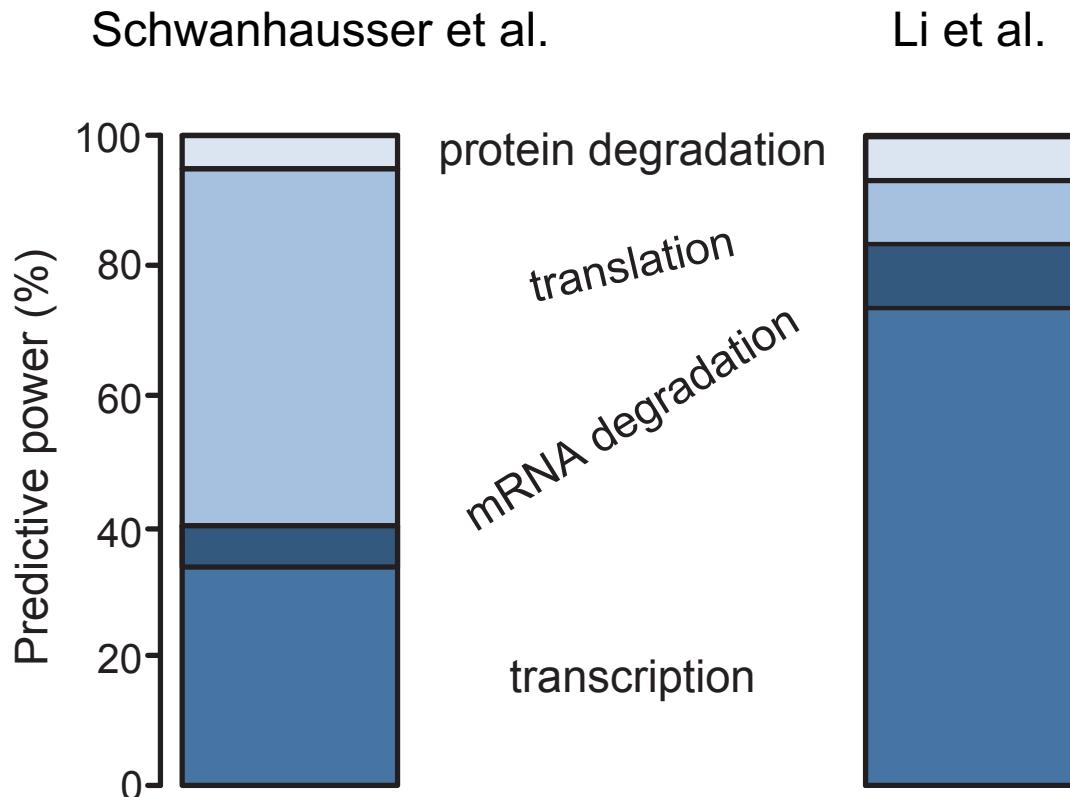
Schwanhausser et al. (2011) Nature 473, p 337

# The variance in measured translation rates is 11 fold less than Schwanhausser inferred



Li et al. (2014) PeerJ: e270.

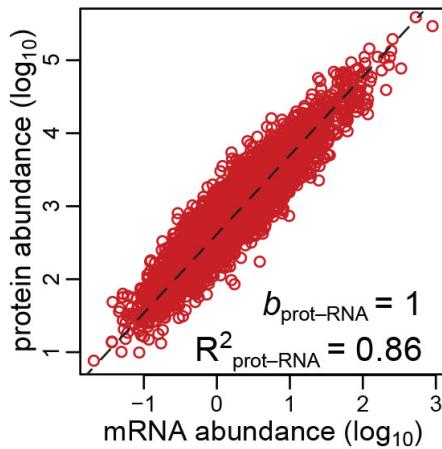
# Transcription is the dominant step determining protein levels



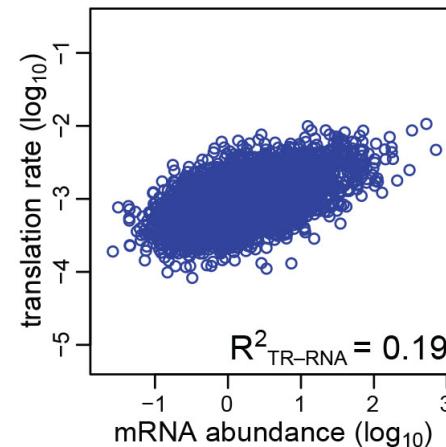
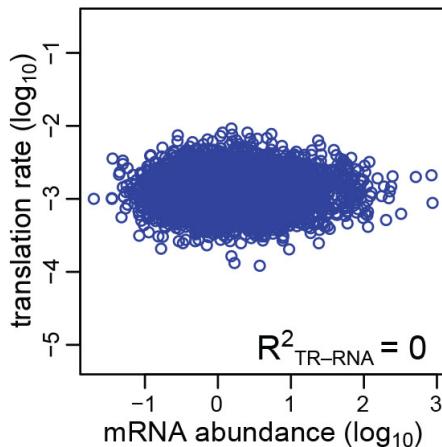
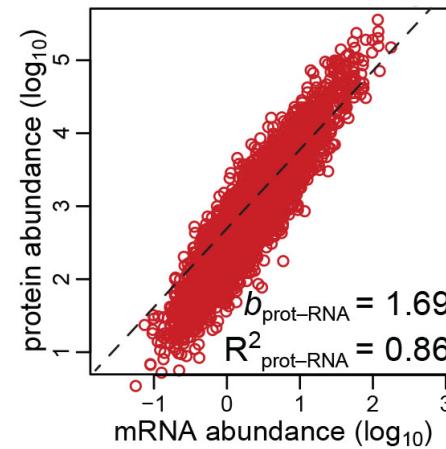
Li et al. (2014) PeerJ: e270; Li and Biggin (2015) Science 347, 1066-1067.

# Translation rates impact protein levels in two ways

Translation does not correlate with mRNA

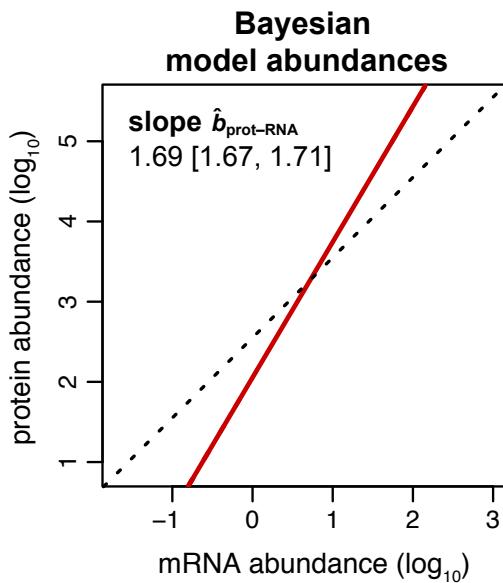


Translation partially correlates with mRNA

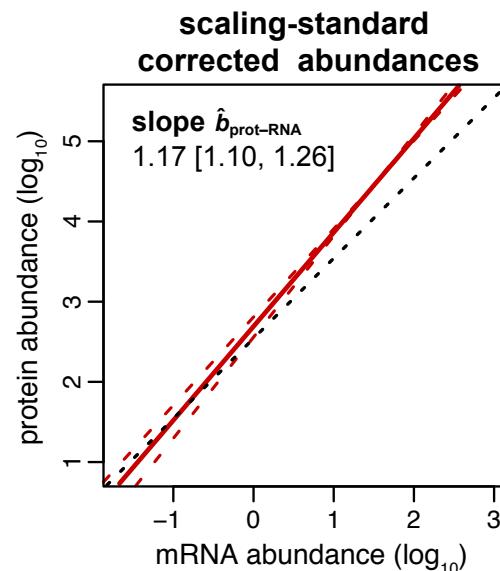


# Two separate approaches both imply a shallower slope for protein vs mRNA

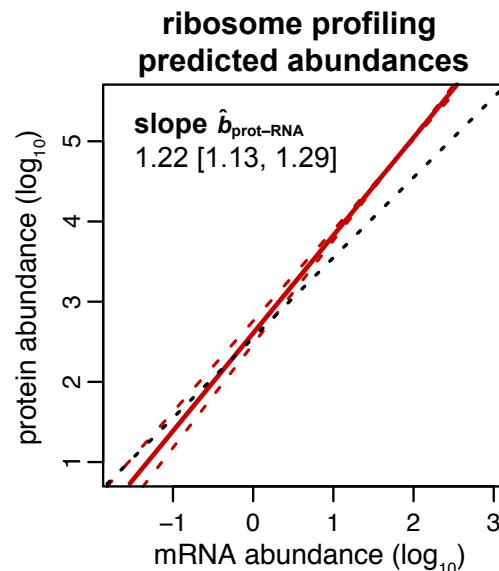
Csardi et al.



Li et al.  
Approach 1

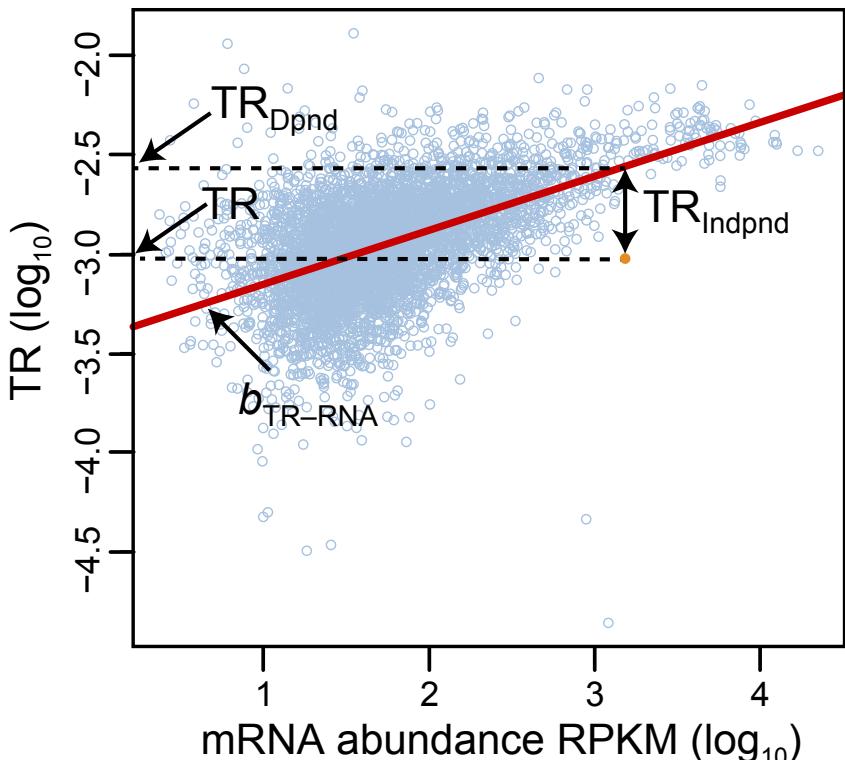


Li et al.  
Approach 2



Li et al. (2017) NAR gkx898.

# Decomposing TR into two components: $TR_{Dpnd}$ and $TR_{Indpnd}$



1. Decompose TR

$$\log_{10}(TR_i) = \log_{10}(TR_{Dpndi}) + \log_{10}(TR_{Indpndi})$$

2. Determine slope  $b_{TR-mRNA}$

$$b_{TR-RNA} = \text{sd}(\log_{10}(TR_{Dpnd})) / \text{sd}(\log_{10}(RNA))$$

3. Determine  $b_{prot-mRNA}$  from  $b_{TR-mRNA}$

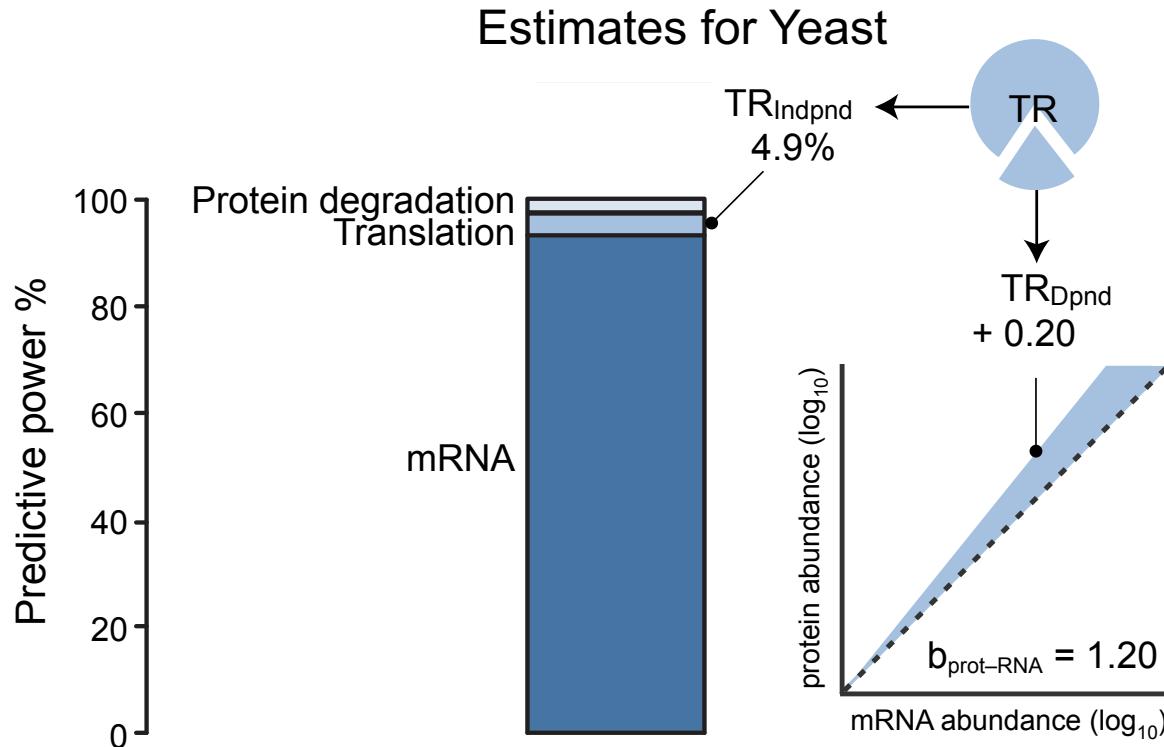
$$b_{prot-RNA} = 1 + b_{TR-RNA}$$

4. Define protein via  $b_{prot-mRNA}$  and  $TR_{Indpnd}$

$$\begin{aligned} \log_{10}(\text{prot}_i) = & \log_{10}(a) + b_{prot-RNA} \log_{10}(\text{RNA}_i) \\ & + \log_{10}(TR_{Indpndi}) + \log_{10}(PnD_i) \end{aligned}$$

Li et al. (2017) NAR gkx898.

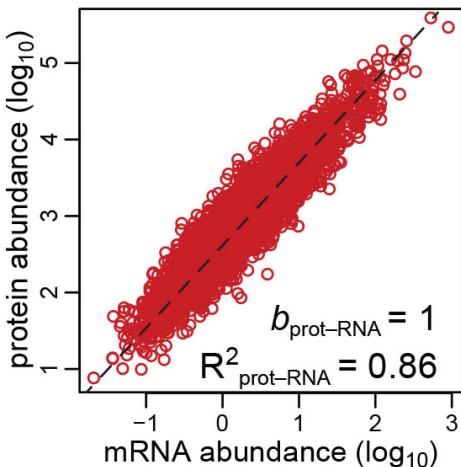
# How can we estimate the contribution of translation rates to protein levels?



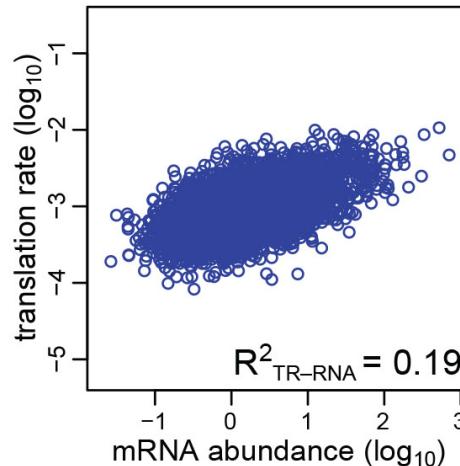
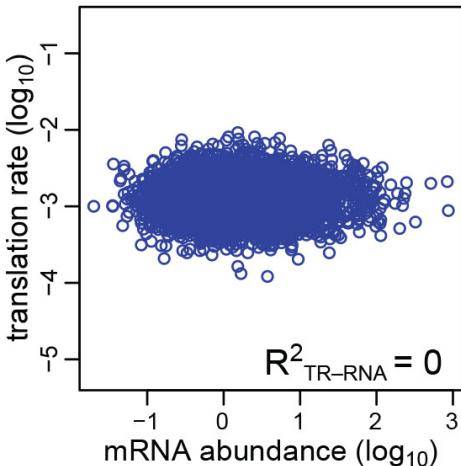
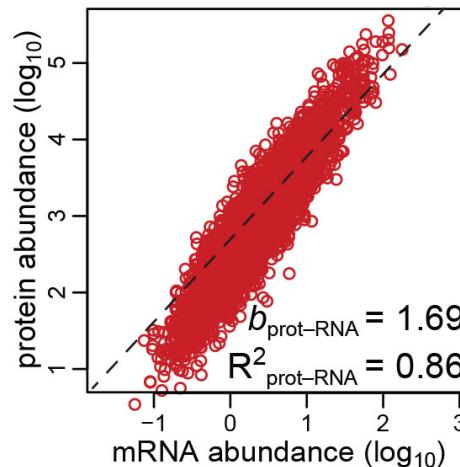
Li et al. (2017) NAR gkx898.

# The Contributions of General Translational Control Sequences

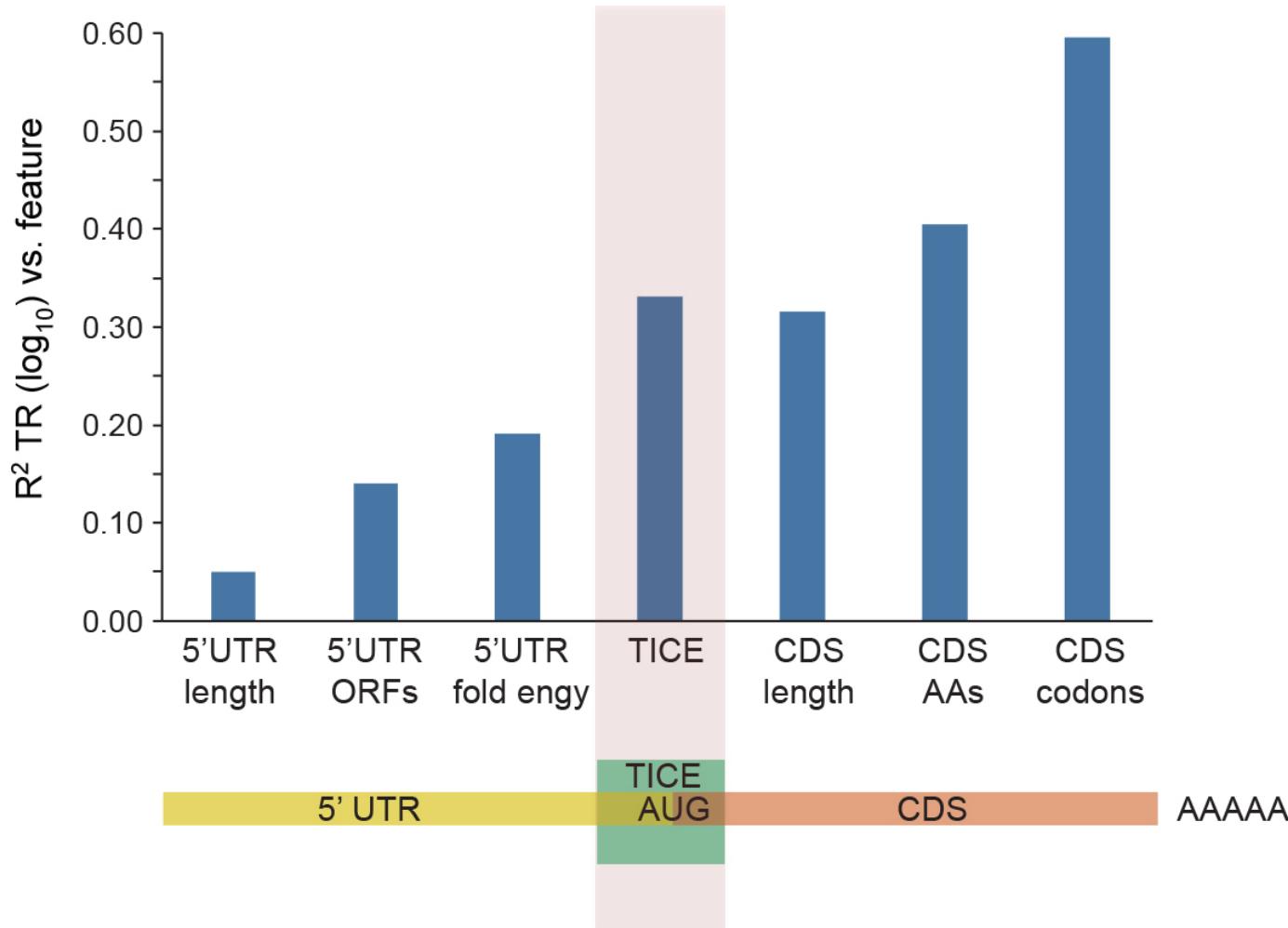
**Translation does not correlate with mRNA**



**Translation partially correlates with mRNA**

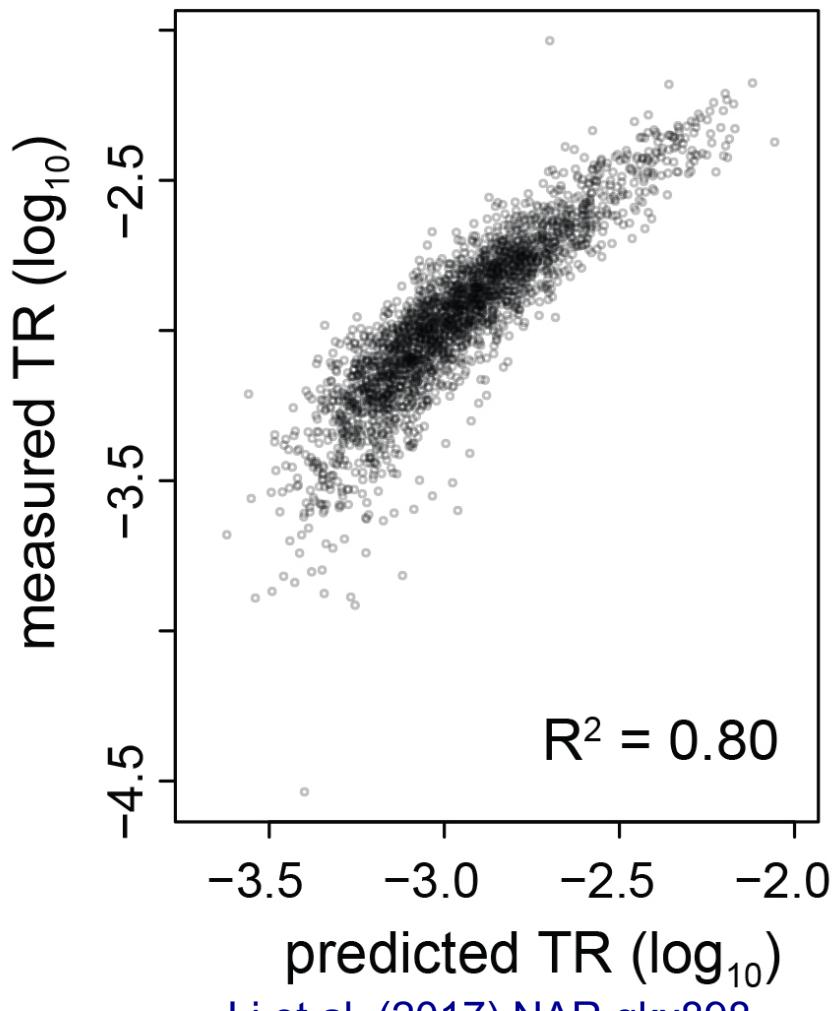


# Seven mRNA sequence features specify 80% of the variance in translation rates



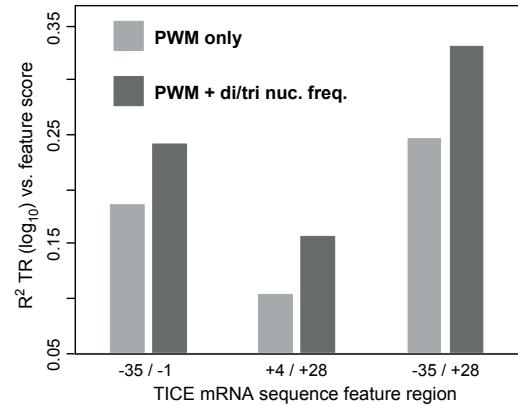
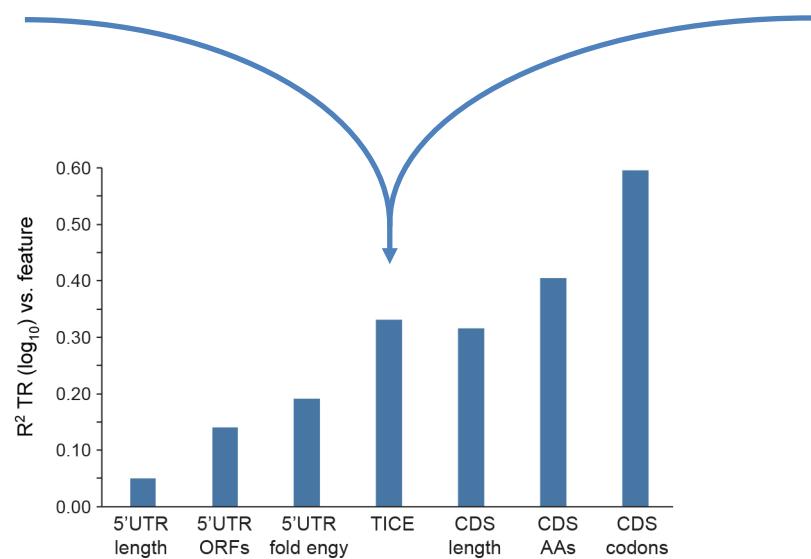
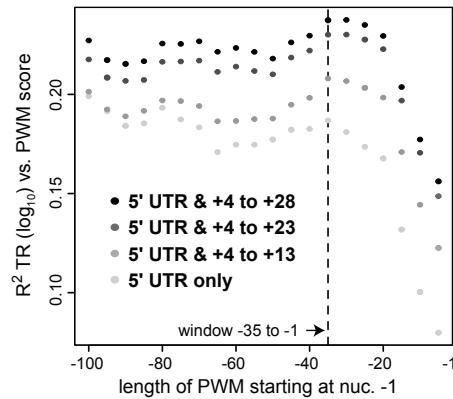
Li et al. (2017) NAR gkx898.

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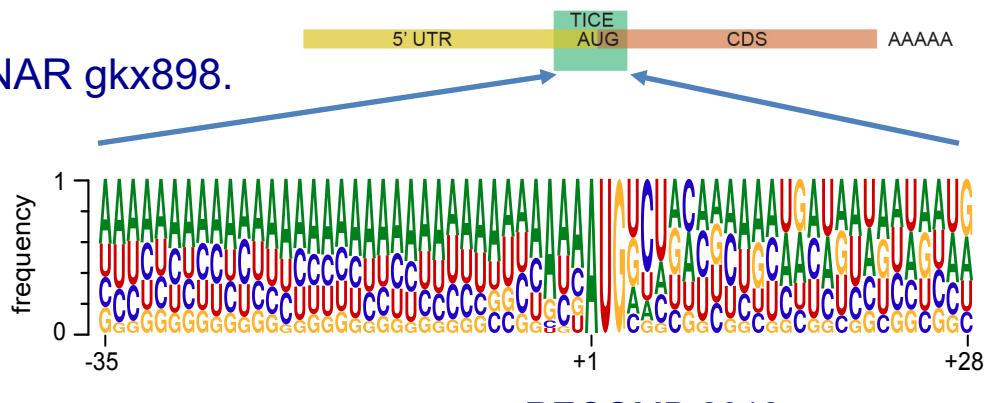


Li et al. (2017) NAR gkx898.

# A Translation Initiation Control Element (TICE) spans -35 to +28



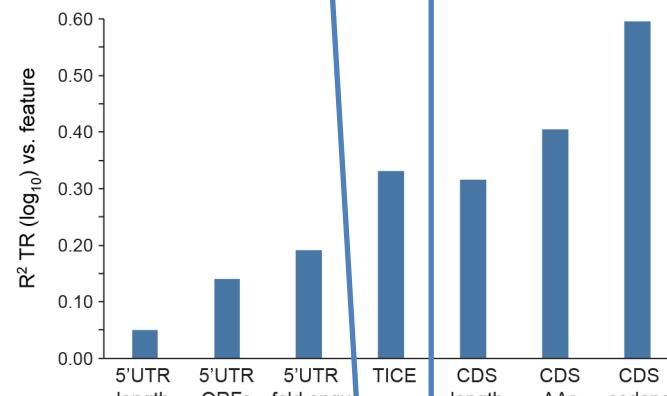
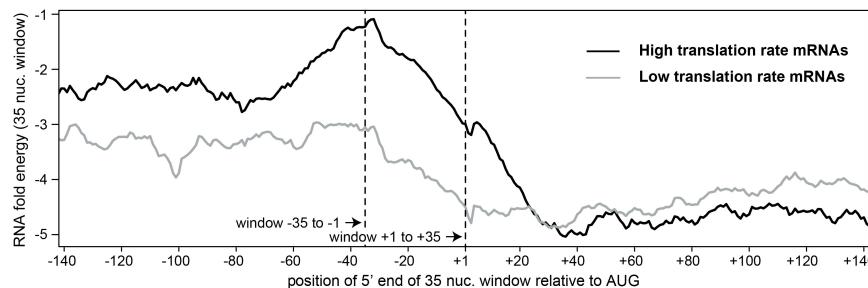
Li et al. (2017) NAR gkx898.



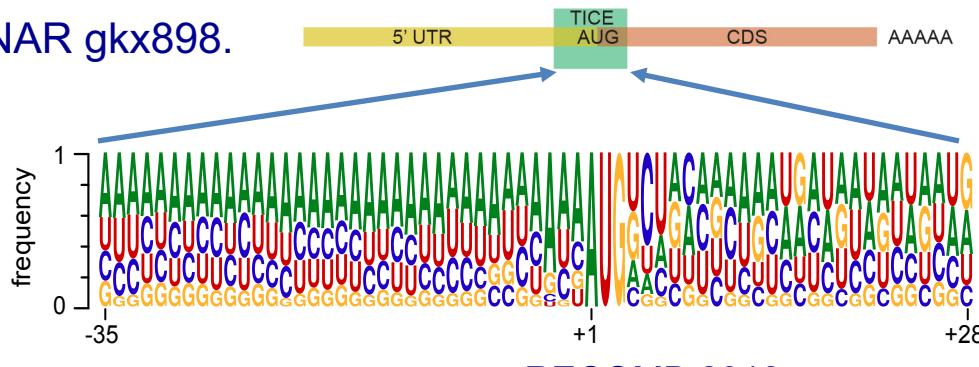
Translation Initiation  
Control Element (TICE)

# A Translation Initiation Control Element (TICE) spans -35 to +28

mRNA 2<sup>ry</sup>  
structure

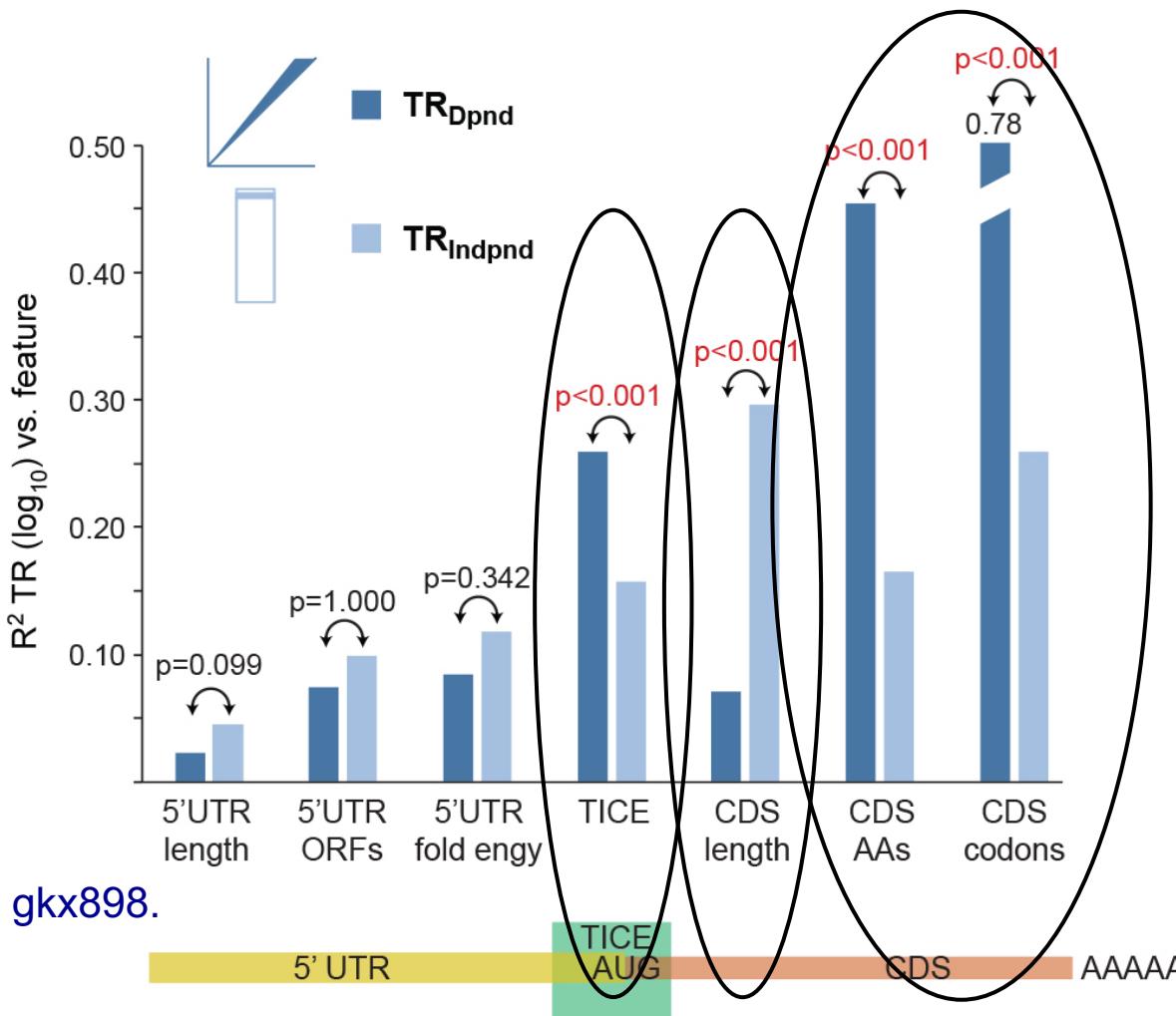


Li et al. (2017) NAR gkx898.



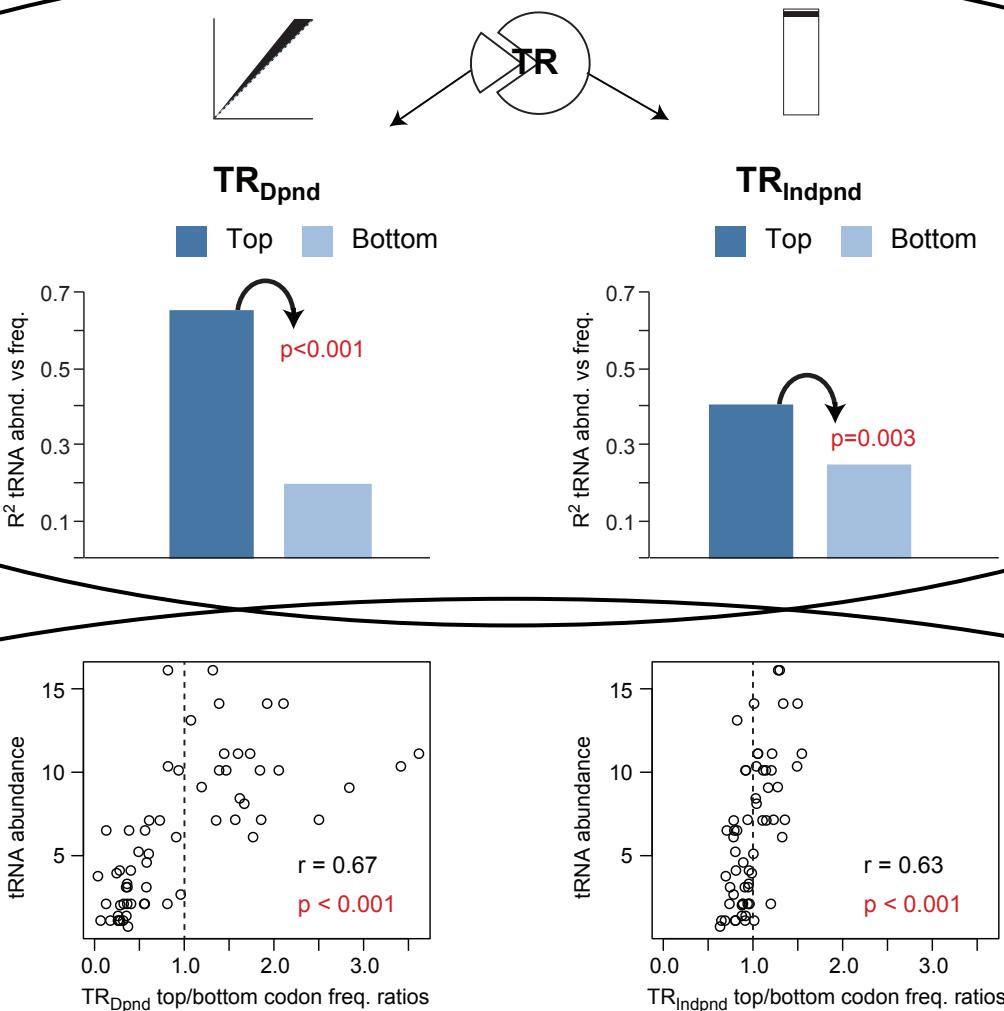
Translation Initiation  
Control Element (TICE)

# mRNA sequence features differentially specify TR<sub>Dpnd</sub> and TR<sub>Indpnd</sub>



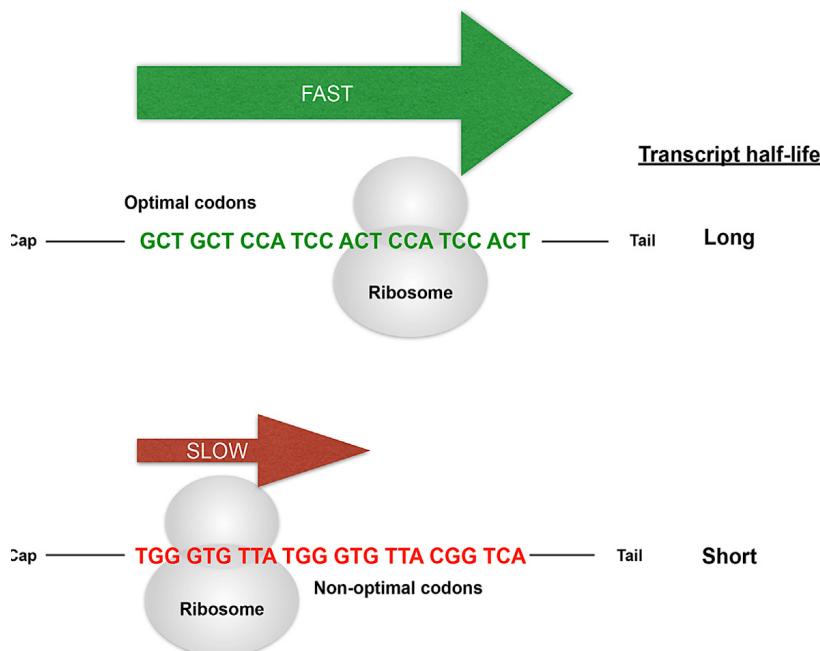
Li et al. (2017) NAR gkx898.

# Codon frequency preferentially specifies $TR_{Dpnd}$

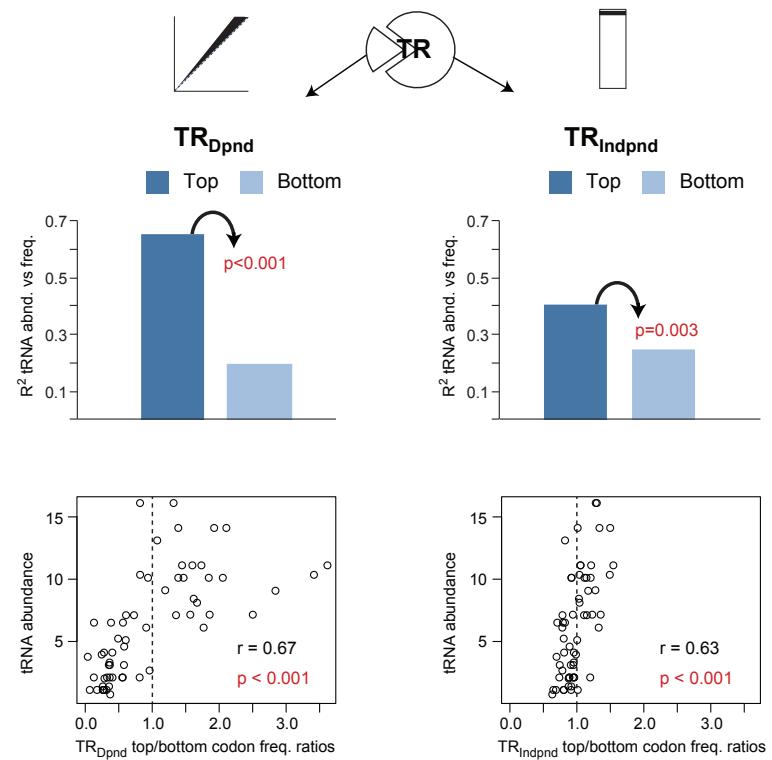


# Codon frequency preferentially specifies $\text{TR}_{\text{Dpnd}}$

Codon usage increases mRNA stability

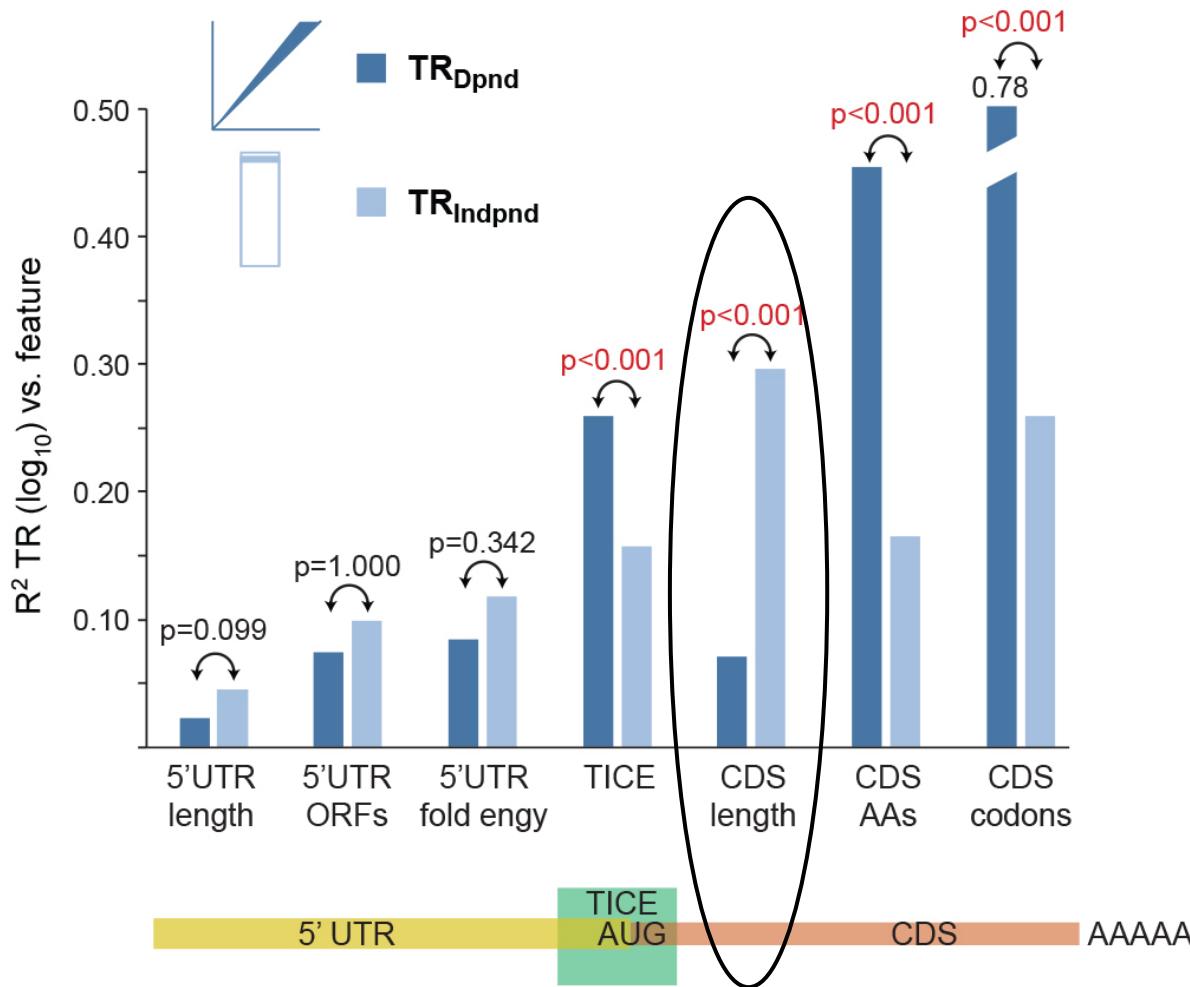


Therefore.....



Presnyak et al, 2015

# CDS length preferentially specifies TR<sub>Indpnd</sub>



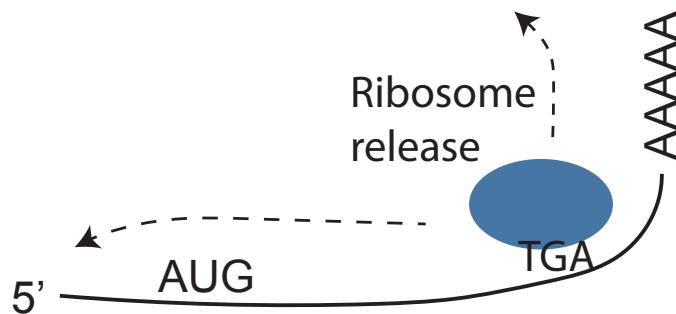
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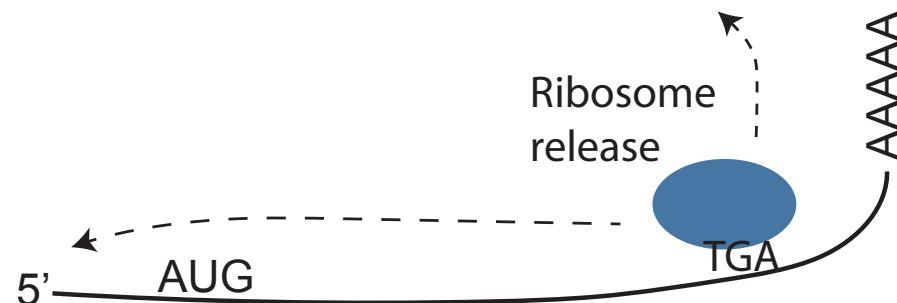
Jingyi Jessica Li (UCLA)

# CDS length affects initiation rate

**Short CDS**



**Long CDS**

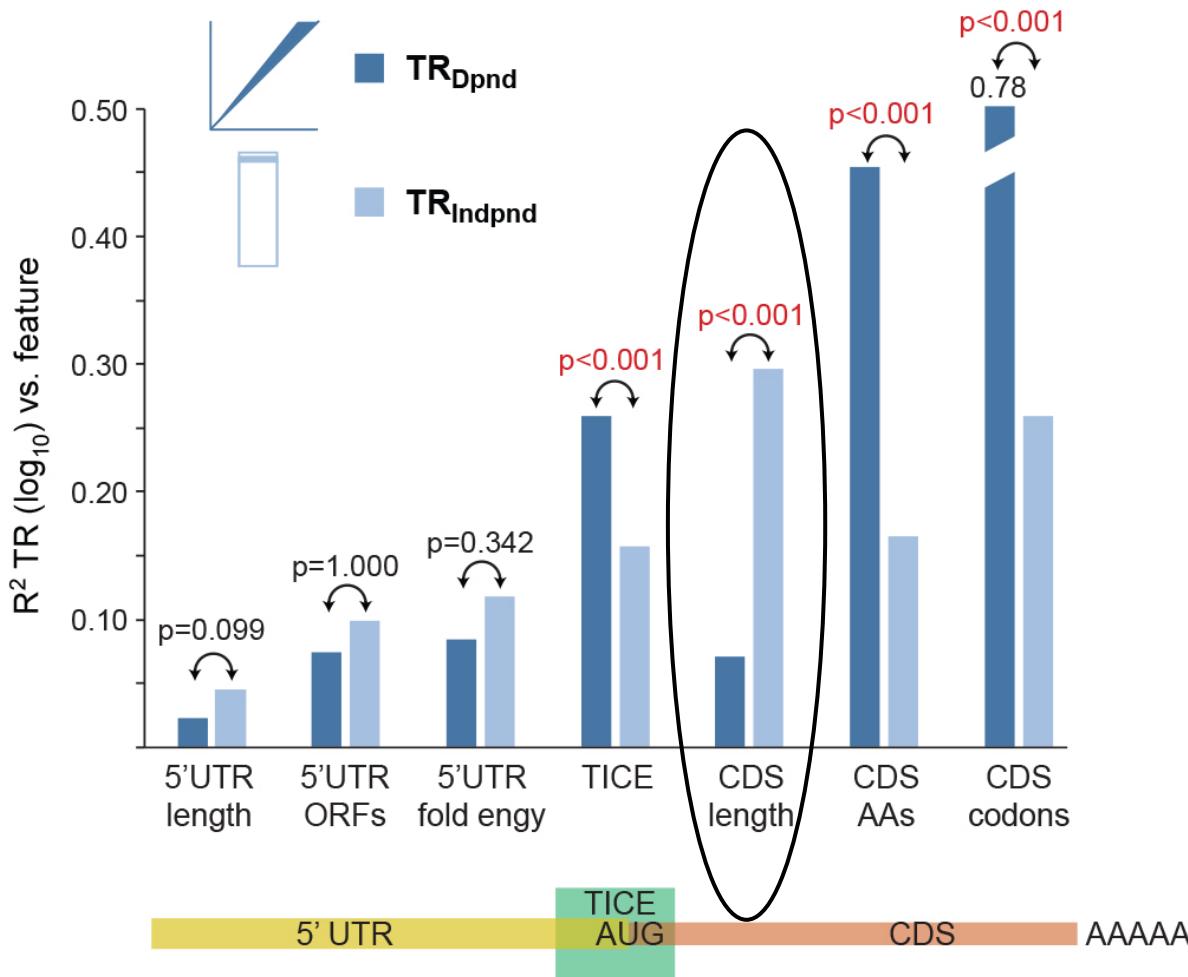


Efficient recapture of  
released ribosomes

Inefficient recapture of  
released ribosomes

Christensen et al. 1987; Arava et al, 2003; Thompson and Gilbert, 2016

# CDS length preferentially specifies TR<sub>Indpnd</sub>

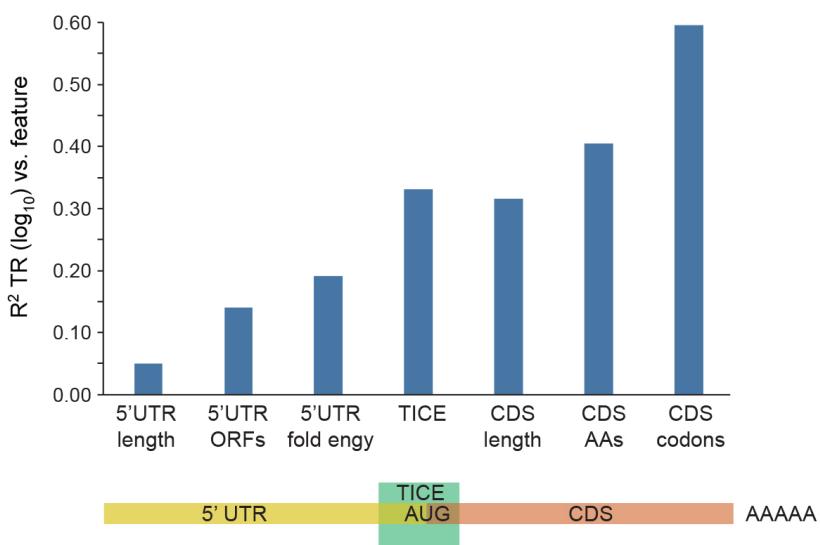


Li et al. (2017) NAR gkx898.

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# The Contributions of General Translational Control Sequences Across the Eukarya



SPECIES
<i>S. cerevisiae</i> (yeast)
<i>S. pombe</i> (yeast)
<i>A. thaliana</i> (plant)
<i>D. melanogaster</i> (fruit fly)
<i>M. musculus</i> (mouse)
<i>H. sapiens</i> (human)

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