

The “dark proteome”:  
Discovering new protein-coding genes in  
non-canonical open-reading frames

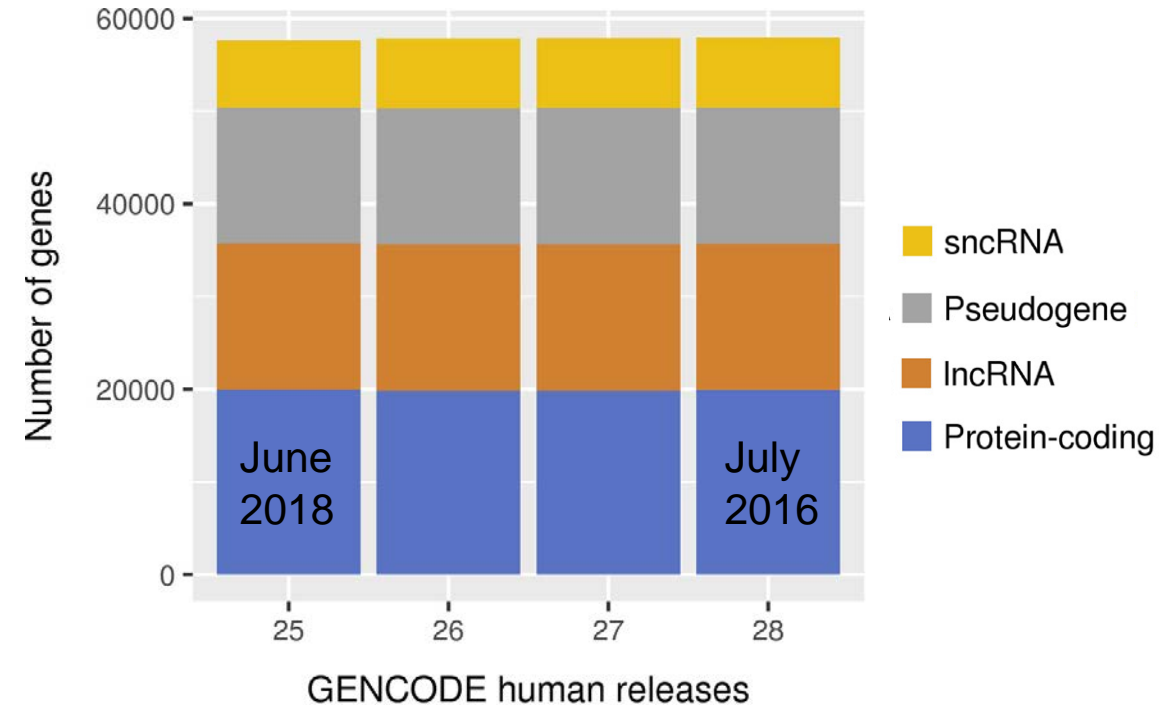
Technical Journal Club

Lukas Frick

9 June 2020

# How many protein-coding genes exist?

- There are **~20'000** protein-coding genes in the human genome...  
... but the exact number is unknown!
- The catalog of protein-coding genes is derived mainly from the analysis of **coding sequences**
  - bioinformatics pipelines  
± manual review
  - The algorithms have **blind spots!**



***GENCODE reference annotation for the human and mouse genomes, Nucleic Acids Research, 2018***

# DNA

```
graph TD; DNA --> Non-transcribed; DNA --> Transcribed; Non-transcribed --> JunkDNA["Junk DNA"]; Non-transcribed --> RegulatoryDNA["Regulatory DNA"]; Transcribed --> Non-codinggenes["Non-coding genes"]; Transcribed --> mRNA["mRNA"];
```

## Non-transcribed

### “Junk DNA”

- Retrotransposons, e.g. LINE-1
- ...

### Regulatory DNA

- Promoter
- Enhancer
- Silencer
- Centromere
- Telomere
- ...

## Transcribed

### Non-coding genes

- pri-miRNA
- lncRNA
- rRNA
- tRNA
- snoRNA
- ...

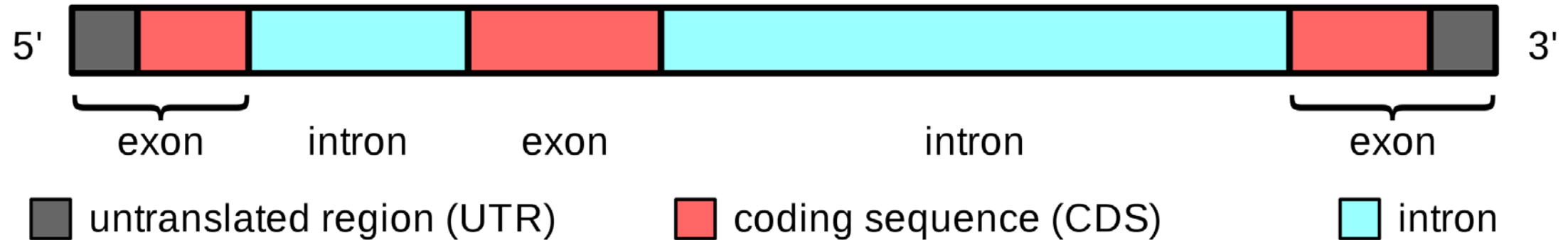
### mRNA

↓  
~1% of DNA in humans is translated into proteins

(~80% of DNA in prokaryotes)

Only the **CDS** (coding DNA sequence – a subset of the exonic sequence) is **translated** into protein

### pre-mRNA



The simplest way to find potential protein-coding sequences is to look for (long) **open reading frames (ORFs)**

```
1.  ATG CAA TGG GGA AAT GTT ACC AGG TCC GAA CTT ATT GAG GTA AGA CAG ATT TAA
2.  A TGC AAT GGG GAA ATG TTA CCA GGT CCG AAC TTA TTG AGG TAA GAC AGA TTT AA
3.  AT GCA ATG GGG AAA TGT TAC CAG GTC CGA ACT TAT TGA GGT AAG ACA GAT TTA A
```

An open reading frame is a continuous stretch of codons that begins with a **start codon** and ends with a **stop codon**.



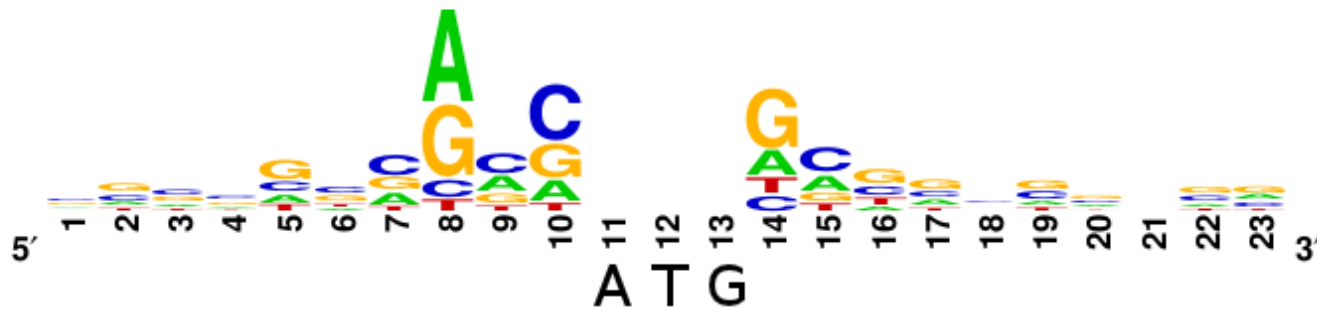
**AUG**



**UAA / UAG / UGA**

CUG / UUG / GUG are non-canonical

In addition to the start codon, the surrounding nucleotides, i.e. the **Kozak sequence**, determine the initiation of translation



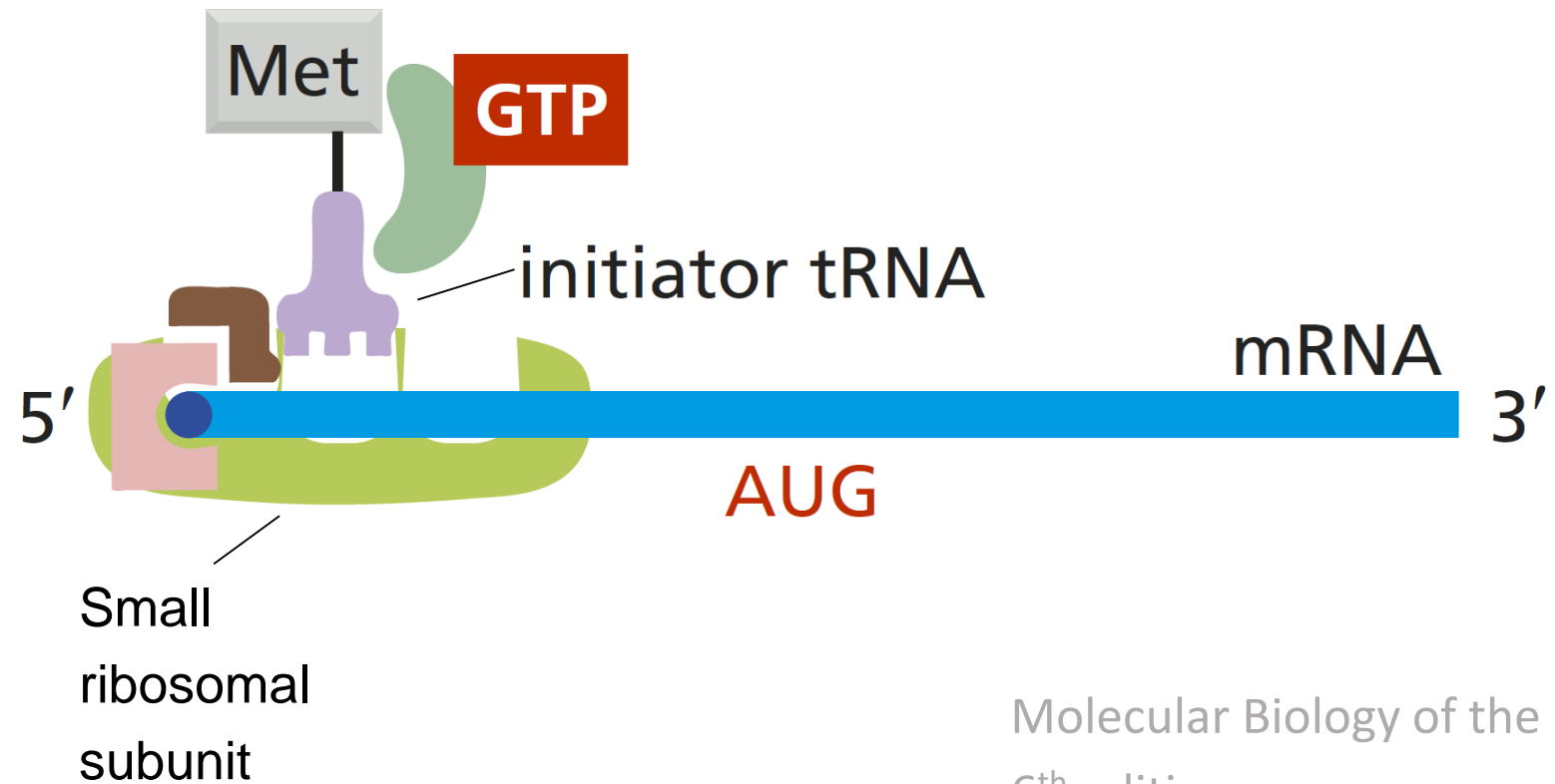
consensus recognition site

5'-ACCAUGG-3'

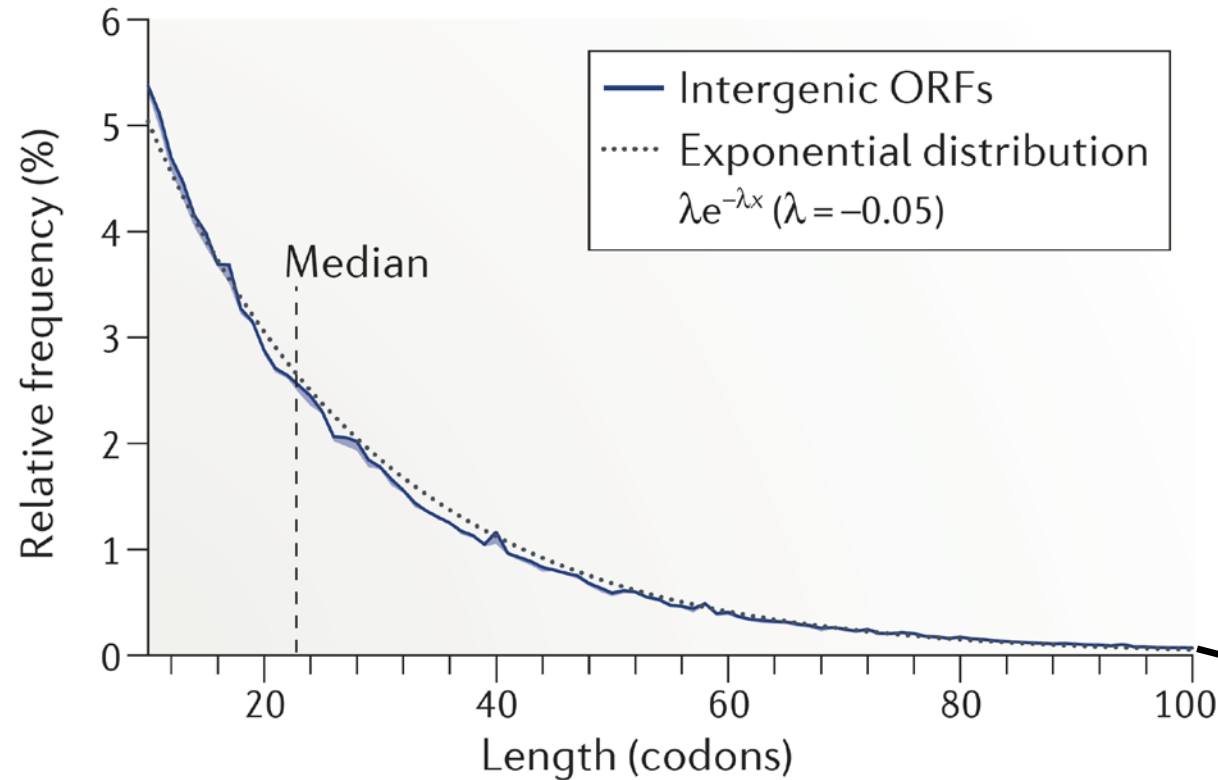
If a start codon deviates from this sequence, it may sometimes be skipped  
→ **leaky scanning**  
by the ribosome!

In ~90% of cases, translation begins at the first AUG start codon

In eukaryotes,  
the ribosome  
binds to the  
5' cap of mRNA  
and starts  
scanning.



In a random DNA sequence, the median ORF is 23 codons long



3/64 triplets are stop codons  
= 5% probability

**Very few ORFs  $\geq 100$   
amino acids in size are  
expected by chance!**

Among the millions of small ORFs in our genome, only a tiny fraction code for proteins.

*Couso and Patraquim, 2017*



# Criteria for identifying canonical protein-coding ORFs

1. Length > 100 amino acids
2. Canonical start codon & Kozak motif
3. **Homologies** to known proteins
4.  $\pm$  Mass spectrometry confirmation

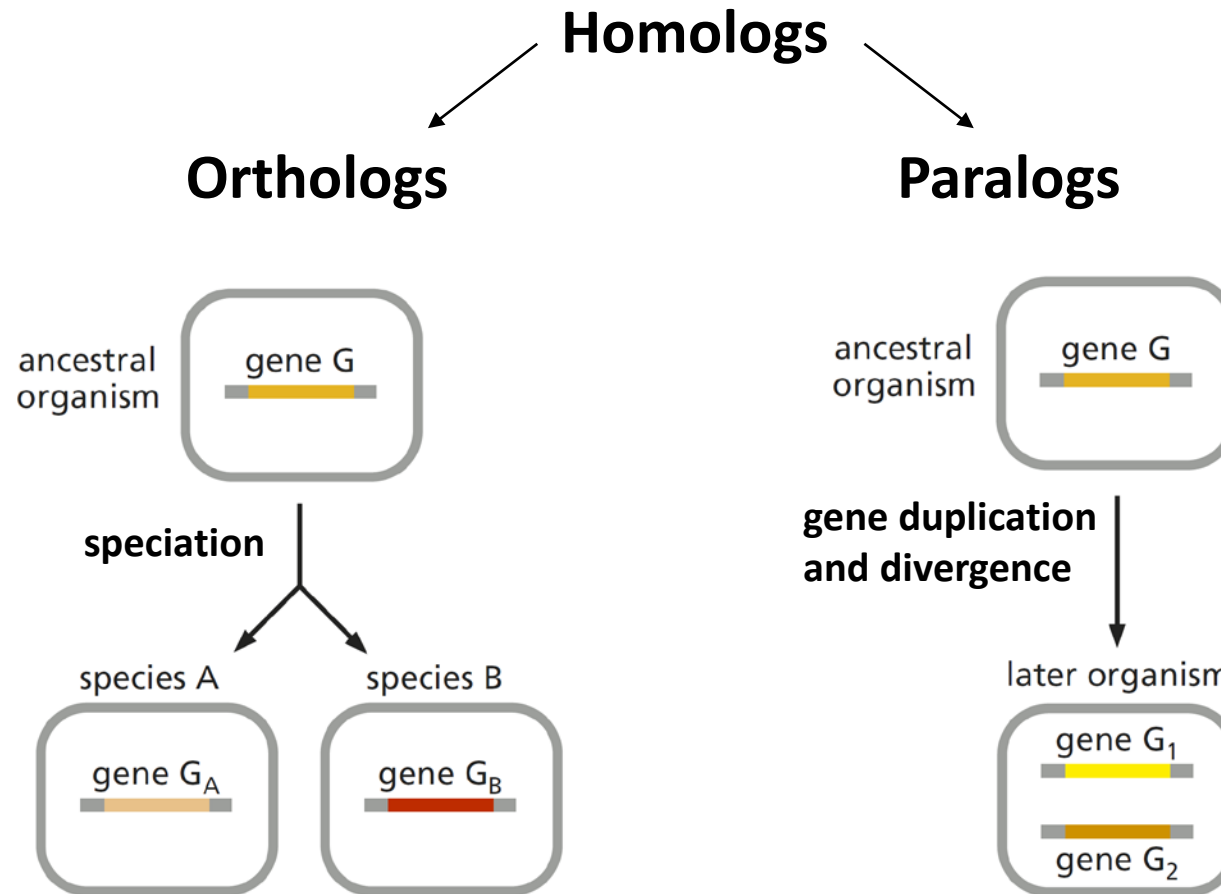
MS is poorly suited for...

- Newly identifying proteins
- Detecting low-abundance proteins

Bioinformaticians rely heavily on evolutionary relationships to known protein-coding genes

Sequence  
preservation  
among  
organisms

PhyloCSF score,  
Lin et al, 2011



Similarity to  
known  
protein  
domains

When comparing human and mouse sequences, a large fraction of **synonymous substitutions** indicates a protein-coding gene!

|     |     |     |     |     |     |     |     |     |     |     |     |     |     |     |     |     |     |     |     |      |
|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|------|
| GCA | AGA |     |     |     |     |     |     |     |     | UUA |     |     |     |     | AGC |     |     |     |     |      |
| GCC | AGG |     |     |     |     |     |     |     |     | UUG |     |     |     |     | AGU |     |     |     |     |      |
| GCG | CGA |     |     |     |     |     | GGA |     |     | CUA |     |     |     | CCA | UCA | ACA |     |     | GUA |      |
| GCU | CGC |     |     |     |     |     | GGC |     | AUA | CUC |     |     |     | CCC | UCC | ACC |     |     | GUC | UAA  |
|     | CGG | GAC | AAC | UGC | GAA | CAA | GGG | CAC | AUC | CUG | AAA |     | UUC | CCG | UCG | ACG |     | UAC | GUG | UAG  |
|     | CGU | GAU | AAU | UGU | GAG | CAG | GGU | CAU | AUU | CUU | AAG | AUG | UUU | CCU | UCU | ACU | UGG | UAU | GUU | UGA  |
| Ala | Arg | Asp | Asn | Cys | Glu | Gln | Gly | His | Ile | Leu | Lys | Met | Phe | Pro | Ser | Thr | Trp | Tyr | Val | stop |
| A   | R   | D   | N   | C   | E   | Q   | G   | H   | I   | L   | K   | M   | F   | P   | S   | T   | W   | Y   | V   |      |

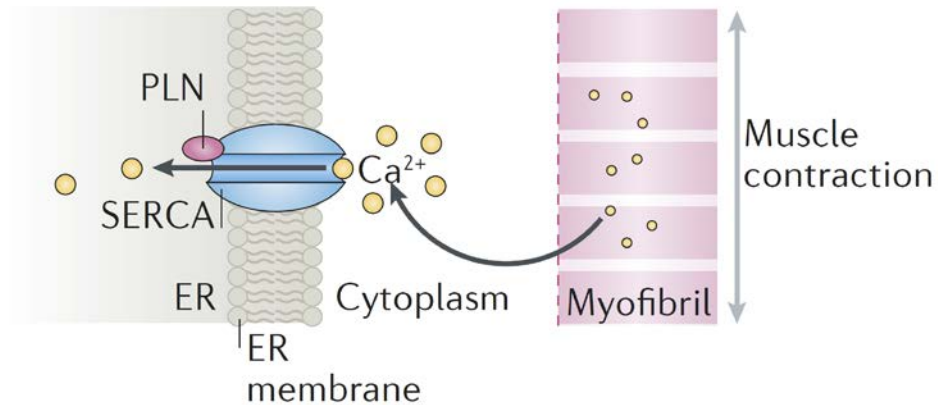
**Non-coding sequences / RNA genes** will accumulate mutations that **do not conserve** the amino acid sequence!

The existing pipelines have a bias against **small, new** and **non-canonical** ORFs!

*“Functional small ORFs are often not annotated because they have not been experimentally corroborated, and they have not been corroborated because they are not annotated...”*

*Couso and Patraquim, 2017*

Because of their small size, microproteins usually have regulatory functions



Example:

**Phospholamban** (52 aa) and **myoregulin** (46 aa) inhibit SERCA, which pumps  $\text{Ca}^{2+}$  back to the sarcoplasmic reticulum to terminate muscle contraction.



Phospholamban and myoregulin are paralogs.

# Localization of newly discovered non-canonical ORFs

1. On **lncRNAs** (long non-coding RNAs)

True lncRNAs often have regulatory functions (transcription, heterochromatin...)

2. On transcribed **pseudogenes**

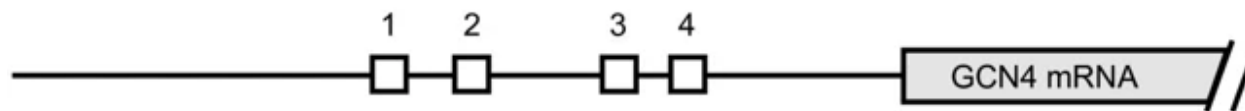
Pseudogenes usually arise from the duplication of a gene, followed by the accumulation of damaging mutations in one copy

3. On **mRNAs** (near canonical ORFs)

- Upstream ORFs (uORFs)
- Downstream ORFs (dORFs) (rare)

# uORFs sometimes **compete with** and inhibit translation of the **canonical ORF**

- Classic example:
  - The **yeast Gcn4 gene** has 4 uORFs that normally inhibit its translation
  - In conditions of starvation, the ribosome skips the uORFs  
→ Gcn4 is translated instead
  - The **amino acid sequences of the translated Gcn4 uORFs are irrelevant**  
→ do not code for functional proteins



# LETTER

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## **The translation of non-canonical open reading frames controls mucosal immunity**

Ruaidhrí Jackson<sup>1</sup>, Lina Kroehling<sup>1</sup>, Alexandra Khitun<sup>2</sup>, Will Bailis<sup>1</sup>, Abigail Jarret<sup>1</sup>, Autumn G. York<sup>1</sup>, Omair M. Khan<sup>1</sup>, J. Richard Brewer<sup>1</sup>, Mathias H. Skadow<sup>1</sup>, Coco Duizer<sup>1</sup>, Christian C. D. Harman<sup>1</sup>, Lelina Chang<sup>1</sup>, Piotr Bielecki<sup>1</sup>, Angel G. Solis<sup>1</sup>, Holly R. Steach<sup>1</sup>, Sarah Slavoff<sup>2,3,4</sup> & Richard A. Flavell<sup>1,5\*</sup>

Nature, 2018



The authors use mouse models of colitis (e.g. colon infection with *Salmonella typhimurium*) to study the mucosal immune system.

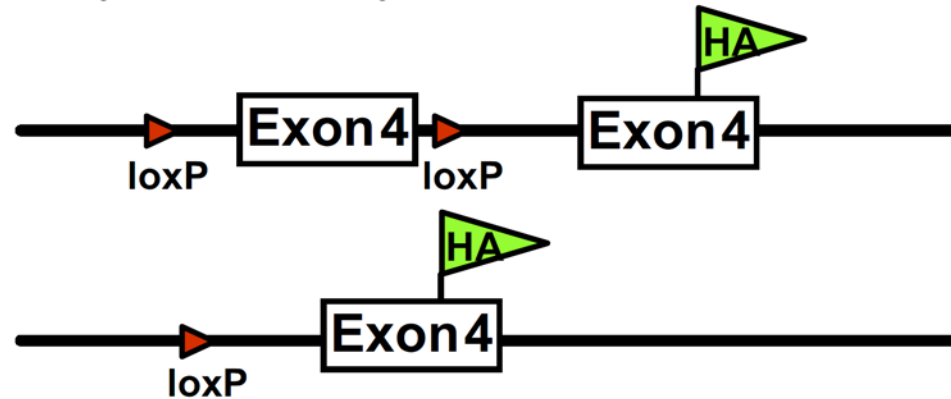
While **RNA-seq** offers a global view of **transcription**, the authors wanted to acquire a global view of **translation** in their colitis model.

They used two complementary strategies to identify RNAs that are being translated:

1. **RiboTag RNA-seq**
2. **Ribosome profiling**

# RiboTag RNA-seq employs Cre mouse lines to enrich for mRNAs from a specific cell type

Modified  
RPL22 locus



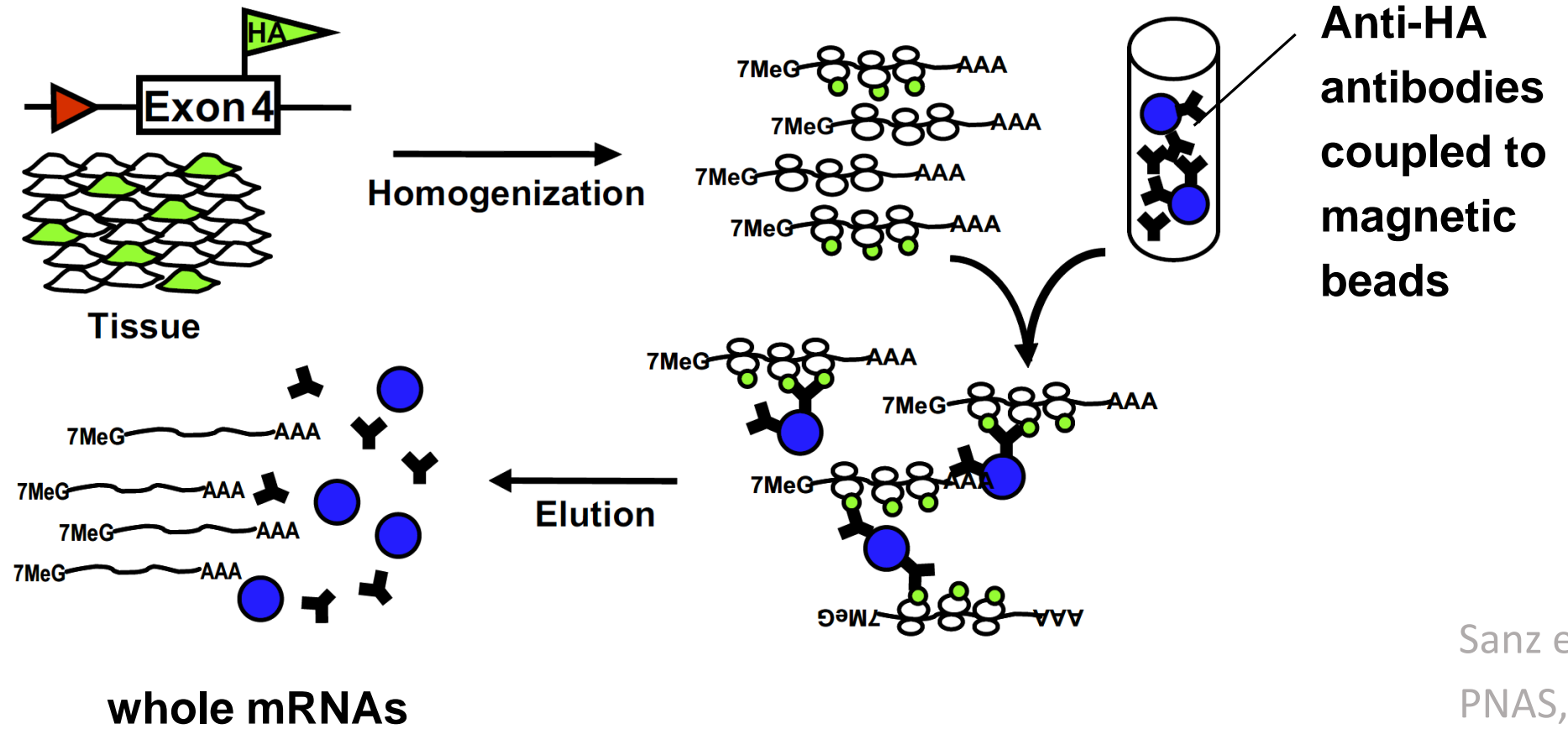
Sanz et al,  
PNAS,  
2009

After crossing  
to Cre Mouse

A transgenic mouse expresses Cre recombinase only in a cell type of interest, e.g. LysM-Cre mice in bone-marrow derived macrophages

If Cre is expressed, the **RPL22 ribosomal protein** is altered: The original exon 4 is excised, and a **HA-(hemagglutinin)-tagged** version of exon 4 is transcribed instead.

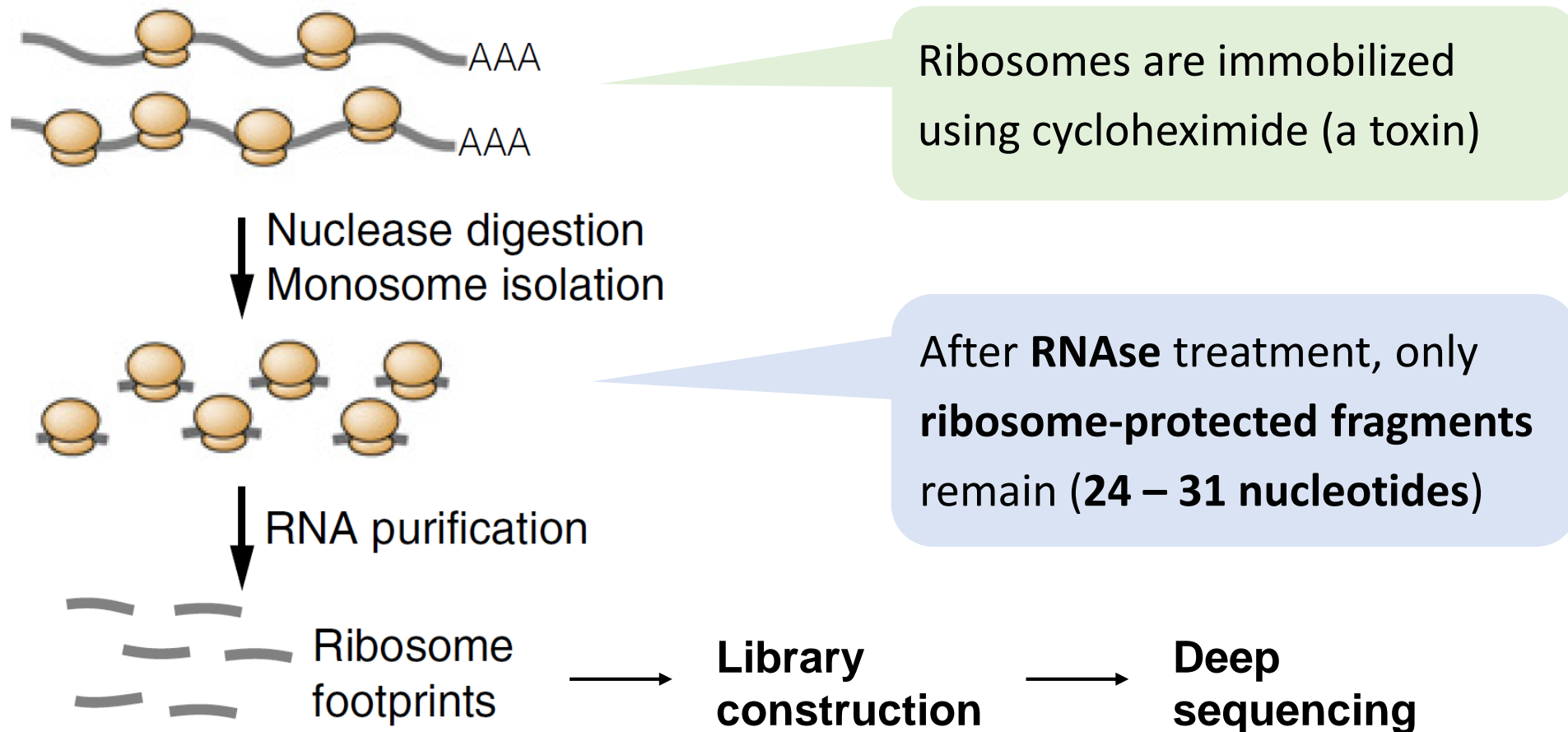
RiboTag RNA-seq uses **anti-HA antibodies** to select for ribosome-bound mRNAs from a specific cell type



**RNA-seq  
qPCR**

Sanz et al,  
PNAS,  
2009

**Ribosome profiling = ribosome footprinting = Ribo-Seq** allows for the specific identification of only **translated sections** of mRNA



Note: **RiboTag RNA-seq** (or similar systems) **can be combined with ribosome profiling** into one workflow  
(but this was not done by the authors).

With RiboTag RNA-seq, they found **many** differentially expressed **ribosome-associated transcripts** that mapped to **non-coding genes**!

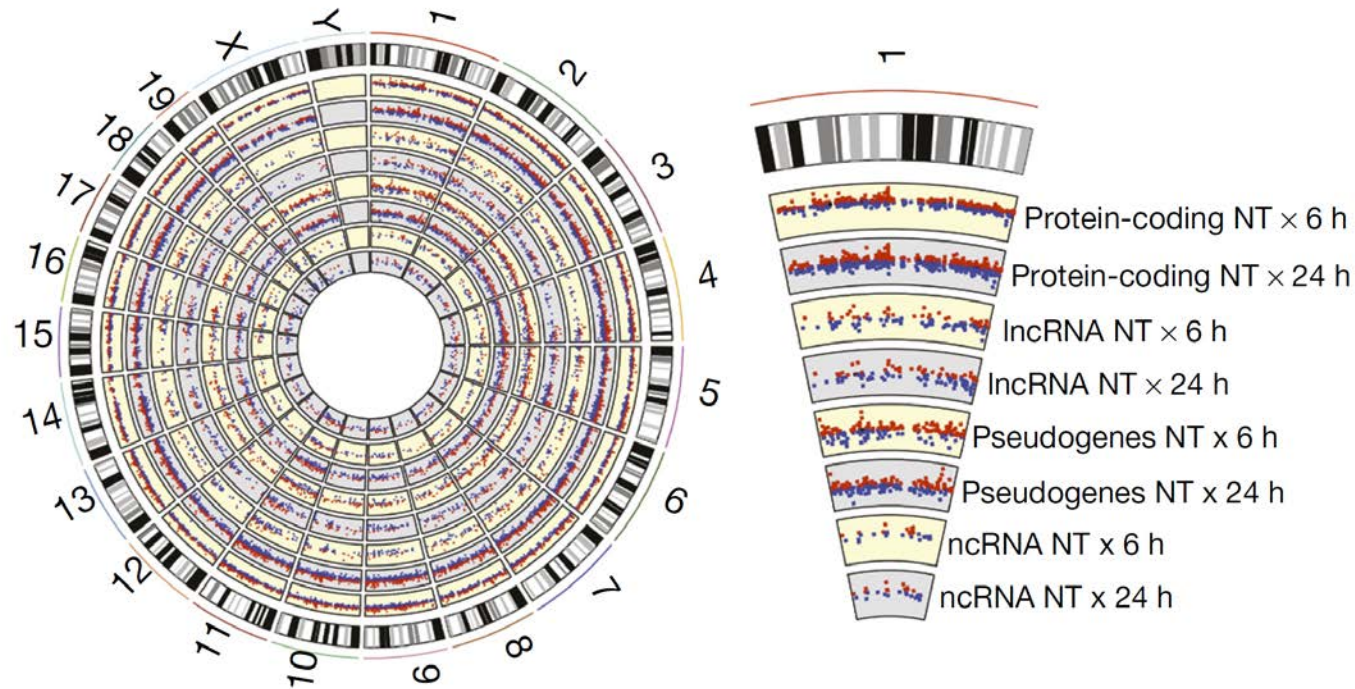


Fig. 1a

Upregulation with LPS

Downregulation with LPS

Bone marrow derived-macrophages were generated from **RiboTag<sup>LysM</sup>** mice and stimulated with 1 ng/ml bacterial lipopolysaccharide (LPS) for 6 or 24 hours *in vitro*.

With RiboTag RNA-seq, they found **many** differentially expressed **ribosome-associated transcripts** that mapped to **non-coding genes**!

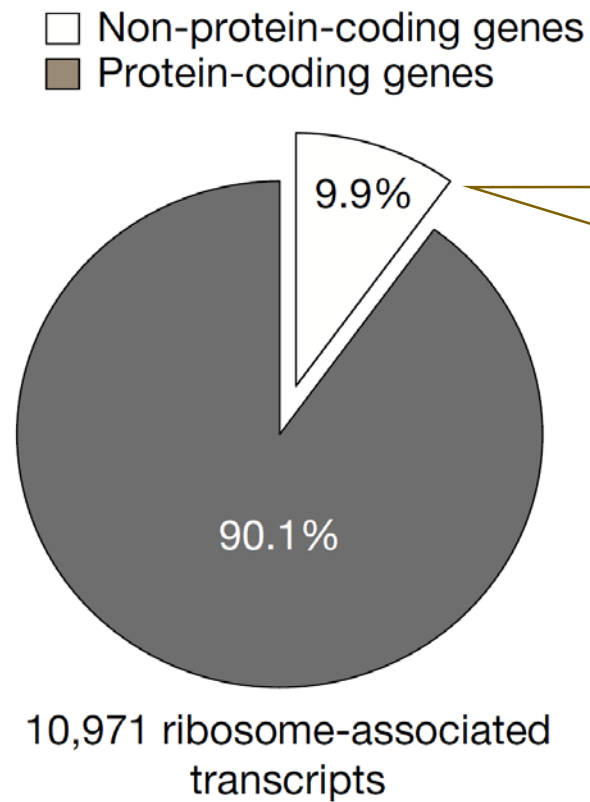


Fig. 1b

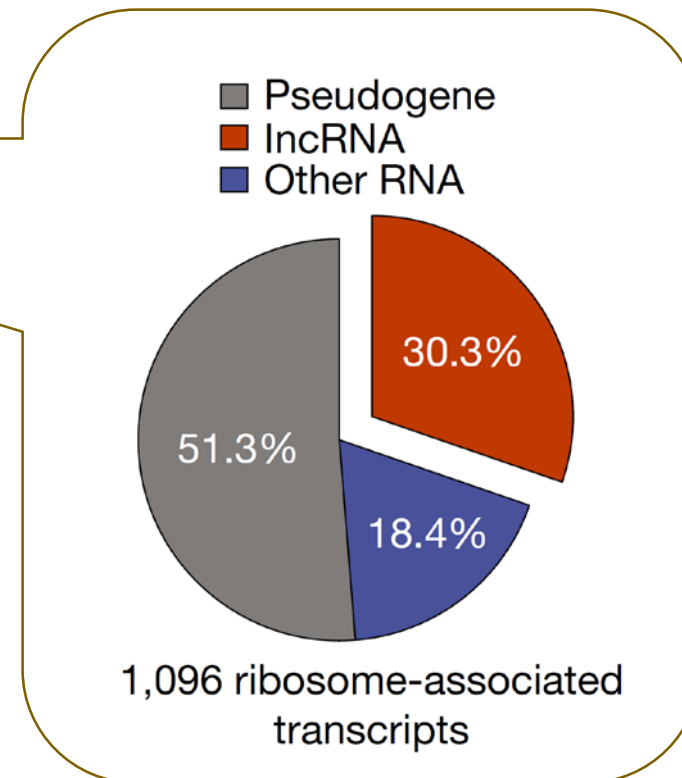
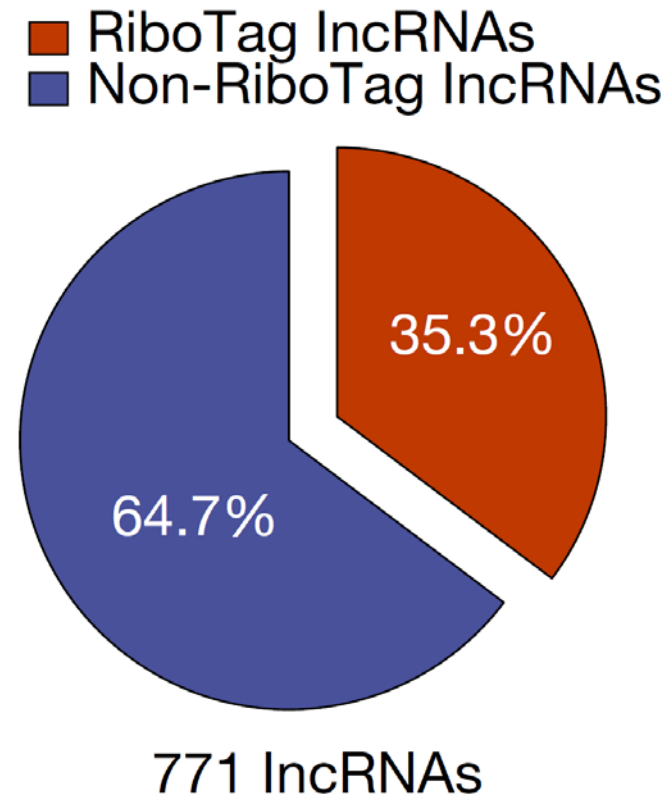


Fig. 1c

Comparison with paired RNA-seq data indicates that **one third** of expressed **lncRNAs** associate with ribosomes

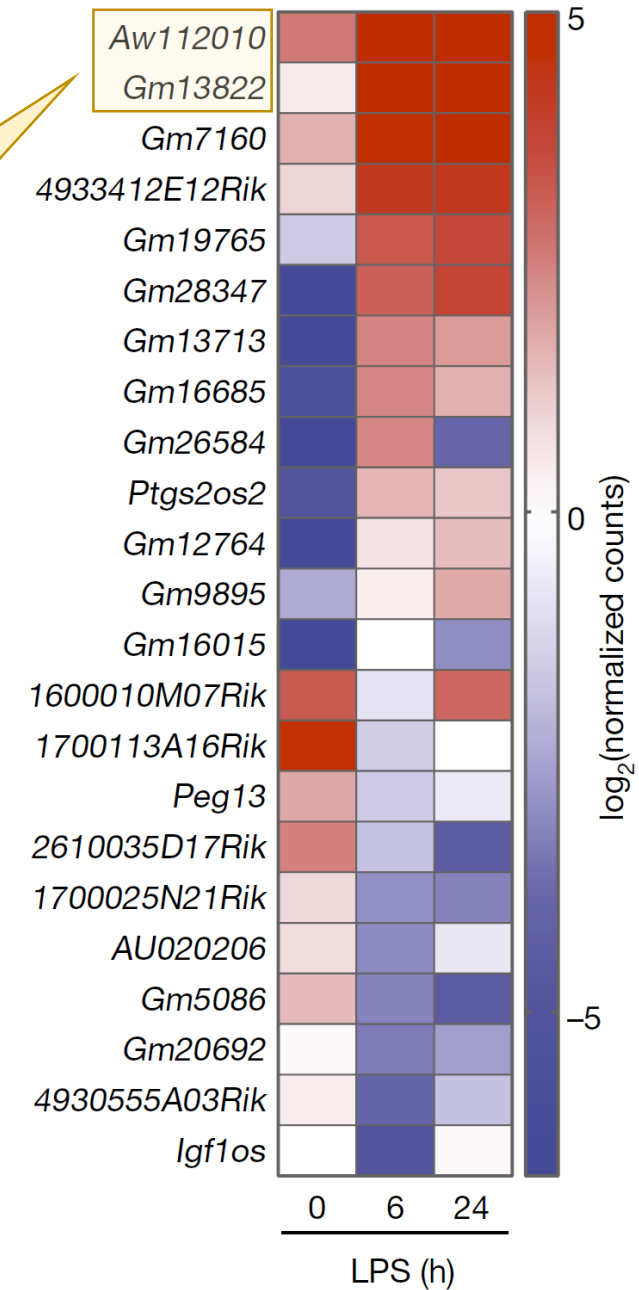


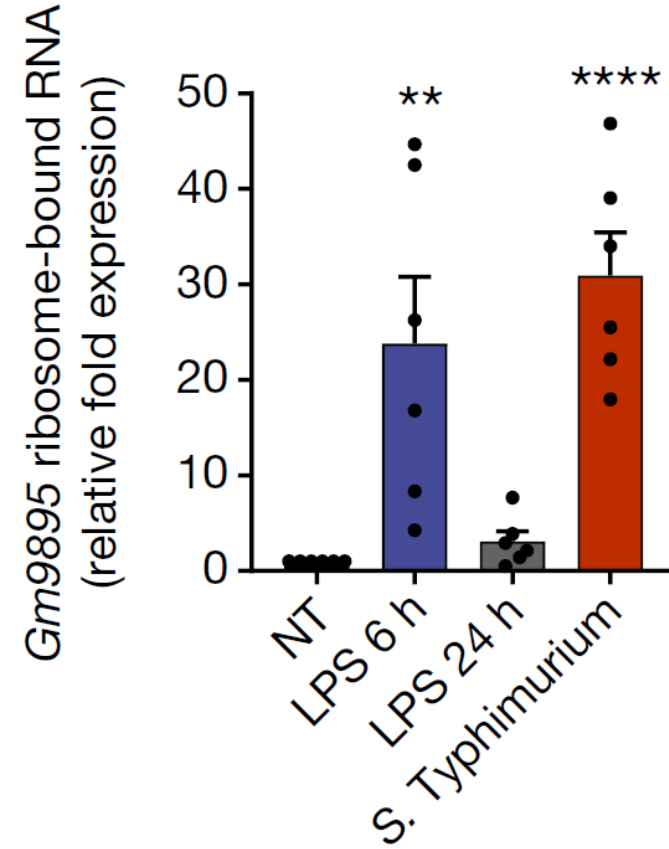
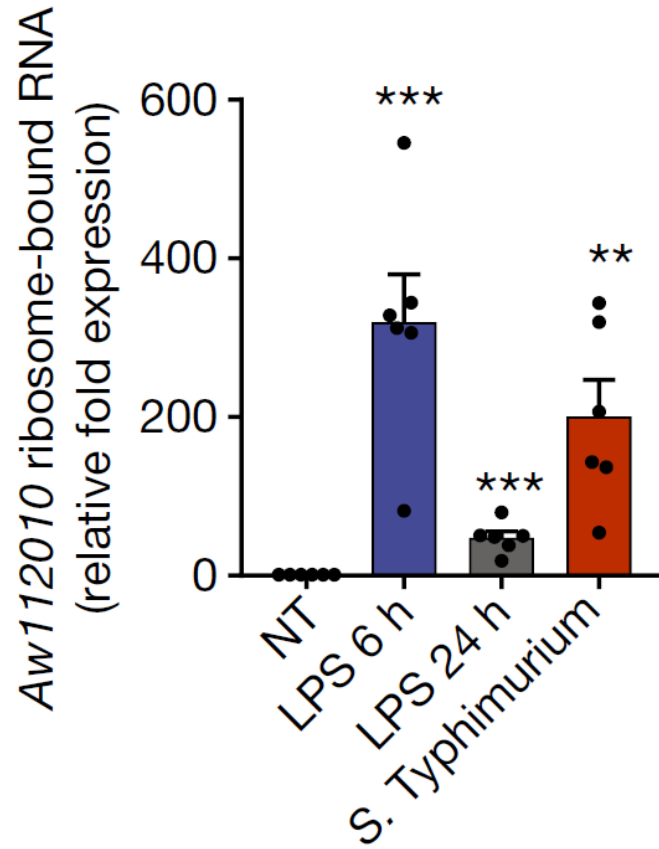


Two top upregulated  
ribosome-associated  
“lncRNAs” were examined  
in more detail:

*Aw112010*

*Gm13822*

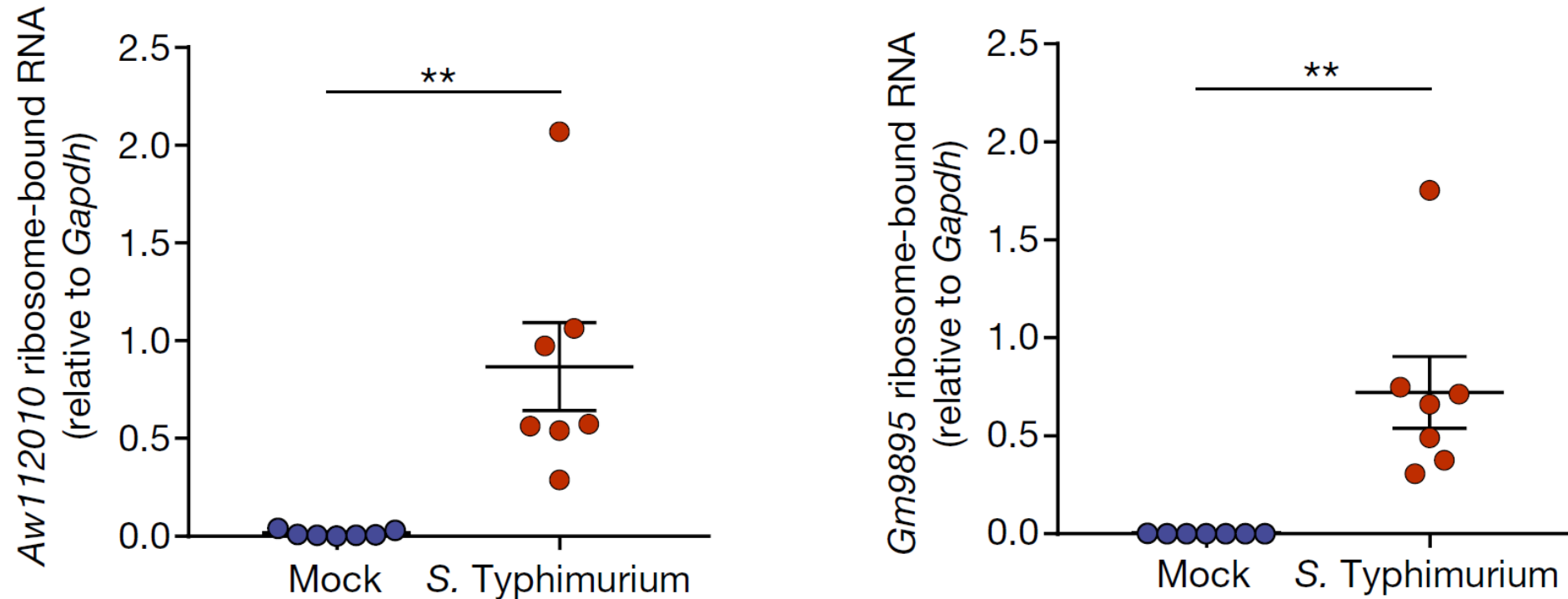




Bone-marrow derived macrophages were stimulated with LPS or infected with *Salmonella typhimurium*.

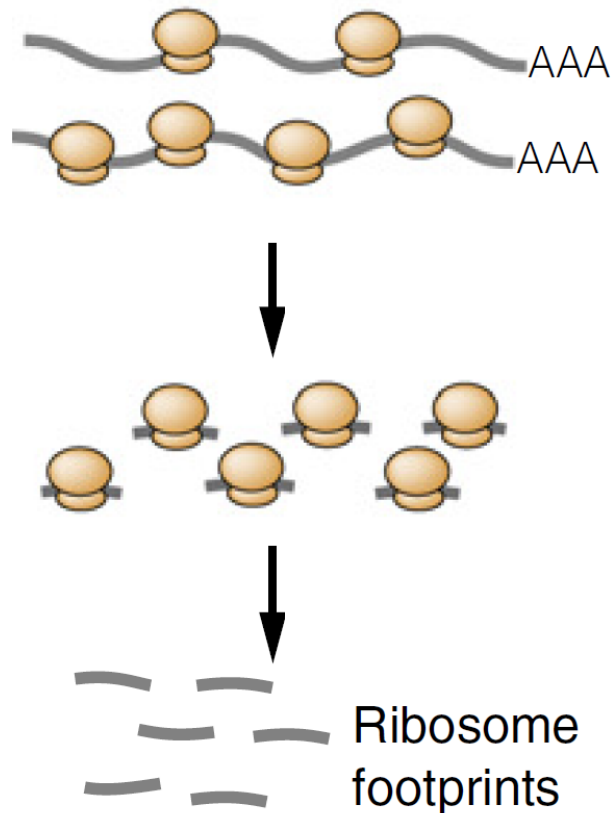
Ribosome-bound mRNA was measured by qPCR.

The two ribosome-bound RNAs were **induced in colonic macrophages *in vivo*** 24h after infection with *S. typhimurium*



Colon samples were washed, homogenized, and incubated overnight with HA beads.

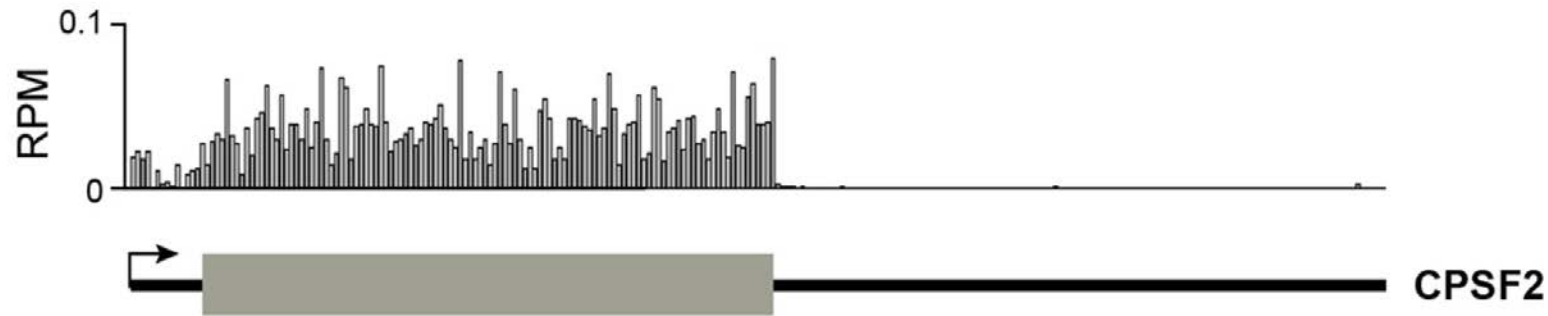
Next, the authors used **ribosome profiling** to corroborate that lncRNAs are truly being translated



They made heavy use of bioinformatics scores and algorithms to decide, for each ORF, whether translation was taking place.

(Ribosome footprints can be artefacts, e.g. represent noise or protection by non-ribosome RNA-binding proteins.)

A high Percentage of Maximum Entropy (PME) value  
(a **homogenous footprints** profile) indicates translation



Protein-coding  
gene

Homogeneous spread  
of reads indicates  
translation



Non-coding small  
nucleolar RNA

Single Ribo-Seq peak,  
very inhomogenous

Many lncRNAs  
had high PME  
values.

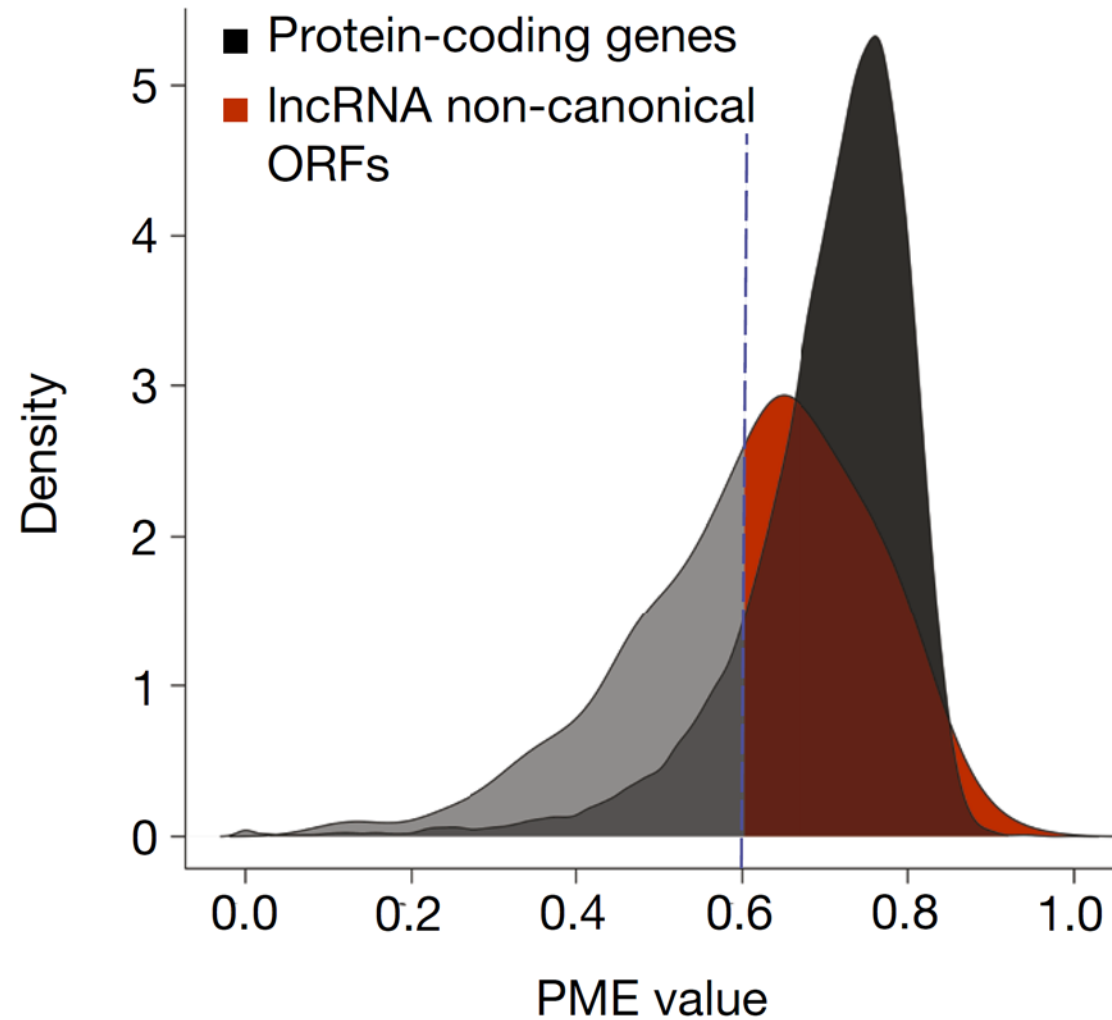
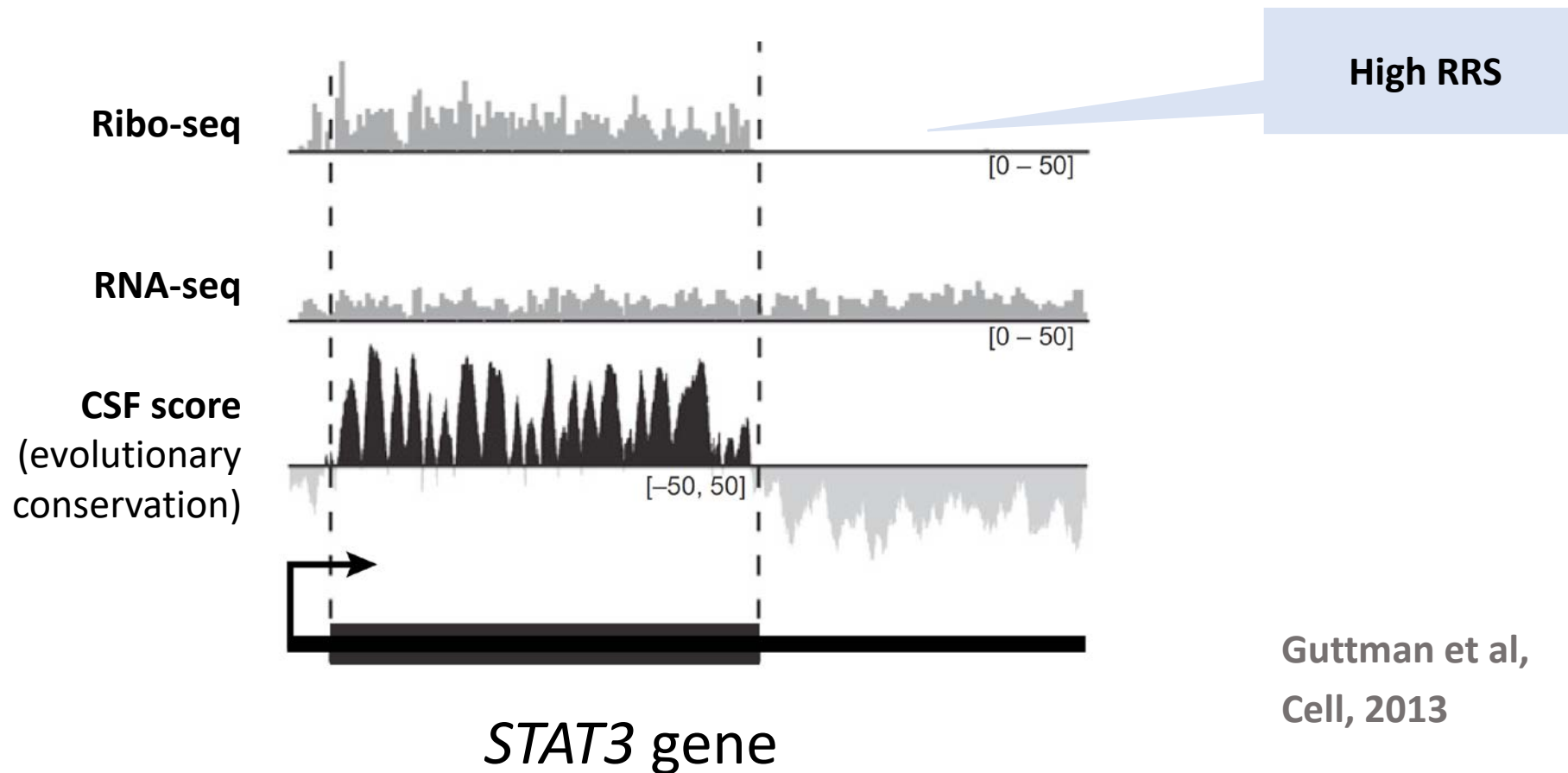
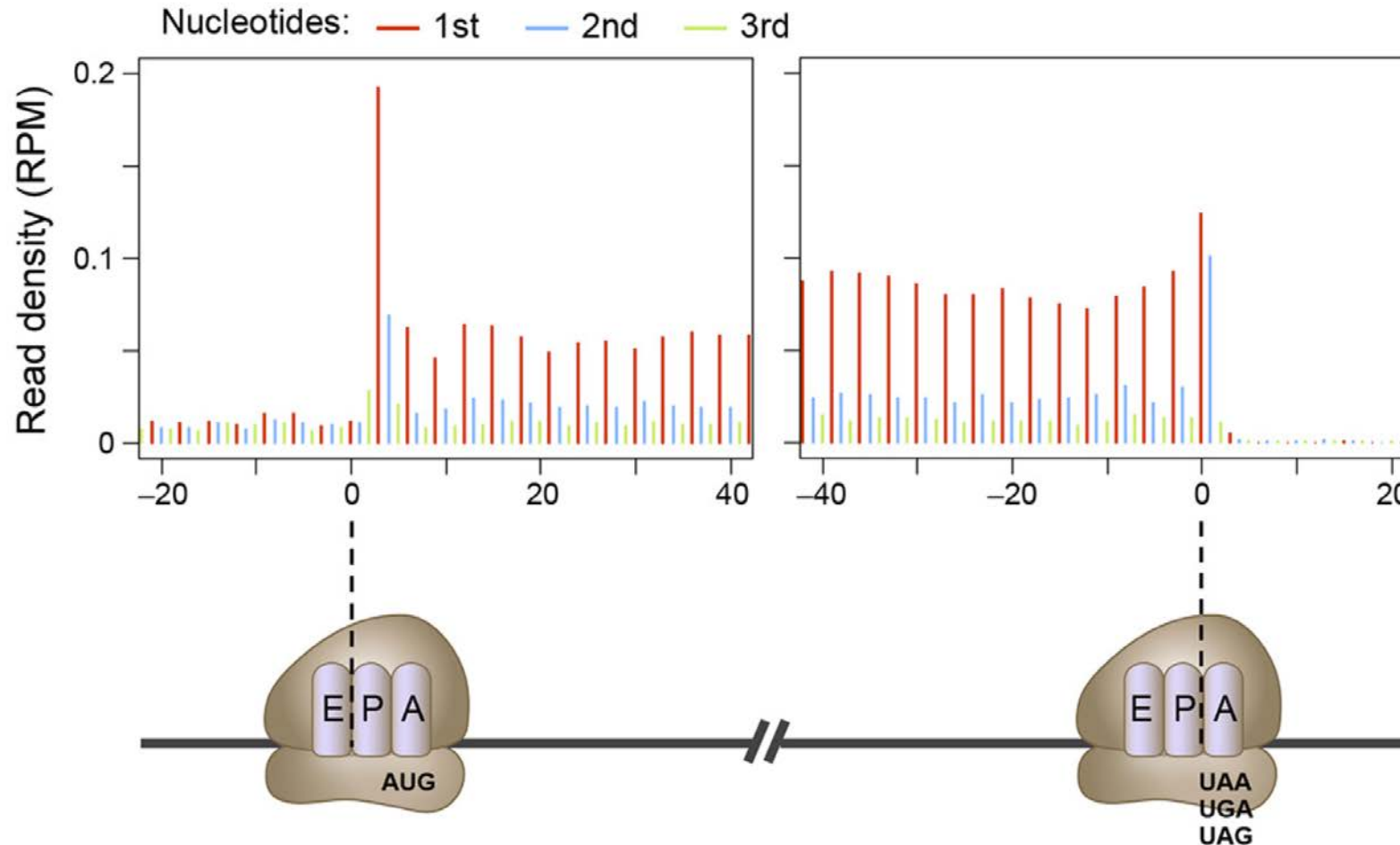


Fig. 2a

A high **ribosome release score (RRS)** – the ratio of footprints in the **coding region vs. 3' UTR** – also indicates translation



# Three-nucleotide periodicity is also a strong indicator of translation!

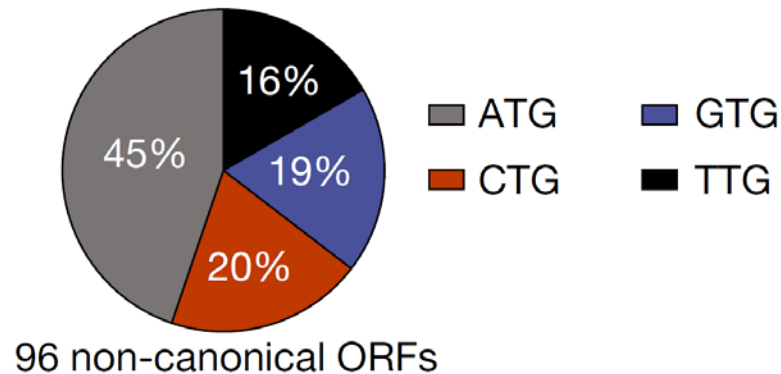


- Ribosome profiling offers single-nucleotide resolution.
- The ribosome moves in 3-nucleotide jumps.
- Footprints of a given size often have the same offset to the P site (11 nt for a 24 nt footprint)
  - → can be aligned
  - → typical pattern in coding sequences

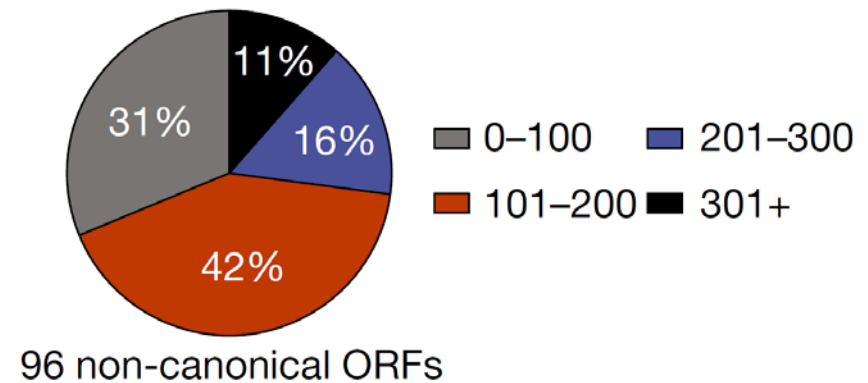


The authors used two tools (RibORF and RiboScan) plus a ribosome release score  $\geq 7$  to identify **96 translated lncRNAs**.

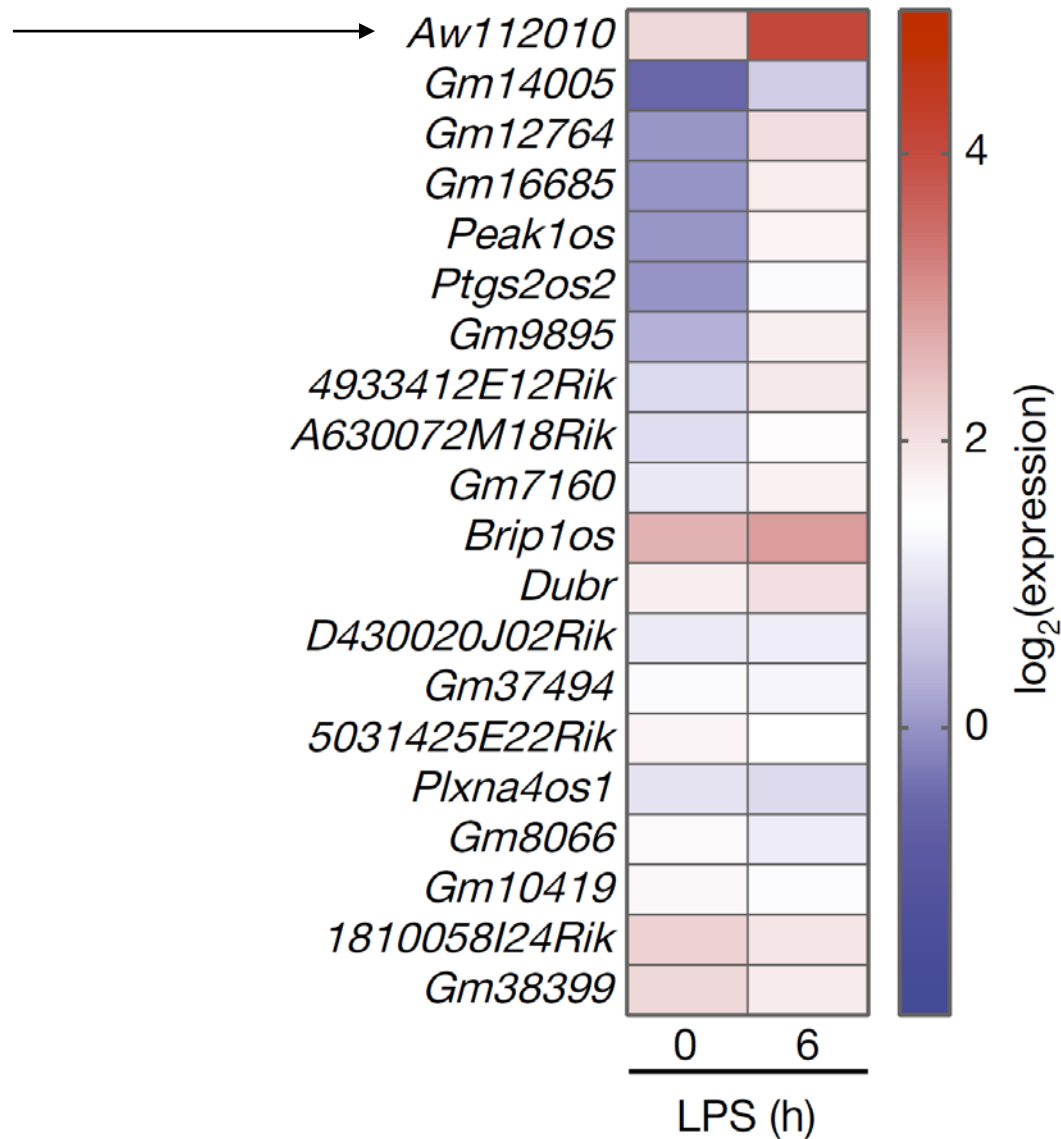
*Aw112010* was among them.



55% used non-canonical  
start codons



73% were smaller than  
100 amino acids

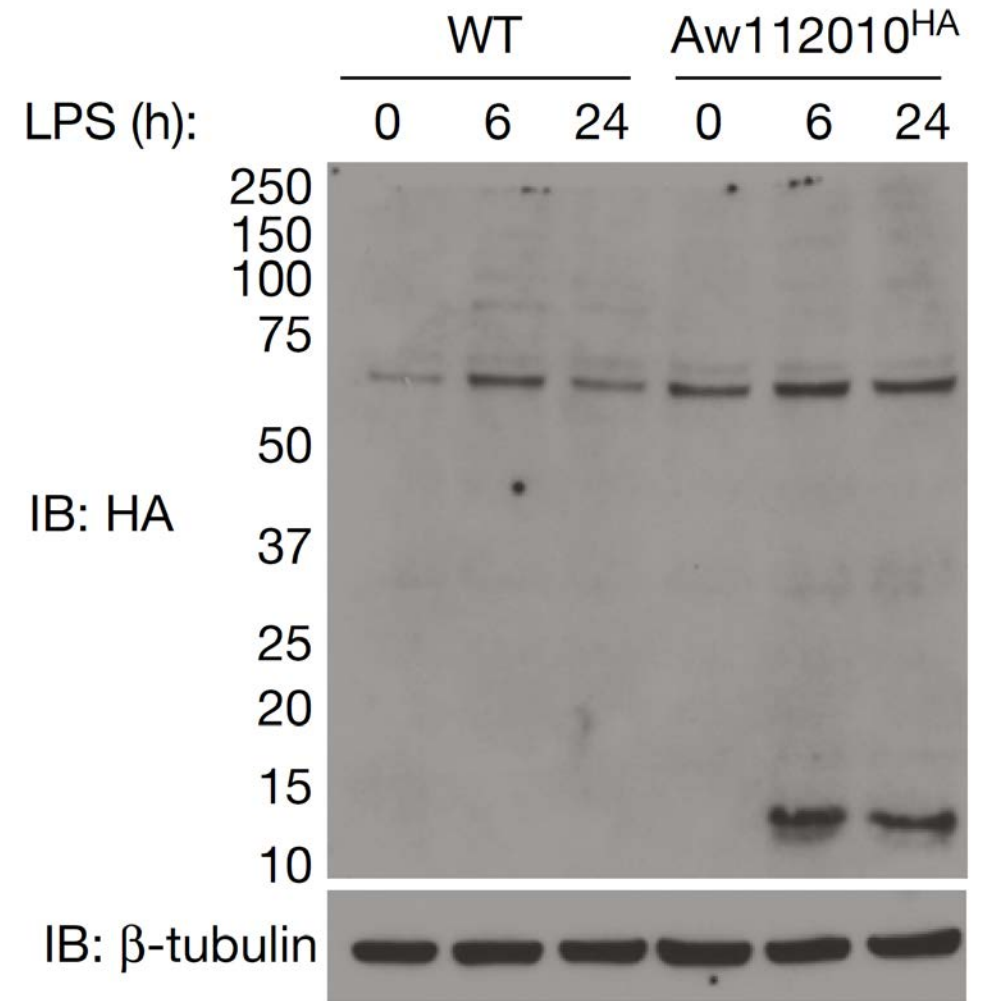


**Ribosome profiling**  
 revealed ***Aw112010*** as  
 the top differentially  
 translated gene  
**upregulated after LPS**  
 stimulation of wild-type  
 bone-marrow derived  
 macrophages.

Does *Aw112010* really produce a protein?

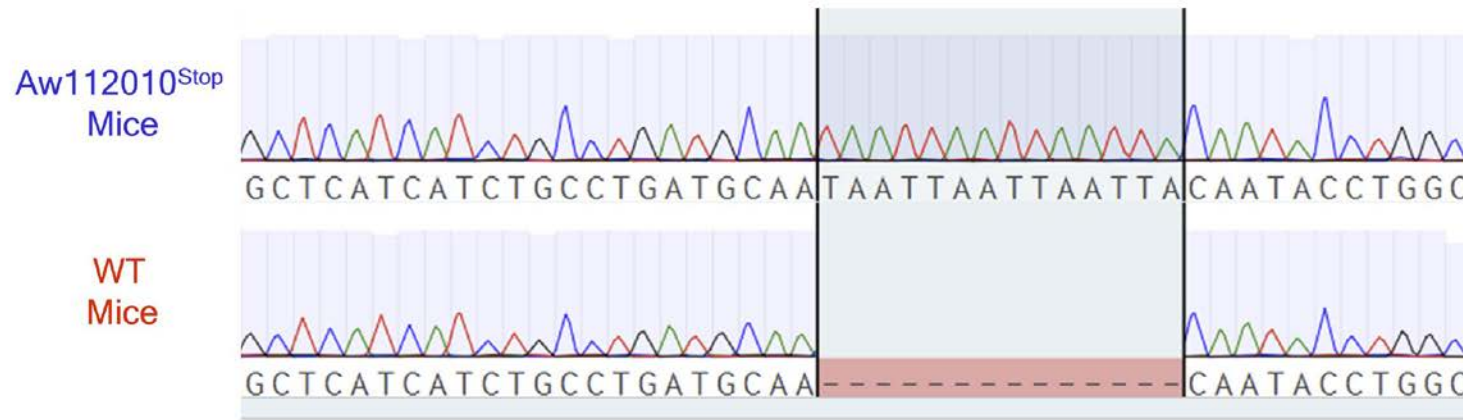
No antibodies for *Aw112010* exist, so an epitope-tagged *Aw112010*<sup>HA</sup> knock-in mouse was generated using CRISPR-Cas9.

Mass spectrometry also confirmed expression of the protein.



Aw112010-HA protein is induced by LPS stimulation

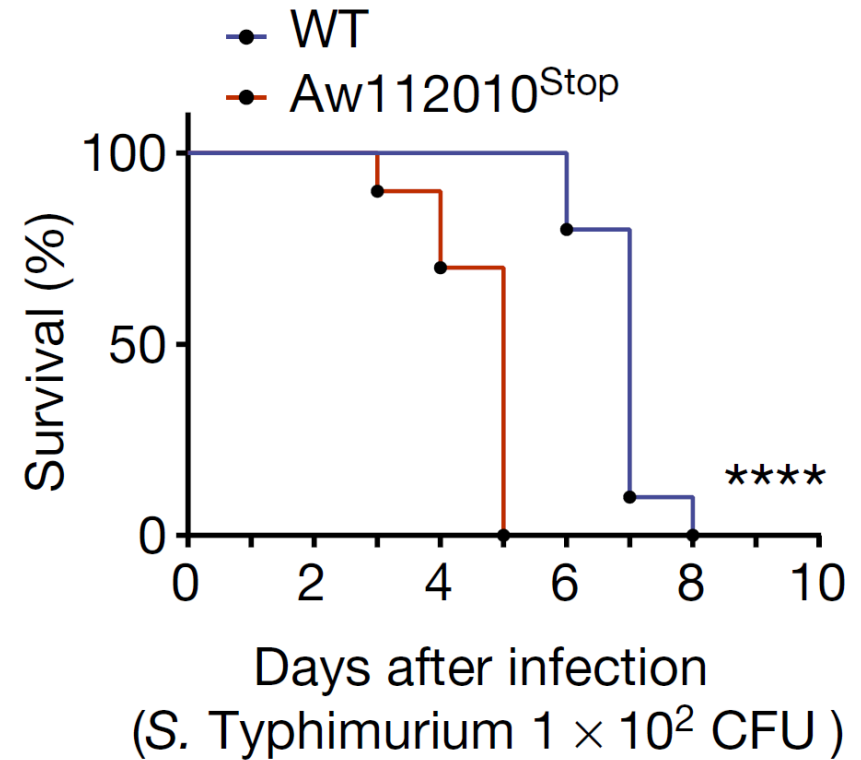
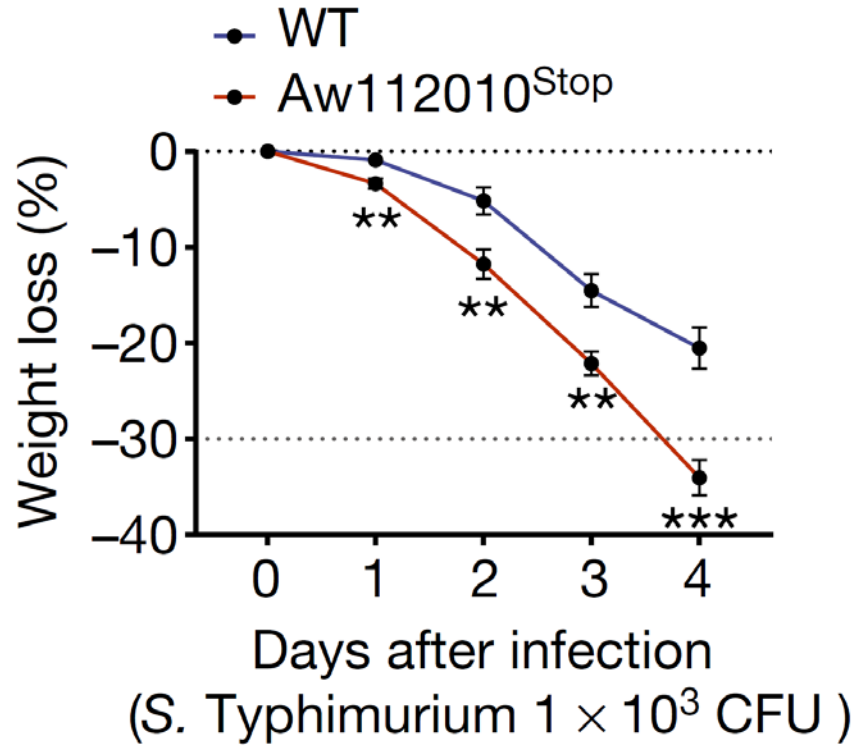
To abolish translation of *Aw112010* and prove its functional relevance, the authors created **Aw112010<sup>Stop</sup> mice**



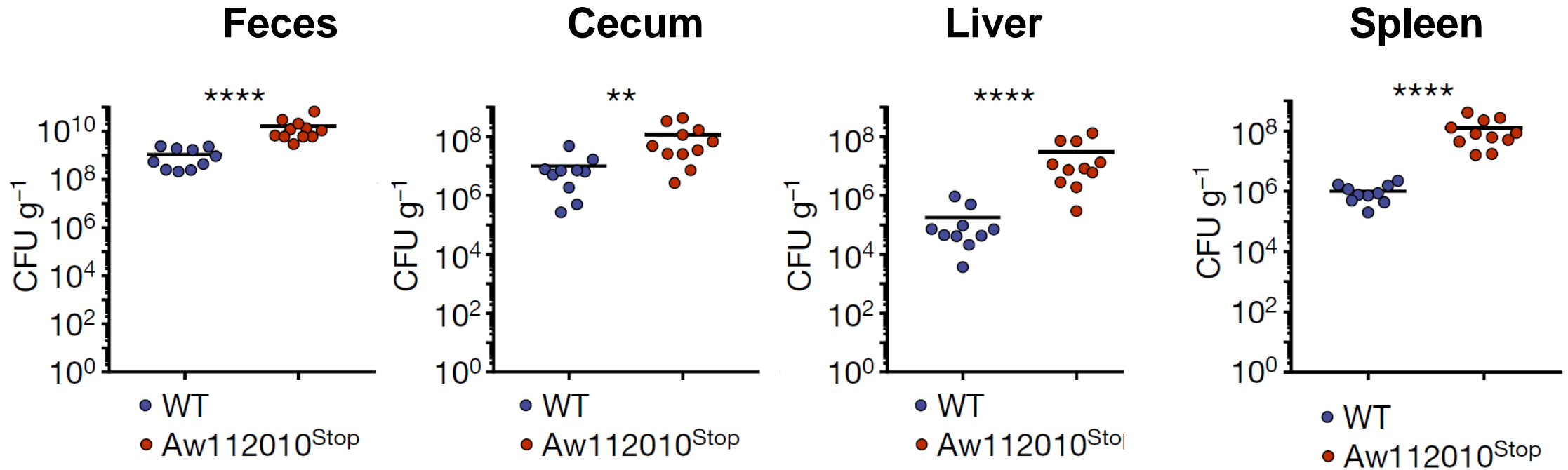
TAATTAATTA  
Stop Stop Stop  
+1 +2 +3

Frameshifting stop insert  
(14 nt)

## Aw112010<sup>Stop</sup> mice developed more severe infectious colitis



Aw112010<sup>Stop</sup> had a higher bacterial load of *S. typhimurium*

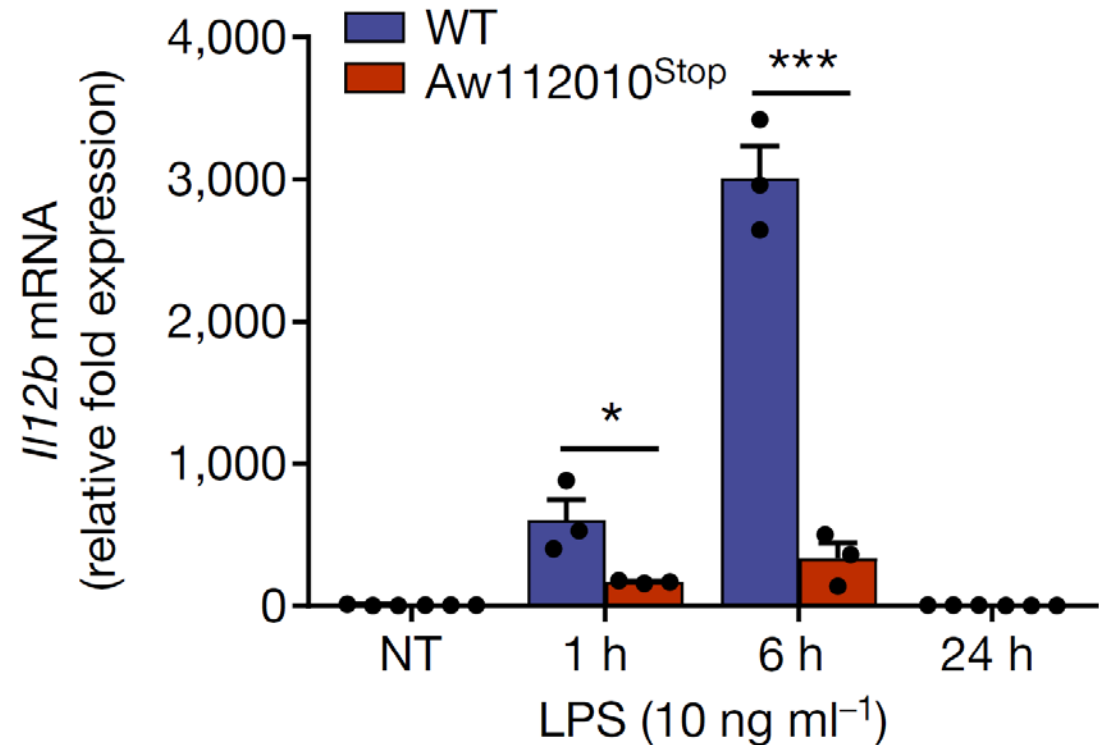


# What is Aw112010's mechanism of action?

Phagocytosis, phagosome acidification, intracellular killing, and pyroptosis were unaltered in Aw112010<sup>Stop</sup> macrophages.

However, production of **IL-12 and IL-6** was impaired! (IL-10 was unaltered)

The cytokine IL-12 is crucial for defense against salmonella.



Objection: This still does not prove that the protein product of *Aw112010* accounts for the phenotype of *Aw112010*<sup>Stop</sup> mice.

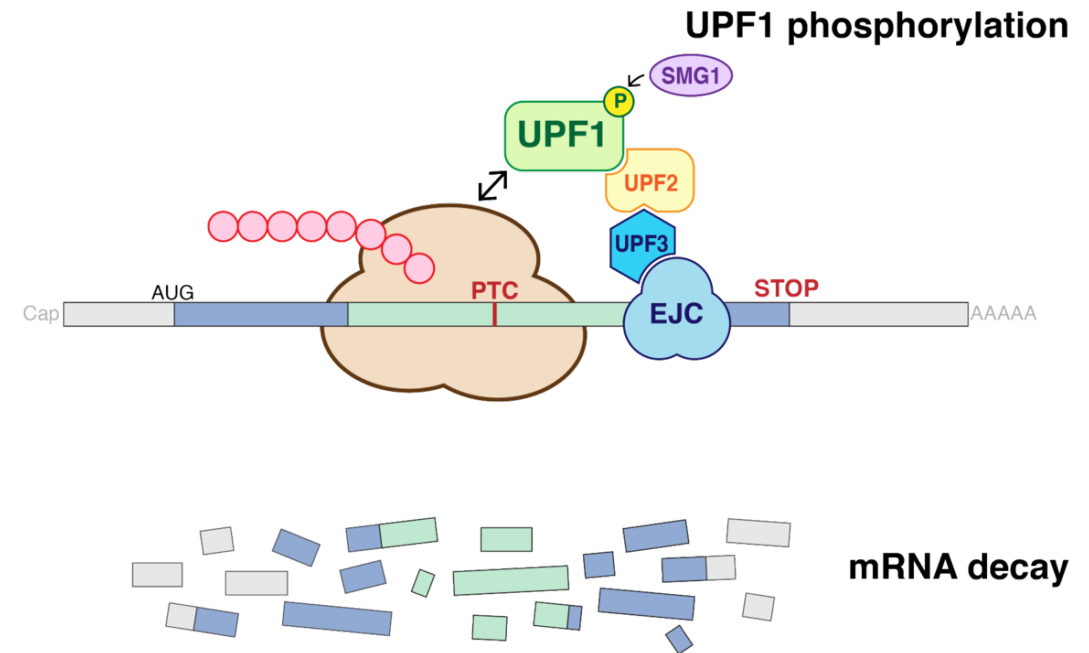
The lncRNA itself might perform the function.

Indeed, the authors found that the altered *Aw112010*<sup>Stop</sup> transcript is subject to nonsense-mediated decay (NMD), which leads to rapid destruction of the RNA.

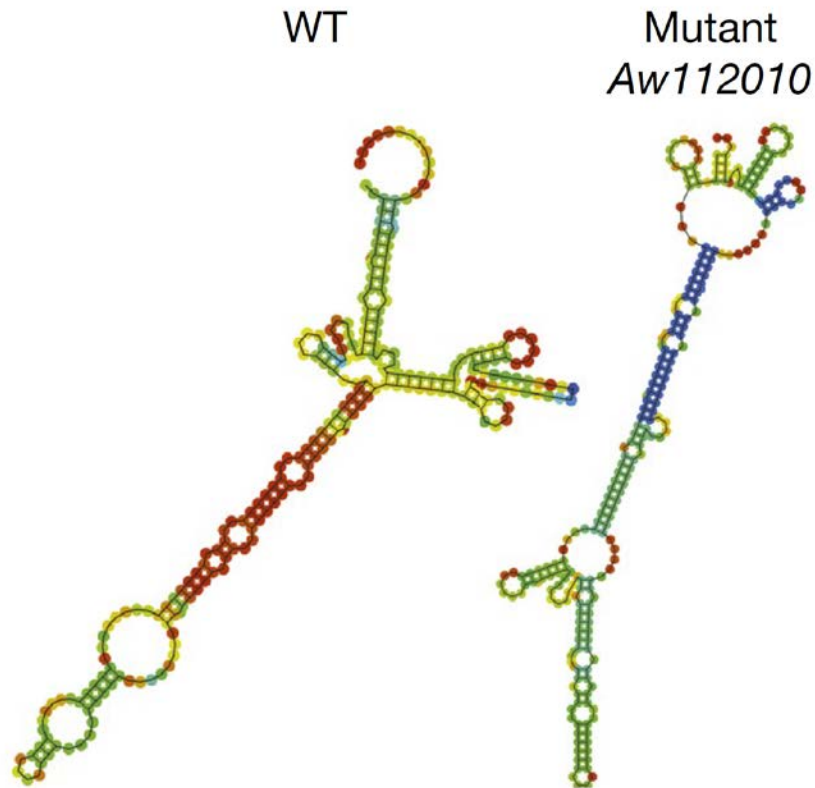


Nonsense-mediated decay is a mechanism of the cell to protect against **nonsense mutations** (premature stop codons)

- After splicing, exon junctional complexes (EJC) are placed on exon-exon junctions.
- In the first ever round of translation, these are removed.
- In subsequent rounds of translation, encountering an EJC triggers nonsense-mediated decay.

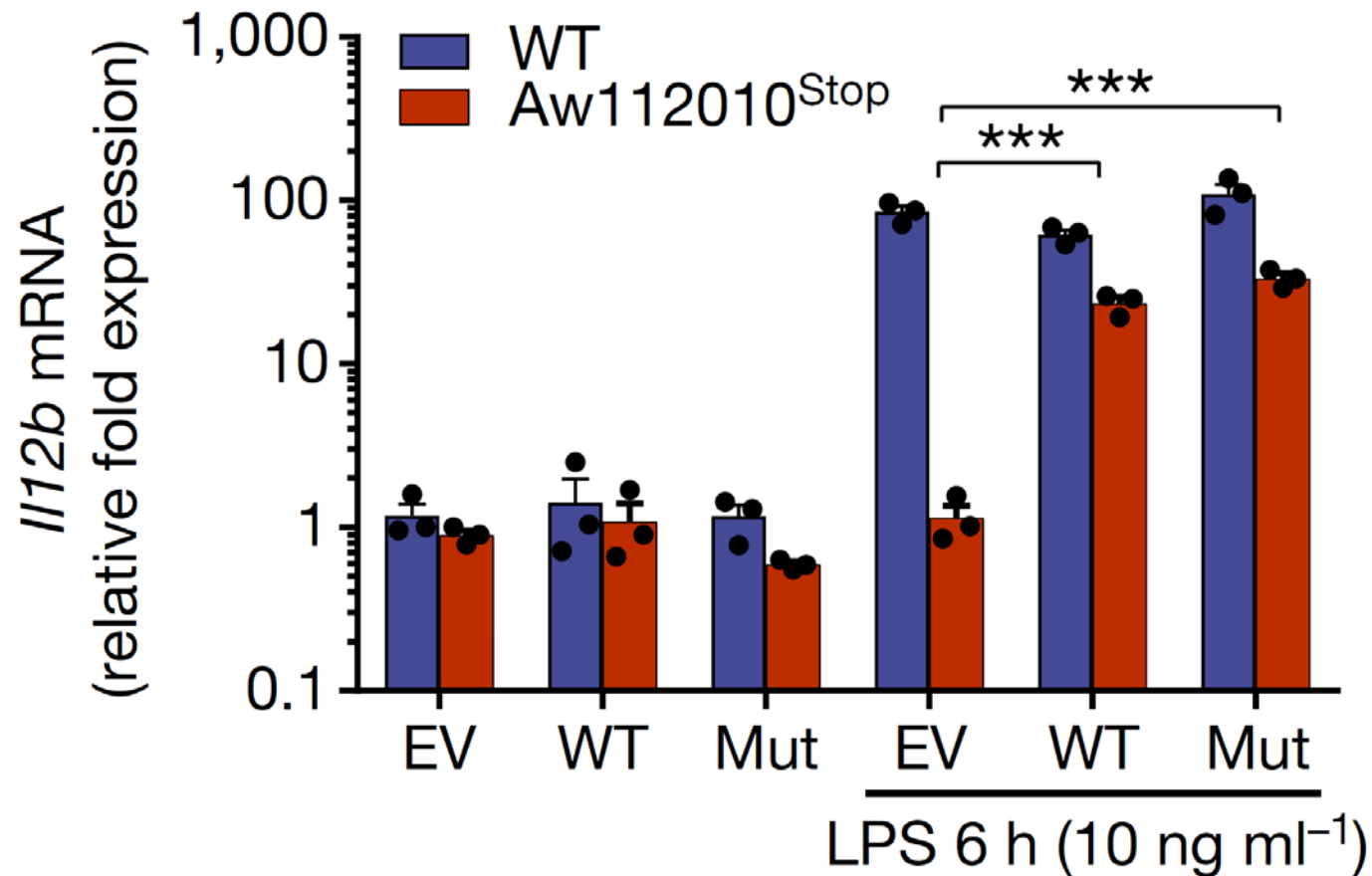


The authors created a very different version of *Aw112010*, where the nucleic acid sequence is heavily mutated, but the amino acid sequence remains the same



**The predicted RNA  
secondary structures  
are very different**

Re-introduction of both the wild-type and heavily mutated *Aw112010* into *Aw112010*<sup>Stop</sup> mice rescued IL-12 production



Plasmids expressing *Aw112010* or the empty vector (EV) were delivered to bone marrow-derived macrophages by electroporation.

### Conclusions

**The translation of non-canonical open reading frames controls mucosal immunity**

- **Profiling translation in specific situations** (e.g. infection, LPS stimulation) can lead to the discovery of previously unknown, functional proteins.
- Various bioinformatics tools exist for **re-analyzing Ribo-Seq** data to identify translated ORFs *de novo*.
- Some open questions remain:
  - What are the functions of the other translated IncORFs?
  - What role does *Aw112010* play in humans?

# Pervasive functional translation of noncanonical human open reading frames

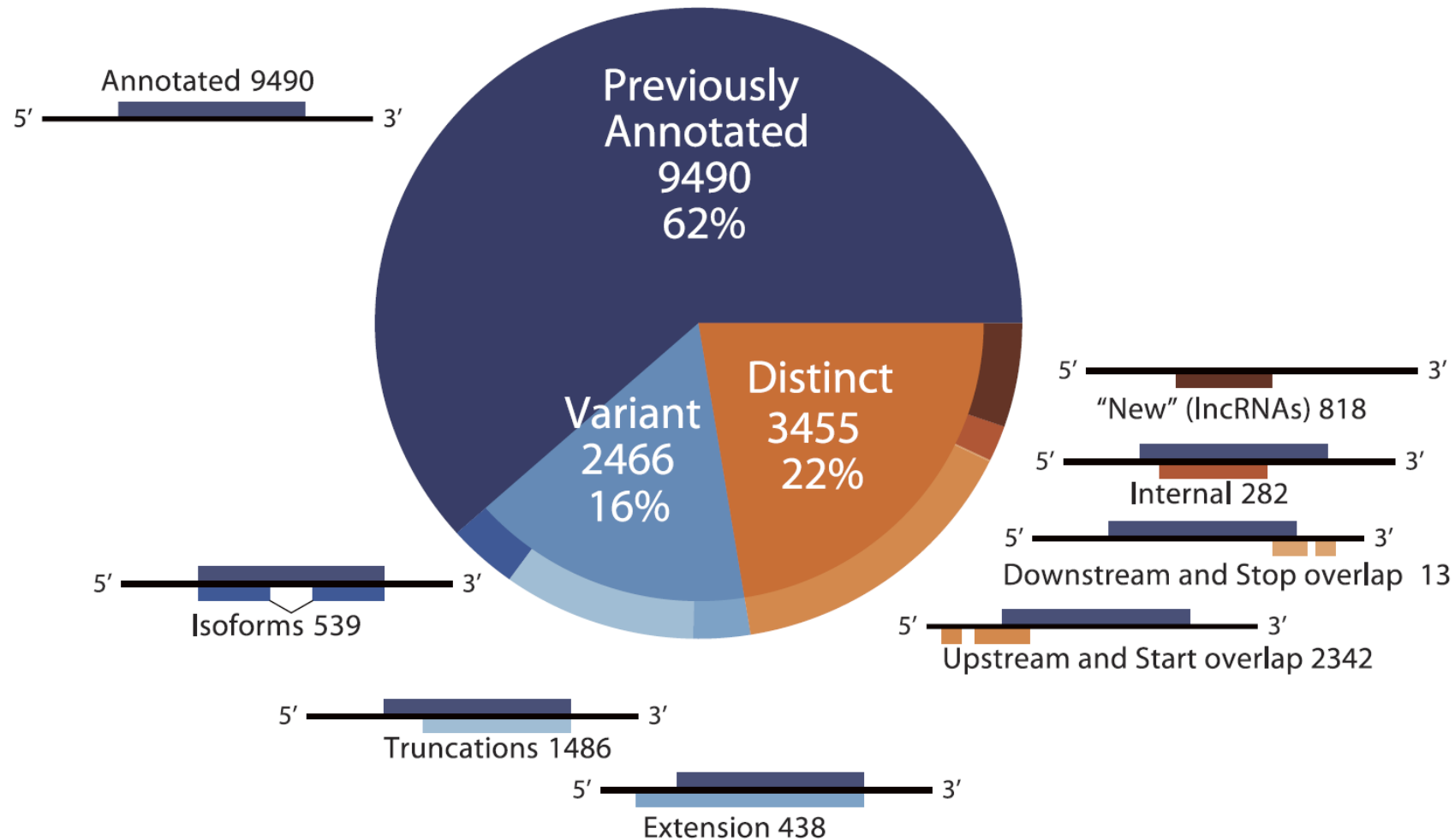
Jin Chen<sup>1,2</sup>, Andreas-David Brunner<sup>3</sup>, J. Zachery Cogan<sup>1,2</sup>, James K. Nuñez<sup>1,2</sup>, Alexander P. Fields<sup>1,2\*</sup>,  
Britt Adamson<sup>1,2†</sup>, Daniel N. Itzhak<sup>4</sup>, Jason Y. Li<sup>4</sup>, Matthias Mann<sup>3,5</sup>,  
Manuel D. Leonetti<sup>4</sup>, Jonathan S. Weissman<sup>1,2‡</sup>

**Science, March 2020**

The authors aimed to obtain a **global view** of functional non-canonical ORFs.

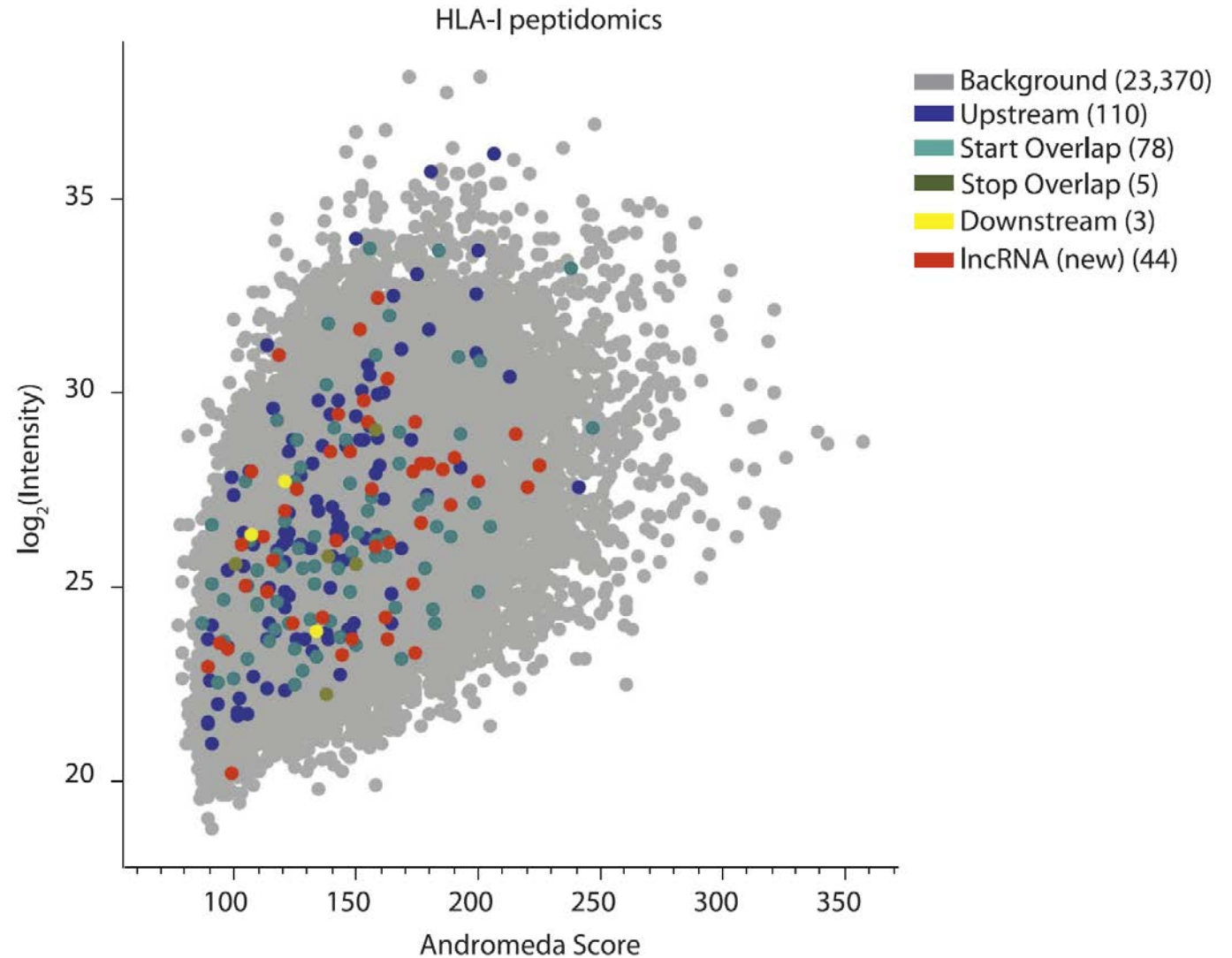
1. First, they generated a large **Ribo-Seq** dataset, and used ORF-RATER to identify potential ORFs.
2. A specialized **CRISPR-ko library** was then constructed to target 2353 non-canonical ORFs.  
→ A **pooled screen** identified >500 ORFs whose knockout caused a **fitness defect**.
3. Selected hits were validated.

# Analysis of Ribo-Seq data using ORF-Finder identifies 38% new ORFs



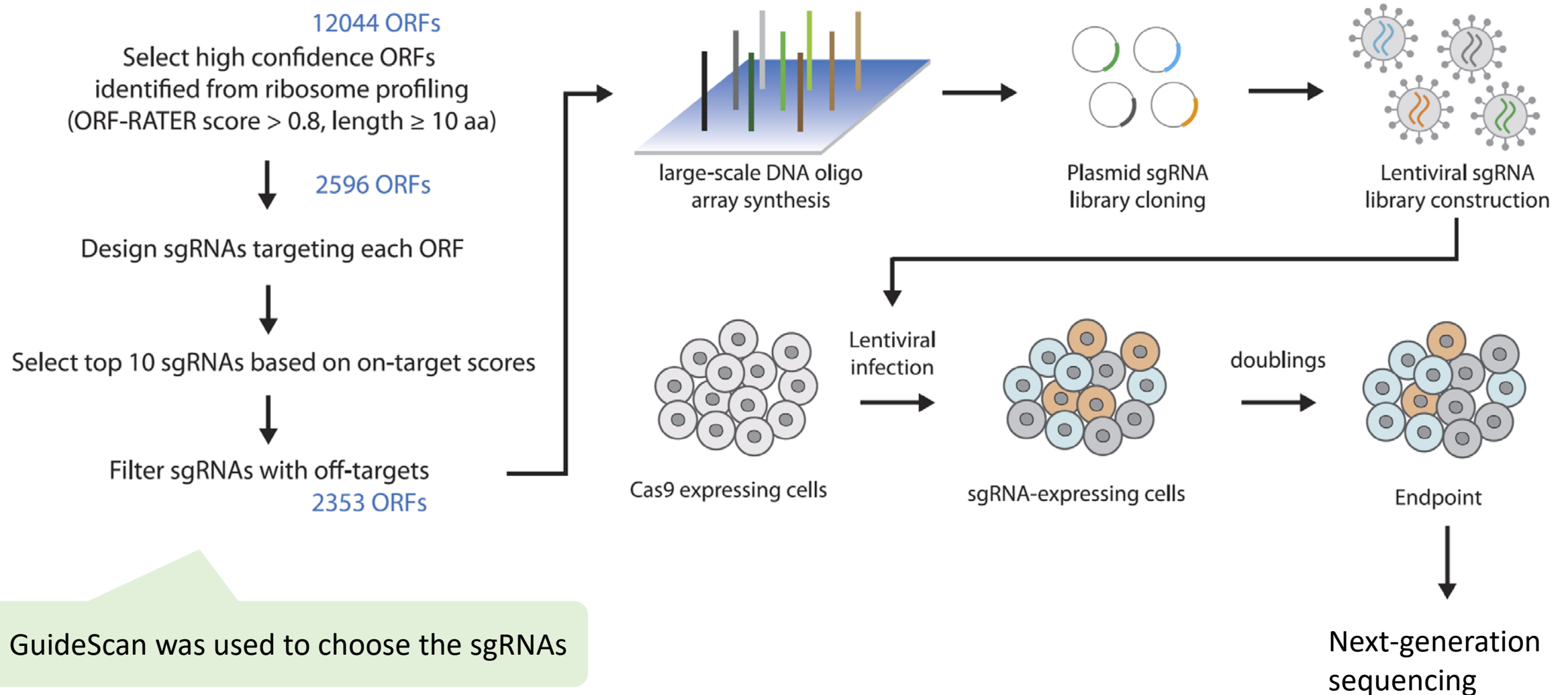
Data from human induced pluripotent stem cells (iPSCs), iPSC-derived cardiomyocytes, and human foreskin fibroblasts (HFFs) were pooled

HLA-I peptidomics  
(mass spectrometry  
of peptides eluted  
from HLA-I)  
confirms 240  
non-canonical  
peptides





# Design of a CRISPRko library targeting non-canonical ORFs



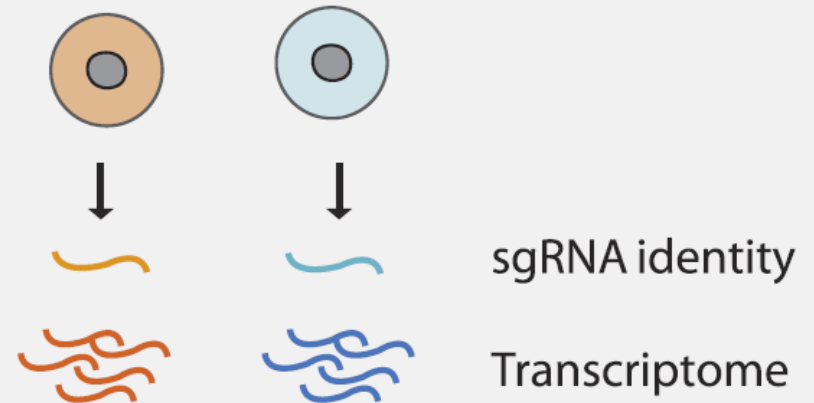
The endpoints included cell fitness/growth, as well as transcriptional changes (Perturb-Seq)

### Growth

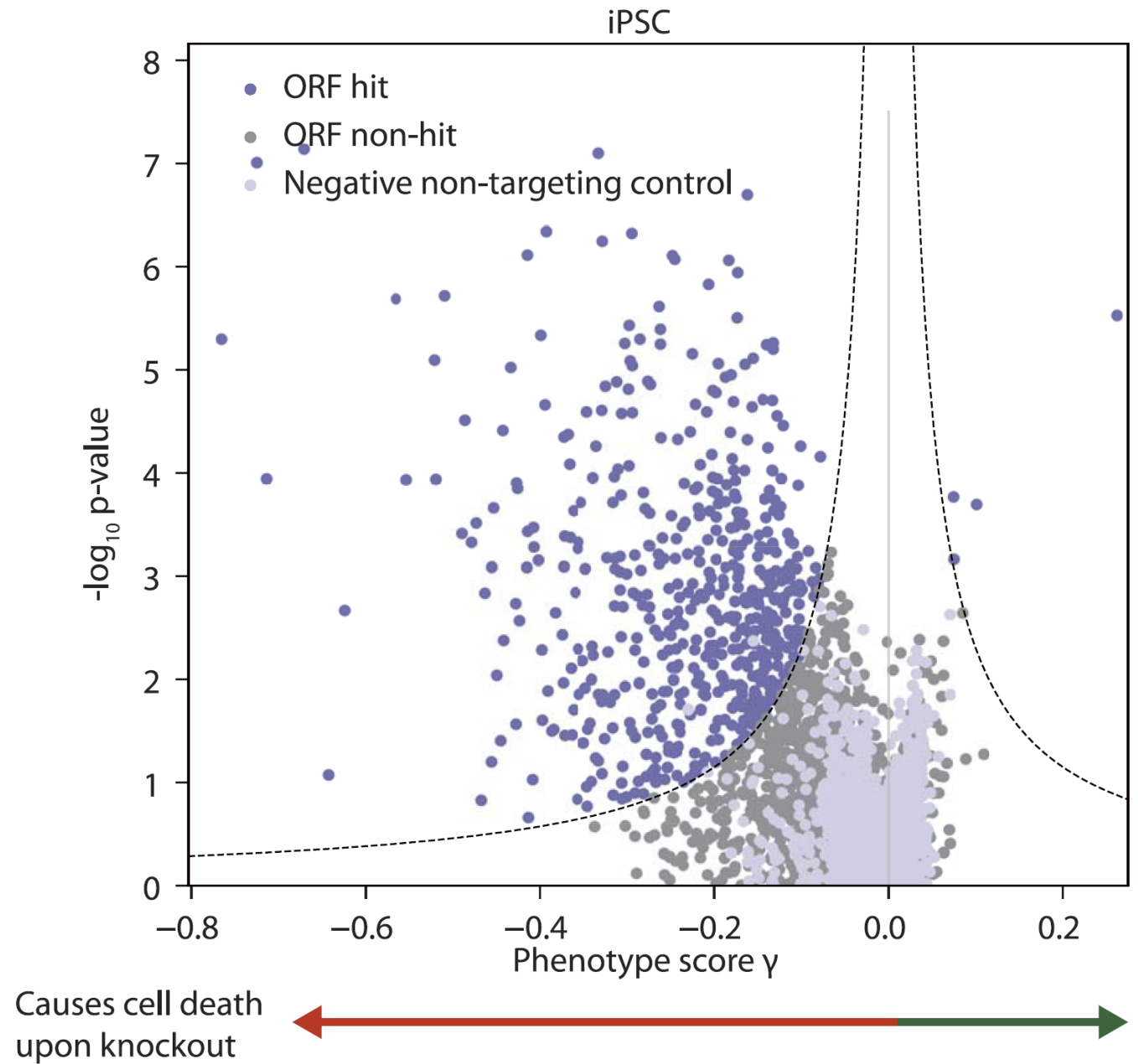
$$\frac{\log_2 \text{sgRNA enrichment}}{\text{cell doublings}}$$

= growth phenotype ( $\gamma$ )

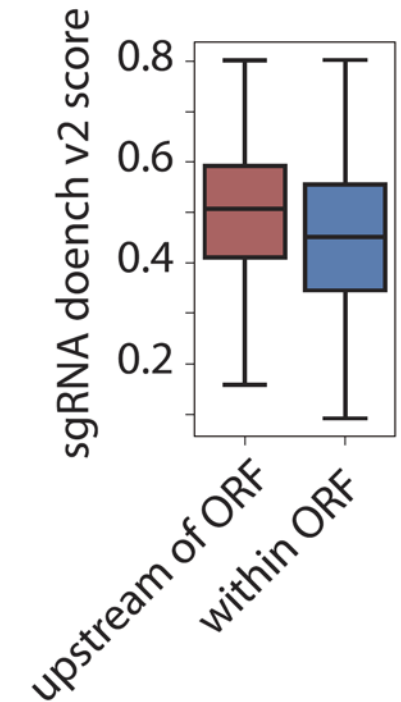
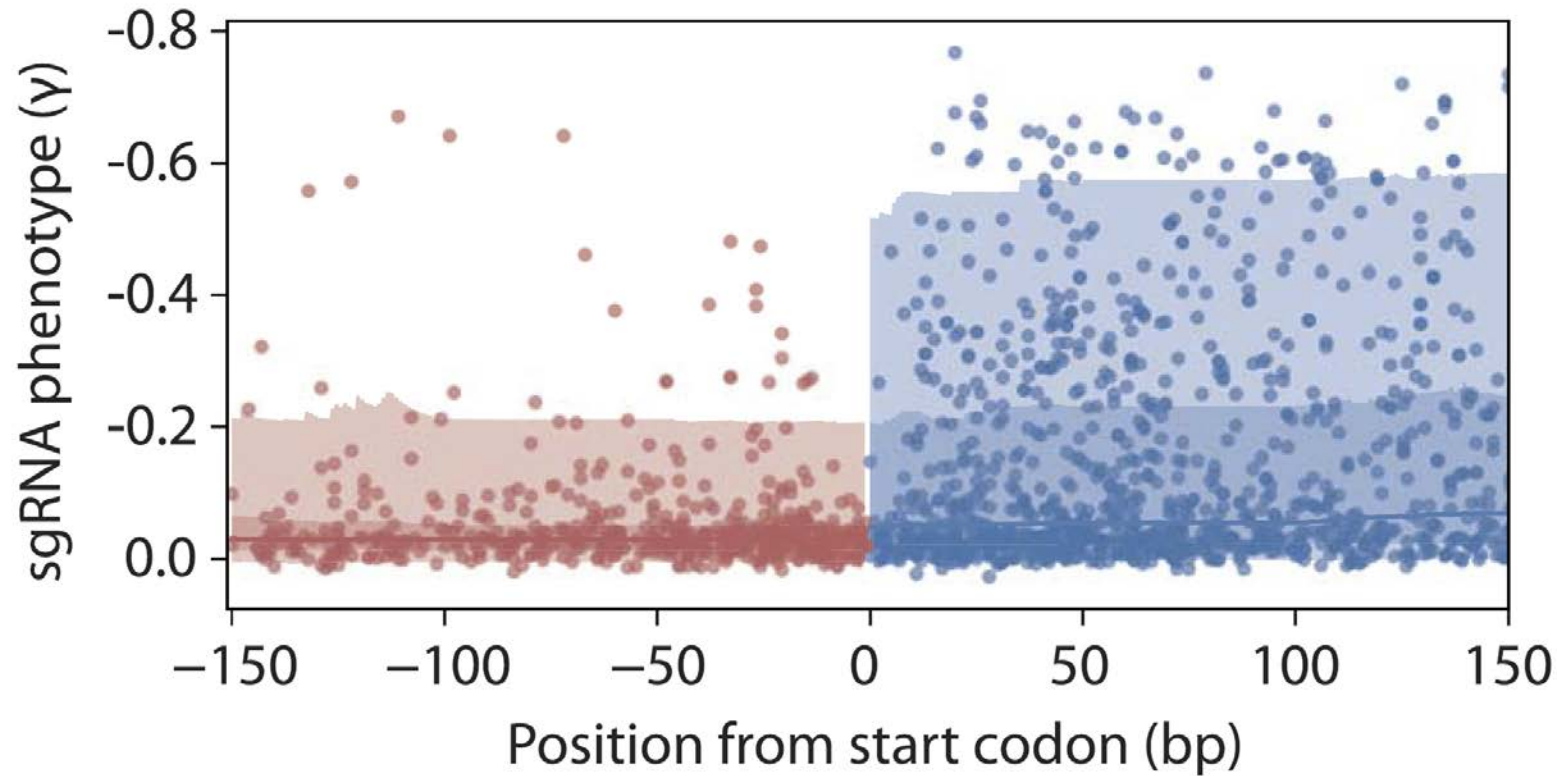
### Single-cell RNA-seq (Perturb-Seq)



> 500 ORFs were  
found to influence  
fitness in iPSCs!

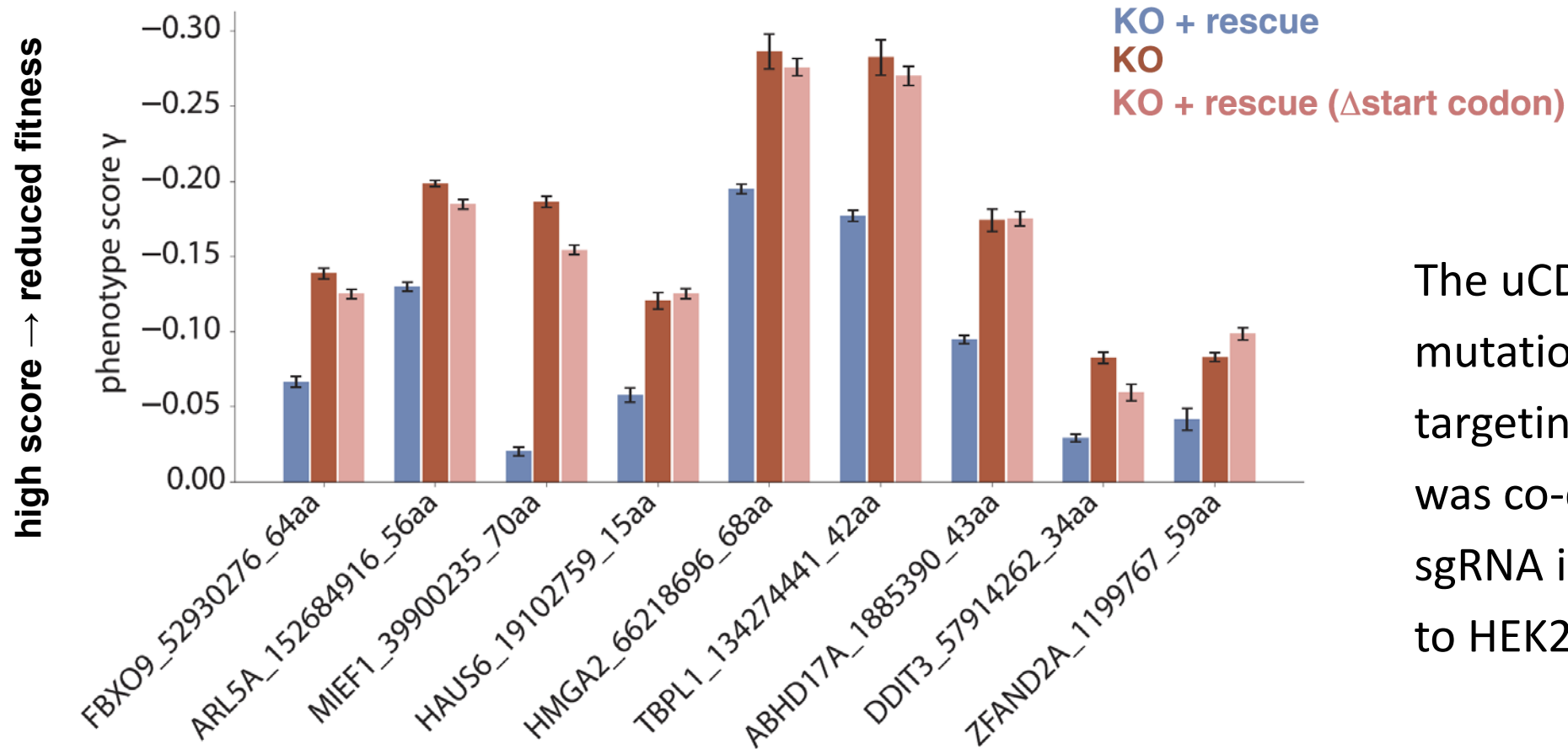


Guides targeting the ORFs showed much higher fitness effects than control guides



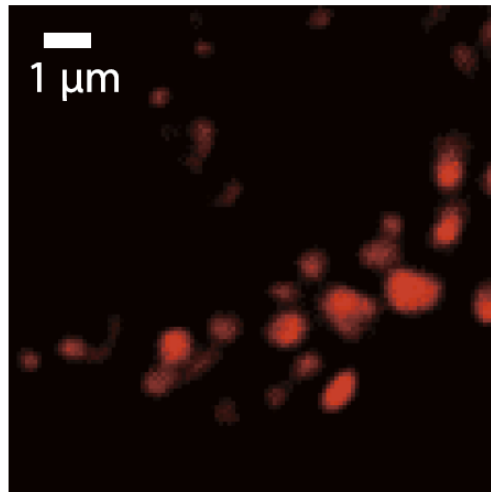
predicted efficiency scores were the same

Selected upstream ORFs were confirmed by ectopically expressing a transcript that encodes **only the uORF peptide**

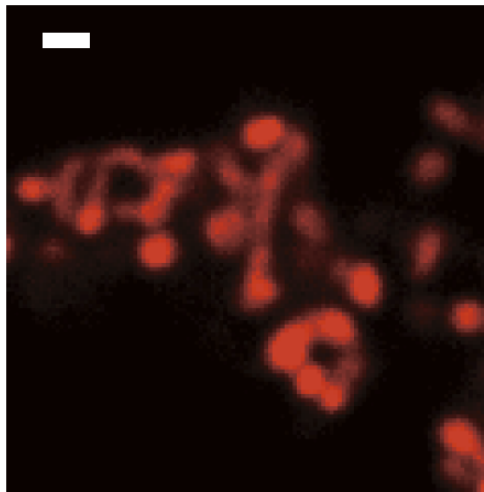


The uCDS (with synonymous mutations to prevent targeting by the sgRNA) was co-delivered with the sgRNA in a lentiviral vector to HEK293 cells.

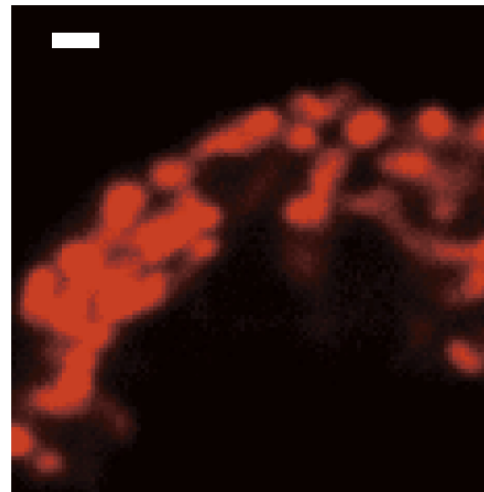
Example: Overexpression of the MIEF1 uORF increased mitochondrial *fission*, whereas its knockout increased *fusion*



MIEF1 uORF  
overexpression



Wild-type



MIEF1 uORF  
KO

MIEF1 = Mitochondrial Elongation Factor 1

# Conclusions

## Pervasive functional translation of noncanonical human open reading frames

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- A CRISPR screen demonstrates that hundreds of non-canonical ORFs have significant fitness effects.
  - ORFs that are dispensible for cell growth or survival, but have specific other functions, are not detected.
- Many upstream ORFs encode for functional proteins.
  - These are sometimes related to the function of canonical ORF.

Thank you for your attention!