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Computational prediction and experimental validation identify functionally conserved lncRNAs from zebrafish to human

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Functional studies of long noncoding RNAs (IncRNAs) have been hindered by the lack of methods to assess their evolution. Here we present IncRNA Homology Explorer (IncHOME), a computational pipeline that identifies a unique class of long noncoding RNAs (lncRNAs) with conserved genomic locations and patterns of RNA-binding protein (RBP) binding sites (coPARSE-lncRNAs). Remarkably, several hundred human coPARSE-IncRNAs can be evolutionarily traced to zebrafish. Using CRISPR-Cas12a knockout and rescue assays, we found that knocking out many human coPARSE-IncRNAs led to cell proliferation defects, which were subsequently rescued by predicted zebrafish homologs. Knocking down coPARSE-IncRNAs in zebrafish embryos caused severe developmental delays that were rescued by human homologs. Furthermore, we verified that human, mouse and zebrafish coPARSE-IncRNA homologs tend to bind similar RBPs with their conserved functions relying on specific RBP-binding sites. Overall, our study demonstrates a comprehensive approach for studying the functional conservation of lncRNAs and implicates numerous IncRNAs in regulating vertebrate physiology.

A major advance in molecular biology and genomics over the last few decades is the discovery and characterization of long noncoding RNAs (lncRNAs), transcripts that are larger than 200 nucleotides (nt) without protein-coding potential¹. LncRNAs can act as regulators in numerous physiological processes and diseases²⁻⁴. A well-known example is Xist, which reshapes chromatin architecture to ensure X-chromosome

inactivation and achieve dosage compensation in mammalian females⁵. Another example is JPX, which controls the genome-wide binding of CCCTC-binding factor to regulate the 3D structure of the mouse genome⁶. In addition, Bvht has been shown as essential for cardiovas-cular lineage commitment⁷ and Pnky to regulate the differentiation of neural stem cells⁸.

¹MOE Key Laboratory of Bioinformatics, Center for Synthetic and Systems Biology, School of Life Sciences, Tsinghua University, Beijing, China. ²Beijing Advanced Innovation Center for Structural Biology & Frontier Research Center for Biological Structure, School of Life Sciences, Tsinghua University, Beijing, China. ³Tsinghua-Peking Center for Life Sciences, Beijing, China. ⁴Institute of Molecular Medicine, College of Future Technology, Peking University, Beijing, China. ⁵Academy for Advanced Interdisciplinary Studies, Peking University, Beijing, China. ⁶State Key Laboratory of Membrane Biology, Institute of Zoology, Chinese Academy of Sciences, Beijing, China. ⁷Institute for Stem Cell and Regeneration, Chinese Academy of Sciences, Beijing, China. ⁸Department of Biomedical Engineering, College of Future Technology, Peking University, Beijing, China. ⁹University of Chinese Academy of Sciences, Beijing, China. ¹⁰School of Life Sciences, Shandong University, Qingdao, China. ¹¹These authors contributed equally: Wenze Huang, Tuanlin Xiong, Yuting Zhao. *Center Strue Strue* Dysregulation of lncRNAs has been linked to diverse pathological processes^{9,10}. HOTAIR and MALAT1 have been reported to regulate tumorigenesis in various human cancers^{11–14}. Mhrt functions in the pathogenesis of cardiomyopathy including hypertrophy and heart failure¹⁵. A highly conserved lncRNA NORAD functions in maintaining genome stability by sequestering PUMILIO proteins¹⁶. Despite these notable examples, the function of most lncRNAs remains unknown, and it has been postulated that many lncRNAs may not be functional, owing to their minimal sequence conservation¹⁷.

Comparative sequence analysis can provide useful information for dissecting lncRNA evolution and functions¹⁸⁻²⁰. Through sequence analysis, a study identified THORLNC as a highly conserved lncRNA in vertebrates²¹. Further analysis revealed its conserved oncogenic function in human and zebrafish. Another study reported that defects in zebrafish deficient for the lncRNAs Cyrano and Megamind can be rescued upon complementation with human or mouse homologs²². These examples demonstrate the feasibility of searching for functionally conserved lncRNAs through sequence analysis.

However, an overwhelming majority of IncRNAs show little sequence similarity^{1,23,24}. For example, only 5.1% of IncRNAs from zebrafish were found to have mammalian homologs in the aforementioned study at the sequence level²². Serendipitously, IncRNAs lacking apparent sequence conservation may still have conserved functionality. For example, human JPX can rescue the defects of cell viability in *Jpx* knockout (KO) mouse embryonic stem cells, despite the substantial sequence and structural divergence between the two homologs²⁵. It thus appears clear that IncRNA evolution and protein-coding gene evolution have substantially different constraints^{2,26,27}. Accordingly, an innovative strategy to identify IncRNA homologs in distant species is urgently needed.

A previous strategy integrating synteny, microhomology of short sequence motifs and secondary structure successfully identified roX homologs among 35 fly species, even for the most distantly related species with no detectable primary sequence similarity²⁸. In that study, the microhomology analysis was based on the roX box motif, an essential functional element of roX. In general, IncRNAs often interact with RNA-binding proteins (RBPs) through short sequence motifs to exert their functions^{29,30}. Recall, for example, that NORAD functions by binding PUMILIO¹⁶ and THORLNC functions by binding IGF2BP1 (ref. 21). For IncRNA homologs with similar functions, the order and the sequence of these functional elements may appear conserved under selection pressure, whereas other nonessential sequences may evolve rapidly. It should thus be possible to identify functionally conserved IncRNAs across species by evaluating IncRNAs based on overall patterns of conserved RNA motifs.

Here we developed a computational method to identify lncR-NAs with conserved genomic locations and patterns of RBP-binding sites across species (coPARSE-IncRNAs). We identified 570 human coPARSE-IncRNAs with a predicted zebrafish homolog, only 17 of which have detectable sequence similarity between the two species. Furthermore, we performed a CRISPR-Cas12a KO screen and identified 75 coPARSE-IncRNAs that promote cell proliferation in at least one of three cancer cell lines. We show that the loss of four human coPARSE-IncRNAs can be phenotypically rescued by their predicted zebrafish homologs and vice versa. We also verified that human, mouse and zebrafish homologs of two coPARSE-IncRNAs interact with similar sets of RBPs, supporting their functional conservation in RBP binding. Importantly, wild-type homologous lncRNA fragments but not variants containing mutated binding sites of certain RBPs rescued the knockdown/KO of a coPARSE-IncRNA in another species, supporting that coPARSE-lncRNAs are functionally related through interactions with specific RBPs. Together, our study substantially expands the known repertoire of conserved lncRNAs across vertebrates, reveals insights about the evolution and mechanisms of lncRNA functions and provides a powerful tool and analytical framework to support further studies of functional lncRNA conservation.

Results

LncRNAs across vertebrates share little sequence conservation

To explore lncRNA homology, we initially annotated lncRNA datasets for six vertebrates, including cow, opossum, chicken, lizard, frog and zebrafish, as an addition to the existing high-quality lncRNA annotations for human and mouse from the GENCODE project³¹ (Fig. 1a; Methods). Specifically, we collected 233 RNA-sequence (RNA-seq) datasets for these six vertebrates (Extended Data Fig. 1a and Supplementary Table 1). We then assembled transcripts from the RNA-seq data and identified lncRNAs adapting an established pipeline²⁴, where we filtered out transcripts with protein-coding potential >0.5 predicted by the coding-potential assessment tool (CPAT)³² (Extended Data Fig. 1b). We found that our curated lncRNAs share extensive overlap with the lncRNAs from five other public sources, including Ensembl³³ and a curation from the Ulitsky laboratory²⁴ (Extended Data Fig. 1c,d). We then merged our annotations with these public curations to form the final lncRNA dataset (Extended Data Fig. 1e,f).

We obtained 20,688–42,725 candidate lncRNAs for the six vertebrate species (Fig. 1a and Extended Data Fig. 1e,f). Agreeing with previous reports^{20,24}, these lncRNAs showed consistently lower protein-coding potential, lower expression level and higher tissue specificity than protein-coding genes (Extended Data Fig. 2a–d). As expected, there was very little sequence conservation among the lncRNAs across these vertebrates (Fig. 1a and Extended Data Fig. 2e). From a pairwise BLAST analysis between the eight vertebrates, only 0.3–3.9% of the lncRNAs from one species had detectable sequence similarity with lncRNAs from another species (Methods), levels much lower than those for protein-coding genes (40–90%). Collectively, these results reinforce the concept that lncRNAs generally share very low sequence-level conservation.

Identification of candidate IncRNA homologs with synteny

Synteny analysis can identify chunks of genomic regions sharing the same evolutionary origin¹⁸. We speculated that synteny information may be informative for identifying conserved lncRNAs. Pursuing this, we designed a predictive random forest model to identify candidate lncRNA homologs across vertebrates for each human lncRNA based on synteny (Fig. 1a and Extended Data Fig. 3a; Methods). We used two sets of 'synteny indicators' along the genomes and defined 12 features of these two 'synteny indicators' for random forest model prediction (Extended Data Fig. 3b). The protein-coding homolog pairs and their associated scores were used as the training set for the model, which was then used for predicting synteny relationship of lncRNA pairs.

This analysis discovered syntenic counterparts in other species for thousands of human lncRNA genes (Extended Data Fig. 3c and Supplementary Table 2). The genome context for the identified syntenic lncRNA candidates was largely similar to that of homologous protein-coding genes (Fig. 1b and Extended Data Fig. 3d). Nevertheless, fewer than 10% of lncRNAs had unique syntenic lncRNAs in the seven other species, while most human lncRNAs had 2–5 syntenic candidates (Extended Data Fig. 3e). Thus, further analysis is needed to refine the list of candidates to identify evolutionarily conserved lncRNA homologs.

$Identification\, of\, evolution arily\, co {\sf PARSE-lncRNA}\, homologs$

RBPs function as essential regulators of RNA, and recent studies have accumulated large-scale data resources for transcriptome-wide profiling of RBP-binding sites³⁴⁻³⁶. Numerous studies have observed that RBP–RNA interactions tend to be conserved across species^{37,38}. For instance, binding motifs of ELAVL1 and HNRNPA1 are similar in human and zebrafish (Extended Data Fig. 3f; Methods). We thus speculated



Fig. 1 | **Identification of coPARSE-IncRNA and their homologs across vertebrates. a**, A simplified workflow for IncHOME analysis of vertebrate IncRNAs. The phylogenetic tree shows the evolutionary descent of eight vertebrates, with the number of annotated IncRNAs in each species. The heatmap shows the Jaccard index of IncRNAs and protein-coding genes identified by sequence similarity across eight vertebrates (top). IncHOME defines coPARSE-IncRNAs by combining the alignment of homologous protein-coding genes and corresponding genomic anchors (bottom left) and analysis of similar motif distribution patterns (bottom right). **b**, Contour line plot of syntenic IncRNAs in human versus mouse and human versus zebrafish identified by IncHOME, in terms of the proportion of common protein-coding genes and the proportion of corresponding genomic anchors. Background density plot showing the proportion scores for protein-coding genes with one-to-one homology. **c**, The distribution of curated RNA motifs for representative RBPs. Represented motifs for two example RBPs (FUS and TARDBP) are shown. **d**, coPARSE-IncRNA homolog pairs with similar motif distribution patterns between human and mouse. A coPARSE-IncRNA with annotation in the IncRNAdb database is highlighted in red. The IncRNA THORLNC is highlighted in blue. Red dashed lines represent the median value of the MPSSs and the GPSs.

that consensus patterns of RBP-binding sites could be informative for identifying functionally conserved lncRNA homologs.

We first defined a library of RBP-binding motifs for the eight species examined in our study (Methods). For humans, we constructed the library based on the following: (1) results of motif calling from high-throughput cross-linking and immunoprecipitation (CLIP)-seq data using the MEME suite³⁹ and (2) available RNA motifs from databases including RNACOMPETE³⁸, CISBP-RNA³⁸, RBPDB⁴⁰ and ATtRACT⁴¹ (Extended Data Fig. 3g). For each of the other species, we extrapolated every human motif to define a corresponding new species-specific motif, using an iterative mapping-and-refinement strategy (Extended Data Fig. 3h). Finally, we obtained 2,171 motifs for human (181 RBPs), 2,165 motifs for mouse (179 RBPs) and 1,844 motifs for zebrafish (144 RBPs; Fig. 1c, Extended Data Fig. 3i, j and Supplementary Table 3).

We then identified homologous lncRNAs for every human lncRNA based on a motif-pattern similarity score (MPSS) and a gap penalty score (GPS; Methods). We defined 'IncRNA Homology Explorer (IncHOME)-predicted IncRNA homologs' as the two members of a IncRNA pair between two vertebrates for which (1) the MPSS was higher than the corresponding background threshold (P < 0.05, permutation test; Extended Data Fig. 4a), (2) the GPS was lower than the corresponding background threshold (P < 0.05, permutation test) and (3) the MPSS was higher than 0.8 times of the maximum MPSS among all candidate pairs.

The IncHOME pipeline predicted homologs for 570–5,564 human IncRNAs in other vertebrates (Supplementary Tables 4 and 5), which we defined as coPARSE-IncRNAs for their conserved patterns in synteny and RBP-binding sites. Specifically, 5,564 (35.3%) human IncRNAs are coPARSE-IncRNAs with predicted homologs in mouse, among which around a half had predicted homologs in at least a third species, and notably, 570 (3.6%) human coPARSE-IncRNAs had predicted homologs in zebrafish (Extended Data Fig. 4b). We found no correlation between MPSS and GPS (Extended Data Fig. 4c), indicating no inflation of our estimation of significance for the identified coPARSE-IncRNA homolog pairs.

Supporting the accuracy of the pipeline, IncHOME identified the correct mouse homologs of all 26 human IncRNAs in IncRNAdb⁹ with known homologs (Fig. 1d). Additionally, we found that many well-known IncRNAs are coPARSE-IncRNAs. For example, we found that THORLNC²¹ is a coPARSE-IncRNA with a predicted mouse homolog Gm29359.

We examined length-matched, nontranscribed DNA regions or enhancer element pairs that are in the same syntenic regions of coPARSE-lncRNA pairs (Methods) and found that few selected genomic region pairs (0.2%) or enhancer element pairs (1.9%) were predicted as 'coPARSE' regions, supporting that lncHOME predictions have a low false positive rate (Extended Data Fig. 4d). We also found no correlations between the lengths of the coPARSE-lncRNAs and MPSS or GPS (Extended Data Fig. 4e).

It bears mention that 515 (90.4%) of 570 human coPARSE-IncRNAs have one-to-one homolog correspondence in both mouse and zebrafish. For comparison, 83.2% of all human protein-coding genes have one-to-one homolog correspondence in mouse (Extended Data Fig. 4f). Together, these results demonstrate that incorporating conserved RBP-binding site data substantially improves the accuracy of IncHOME in predicting potential IncRNA homologs.

Evolutionary and functional features among IncRNA homologs

We divided the coPARSE-IncRNAs and their homologs into the following two groups: a homolog_ss group containing 605 coPARSE-lncRNA homolog pairs with high sequence similarity (>50%) and a homolog_nss group containing the other 4,959 coPARSE-IncRNA homolog pairs with low or no sequence similarity. We then compared sequence conservation for the coPARSE-lncRNA homolog pairs in the two groups (Methods). For both human versus mouse and human versus zebrafish, the homolog_ss coPARSE-IncRNAs are substantially more conserved than the homolog_nss coPARSE-IncRNAs, whereas the homolog_nss coPARSE-IncRNAs were only marginally more conserved than random IncRNAs, based on the PhastCons and PhyloP conservation scores^{42,43} (Fig. 2a and Extended Data Fig. 4g). Interestingly, we found that the motif regions have a much lower density of common single-nucleotide polymorphisms (SNPs) or major alternative allele frequencies (Fig. 2b,c) than nonmotif regions for both homolog_ss and homolog_nss coPARSE-IncRNAs. These results suggest that predicted motif regions of coPARSE-IncRNAs have undergone stronger selection pressures than the nonmotif regions.

We also found that coPARSE-IncRNA homologs share a relatively higher level of histone modification pattern similarity than the random IncRNA pairs (Fig. 2d; Methods), suggesting similar transcription programs regulating coPARSE-IncRNA homolog pairs. Indeed, coPARSE-IncRNA homolog pairs exhibit comparable tissue-expression profiles across different species, both higher than other random syntenic lncRNA pairs (Fig. 2e, f and Extended Data Fig. 4h).

Moreover, 270 (47%) of 570 human coPARSE-IncRNAs located in genomic regions implicated in diseases by genome-wide association studies, a proportion higher than that of other human lncRNAs (Extended Data Fig. 4i). It is also notable that compared to random lncR-NAs, the human coPARSE-lncRNAs are enriched for disease-associated mutations (Fig. 2g), and their expression is more likely to be dysregulated in cancer tissues (Fig. 2h and Extended Data Fig. 4j). As an illustration, we noted 13 ClinVar⁴⁴ mutations within KCNQ10T1 (Extended Data Fig. 4k), a coPARSE-lncRNA that has been previously linked to Beckwith–Wiedemann syndrome⁴⁵.

A CRISPR screen identified lncRNAs promoting proliferation

To functionally characterize coPARSE-IncRNAs, we performed an extensive CRISPR-based KO screen (Methods). Briefly, we conducted cell proliferation assays using cancer cell lines for 574 human lncRNAs (including 249 coPARSE-IncRNAs with predicted homologs in zebrafish) that are highly expressed in human cancer samples (Extended Data Fig. 5a and Supplementary Table 6). We used the nuclease Cas12a⁴⁶, coupled with a pair of crRNA oligonucleotide sequences, to generate genome deletions to KO the function of target genes (Fig. 3a). To construct the KO library, we designed 20 pairs of crRNA oligonucleotide sequences for each of the 574 lncRNAs to purposely target regions including promoter regions⁴⁷. We then constructed a library based on a lentiviral vector containing paired crRNAs driven by the U6 promoter with a downstream reporter cassette of cytomegalovirus promoter-enhanced green fluorescent protein (CMV–EGFP)⁴⁷ (Extended Data Fig. 5b).

The PCR results indicated that the KO efficiency ranged from 47.2% to 71.0% for the targeted regions (Extended Data Fig. 5c,d). The real-time quantitative PCR (RT-qPCR) analysis indicated 57.9-87.5% KO efficiency for the examined lncRNAs (Extended Data Fig. 5e). We introduced the library by lentiviral transduction to three cancer cell lines (HeLa, Huh7 and MCF7) stably expressing Cas12a and selected green fluorescent protein (GFP)-positive cells for propagation (Extended Data Fig. 6a,b). We observed high agreement between experimental replicates (Extended Data Fig. 6c) and high evenness of the crRNA distribution at day 0 as well as a gradual increase in unevenness during screening (Extended Data Fig. 6d). As expected, the overall abundance of crRNAs targeting positive controls consistently decreased during screening, as compared with the crRNAs targeting the nonfunctional adeno-associated virus integration site 1 (AAVS1) intron loci (Extended Data Fig. 6e). Collectively, these data provide compelling evidence for the robustness and reliability of our KO screen.

We identified 167 lncRNAs (75 coPARSE-lncRNAs) with significantly decreased crRNA abundance at days 15, 30 and 45 as compared to day 0 in the three cancer cell lines (Fig. 3b–d, Extended Data Fig. 6f,g and Supplementary Table 7). The screen recovered 74% or 14 positive control oncogenes (for example, *XIST*⁴⁸ and *RNY1*; Fig. 3b and Extended Data Fig. 6g). Notably, 82% of the crRNAs targeting these genes were depleted (Supplementary Table 7). Consistent with a previous study⁴⁷, we observed limited overlap between different cell lines (Fig. 3d). Notably, there is no correlation between robust rank aggregation (RRA) scores and genomic copy-number variation (CNV), indicating that the screening results were not biased by copy-number-amplified regions (Extended Data Fig. 6h), which is a potential cause for false positives in CRISPR screening⁴⁹.

We focused on several negatively selected coPARSE-IncRNAs to validate the screening results. We confirmed that, for a positive control IncRNA RNY1 and two candidate coPARSE-IncRNAs (RPI-212P9.3 and AL355075.4), KO by all paired crRNAs caused a substantial reduction in the cell proliferation rate (Extended Data Fig. 7a). Of particular note, shRNA knockdown of three coPARSE-IncRNAs (RPI-212P9.3, AL355075.4 and RPI1-563J2.3) confirmed their functions in promoting



Fig. 2 | The coPARSE-IncRNAs and their predicted homologs share similar evolutionary and functional features. a, The distribution of average conservation scores (PhastCons) for coPARSE-IncRNA homolog pairs with sequence similarity (homolog ss, n = 605/17 for human versus mouse/human versus zebrafish) and without sequence similarity (homolog nss, n = 4,959/553for human versus mouse/human versus zebrafish), and paired lncRNAs randomly selected from human and mouse lncRNAs (nonhomolog, n = 5,000). **b**, The distribution of common SNP density of SNPs in motif or nonmotif regions in human coPARSE-IncRNAs among the homolog_ss (n = 605) and homolog_nss (n = 4,959) groups of lncRNA pairs. c, The distribution of major alternative allele frequency of SNPs in motif or nonmotif regions in human coPARSE-IncRNAs among the homolog_ss (n = 605) and homolog_nss (n = 4,959) groups of lncRNA pairs. d, The distribution of the common histone modification site rate among the homolog_ss (n = 605), homolog_nss (n = 4,959) and nonhomolog (n = 5,000) groups of IncRNA pairs. For a-d, two-sided Mann-Whitney U test. Boxes, IQR. Center lines, median, Whiskers, values within 1.5× IOR of the top and bottom

quartiles. **e**, Heatmap of normalized expression values of coPARSE-IncRNAs and their predicted homologs in five organs (brain, kidney, liver, muscle and spleen) and three species (human, mouse and zebrafish) are displayed (top), and distribution of tissue-specific expression score (among the five organs) of the coPARSE-IncRNAs and their homologs (bottom). **f**, Correlation of tissue specificity of homolog_ss and homolog_nss groups of coPARSE-IncRNAs and their homologs among three species. **g**, Distribution of enrichment for human coPARSE-IncRNA genes with ClinVar mutations (excluding the mutations falling in exons of protein-coding genes), compared to randomly selected lncRNA genes (*P* value calculated using a permutation test). Blue dashed lines represent the nonenrichment threshold of 1. **h**, Enrichment of the homolog_ss and homolog_ nss groups of human coPARSE-IncRNAs with homologs in mouse for differentially expressed lncRNAs across different cancer types. Each dot represents a cancer type, and the orange and yellow colors indicate significant enrichment (*P* values calculated using two-sided Fisher's exact test). IQR, interquartile range.





the top ten negatively selected lncRNAs are highlighted in red, whereas the non-coPARSE-lncRNAs are highlighted in orange. Nine positive control genes are shown in blue (round dots for lncRNAs and triangles for protein-coding genes). Background represents the overall distribution. **c**, The mean read count value for paired crRNAs at day 45 relative to that of day 0 for lncRNA genes in our screening library. Highlighted dots are paired crRNAs for five negatively selected candidate genes in our screening assay, and the background represents the overall distribution. **d**, Overlap of the negatively selected lncRNAs in the three indicated cell lines. **e**, Cell proliferation validation assays in HeLa cells treated with two independent shRNAs for each candidate lncRNA. Error bars, means \pm s.d., n = 3 biologically independent experiments. DR, direct repeats.

cell proliferation (Fig. 3e and Extended Data Fig. 7b,c). Additionally, KO of the protein-coding gene *OPRD1*, which partially overlaps with RP1-212P9.3, did not affect cell proliferation (Extended Data Fig. 7d–g), supporting that the lncRNA gene per se, but not its adjacent protein-coding gene *OPRD1*, promotes cell proliferation. Thus, our screen has identified conserved coPARSE-lncRNAs regulating cancer cell proliferation.

Functional validation of the conservation of IncRNA homologs We next explored the functional conservation of coPARSE-IncRNAs

using a CRISPR–Cas12a KO-rescue system, in which KO human lncR-NAs were complemented with their predicted zebrafish homologs (Fig. 4a,b; Methods). After successfully testing doxycycline (Dox)-induced ectopic gene expression (Extended Data Fig. 7h,i), we transfected the Cas12a-expressing cancer cells using lentivirus particles targeting 21 human lncRNAs with rescue sequences of their zebrafish homologs (Fig. 4b, Extended Data Fig. 7j and Supplementary Table 8).

Proliferation assays revealed that all selected coPARSE-lncRNAs, except RP11-20123.6, showed 30–70% decrease in the proliferation rate for the no-Dox group as compared to the control (Fig. 4c). The cells grown in Dox-containing media had increased proliferation rates compared to the no-Dox group for five coPARSE-lncRNA and homolog pairs, indicating functional compensation by these five zebrafish homologs to promote proliferation. Note that the overall sequence identity of the four pairs (excluding THORLNC) was quite low, ranging from 39.4% to 44.9% (Supplementary Table 9).

We next focused on the coPARSE-IncRNA RP1-212P9.3 as an example. The ectopic expression of the predicted zebrafish homologous region partially rescued the cell proliferation defect resulting from RP1-212P9.3 KO, whereas the expression of a firefly luciferase gene fragment of matched length conferred no rescue effect (Fig. 4d, Extended Data Fig. 7k, I and Supplementary Table 9).

We also assessed the potential functional conservation of predicted homologs for coPARSE-IncRNAs in early zebrafish embryo development. For the four coPARSE-IncRNAs identified in the rescue assay (RP1-212P9.3, RP11-1055B8.4, RP11-429B14.1 and RP11-223I10.1), we used antisense oligonucleotides (ASOs) to knockdown the predicted homologs in zebrafish early embryos^{50–52} and observed evident developmental delays as judged by morphologies⁵³ (Fig. 4e, f and Extended Data Fig. 8a–d; Methods). Notably, the sense but not the antisense sequence of human coPARSE-IncRNA homologs rescued the development delay (Fig. 4e, f and Extended Data Fig. 8e, f). In addition, we found that knocking down the zebrafish lncRNA homologs led to reduced expression of known zygotic genes⁵⁴ in zebrafish embryos, suggesting a delay in the zygotic gene activation process (Extended Data Fig. 8g).

Finally, we focused on RP1-212P9.3 and examined its functional conservation in a xenograft tumor model in mice. RP1-212P9.3 KO cells formed substantially smaller tumors than control AAVS1 KO cells. Moreover, the expression of human or zebrafish RP1-212P9.3 but not-substantial the firefly luciferase gene fragment in the RP1-212P9.3 KO cells restored the tumor growth (Fig. 4g and Extended Data Fig. 8h). Together, these results support that coPARSE-IncRNAs have common regulatory impacts in distantly related species.

Large overlap between coPARSE-IncRNAs homolog interactomes

We next tested if coPARSE-IncRNA homolog pairs interact with the same RBPs. We conducted RNA pull-down followed by mass spectrometry (MS) analysis for RP1-212P9.3 and RP11-1055B8.4 to examine interaction proteins of the human, mouse and zebrafish lncRNA homologs with HeLa cell lysates. Our MS data were of high quality (that is, correlation coefficients between biological replicates >0.85) and successfully

Fig. 4 | Functional validation of coPARSE-IncRNAs. a, KO-rescue lentivirus plasmid construction. The plasmid contains three functional cassettes for U6 promoter-driven expression of crRNAs, Dox-inducible ectopic expression of homologs and GFP labeling for infected cells. b, IncuCyte proliferation analysis. HeLa cells maintained in a Dox-free culture medium were split into two groups (Dox+/-) for lentivirus infection, followed by transient transfection of rtTAexpression or control pcDNA3.1 plasmids 24 h after infection. GFP-positive cells were sorted by FACS for IncuCyte proliferation analysis. Error bars, means \pm s.d., n = 3 biologically independent experiments. c, KO-rescue assays of 21 candidate coPARSE-IncRNAs (THORLNC as a positive control). The relative cell confluence upon Dox induction was calculated for these coPARSE-IncRNAs (the fold change of 72 h versus 0 h for each coPARSE-lncRNA was normalized to AAVS1 in the Dox+/- groups). An AAVS1-targeting crRNA pair and a segment of fly luciferase gene were used for the AAVS1 group. Error bars, means ± s.d., n = 3 biologically independent experiments, two-sided Student's t-test. d, IncuCyte assay of the human coPARSE-IncRNA RP1-212P9.3 and its zebrafish

recovered the interaction between THORLNC and IGF2BP1 (ref. 21; Extended Data Fig. 9a and Supplementary Table 10).

Principal component analysis (PCA) of the pull-down proteins revealed that coPARSE-IncRNA homolog pairs are closer to each other than distinct lncRNAs in the same species in the embedding, strongly supporting the similarity of the binding protein profiles between coPARSE-IncRNA homolog pairs (Fig. 5a). We observed a very high correlation and extensive overlap for the enriched RBPs (MiST scores >0.7) and top interactors of coPARSE-lncRNA homolog pairs (Fig. 5b,c and Extended Data Fig. 9b-e). Immunoblotting confirmed that human coPARSE-IncRNA RP1-212P9.3 and its mouse and zebrafish homologs all interact with CAPRIN1, TARDBP and NONO (Fig. 5b). Gene Ontology (GO) analysis indicated that proteins interacting with the examined IncRNAs are enriched for cell proliferation-related functions (Extended Data Fig. 9f). The RNA pull-down experiments identified 6 and 5 RBPs in our RBP library used for motif-pattern analysis to bind RP1-212P9.3 and RP11-1055B8.4. It bears mention that 3 of 6 and 2 of 5 identified RBPs were accurately predicted by IncHOME for RP1-212P9.3 and RP11-1055B8.4, and there was good alignment of the motif matches between the coPARSE-IncRNA homolog pairs (Extended Data Fig. 9g-j).

We also conducted RNA pull-down and MS analyses for RP1-212P9.3 homologs in mouse cells (V6.5 embryonic stem cells) and early zebrafish embryos (Methods). Our results revealed strong correlation and extensive overlap in the enriched RBPs (MiST scores >0.7) for RP1-212P9.3 homologs in human HeLa cells, mouse V6.5 cells and zebrafish embryos (Fig. 5b and Extended Data Fig. 10a,b).

Additionally, we assessed the common proteins pulled down by RPI-212P9.3 homologs in the cells of the corresponding species. Because these cells are not from equivalent tissues and express drastically different sets of RBPs, we defined benchmark sets of common proteins that were pulled down by the same lncRNA RPI-212P9.3 in samples of different cell types. We noted a relatively high overlap between the pulled-down proteins by RPI-212P9.3 and its homologs in comparisons to the benchmark (Extended Data Fig. 10c). We also observed that the proteins pulled down by RPI-212P9.3 homologs showed enrichment for functions related to translation and cell proliferation (Extended Data Fig. 10d).

We next performed five additional complementation assays attempting to rescue the zebrafish early development delay defect resulting from TCONS_00107744_zbfknockdown, with each assay using a fragment of the predicted human homolog RP1-212P9.3 harboring distinct sets of putative RBP-binding sites (Methods). We found that only the fragment with intact NONO-binding sites rescued the developmental delay of the TCONS_00107744_zbf knockdown zebrafish embryos (Fig. 5d,e). These results demonstrate the specificity of the binding sites of an RBP (NONO) for the rescue fragments.

We also performed two KO-rescue experiments in HeLa cells for coPARSE-lncRNAs (RP1-212P9.3 and RP11-1055B8.4) and found that mutation of the NONO-binding site and the IGF2BP2-binding site,

homolog TCONS_00107744_zbf, using luciferase segments as a negative control, n = 2 biologically independent experiments. **e**, Time-matched images of early embryogenesis showing that injection of the four human coPARSE-lncRNAs rescued the developmental defect of the corresponding zebrafish lncRNA homolog knockdown embryos. The epiboly edge is marked by red dotted lines, and the embryonic shield is indicated by red arrowheads. Scale bars, 100 µm. f, Quantification of zebrafish lncRNA knockdown embryos complemented with human homologous coPARSE-IncRNAs, showing a rescue of the developmental delay. n = 3 biologically independent experiments. The number of embryos in each injection group is detailed in Methods. Error bars, means ± s.d., two-sided Student's t-test. g, HeLa cell line xenograft tumors of Dox+/- groups of the human IncRNA RP1-212P9.3 KO and complementation samples by RP1-212P9.3 and its zebrafish homolog (TCONS_00107744_zbf), showing increased tumor growth of the complementation samples (top). Bar plot showing tumor weights (bottom). Error bars, means \pm s.d., n = 13, 14, 6 and 7 biologically independent experiments, one-sided Student's t-test.

respectively, abolished the rescue effect of the TCONS_00107744_zbf fragment and the TCONS_00075010_zbf fragment (Fig. 5f,g). Together with the results from the zebrafish rescue experiments, these findings strongly suggest that coPARSE-IncRNA homologs are functionally related through interactions with specific RBPs.

Discussion

We here developed lncHOME, a computational pipeline that identifies coPARSE-lncRNAs, a unique class of lncRNAs with conserved genomic

locations and patterns of RBP-binding sites. We also developed a KO screen using Cas12a with paired crRNAs and identified 75 coPARSE-IncRNAs that functionally impact cancer cell proliferation. Moreover, several prioritized human coPARSE-IncRNAs and their zebrafish homologs were validated to exert common functions in distantly related species. Homologs of two coPARSE-IncRNAs from human, mouse and zebrafish share a large number of RBPs in their interactomes. Finally, experiments with mutant variants for particular RBP-binding sites established that specific RBP bindings impact the





conserved functions (Fig. 5h). Our study thus provides a rich resource of conserved lncRNAs across vertebrates and sheds new light on the evolution of lncRNA functions.

Previous studies investigating lncRNA evolution have mostly relied on strategies developed to study protein-coding gene evolution, such as BLAST-like tools^{19,20,24} or UCSC LiftOver⁵⁵. However, these protein sequence conservation analysis tools have achieved limited success for studying lncRNA evolution, and identifying lncRNA homologs across evolutionarily very divergent species has remained a formidable challenge. Unlike protein-coding genes, which are subjected to strong evolutionary pressure to maintain their primary sequences of open reading frames and codon synonyms, lncRNAs Fig. 5 | Identification and functional analysis of the RBP interactome for two coPARSE-IncRNAs. a, PCA of MS data for HeLa cell lysates pulled down for the indicated human coPARSE-IncRNAs and the predicted mouse and zebrafish homologs. The control samples are based on luciferase transcript segments. b, Distribution of the MiST scores of enriched RBPs upon pull-down using the human coPARSE-IncRNA RP1-212P9.3 and its predicted mouse and zebrafish homologs. Dashed lines represent a threshold of 0.7. Three commonly enriched RBPs from all comparisons (highlighted in colored circles) were validated by immunoblotting. The *r* represents the Pearson correlation coefficient, two-sided Student's *t*-test. c, Venn diagram showing identified binding proteins of eight lncRNAs (human coPARSE-IncRNAs THORLNC, RP1-212P9.3 and RP11-1055B8.4, and their mouse and zebrafish homologs) in the RNA pull-down experiments (top). The table presents common binding proteins of three human lncRNAs and their homologs (bottom). Each dot represents a binding protein. d, e, Timematched images (d) and quantifications (e) of early embryogenesis showing

function through interacting with other biomolecules including DNA, RNA and proteins^{3,56}.

It has been proposed that conserved functions of lncRNAs across different species may require only short specific sequences²⁴. Notably, lncRNAs with similar *k*-mer content have been associated with similar regulatory roles in transcriptional regulation⁵⁷. SEEKER⁵⁷, a computational method based on lncRNA *k*-mer profiles, has been developed to identify groups of lncRNAs with similar functions. However, it is important to note that SEEKER is not designed to discriminate homologous lncRNAs within a functional group. In contrast, lncHOME achieves this goal by analyzing conserved genomic locations and distribution patterns of sequence motifs. Additionally, lncHOME uses motifs derived from known and validated RBP-binding sites, enabling our approach to generate testable hypotheses regarding the functions of coPARSE-lncRNAs.

In the present analysis, we used binding motifs of ~200 RBPs. However, the total number of known RBPs in humans is estimated to be around 2,000 (refs. 30,58). The list of RBP-binding motifs is expected to expand substantially as more transcriptome-wide profiling data for RBP-binding sites become available^{41,59}. Future development of IncHOME may include the incorporation of other functional elements such as microRNA-binding sites. It is also worth noting that although our curated lncRNAs display extensive overlap with existing annotations, improved annotations in the future are likely to enhance the identification of coPARSE-IncRNAs. Consequently, the set of conserved lncRNAs is likely to expand. It should be interesting to search for homologs of coPARSE-lncRNAs between humans and evolutionarily distant species beyond vertebrates. The identification and study of these coPARSE-IncRNAs could provide insights into their fundamental biological roles and potentially shed light on the origin of IncRNAs.

Our coPARSE-IncRNA KO screening method takes advantage of the capability of Cas12a in processing paired crRNAs expressed as a single transcript under a U6 promoter. This approach minimizes the gRNA library construction procedure and prevents incorrect paired gRNA assembly caused by the recombination of two separate U6 promoter sequences used in the Cas9 approach⁴⁷. Our method is applicable for dissecting the functions of protein-coding genes and noncoding elements, including promoters and enhancers, where genome deletions are preferred over mutations. While this study focused on cell proliferation, it is feasible to screen for coPARSE-IncRNAs essential in other cellular processes using suitable reporter systems, such as Nanog-GFP⁶⁰ or miRNA activity reporters for cell differentiation⁶¹. Exploring coPARSE-IncRNA functions in different cellular processes is expected to expand the repertoire of known functionally conserved lncRNAs.

Our single-step KO-rescue approach illustrates an effective screening system for assessing the functional conservation of lncRNA homolog pairs from distantly related species. However, our current design involves ectopic expression of a fragment of the lncRNA that that injection of a human homologous coPARSE-IncRNA RP1-212P9.3 fragment and an RP1-212P9.3 fragment with the intact NONO-binding sites (RP1-212P9.3 re1) rescued the developmental defect of the corresponding zebrafish lncRNA homolog knockdown embryos. The epiboly edge is marked by red dotted lines, and the embryonic shield is indicated by red arrowheads. n = 3 biologically independent experiments. The number of embryos in each injection group is detailed in Methods. Scale bars, 100 µm. Error bars, means ± s.d., two-sided Student's *t*-test. **f.g.** High-content imaging proliferation assays of RP1-212P9.3 (**f**) and RP11-1055B8.4 (**g**) KO HeLa cells rescued with wild-type zebrafish homologs and mutants bearing mutated RBP-binding sites. A luciferase segment was used as a negative control. AAVS1/FLU, control with pcrRNA targeting AAVS1 gene and overexpression of the luciferase segment. All groups were cultured with 500 ng ml⁻¹ Dox. Error bars, means ± s.d., n = 3 biologically independent experiments. **h**, A simplified model for the evolution and function of coPARSE-lncRNAs. NS, not significant.

covers a IncHOME-predicted homologous region, instead of the full-length IncRNA. This design may cause an underestimation of the number of homologous IncRNAs with conserved functions, as other parts of the IncRNAs could contain motifs that are required for their (conserved) function. Moreover, it is worth noting that the overexpression levels of IncRNA fragments were not tightly controlled, and different cell types were used across species. These limitations may introduce potential artifacts into our interpretations, so it will be beneficial to develop assays that specifically address these constraints, especially in the context of high-throughput analysis involving a large number of coPARSE-IncRNAs.

Online content

Any methods, additional references, Nature Portfolio reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at https://doi.org/10.1038/s41588-023-01620-7.

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Methods

Ethics statement

This research complies with all relevant ethical regulations. All animal protocols were approved by the Institutional Animal Care and Use Committees of Peking University, which are accredited by the Association for Assessment and Accreditation of Laboratory Animal Care International. All zebrafish experiments were approved and carried out in accordance with the Animal Care Committee at the Institute of Zoology, Chinese Academy of Sciences.

Cell culture and reagents

HEK293T and HeLa cell lines were obtained from ATCC, and Huh7 and MCF7 cell lines were from the National Biomedical Cell Resource (Beijing). All cell lines were cultured in Dulbecco's modified Eagle's medium (Gibco) supplemented with 10% FBS (Dox-free, BI) at 37 °C. Mycoplasma kit (Vazyme) was used to routinely check for mycoplasma contamination in culture. For lncRNA rescue, Dox (Selleck) was added at a final concentration of 500 ng ml⁻¹. The ZEM-2S zebrafish cell line was obtained from the China Center for Type Culture Collection and was cultured in 50% Leibovitz's L-15 medium (Gibco), 35% DEEM (Gibco) and 15% F12 medium (Gibco) supplemented with 10% FBS (Hyclone) at 28 °C.

Plasmid construction

The crRNA-expressing vector for genome deletion was constructed by cloning two tandem crRNAs (paired crRNAs) to downstream of the human U6 promoter of the lentiviral vector psWLV (a lentivirus plasmid, Addgene). For homolog rescue, an inducible expression cassette containing tetracycline-responsive element (TRE) promoter, homologous segments and bovine growth hormone (BGH)-polyA was inserted downstream of the cPPT site in a reverse transcription direction. The construction was done using a Gibson assembly strategy (TransGen Biotech) according to the manufacturer's instructions.

Construction of the cell line stably expressing Cas12a nucleases

A lentiviral vector expressing Cas12a-T2A-mCherry (Addgene) was packaged in 293T, and infection was performed in HeLa, Huh7 and MCF7. To obtain clones with high Cas12a expression, mCherry-positive cells were sorted as single cells into 96-well plates. After culturing for 3 weeks, the selected cell lines were tested for KO efficiency and those with the strongest KO effects were retained for further analysis.

Construction of paired crRNA KO library

The CRISPR KO protocol was modified from that of the previous reports^{62,63}. We created a library containing 11,301 pairs of crRNAs targeting 574 lncRNAs (including 249 coPARSE-lncRNAs with predicted zebrafish homologs) and 23 positive controls collected from previous studies (Supplementary Table 6). An additional 100 paired crRNAs were designed to target the introns of AAVS1 loci as the negative control. The 126-nt oligonucleotides containing pairs of tandemly arranged direct repeat sequences (19 nt) followed by a guide sequence (23 nt) with flanking adapters were synthesized by CustomArray. A pair of primers targeting the flanking adaptors was used for the PCR amplification of crRNA libraries with reaction systems in 24 tubes and at most 26 cycles. The amplified DNA products were ligated, using a Gibson cloning kit (TransGen Biotech), into a lentiviral vector linearized by BsmBI. The resulting assembly products were transformed into trans-T1 competent cells (TransGen Biotech) to obtain the plasmid library.

All colonies from transformation were reseeded in 16 flasks of 200 ml Luria broth liquid medium and cultured to the early exponential phase. The library plasmids were extracted using the EndoFree Plasmid Extraction Kit (CWbio). The lentivirus of the paired crRNA library was produced by cotransfecting library plasmids and packaging plasmids psPAX2 and pMD2.G (Addgene) into HEK293T cells using the jetPRIME DNA transfection reagent (Polyplus-transfection).

CRISPR-Cas12a screening

Initial cell libraries were obtained through lentivirus infection at low multiplicity of infection (MOI; -0.3), followed by sorting and collecting GFP-positive cells 72 h after infection using FACSAria II (BD Biosciences). For each sample, 2 million GFP-positive cells (-175-fold of the paired crRNA library size) were plated onto a 150-mm dish. Three replicate samples were processed for library screening, and one sample was used for genomic DNA extraction as the control group (day 0). During the screening, samples containing at least 4 million cells were collected for genomic DNA extraction at three time points (days 15, 30 and 45) after splitting.

Identification of candidate-paired crRNA sequences

The genomic DNA was isolated from around 4 million cells using the Genomic DNA Kit (TianGen Biotech), and 32 µg DNA was used as amplification templates in 16 independent PCR (50-µl reaction each). The fragments containing paired crRNAs were first amplified using Q5 High Fidelity Polymerase (NEB; Fig. 3a and Supplementary Table 11). In the second round of PCR, primers for sequencing purposes with different indexes were added for different samples (replicates and time points). Finally, the PCR products of all samples were pooled and purified with a DNA Clean & Concentrator-5 Kit (Zymo Research) and sequenced by Illumina HiSeq 2500.

Cell proliferation assay

For the validation of individual coPARSE-IncRNAs, the percentage of GFP-positive cells was quantified by flow cytometry analysis at 72 h postinfection (day 0) and every 5 d. Cell viability was determined by normalizing data to day 0. All virus infection assays were performed in 24-well plates with triplicates. Flow cytometry and data analysis were performed by the LSRFortessa SORP system and FlowJo software (BD Biosciences). For proliferation assay in a pure KO population, 0.2×10^4 GFP-positive cells were seeded in triplicates in 96-well plates. Cell confluence (occupied area) was monitored by the IncuCyte ZOOM live-cell imaging system (Essen BioSciences, 2016a version). Data were normalized to time 0. Raw and processed statistical results are accessible in Supplementary Table 9.

shRNA knockdown assay

The sequences of shRNAs were designed by an online tool (http://rnaidesigner.thermofisher.com/). The shRNA template was generated by overlap PCR from two short complementary oligonucleotide sequences with flanking primers and ligated into the lentiviral psWLV backbone through the Gibson assembly step. Scrambled shRNA was designed as a control. Lentivirus infection and cell proliferation analysis were performed as described above. Oligonucleotide sequences for constructing shRNAs were synthesized at Tsingke, and their sequences (in sense format) are listed in Supplementary Table 11.

RNA isolation, cDNA synthesis and RT–qPCR

Total RNA was extracted using Trizol reagent (Invitrogen) according to the manufacturer's instructions and further purified with an RNA Clean & Concentrator-5 Kit (Zymo Research). cDNAs were synthesized using random primers by PrimeScript RT Reagent Kit (Takara). RT–qPCR was performed with SYBR TB Green Premix (Takara) on an ABI qPCR system. The Actin was used as a control. RT–qPCR primers are shown in Supplementary Table 11.

Cloning of cDNA for coPARSE-IncRNA homologs

cDNA for the predicted zebrafish coPARSE-IncRNA homologs were amplified from zebrafish mixture cDNA samples of different developmental phases (gift from A.M. Meng laboratory, Tsinghua University) or synthesized by TsingKe Biotech. For rescue plasmids, homologs amplified by PCR were inserted into AvrII (NEB, R0174S) digested rescue plasmids under the control of a Dox-inducible promoter using a Gibson Assembly Kit (NEB, E2611S). The sequences with adaptors for coPARSE-lncRNA homologs are listed in Supplementary Table 11.

DNA isolation and genotyping PCR

For genomic DNA quick extraction, around 2,000 cells were lysed in 19 μ l lysis buffer (10 mM Tris–HCl (pH 8.0), 2 mM EDTA and 0.2% Triton). After a freeze-thaw cycle under –80 °C, 1 μ l proteinase K (10 mg ml⁻¹) was added and the mixture was incubated at 55 °C for 2 h before heating at 95 °C for 10 min. Then, 1 μ l of lysate was used directly for PCR genotyping. All genotyping primers are listed in Supplementary Table 11.

Single-step CRISPR-Cas12a KO-rescue assay

To obtain high efficiency of lentivirus package and/or infection⁶⁴, we tested multiple versions of construction and selected a highly efficient version in which the rescue cassette was inserted in a reverse transcription direction between two long terminal repeats (LTRs) of the lentiviral vector (Fig. 4a and Extended Data Fig. 7h). For rescue assay, HeLa cells stably expressing Cas12a-TA-mCherry were split into two groups (Dox+/-) during lentivirus infection and transfected with an rtTA-expression vector the day after infection. GFP-positive cells were then collected by FACS and split into 96-well plates the following day. The plates were loaded for IncuCyte proliferation analysis after culturing for 3 d.

Design of rescue RNA fragments with RBP-binding sites mutated

Mutation of RBP-binding sites was made by replacing the original sequence with its antisense sequence. For the rescue of TCONS_00107744_zbf knockdown zebrafish embryos, we used fragments of the predicted human homolog RP1-212P9.3 harboring distinct sets of the putative RBP-binding sites. Especially, there are four RBPs (NONO, SF3A3, RBM22 and HNRNPC) (1) with predicted motif matches in both human and zebrafish homologs and (2) that were pulled down from zebrafish embryo lysates. We, therefore, designed the following five mutation fragments-(1) the sequence with all binding sites of the four RBPs mutated, (2–5) based on (1), but restoring the sequences at the binding sites for each of the four RBPs.

For rescue experiments in HeLa cells, we used fragments of the predicted zebrafish homologs with wild-type or mutated putative RBP-binding sites. For RP1-212P9.3, we designed a fragment of the predicted zebrafish homolog TCONS_00107744_zbf with the putative NONO-binding sites mutated. For RP11-1055B8.4, there are two RBPs (IGF2BP2 and CAPRINA) (1) with predicted motif matches in both zebrafish and human homologs and (2) that were pulled down from HeLa cell lysates. We thus designed the following three mutation fragments: (1) the sequence with all binding sites of the two RBPs mutated, (2) and (3) based on (1), but restoring the sequences at the binding sites for each of the two RBPs.

Zebrafish husbandry and microinjection

Zebrafish (AB strain) were raised in a circulating aquarium system at 28.5 °C under standard conditions. Adult zebrafish aged between 3 months and 1 year were used for natural mating and egg collection, and the one-cell stage embryos were collected for microinjection experiments. ASOs were synthesized by GenePharma, and 80 pg per embryo was injected. The sequences are listed in Supplementary Table 11. The qPCR primers used for knockdown efficiency examination are listed in Supplementary Table 11. For human lncRNA rescue experiments, coPARSE-lncRNA or antisense RNA was generated by in vitro transcription using SP6 or T7 RNA polymerase (Promega). In total, 40 pg RNA per embryo was injected. The number of embryos in each experiment group is listed in Supplementary Table 9.

Whole-mount in situ hybridization

Whole-mount in situ hybridization was carried out using Digoxigeninuridine-5'-triphosphate (Roche) labeled antisense RNA probes as previously reported⁶⁵. RNA probe was transcribed with SP6 RNA polymerase (Promega). After hybridization, RNA probes were detected by alkaline phosphatase (AP)-conjugated anti-digoxigenin (DIG) antibody (Roche) using Benjamin Moore (BM) purple (Roche, 11093274910; 1:20) as the substrate.

Morphological feature assessment of zebrafish embryos

The developmental characteristics were assessed by the photomicrographs of zebrafish embryos. For the analysis, we measured the height of the blastula at 3 hpf (normal: 140 μ m < n < 200 μ m), the width at 4 hpf (normal: 390 μ m < n < 450 μ m) and the degree of epiboly process from 6 hpf to 10 hpf (normal: embryonic shield appeared and 45% < percent-epiboly < 55% at 6 hpf; 70% < percent-epiboly < 80% at 8 hpf; polster appeared and percent-epiboly = 100% at 10 hpf). The embryos with parameters falling out of the abovementioned ranges were defined as abnormal.

In vivo xenograft experiments

Male mice (NOD/SCID) aged 5–7 weeks were injected with 1 million HeLa cells with stable integration of RP1-212P9.3 KO-rescue cassettes along with a Matrigel scaffold (BD Biosciences) in the posterior dorsal flank region. We used 10 mg ml⁻¹ sucrose in drinking water supplemented with or without Dox (2 mg ml⁻¹) to feed the mice. Animals were killed and subcutaneous tumors were excised and weighed at day 31 postcell injection.

RNA pull-down assay

The in vitro RNA pull-down assay was performed as described previously⁶⁶. Briefly, 100 pmol purified biotinylated RNA of candidate coPARSE-IncRNAs or luciferase fragment control was refolded and incubated with the lysate from 20 million mammalian cells or 2,500 zebrafish embryos at 4 °C for 2 h. Prewashed Dynabeads MyOne Streptavidin C1 beads (Invitrogen) were then added to the mixture and incubated at 4 °C for 45 min. After a series of washing, pull-down proteins were eluted in 15 μ l elution buffer (1% SDS, 50 mM Tris–HCl (pH 8.0) and 1 M NaCl) and were subjected for MS or western blotting analysis.

MS

The protein samples were analyzed by 10% SDS–PAGE and visualized by Fast Silver Stain Kit (Beyotime) according to the manufacturer's instructions. The proteins were recovered from the bands in two or three split fragments per lane and each fragment was independently subjected to further MS analysis (performed by Tsinghua University Phoenix Center using LTQ-Orbitrap Velos Mass Spectrometer). MS raw results and processed MiST results are presented in Supplementary Table 10.

Western blot analysis

The quantity of RNA pull-down proteins was determined by western blotting analysis using the Jess fully automated system (Bio-Techne) following the suggested protocols (https://www.proteinsimple.com/technical_library.html). The 12–230 kDa Jess Separation Module was used, and 3 µl of each sample was loaded. The incubation time of the primary and secondary antibodies was 30 min. Antibody against glyceraldehyde-3-phosphate dehydrogenase (GAPDH; ab9485, 1:500) from Abcam, against TARDBP (10782-2-AP, 1:100), NONO (11058-1-AP, 1:100), CAPRINI (15112-1-AP, 1:100), IGF2BP1 (22803-1-AP, 1:100) and hnRNPA1 (11176-1-AP, 1:100) from Proteintech. The secondary antibodies are listed in Supplementary Table 11.

LncRNA curation

We used the GENCODE data for human (GENCODE v25) and mouse (GENCODE vM10) lncRNA annotations. For the other six vertebrates (cow, opossum, chicken, lizard, frog and zebrafish), we obtained RNA-seq data from the National Center for Biotechnology Information (NCBI) to assemble lncRNA transcripts using established protocols^{67,68}. The process involved quality-control (FASTQC v0.12.1), low-quality base trimming (Trimmomatic v0.39)⁶⁹, mapping to the reference genomes (from UCSC Browser) using STAR 2.4.2a⁷⁰ with a TwoPass Mode (parameter: --sjdbFileChrStartEnd), transcript assembly (StringTie v2.1.5)⁷¹ and merging (Cufflink v2.2.1)⁷², and filtering by length (\geq 200 nt), expression level (FPKM > 0.5) and protein-coding potential (CPAT v3.0.0 (ref. 32), CPAT score >0.5).

Additionally, we collected previously curated lncRNA from Ensembl, NCBI, NONCODE⁷³, DeepBase⁷⁴ and the Ulitsky laboratory²⁴. We analyzed the overlap scores to compare lncRNA annotations from different sources:

Overlap score =
$$0.5 \times \left(\frac{m}{n_1} + \frac{m}{n_2}\right)$$

Here n_1 and n_2 are the numbers of lncRNAs from dataset 1 and dataset 2, and *m* is the number of common lncRNAs.

Conservation of protein-coding genes and lncRNAs between two vertebrates

For protein-coding and lncRNA genes, we performed pairwise sequence alignment to identify homologous genes with a high sequence similarity using BLAST v2.12.0 bl2seq (*E* value < 10^{-4} , hit length >50 nt, overall sequence identity >50%). We then calculated a Jaccard index as the proportion of homologous genes among all genes to represent gene conservation between two vertebrates:

Jaccard index =
$$\frac{n}{x+y-n}$$

Here x and y are the numbers of protein-coding (or lncRNA) genes in species 1 and 2, and n is the number of homologous protein-coding (or lncRNA) genes between species 1 and 2.

Identification of syntenic IncRNA candidates

We identified syntenic lncRNA candidates in different vertebrates by combining information from protein-coding genes (using OrthoDB⁷³) and genomic anchors from pairwise genome alignments (using the UCSC chain extension files, if exist, or built using an in-house pipeline following the UCSC protocol). We only kept protein-coding genes and genomic anchors with one-to-one correspondence.

We used a random forest model to identify syntenic lncRNA candidates among humans (lncRNA1) and other species (lncRNA2). Briefly, we counted nine numbers within 1 Mbps of flanking genomic regions of the two lncRNAs, including the numbers of genomic anchors in the upstream, downstream and both the upstream and downstream regions (m_{1u} , m_{2u} , m_{1d} , m_{2d} , m_{1f} and m_{2f}) and the numbers of genomic anchors with correspondence in lncRNA1 and lncRNA2 also in the three regions (m_u , m_d and m_f). We then defined three proportion scores based on these nine numbers, for the three regions (Extended Data Fig. 3b). As one example, for the upstream region, the proportion score is defined as

Proportion score_{*u*} =
$$\frac{m_u}{\min(m_{1u}, m_{2u})}$$

Similar to genomic anchors, we also defined nine numbers and three proportion scores based on protein-coding genes for lncRNA1 and lncRNA2 (we used protein homology from Ensembl³³ as for correspondence of protein-coding genes). We finally used the six proportion scores and the six numbers (m_u , m_d and m_f) of genomic anchors and homologous protein-coding genes as 12 features for the training of a random forest model.

To train the model, we used protein-coding genes with one-to-one homology between humans and other species as positive samples, and randomly selected gene pairs between the two species as negative samples.

RBP-binding motifs analysis

We downloaded CLIP data for the two RBPs (ELAVL1 and HNRNPA1) $^{34,76-78}$ and called their binding site motifs from the 1,000 top-ranking binding peaks using HOMER⁷⁹:

```
$findMotifs.pl binding_site.fa fasta output_
directory/ -fasta background.fa
```

Here binding_site.fa contains the sequences of the binding peaks and background.fa contains the sequences of 1,000 permutated regions on the same transcripts with no RBP binding.

Construction of RBP-binding motif libraries

For human and mouse, we collected RBP-binding motifs from RNA-COMPETE³⁸, CISBP-RNA³⁸, RBPDB⁴⁰ and ATtRACT⁴¹. We also called RBP-binding motifs from three public CLIP-seq datasets (CLIPdb⁸⁰, eCLIP³⁴ and Starbase⁸¹), using MEME (v4.10.1)⁸²:

```
$meme input_file -p 5 -nostatus -time 36000 -dna
-revcomp -text -mod anr -nmotifs 5 -minw 5 -maxw
30 -maxsites 600 -maxsize 1000000 > motif_file
```

Here input_file contains the sequences of top-ranking 1,000 RBP-binding peaks, and motif_file contains a position weight matrix of called motifs.

Then, for each RBP, we combined the binding motifs from the database collection and the motifs from CLIP-seq data calling (using TOMTOM v5.5.4 (ref. 83), P < 0.001) to define the human and mouse RBP-binding motif libraries.

We extrapolated the established human and mouse motifs to obtain more RBP motifs for human and mouse and to define all motifs for the other six species. First, we downloaded the RBP domain annotation for 263 human RBPs from the UniProt⁸⁴ and defined homologous RBPs (alignment coverage \geq 70% and alignment identity \geq 70%)⁸⁵.

We then extrapolated the human motifs to the mouse or the mouse motifs to the human, using an iterative mapping-and-refinement strategy, using FIMO (v4.11.2) for motif match searching:

```
$fimo --verbosity 1 --text motif_file sequence_
file > motif_match_file
```

Here sequence_file contains target sequences, and motif_match_file contains motif matches.

Then we defined a new motif by combining the old motif and the matched sequences. For each of the other six species, we extrapolated every human motif to define a corresponding new species-specific motif.

Identification of coPARSE-IncRNAs

We identified homologous RNA from the syntenic lncRNA candidates between humans and the other seven species. Briefly, we first scanned for motif matches along the sequences of syntenic lncRNA candidates using the above-curated species-specific motif libraries by FIMO (v4.11.2):

```
$fimo --verbosity 1 --text motif_file sequence_
file > motif_match_file
```

We clustered the motif matches with half of the motif matches overlapped with the other into one block. Then for a candidate pair of

IncRNA homologs from any two species, we defined a similarity score for every pair of blocks from the IncRNA pair:

Block similarity score =
$$\sum_{i=1}^{n} \frac{\min(x_i, y_i)}{\max(x_i, y_i)}$$

Here x_i and y_i are the numbers of matched motif sites of motif class i on the lncRNA from the two species, and n is the number of motif class.

We used a dynamic programming algorithm to calculate an MPSS, which was summed up by the block similarity scores based on the optimal alignment of all block pairs. We also calculated a GPS, defined as the quadratic mean of the distance deviation of all paired blocks.

Gap penalty score =
$$\frac{\sqrt{\sum_{i=1}^{n-1} (x_i - y_i)^2}}{n-1}$$

Here x_i and y_i are the block distance between two blocks in the two lncRNAs, and n is the number of blocks.

We then calculated two *P* values for each pair of the predicted lncRNA homologs, one for MPSS and one for GPS (permutation test by sampling 100,000 random lncRNA pairs from different species and by shuffling the block positions for 1,000 times). We defined all lncRNA pairs having both two *P* values smaller than 0.05 as 'coPARSE-lncRNA' candidates. For a human coPARSE-lncRNA with more than one homolog candidate in another species, we only retained the candidates having an MPSS >0.8 times of the maximum MPSS among all candidates.

We defined the homologous regions for any pair of homologous lncRNAs as the sequence regions between the first aligned motif match and the last aligned motif match based on the alignment of motif matches using dynamic programming (Extended Data Fig. 9g–j). These homologous regions were used for designing lncRNA fragments for rescue and RNA pull-down experiments (only one fragment was used for each coPARSE-lncRNA).

Species conservation analysis of human coPARSE-IncRNAs

We defined the following two groups of coPARSE-lncRNA homolog pairs: (1) The 'homolog_ss' groups containing 605 coPARSE-lncRNA homolog pairs with sequence similarity between human and mouse and 17 coPARSE-lncRNA homolog pairs with sequence similarity between human and zebrafish; (2) the 'homolog_nss' groups containing 4,959 coPARSE-lncRNA homolog pairs without sequence similarity between human and mouse and 553 coPARSE-lncRNA homolog pairs without sequence similarity between human and zebrafish. We also defined a third 'non_homolog' group containing randomly selected lncRNA pairs.

We calculated the distribution of average conservation scores based on the PhastCon and PhyloP scores (from UCSC^{42,43}) for human lncRNAs of these three groups and compared the distributions by calculating a *P* value for the significance of score differences using two-sided Mann–Whitney *U* tests.

SNP enrichment analysis of human coPARSE-IncRNAs

To evaluate selection for coPARSE-lncRNAs, we analyzed the SNP density for human coPARSE-lncRNAs. We first separated each coPARSE-lncRNA sequence into motif and nonmotif regions, based on the lncHOME pipeline. We compared the density difference of common SNPs (major alternative allele frequency >5%, the 1000 Genomes Catalog⁸⁶) and the difference of major alternative allele frequencies of SNPs between the motif and nonmotif regions, by calculating a *P* value using a two-sided Mann–Whitney *U* test.

Histone modification analysis

We collected data for seven types of histone modifications (H3K27ac, H3K27me3, H3K36me3, H3K4me1, H3K4me3, H3K9ac and H3K9me3) from the ENCODE dataset⁸⁷. We calculated the rate of common histone modification sites between each lncRNA pair.

Common histone modification site rate
$$= \frac{\sum_{i=1}^{n} \min(x_i, y_i)}{\sum_{i=1}^{n} \max(x_i, y_i)}$$

Here x_i and y_i are the numbers of each type of histone modification sites in human (x_i) and mouse (y_i) lncRNA genes and nearby regions (10 kb upstream and downstream regions), and *n* is the number of histone modification types. We compared the common histone modification site rate between each pair of lncRNAs for the above-defined three groups (homolog_ss, homolog_nss and non_homolog), by calculating a *P* value using two-sided Mann–Whitney *U* test.

Tissue-specific expression analysis

We compared the tissue-specific expression scores for the 'homolog_ss' and 'homolog_nss' groups of coPARSE-IncRNAs between each two species based on the gene expression data from the Genotype-Tissue Expression (GTEx) Portal⁸⁸, by calculating the Pearson correlation coefficients. We randomly selected lncRNA pairs from the two species, with and without synteny, to calculate the average Pearson correlation coefficient.

Enrichment analysis of ClinVar variations

We collected disease-associated variants from ClinVar⁴⁴. We randomly selected lncRNAs (the same number as the human coPARSE-lncRNA set) from the whole transcriptome and counted the numbers of these random lncRNAs with ClinVar variants. We repeated this process for 100,000 times to construct a background distribution to estimate the *P* value. The enrichment of ClinVar variants in human coPARSE-lncRNAs was calculated as follows:

Enrichment = $\frac{\text{number of human coPARSE-lncRNAs with ClinVar variants}}{\text{number of randomly selected lncRNAs with ClinVar variants}}$

Differential coPARSE-IncRNA expression analysis for cancer tissues

We calculated the differentially expressed genes between normal and disease tissues for different types of cancer. The enrichment (odds ratio) of human coPARSE-lncRNAs with predicted homologs in mouse (coPARSE-lncRNAs in the following formula) for differentially expressed lncRNAs in patients with cancer compared to lncRNAs without predicted homologs in mouse (nonhomologous lncRNAs in the following formula) was calculated as follows:

Odds ratio = $\frac{\frac{number of coPARSE-lncRNAs differentially expressed in cancer patient}{number of coPARSE-lncRNAs normally expressed in cancer patient}}$ umber of nonhomologous lncRNAs differentially expressed in cancer patient number of nonhomologous lncRNAs normally expressed in cancer patient

The *P* value of the enrichment was estimated using Fisher's exact test.

Selection of candidate lncRNAs for CRISPR-Cas12a KO screening

To select lncRNA candidates for KO screening, we defined a set of candidate lncRNAs (including coPARSE-lncRNAs) that show high expression levels in cancer. We started from 570 human coPARSE-lncRNAs with predicted homologs in zebrafish, 511 human lncRNAs with predicted syntenic lncRNA candidates in zebrafish and 252 human lncRNAs with zebrafish homologs from the ZFLNC database⁸⁹. We selected those lncRNAs with widespread expressions across various cancer tissues and cell lines (data from GTEx⁸⁸, TANRIC⁹⁰ and CCLE⁹¹) and finally defined a list of 574 human lncRNAs (including 249 coPARSE-lncRNAs).

For positive controls, we included 4 protein-coding and 19 lncRNA genes with reported proliferation function (Supplementary Table 6).

For negative controls, we used the nontargeting region AAVS1 introns, which are located in an open chromatin region, and insertion or deletion of this region leads to no known adverse effects on the cell.

Paired crRNA design and filtering

When designing crRNA pairs for a particular lncRNA, we first obtained all crRNAs that can target this lncRNA by considering factors potentially impacting efficiency and specificity of crRNAs (for example, protospacer adjacent motif (PAM) sequence TTTV⁹², GC contents), following a strategy previously reported⁴⁷. To avoid off-target bias and low cleavage efficiency, we followed the guidelines of the aforementioned study and only retained a crRNA if (1) its sequence was uniquely mapped to the intended loci, (2) having at least two mismatches to any other loci of the genome, (3) its GC content was between 0.2 and 0.9 and (4) the crRNA did not include a UUUU polymer.

We then enumerated all possible crRNA pairs and selected those based on the following conditions: (1) both crRNAs flanking the TSS of the target lncRNA, (2) neither of the two crRNAs targeting any exon of a coding gene and (3) both crRNAs targeting the nontranscribed strand (a strategy has been shown to have higher KO efficiency than targeting the transcribed strand^{47,93}).

Additionally, we have tried to avoid crRNA pairs overlapping with 1,580 essential genes (defined by a high-resolution CRISPR screen in 3 of 5 cell lines⁹⁴). In the end, only 56 of the 574 (or -9.8%) target lncRNAs have crRNA pairs that overlap with an essential gene. Sequences of crRNA pairs are listed in Supplementary Table 6.

Computational analysis of KO screening

The whole processing procedure includes reads preprocessing, reads mapping, normalization of the count table and enrichment analysis.

First, we trimmed the raw reads to remove flanking sequences of the crRNAs (cutadapt v1.18 (ref. 95), parameters: -m 60 - M 70 - gGCATTCGGTCCGTAGCCAAAA...TCTACAAGAGTAGAAATTCTTTCGTC-CTTTC -e 0.2 --overlap 5 -q 30,30), and then sampled 8 million reads for each screening sample using vsearch (v2.23.0)[%].

Second, we used Bowtie2 (v2.2.5) to map the clean reads to the reference library (parameters: --local --score-min C,95 -D 20 -R 2 -N 1 -L 20 -i S,1,0.75 --norc).

Third, we used MAGeCK (v0.5.9.5)⁹⁷ to obtain read count tables from the mapping results. The count tables were further normalized using RUVseq⁹⁸ to remove variations using the AAVS reads pool as a negative control. The normalized reads were finally used for enrichment analysis to obtain significantly depleted genes during the screening of the cell culture.

We adapted a time-serial polynomial modeling method and combined it with the RRA algorithm⁹⁹ for enrichment analysis, based on the data of multiple time points. Specifically, we fit the time-serial data of all paired crRNAs with a cubic polynomial function using 'nlme' (https://svn.r-project.org/R-packages/trunk/nlme/). We then calculated the rankings for all paired crRNAs based on their changes across time relative to the background controls of AAVS-derived paired crR-NAs. We input the paired crRNA rankings into the RRA algorithm to calculate candidate genes.

Filtering based on CNV and protein-coding gene overlapping

We used the CNV data for HeLa and MCF7 cells from ENCODE. We calculated an enrichment score of all of 574 lncRNA candidates within these CNV regions.

MS data analysis

Following an established protocol¹⁰⁰, we analyzed the MS data files using Proteome Discoverer (v1.4), using human protein sequences from Uni-Prot⁸⁴. We defined valid proteins by applying a minimum protein score of 1.5. We performed intersample comparison using the MiST algorithm¹⁰⁰ and scored all valid proteins with default parameters (MiST score >0.7).

GO enrichment analysis

We performed GO enrichment analysis for interacting proteins of coPARSE-lncRNAs using STRING (v11)¹⁰¹. The significant *P* values of GO terms were calculated by Fisher's exact test and adjusted by false discovery rate (FDR).

Statistics and reproducibility

Statistical methods for all analyses are detailed in the corresponding Methods section. No statistical method was used to predetermine the sample size. No data were excluded from the analyses. In this study, the reported results were acquired using independent mouse and fish that were randomly collected for each group. The investigators were not blinded to allocation during experiments and outcome assessment. All codes to replicate the analysis are available as part of code availability. Statistical analysis and related plots were carried out using R packages or Python Jupyter Note. For Student's *t*-test, data distribution was assumed to be normal but this was not formally tested.

Reporting summary

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

Data availability

The sequencing datasets have been deposited in the Gene Expression Omnibus under the accession code GSE240342. The MS proteomics data have been deposited to the ProteomeXchange Consortium via the PRIDE partner repository with the dataset identifier PXD046452. The RNA-seq data source is provided in Supplementary Table 1. All datasets used in this study are available in supplementary tables and https://github.com/huangwenze/IncHOME_analysis. Source data are provided with this paper.

Code availability

All the codes used for computational prediction and data analysis are available at https://doi.org/10.5281/zenodo.10162676 (ref. 102) and https://github.com/huangwenze/IncHOME_analysis.

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Author contributions

Q.C.Z. conceived the project; Q.C.Z., Y. Wang and J.J.X. supervised the project. W.H. and T.X. developed the lncHOME method and performed bioinformatics analyses. T.X., Y.Z. and Z.Z. performed the CRISPR-Cas12a KO-rescue assays in human cells. J.H. performed the ASO knockdown-rescue assays in zebrafish embryos under the supervision of F.L. T.X. and P.W. performed RNA pull-down followed by MS analysis. Y.Z., M.S. and Y. Wu performed the mouse xenograft assay. J.W. helped to perform the high-content imaging cell proliferation assays. J.L. helped to design the CRISPR library. G.H. helped with RNA-seq analyses for lncRNA annotations. Q.C.Z., Y. Wang, T.X. and W.H. wrote the paper with inputs from all other authors.

Competing interests

The authors declare no competing interests.

Additional information

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Article

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 $\label{eq:constraint} Extended \, Data \, Fig. \, 1 | \, See \, next \, page \, for \, caption.$

Article

Extended Data Fig. 1 | **Curation of IncRNAs. a**, RNA-seq data collected for IncRNA annotation. In total, more than 12 billion sequencing reads were collected for six vertebrates. **b**, Pipeline for IncRNA curation. **c**, Venn diagram showing the overlap of curated IncRNAs of the six species in this study with annotated IncRNAs from the indicated sources. **d**, Heatmaps showing the overlap scores among curated IncRNAs of the six species in this study and annotated IncRNAs from other indicated sources. **e**, Comparison of the number of IncRNA genes in our study vs. previously reported IncRNA datasets. **f**, The number of genes and the distribution of number of exons, lengths, and expression levels of proteincoding genes and IncRNAs curated in this study. Boxes, IQR. Centre lines, median. Whiskers, values within 1.5 × IQR of the top and bottom quartiles.



Extended Data Fig. 2 | See next page for caption.

Extended Data Fig. 2 | **Assessment of IncRNA annotations. a**, Protein-coding potential (estimated by CPAT) of the curated lncRNAs compared to protein-coding genes. **b**, Predicted peptide lengths of the curated lncRNAs compared to protein-coding genes. **c**, Cumulative distribution of the expression level of the curated lncRNAs compared to protein-coding genes. **d**, Distribution of tissue expression specificity scores of the curated lncRNAs compared to protein-coding

genes. **e**, PhastCons conservation scores of the curated lncRNAs compared to protein-coding genes. The numbers of curated lncRNAs and protein-coding genes are consistent with Extended Data Fig. 1f. For panels a, b, and e, boxes, IQR. Centre lines, median. Whiskers, values within 1.5 × IQR of the top and bottom quartiles.



Extended Data Fig. 3 | See next page for caption.

Extended Data Fig. 3 | Identification of syntenic IncRNAs across species and curation of RNA motifs from CLIP-seq datasets and public motif databases. a, Pipeline for syntenic IncRNA identification. A random forest model was trained to predict syntenic IncRNAs between each pair of species based on the two defined sets of 'synteny indicators', using one-to-one homologs of protein-coding genes as positive samples and randomly selected gene pairs as negative samples for model training. b, The calculation of 6 features (the numbers and the proportion scores) for the corresponding genomic anchors in the upstream region, the downstream region, or the flanking region of one pair of human and mouse IncRNAs. c, Heatmap showing the numbers and Jaccard index values for predicted syntenic IncRNAs between human and the seven indicated species. d, Contour line plot of syntenic IncRNAs for human vs. five other species identified by IncHOME, in terms of the proportion of common protein-coding genes and the proportion of corresponding genomic anchors. The background density plot shows the same proportion scores for protein-coding genes with one-to-one homology. **e**, Pie plots showing the proportions of human lncRNAs with one-to-one syntenic lncRNAs (red) and one-to-multiple syntenic lncRNAs in another species (green). **f**, The sequence motifs of ELAVL1 and HNRNPA1 in human and zebrafish called from the binding sites from the CLIP data. *P* values were calculated by one-sided Binomial test. **g**, Pipeline for RNA motif curation for human and mouse. RNA motifs were identified in the CLIP-seq datasets using the MEME suite, and collected from public databases (*that is*, RNACOMPETE, CIS-RBP, RBPDB, and ATtRACT). Motif clustering was performed to merge similar motifs. **h**, Pipeline for RNA motif matches in the transcriptomes of another species. Then the motif matches were used to update (or refine) the original motif to generate new motifs for the other species. **i**, The number of curated human RNA motifs. **j**, The distribution of curated RNA motifs for representative RBPs. Represented motifs for two example RBPs (NONO and Ezh2) are shown.



Extended Data Fig. 4 | See next page for caption.

Extended Data Fig. 4 | Identification of candidate human coPARSE-IncRNAs with predicted homologs across vertebrates and disease relevance of human coPARSE-IncRNAs. a, Density plot of MPSS for randomly selected IncRNA pairs and coPARSE-IncRNAs. b, Bar plots showing the number of candidate IncRNA homologs with synteny, human coPARSE-lncRNAs with predicted homologs in mouse, and human coPARSE-IncRNAs with predicted homologs in mouse and at least one of the other six vertebrates (left), and heatmap showing occurrence of the homologs in six other vertebrates (right). c, Gradient plots of MPSS and GPS for coPARSE-IncRNA homolog pairs between human and the seven other species. d, Density plots of MPSS for randomly selected genomic region pairs (left) and enhancer element pairs (right), compared to coPARSE-lncRNAs. e, Gradient plots showing the correlation between lncRNA lengths and MPSS (and GPS) for human and mouse coPARSE-IncRNAs. For panels c and e, r, Pearson correlation coefficient, two-sided Student's t-test. f, The percentage of genes with one-tomany correspondence homologs in mouse and in both mouse and zebrafish for human coPARSE-lncRNA genes and protein-coding genes. g, Distribution of

average conservation scores (PhyloP, n = 605/17 for human v.s. mouse/zebrafish) for coPARSE-lncRNA homolog pairs with sequence similarity (homolog_ss) and without sequence similarity (homolog nss, n = 4,959/553 for human v.s. mouse/zebrafish), and paired lncRNAs randomly selected from human and mouse lncRNAs (non-homolog, n = 5,000). Two-sided Mann-Whitney U test. Boxes, IQR. Centre lines, median. Whiskers, values within 1.5 × IQR of the top and bottom quartiles. h, Correlation of tissue-specific expression score of random IncRNA pairs with genomic synteny or without genomic synteny among three species. Numbers showing mean values from a random sampling (500 times). i, Overlaps of coPARSE-IncRNAs with disease-linked genomic regions from the GWAS CATALOG database. j, Enrichment of the human coPARSE-IncRNAs with predicted homologs in mouse or zebrafish for differentially expressed human IncRNAs across different cancer types. Each dot represents a cancer type; the orange and yellow colors indicate significant enrichment. P values were calculated by two-sided Fisher's exact test. k, Genomic locations of the ClinVar mutations within KCNQ10T1.



Extended Data Fig. 5 | See next page for caption.

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Extended Data Fig. 5 | Selection of IncRNA candidates for CRISPR-Cas12a knockout screening. a, Heatmaps showing the expression of the IncRNA candidates across various cancer samples (left), and the median expression of the indicated IncRNAs in normal tissues excluding testis and in testis tissues (right). TCGA cancer types include BLCA, BRCA, CHOL, DLBC, ESCA, GBM, HNSC, KIRC, KIRP, LAML, LGG, LIHC, LUAD, LUSC, MESO, OV, PAAD, PRAD, SARC, SKCM, STAD, THCA, UCEC, UCS, COADREAD (left to right). b, Pipeline for crRNA library design and construction. c, IncRNA gene knockout strategy and location of primers used for genome PCR. Representative images of genomic DNA PCR amplification of the four indicated IncRNA genes. MW: DNA marker. n = 3 independent biological experiments. **d**, Quantitative analysis of RP1-212P9.3, RP11-223110.1, RP1-1055B8.4 and RP11-429B14.1 knockout efficiency based on genome PCR results. The genomic DNA amplified by PCR was first normalized to *ACTB* and then to HeLa cells treated with control AAVS without addition of Dox. Error bars, means \pm SD, n = 3 biologically independent experiments, two-tailed Student's *t* test, n.s., not significant. **e**, RT-qPCR analysis of the lncRNA expression level of RP1-212P9.3, RP11-223I10.1, RP1-1055B8.4 and RP11-429B14.1 in the knockout and complemented HeLa cells. Error bars, means \pm SD, n = 3 biologically independent experiments, two-sided Student's *t* test, n.s., not significant.



Extended Data Fig. 6 | See next page for caption.

Extended Data Fig. 6 | CRISPR-Cas12a screening and validation of coPARSE-IncRNAs with cell proliferation function. a, Representative contour plots of FITC FACS gating strategy. Cells were separated from debris based on the forward scatter area and side scatter area. Two polygon gates were applied using the width and height metrics of the side scatter and forward scatter. FITC signals are shown for all live singlets. b, Control HeLa cells stably expressed Cas12a have no green fluorescence signal. The populations with FITC positive signal are the knockout cells with paired crRNAs targeting coPARSE-IncRNAs. **c**, **d**, Correlation (**c**) and Gini index (**d**) of the screening sample replicates of the three indicated cell lines. **e**, Distribution of the fold changes of the paired crRNAs targeting negative controls (n = 100 for three cells), positive controls (n = 1,700 for HeLa and Huh7 cells, n = 1,697 for MCF7 cell), and candidate lncRNAs (n = 9,594 for HeLa cell, n = 9,596 for Huh7 cell, n = 9,587 for MCF7 cell). Two-sided Student's *t*-test. Boxes, IQR. Centre lines, median. **f**, RRA scores of the top-ranking negatively selected IncRNAs calculated for Huh7 and MCF7 cells. Positive control genes that are negatively selected are shown in blue (round dots for IncRNAs and triangles for protein-coding genes). The coPARSE-IncRNAs of the top ten negatively selected IncRNAs are highlighted as red dots, as non-coPARSE-IncRNAs are highlighted as orange dots. **g**, The mean read count value for paired crRNAs at day 0 and day 45. Highlighted dots are paired crRNAs for the five negatively selected candidate genes; the background of gray to yellow density represents overall distribution. **h**, Correlation of the RRA scores of the IncRNAs in our screening and relative copy number data from ENCODE for HeLa and MCF7 cells. R, Pearson correlation coefficient, two-sided Student's *t*-test.

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Extended Data Fig. 7 | See next page for caption.

Extended Data Fig. 7 | Confirmation of cell proliferation-promoting function for coPARSE-IncRNAs identified by CRISPR-Cas12a screening and the selection of coPARSE-IncRNA candidates for knockout-rescue assay. a, Effects of crRNAs targeting the positive control gene RNY1 (left), RP1-212P9.3 (middle) and AL355075.4 (right) on cell proliferation in HeLa cells. Relative confluence of cell proliferation was calculated by normalizing GFP positive percentages at the indicated time points relative to control (day 0). Newly designed paired crRNAs not in the original library are marked with 'new'. b, Culture images of cell proliferation validation assays for HeLa cells treated with two independent shRNAs for each candidate coPARSE-IncRNA. Scale bars, 200 µm. The experiments were repeated three times with similar results. c, Relative RNA expression of RP1-212P9.3, RP11-563J2.3, and AL355075.4 in different shRNA knockdown assays. d. Design of the crRNA pairs and the PCR primers. Representative images of genomic DNA PCR amplification are shown. ACTIN was used as reference. MW: DNA marker. n = 3 independent biological experiments. e, Knockout efficiency based on PCR results for the targeted genome regions of OPRD1. The genomic DNA amplified by PCR was first normalized to the ACTB locus and then to HeLa cells treated with control AAVS1

crRNAs. f, Representative cell proliferation images for GFP-positive cells. Note that the selected images are all from a fixed field of view. Scale bars, 100 µm. The experiments were repeated three times with similar results. g, High-content imaging assay. The relative cell confluence at the indicated time points was calculated by normalizing to the cell numbers of day 0. h, Comparison of lentivirus packaging efficiency for the original knockout and the knockoutrescue plasmids. The lentivirus packaging efficiency was measured as the infection rates at 3 days post lentivirus infection. Scale bars, 200 µm, Error bars, means \pm SD, n = 6 biologically independent experiments, two-sided Student's t-test, n.s., not significant. i, Successful induction of ectopic gene expression under the indicated induction conditions. j, Scatter plot of the candidate coPARSE-IncRNAs (highlighted in red) selected for the knockout-rescue assay. **k**, **l**, Relative RNA expression of targeting genes for the knockout-rescue assays. Two pairs of primers were used to detect (k) endogenous and (l) ectopic expression of RP1-212P9.3 and its homolog or luciferase fragment. For panels a, e, and g, error bars, means \pm SD, n = 3 independent biological experiments. For panels c, i, k, and l, n = 2 independent biological experiments.

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Extended Data Fig. 8 | See next page for caption.

Extended Data Fig. 8 | Validation of functional homology of RP1-212P9.3 and its zebrafish homolog in zebrafish early embryos and xenograft tumors. a, Expression pattern of four zebrafish lncRNA homologs of human coPARSE-IncRNAs in early zebrafish embryos. The expression pattern of the four zebrafish lncRNAs was analyzed using whole-mount in situ hybridization. Scale bar, 100 µm. b, Examination of ASO knockdown efficiency. The RNA levels of the four zebrafish lncRNAs knocked down by ASOs (two ASOs per lncRNA) were examined by RT-qPCR at 4 hpf. Data were normalized to gapdh then to control ASO knockdown embryos. n = 3 biologically independent experiments with 90 embryos, error bars, means ± SD. c, Time-matched images of early embryogenesis showed a developmental delay beginning at 4 hpf and continuing throughout subsequent gastrulation in the knockdown embryos, **d**. Quantification of developmental phenotypes, n = 3 biologically independent experiments with embryos (158 for control ASO, 134 for TCONS 00107744 zbf ASO-1, 152 for TCONS 00075010 zbf ASO-1, 74 for TCONS_00052912_zbf ASO-1, 133 for TCONS_00124948_zbf ASO-1), error bars, means ± SD, two-sided Student's t-test. e, Time-matched images of early embryogenesis showing that injection of an antisense RNA for human

coPARSE-IncRNAs did not rescue the developmental delay in corresponding zebrafish lncRNA homolog knockdown embryos at 6 hpf. For panels c and e, the height and width of the blastula are denoted by straight red lines. The epiboly edge is marked by dotted lines. The embryonic shield and polster are indicated by red arrowheads. Scale bars, 100 µm. f, Quantification of zebrafish IncRNA knockdown embryos complemented with antisense fragments of the human homologous coPARSE-lncRNAs showing no resue of developmental delay defect(s). n = 3 biologically independent experiments. The number of embryos in each injection groups is detailed in Methods. Error bars, mean ± SD, two-sided Student's t-test, n.s., not significant. g, Down-regulation of zygotic genes in zebrafish lncRNA knockdown embryos. The relative mRNA levels of zygotic genes bahd1 and plekhg4 were examined by RT-qPCR in the control and zebrafish lncRNA knockdown embryos at 4 hpf. n = 3 biologically independent experiments with 90 embryos. Scale bars, 100 µm. Error bars, mean ± SD, twosided Student's t-test. h, Xenograft tumor mouse models of Dox+/- groups for the lncRNA RP1-212P9.3 or its homolog (TCONS_00107744_zbf) rescue samples.



Extended Data Fig. 9 | See next page for caption.

Extended Data Fig. 9 | Identification and GO analysis of RBP interactome of two coPARSE-IncRNAs in human HeLa cells. a, Scatter plot showing the correlation between two biological replicates of peptide spectral matches (PSMs) of proteins pull-down by the candidate coPARSE-lncRNA segments with predicted homologs across species in HeLa cells. b, Heatmap showing the number of common proteins pulled-down by different lncRNAs. Top 20 pull-down proteins (top interactors) with highest MiST scores were analyzed. c, Heatmap showing the enrichment *P* value (two-sided Fisher's exact test) of proteins pulled-down by different lncRNAs. d,e, Distribution of the MiST scores of pull-down RBPs by IncRNAs for (d) human THORLNC and its predicted homolog (thor) in zebrafish. Two commonly enriched RBPs from comparisons (highlighted in red circles) were validated by immunoblotting. (e) Human RP11-1055B8.4 and its predicted homologs (2900052L18Rik and TCONS 00075010 zbf) in mouse and zebrafish. The dashed lines represent a threshold of 0.7. For panels a, d, and e, r, Pearson correlation coefficient, two-sided Student's t-test. f, The enrichment Gene Ontology (GO) terms related to the interacting proteins are shown. *P* values were calculated by two sided Fisher's exact test and adjusted by FDR. **g**, Distribution of motif matches of RBPs in the human coPARSElncRNA RPI-212P9.3 and its homologs in mouse (Gm13063) and zebrafish (TCONS_00107744_zbf). Homologous regions are shadowed in blue. **h**, Distribution of motif matches of RBPs in homologous regions of human coPARSE lncRNA (RPI-212P9.3) and its homologs in mouse (Gm13063) and zebrafish (TCONS_00107744_zbf). **i**, Distribution of motif matches of RBPs in the human coPARSE-lncRNA RPI1-1055B8.4 and its homologs in mouse (2900052L18Rik) and zebrafish (TCONS_00075010_zbf). Homologous regions are shadowed in blue. **j**, Distribution of motif matches of RBPs in homologous regions of human coPARSE lncRNA (RPI1-1055B8.4) and its homologs in mouse (2900052L18Rik) and zebrafish (TCONS_00075010_zbf). For panels h and j, the motif matches for 7 representative RBPs with good alignment between three lncRNAs are shown. The RBPs predicted by lncHOME and identified by the RNA pulldown experiments in HeLa cell lysates are highlighted in red.

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Extended Data Fig. 10 | See next page for caption.

Extended Data Fig. 10 | Identification and GO analysis of the RBP interactome of two coPARSE-incRNAs in mouse cells and zebrafish embryos.

a, Distribution of the MiST scores of enriched RBPs pulled down using the human coPARSE-IncRNA RPI-212P9.3 and its predicted homologs from mouse and zebrafish in mouse V6.5 cells. The dashed lines represent a threshold of 0.7. The yellow circles represent the enriched RBPs in both two lncRNAs. Venn diagram showing the overlap of identified binding proteins for RPI-212P9.3 and its predicted homologs in mouse V6.5 cells. R, Pearson correlation coefficient, two-sided Student's *t*-test. **b**, Distribution of the MiST scores of enriched RBPs pulled down using the human coPARSE-lncRNA RPI-212P9.3 and its predicted homologs from mouse and zebrafish in zebrafish embryos. The dashed lines represent a threshold of 0.7. The yellow circles represent the enriched RBPs in both two lncRNAs. Venn diagram showing the overlap of identified binding proteins

for RP1-212P9.3 and its predicted homologs in zebrafish embryos. R, Pearson correlation coefficient, two-sided Student's *t*-test. **c**, Venn diagram showing the overlap of identified binding proteins for RP1-212P9.3 in HeLa cells, mouse V6.5 cells, and zebrafish embryos (left) and identified binding proteins for RP1-212P9.3 in HeLa cell, for its predicted mouse homolog in mouse V6.5 cells, and for its predicted zebrafish homolog in zebrafish embryos (right). Note that during the analysis, we only retained the proteins which have a homolog in all three species. The overlap proteins between the left and the right diagrams are highlighted in red. **d**, Enriched Gene Ontology (GO) terms related to the interacting proteins of human coPARSE-IncRNA RP1-212P9.3 and its predicted mouse and zebrafish homologs in human HeLa cells, mouse V6.5 cells, and zebrafish early embryos. *P* values were calculated by two-sided Fisher's exact test.

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For all statistical analyses, confirm that the following items are present in the figure legend, table legend, main text, or Methods section.					
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		Estimates of effect sizes (e.g. Cohen's d, Pearson's r), indicating how they were calculated			
	1	Our web collection on statistics for biologists contains articles on many of the points above.			

Software and code

Policy information about availability of computer code

Data collection RNA-seq data was collected from the NCBI website. The IncRNA annotations were downloaded from the other sources (e.g., Ensembl, NCBI, DeepBase). For one-to-one homology of protein-coding genes, we used the OrthoDB database. For pairwise genome alignments, we either obtained the data from the UCSC database. RBP binding motifs were collected from several databases, including CISBP-RNA, RBPDB, ATTRACT, and RNACOMPETE. CLIP-seq data was collected from CLIPdb, eCLIP, and Starbase datasets. We downloaded species conservation scores from UCSC database, SNP from the 1000 Genomes Catalog, and disease-associated variants from ClinVar database. We collected data of histone modifications determined in human and mouse liver tissues from the ENCODE dataset and gene expression data of three species from the Genotype-Tissue Expression (GTEx) Portal. The sequencing datasets have been deposited in the Gene Expression Omnibus (GEO) under the accession code GSE240342. The mass spectrometry proteomics data have been deposited to the ProteomeXchange Consortium via the PRIDE partner repository with the dataset identifier PXD046452.

Data analysis Raw reads of RNA-seq data were quality-controlled using FASTQC (v0.12.1), pre-processed using Trimmomatic (v0.39), and mapped to the reference genomes using STAR 2.4.2a. StringTie (v2.1.5) was used to assemble transcripts, and the Cufflink (v2.2.1) tool was used for transcripts merging. CPAT (v3.0.0) was used to estimate protein-coding potentials of the resulting transcripts. LiftOver (v1.1) was used to transformed the genomic coordinates to the latest formal versions of the UCSC Browser database. BLAST (v2.12.0) was used to perform pairwise sequence alignment. MEME suite (v4.10.1) and HOMER (only one version) was used to call RBP binding motifs from CLIP-seq datasets. TOMTOM (v5.5.4) was used to calculate motif similarity. FIMO (v4.11.2) was used to search for motif matched sites in transcripts. For KO screening analysis, RUVseq (v1.34.0) package was used to normalize read counts and vsearch (v2.23.0) was used to subsampled reads. MAGeCK (v0.5.9.5) was used to obtain read count tables for all samples from the SAM files of mapping results. For Mass spectrometry data analysis, Proteome Discoverer (v1.4) was used to identified proteins from mass spectrometry data and MIST algorithm was used to identified interacting proteins. STRING (v1.1) was used for GO enrichment analyses. All the code used for computational prediction and data analysis is available at https://github.com/lynhsiong/lncHOME and https://github.com/huangwenze/lncHOME_analysis.

For manuscripts utilizing custom algorithms or software that are central to the research but not yet described in published literature, software must be made available to editors and reviewers. We strongly encourage code deposition in a community repository (e.g. GitHub). See the Nature Portfolio guidelines for submitting code & software for further information.

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All manuscripts must include a data availability statement. This statement should provide the following information, where applicable:

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The sequencing datasets have been deposited in the Gene Expression Omnibus (GEO) under the accession code GSE240342. The mass spectrometry proteomics data have been deposited to the ProteomeXchange Consortium via the PRIDE partner repository with the dataset identifier PXD046452. The RNA-seq data source is provided in Supplementary Table 1. All datasets used in this study are available in supplementary tables and https://github.com/huangwenze/IncHOME_analysis.

Human research participants

Policy information about studies involving human research participants and Sex and Gender in Research.

Reporting on sex and gender	No human research participant
Population characteristics	No
Recruitment	No
Ethics oversight	No

Note that full information on the approval of the study protocol must also be provided in the manuscript.

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All studies must disclose on these points even when the disclosure is negative.

Sample size	No statistical method was used to predetermine sample size.
Data exclusions	No data were excluded from the analyses.
Replication	For RT-qPCR analysis, at least two biological independent samples were used. For CRISPR-Cas12a knockout screen, at least three biological independent samples were used. For CRISPR-Cas12a knockout-rescue assay, at least three biological independent samples were used. For the knockout-rescue experiments in zebrafish early embryos, at least three biological independent samples were used. For the RNA pull-down and MS analyses, at least two biological independent samples were used.
Randomization	In this study, the reported results were acquired using independent mouse and fish that were randomly collected for each group.
Blinding	The investigators were not blinded to allocation during experiments and outcome assessment.

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Materials & experimental systems			Methods	
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	Antibodies	\boxtimes	ChIP-seq	
	Eukaryotic cell lines		Flow cytometry	
\boxtimes	Palaeontology and archaeology	\boxtimes	MRI-based neuroimaging	
	Animals and other organisms			
\boxtimes	Clinical data			
\boxtimes	Dual use research of concern			

Antibodies

Antibodies usedFor western blot, For western blot, anti-GAPDH (Abcam, ab9485, 1:500), anti-TARDBP (proteinTech, 10782-2-AP,1:100), anti-NONO
(proteinTech, 11058-1-AP,1:100), anti-CAPRIN1 (proteinTech, 15112-1-AP, 1:100), anti- IGF2BP1 (proteinTech, 22803-1-AP, 1:100),
hnRNPA1 (proteinTech, 11176-1-AP,1:100), and HRP-conjugated goat anti-rabbit (Abcam, ab6721, 1:2000)
For in situ Hhybridization, AP-conjugated anti-DIG antibody (Roche, 11093274910,1:20)was used.ValidationThe validation of commercially available antibody was available on the manufacturer's website
GAPDH: https://www.abcam.com/products/primary-antibodies/gapdh-antibody-loading-control-ab9485.html
TARDBP: https://www.ptgcn.com/products/IARDBP-Antibody-10782-2-AP.htm
NONO: https://www.ptgcn.com/products/CAPRIN1-Antibody-15112-1-AP.htm
IGF2BP1: https://www.ptgcn.com/Products/IGF2BP1-Antibody-15112-1-AP.htm
IGF2BP1: https://www.ptgcn.com/Products/HNRNPA1-Antibody-11176-1-AP.htm
Goat Anti-Rabbit IgG H&L (HRP): https://www.abcam.cn/products/secondary-antibodies/goat-rabbit-igg-hl-hrp-ab6721.html
AP-conjugated anti-DIG antibody: https://www.sigmaaldrich.cn/CN/zh/product/roche/11093274910

Eukaryotic cell lines

Policy information about cell lines and Sex and Gender in Research					
Cell line source(s)	HEK293T (ATCC), HeLa (ATCC), Huh7 (BMCR), MCF7 (BMCR), ZEM-2S(CCTCC), V6.5 mouse ESC line was previously generated by us (Please see Wang Y.et al., Nature Genet 39,380-385 (2007))				
Authentication	All cell lines were used as received without further authentication.				
Mycoplasma contamination	All cell lines were negative for mycoplasma contaminatioin.				
Commonly misidentified lines (See <u>ICLAC</u> register)	No commonly misidentified cell lines were used in the study.				

Animals and other research organisms

Policy information about studies involving animals; ARRIVE guidelines recommended for reporting animal research, and <u>Sex and Gender in</u> <u>Research</u>

Laboratory animals	Male mice (NOD/SCID, 5-7 weeks), Zebrafish (AB strain, aged between 3 months to one year)
Wild animals	The study did not involve wild animals.
Reporting on sex	No considers on sex in this study.
Field-collected samples	The study did not involve samples collected from the field.
Ethics oversight	This research complies with all relevant ethical regulations. All animal protocols were approved by Institutional Animal Care and Use Committees (IACUC) of Peking University, which are accredited by the Association for Assessment and Accreditation of Laboratory Animal Care International (AAALAC). All zebrafish experiments were approved and carried out in accordance with the Animal Care Committee at the Institute of Zoology, Chinese Academy of Sciences.

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Flow Cytometry

Plots

Confirm that:

The axis labels state the marker and fluorochrome used (e.g. CD4-FITC).

The axis scales are clearly visible. Include numbers along axes only for bottom left plot of group (a 'group' is an analysis of identical markers).

All plots are contour plots with outliers or pseudocolor plots.

A numerical value for number of cells or percentage (with statistics) is provided.

Methodology

Sample preparation	Cells were digested and resuspended in culture medium, filtered through 70 um nylon mesh and then analyzed or sorted.
Instrument	FACSAria III and LSRFortessa (BD Biosciences)
Software	FlowJo V10
Cell population abundance	Flow cytometry was performed on bulk cells. 10000 cells analyzed for each condition.
Gating strategy	The gating and sorting strategy is illustrated in the figures. Cells were gated using FSC/SSC to exclude debris and boublets. GFP-positivity is defined by comparing with no GFP-expressed cells.

Tick this box to confirm that a figure exemplifying the gating strategy is provided in the Supplementary Information.