RNAi-Dependent and Independent Control of LINE1 Accumulation and Mobility in Mouse Embryonic Stem Cells

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Abstract

In most mouse tissues, long-interspersed elements-1 (L1s) are silenced via methylation of their 5′-untranslated regions (5′-UTR). A gradual loss-of-methylation in pre-implantation embryos coincides with L1 retrotransposition in blastocysts, generating potentially harmful mutations. Here, we show that Dicer- and Ago2-dependent RNAi restricts L1 accumulation and retrotransposition in undifferentiated mouse embryonic stem cells (mESCs), derived from blastocysts. RNAi correlates with production of Dicer-dependent 22-nt small RNAs mapping to overlapping sense/antisense transcripts produced from the L1 5′-UTR. However, RNA-surveillance pathways simultaneously degrade these transcripts and, consequently, confound the anti-L1 RNAi response. In Dicer−/− mESC complementation experiments involving ectopic Dicer expression, L1 silencing was rescued in cells in which microRNAs remained strongly depleted. Furthermore, these cells proliferated and differentiated normally, unlike their non-complemented counterparts. These results shed new light on L1 biology, uncover defensive, in addition to regulatory roles for RNAi, and raise questions on the differentiation defects of Dicer−/− mESCs.

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Introduction

Long-interspersed elements-1 (LINE-1 or L1) belong to the most abundant class of autonomous transposable elements (TEs) in mammalian genomes. While most L1s are truncated and unable to transcribe or retrotranspose, a fraction of young, full-length L1s are capable of mobilization [1]. Active and inactive L1s influence the evolution of mammalian genomes, yet L1 insertions are also linked to disease [1], raising the issue of how L1 expression and retrotransposition are controlled. In plants, fungi and metazoans, silencing small (s)RNAs suppress TEs at both transcriptional and post-transcriptional levels [2]. I. In mice, germline-specific, 26–31-nt post-transcriptional silencing small (s)RNAs suppress TEs at both transcriptional and retrotranspositional levels [2]. In most mouse tissues, long-interspersed elements-1 (L1s) are silenced via methylation of their 5′-untranslated regions (5′-UTR). A gradual loss-of-methylation in pre-implantation embryos coincides with L1 retrotransposition in blastocysts, generating potentially harmful mutations. Here, we show that Dicer- and Ago2-dependent RNAi restricts L1 accumulation and retrotransposition in undifferentiated mouse embryonic stem cells (mESCs), derived from blastocysts. RNAi correlates with production of Dicer-dependent 22-nt small RNAs mapping to overlapping sense/antisense transcripts produced from the L1 5′-UTR. However, RNA-surveillance pathways simultaneously degrade these transcripts and, consequently, confound the anti-L1 RNAi response. In Dicer−/− mESC complementation experiments involving ectopic Dicer expression, L1 silencing was rescued in cells in which microRNAs remained strongly depleted. Furthermore, these cells proliferated and differentiated normally, unlike their non-complemented counterparts. These results shed new light on L1 biology, uncover defensive, in addition to regulatory roles for RNAi, and raise questions on the differentiation defects of Dicer−/− mESCs.

In plants, RNA interference (RNAi) at the post-transcriptional level can operate as a surrogate to cytosine methylation and heterochromatinization in TE-silencing [8,9]. RNAi relies on populations of small interfering (si)RNAs, processed sequentially by the RNase-III Dicer (DCR) from long, perfectly double-stranded (ds)RNA precursors [10]; these are commonly produced by TEs due to their complex insertion patterns or intrinsic bi-directional transcription. Processed siRNAs load into ARGONAUTE (Ago)-family effector proteins and guide sequence-specific degradation of complementary target transcripts. The existence of an endogenous (endo)-siRNA pathway in mammals has been debated, notably because long dsRNA triggers the non-specific interferon (INF) response in most cells [11]. In mouse oocytes, which lack an INF response, heterogeneous sRNA populations map to L1 and LTR elements, among other loci, but their DCR-dependency is unknown; additionally, L1 accumulation is unchanged in oocytes of conditional Der−/− animals [12].
Author Summary
A basal network of gene regulation orchestrates the processes ensuring maintenance of genome integrity. Eukaryotic small RNAs generated by the RNAse-III Dicer have emerged as central players in this network, by mediating gene silencing at the transcriptional or post-transcriptional level via RNA interference (RNAi). To gain insight into their potential developmental functions in mammals, we have characterized small RNA expression profiles during mouse Embryonic Stem Cell (mESCs) differentiation, a model for early mammalian development. Long interspersed elements 1 (L1) are non-long-terminal-repeat retrotransposons that dominate the mouse genomic landscape, and are expressed in germ cells or during early development and mESCs. Based on clear precedents in plants and fission yeast, we investigated a role for RNAi and other RNA-based pathways in the regulation of L1 transcription and mobilization. Our work uncovered the existence of small (s)RNAs that map to active L1 elements. Some have characteristics of cognate siRNA produced by Dicer, while others display strand biases and length heterogeneity that evoke their biogenesis through RNA surveillance pathways, in a Dicer-independent manner. Furthermore, genetic ablation of DICER or of ARGONAUTE proteins has complex and profound consequences on L1 transcription and mobilization, indicating that endogenous RNAi do indeed maintain genomic integrity against L1 proliferation.

Embryonic Stem Cells (mESCs) also lack an INF response and their ability to produce DCR-dependent endo-siRNAs was clearly established genetically [13]. Being isolated from the blastocyst’s inner mass, cultured mESCs are thus potentially suited to study the mechanism(s) that might restrict L1 retrotransposition during pre-implantation, including, possibly, RNAi. Supporting this view, several classes of young, full-length endogenous L1 are hypo-methylated and transcriptionally active in undifferentiated mESCs [14,15] but become re-methylated and silenced upon differentiation [15,16]. Moreover, substantially increased L1 transcript levels were reported in undifferentiated Dcr−/− mESCs [17], although this was not confirmed in separate analyses of a distinct KO cell line [18]. Shallow RNA sequencing (15–50-nt size-range) in undifferentiated mESCs revealed that L1 transcription correlates with accumulation of sense and antisense sRNAs of undetermined nature/function, mapping mostly to the L1_5’-UTR [15]. In Human L1s, this region displays overlapping sense-antisense transcription with the potential to form dsRNA and, as such, was proposed to generate anti-L1 sRNAs [19,20]. In a pioneering study, attempts to substantiate this idea in somatic human cells yielded, however, indecisive results: discrete 21–23-nt L1-derived sRNAs could indeed be detected in some cell lines but not others, and their DCR-dependency was not established; moreover, knocking-down human Dcr-1 caused only marginal increases in endogenous L1 transcription and retrotransposition [20,21].

Here, we have investigated the possible link between RNAi and endogenous L1 regulation in undifferentiated mESCs. Uniquely, these cells can withstand full genetic ablation of DCR or the AGO proteins, albeit at the cost of proliferation and differentiation defects tentatively ascribed, at least partly, to an inability of Dcr−/− mESCs to produce micro- (mi)RNAs [17,22]. Unlike siRNA populations, DCR-dependent miRNAs accumulate as discrete, imperfect duplexes excised from stem-loop-containing precursor transcripts produced from numerous independent transcription units. Mature miRNAs are thought to regulate hundreds of cellular transcripts displaying partial miRNA-complementarity, which include mRNAs important for cell fate specification but also pluripotency [23]. Undifferentiated mESCs contain relatively few, albeit highly abundant miRNAs, that can be genetically discriminated from endo-siRNAs and other rare DCR-dependent sRNAs using mutations in the generic miRNA biosynthesis factor DGCIR8. Dgcir8 KO mESCs contain, nonetheless, few non-canonical miRNAs produced by diverse means [13]. Combining the use of deep-sequencing and cell lines carrying null mutations in Dcr, Ago2 and Dgoβ, we have investigated the distribution, biochemical origin(s) and ability of L1-derived sRNAs to silence L1 transcript accumulation and retro-transposition in undifferentiated mESCs. Our study reveals an unexpected level of complexity in L1 silencing in these cells, where siRNA-directed RNAi processes are confounded by the overlapping effects of general RNA-surveillance pathways. These findings reveal a novel level of mammalian L1 regulation and shed new light on the proliferation defects and inability of Dcr−/− mESCs to differentiate.

Results
LINE-1 mRNA and proteins overaccumulate in Dicer knockout mESCs
To further explore the L1-derived sRNAs in undifferentiated mESCs, we combined ILLUMINA deep-sequencing and the use of the ncPRO pipeline [24] enabling genomic mapping of repeat-derivated sRNAs. A population of abundant, sense and antisense sRNAs was detected, mapping as a majority to the L1-Tf_5’-UTR, consistent with our previous observations (Figure 1A and Figure S1A) [15]. As seen previously with human L1 [19], strand-specific RT-PCR revealed that the 5’-UTR of the L1-Tf subfamily [25] displays overlapping sense-antisense transcription (Figure S1B) with the potential, therefore, to generate dsRNA as a possible source of DCR-dependent sRNAs. Because constitutive DCR depletion is detrimental to cultured mESCs [22], we pursued the above idea by generating inducible Cre-ERT2 Dcr knockouts. Although Dcr deletion was already achieved 24 h post-tamoxifen treatment (Figure 1B), reduced accumulation of miR-295, one of the most abundant mESC miRNAs, was only visible 6 days post-tamoxifen treatment, presumably reflecting the high DCR protein stability [22]. By 12 d post-tamoxifen treatment, miR-295 was below detection levels of quantitative qRT-PCR, indicating full depletion of DCR activity, also confirmed by quantitation of previously validated mESC miRNA target transcripts (Figure 1C and Figure S1C). Strikingly, decreased DCR levels were inversely correlated with accumulation of miRNA and ORF1 protein derived from all L1 classes (Figure 1D and 1E) or from distinct L1-subtypes displaying 5’-UTR polymorphisms [25] (Figure S1D). Analysis of a specific, polymorphic L1 element on chromosome 17 [15] yielded similar results (Figure 1F). Dicer−/− mESCs have been reported to display hypomethylation due to decrease levels in DNA methyl-transferases (DNMTs) [26]. However, DNMT1 and DNMT3b proteins were expressed to the same levels in wild type and Dicer−/− cells (Figure S2A). In addition the L1 mRNA was not up-regulated in a cell line carrying a triple-KO for DNMT1, 3a and 3b (Figure S2B) [27]. Investigating the methylation status of the L1_5’-UTR through bisulfite sequencing revealed nonetheless that Dicer−/− mESCs are hypomethylated, which could contribute to the observed up-regulation of the L1 mRNA (Figure S2C).

Retrotransposition of LINE-1 in Dicer knockout mESCs
Moreover, this increase in L1 transcript/protein in Dcr−/−, but not Dcr+/− mESCs, was paralleled by a marked gain in
endogenous L1 copy-number, estimated by Q-PCR using PCR primers specific for the L1_Tf subfamily. The promoter activity of mouse L1 elements lies in tandemly repeated, 200 bp monomeric units within the 5' UTR. These monomers are distinct between different LINE-1 families [28]. We used promoter-specific primers to discriminate, by Q-PCR, the three active families of murine L1 elements designated Tf-, Gf-, and A-type (Table S1). For copy number analysis, we focused exclusively on L1_Tf, which was the subfamily we found mostly associated with small RNAs accumulation (Figure S1A) [15]. Using RepeatMasker (AFA. Smit and R. Hubley. RepeatModeler Open-1.0. http://www.repeatmasker.org, 2008–2010), we identified 22,506 sequences annotated L1Md_T (L1_Tf), 15,286 annotated L1Md_A and 819 annotated L1Md_Gf. Among these "fragment" population of L1 elements, we identified 2,291 L1Md_T, 1,338 L1Md_A and 35 L1Md_Gf, which have a length matching at least 95% of their corresponding L1 reference sequence. For 1 512 L1Md_T, we were able to identify at least one amplicon using the L1_Tf specific PCR primers (See Materials & Methods and Table S1), with an average of 3.9 amplicons per elements. We thus calculated 2,770 full length L1_Tf elements in the mm9 genome, which is in line with the 2000–3000 L1_Tf elements previously estimated by Naas et al. [29], of which 60% are putatively active. To evaluate the gain in copy-number, Dcr<sup>F<sup>x</sup>F<sup>x</sup></sup> mESCs were analysed at passage 10, upon which the Dcr deletion was induced; the L1_Tf copy number was then re-assessed after 20 additional passages in Dcr<sup>F<sup>x</sup>F<sup>x</sup></sup> and Dcr<sup>−/−</sup> background (Figure 2A). About 2,452 active L1_Tf copies were found in Dcr<sup>F<sup>x</sup>F<sup>x</sup></sup> mESCs at P10 and 2,707 copies at P30. A gain of approximately 860 new copies was detected in the Dcr<sup>−/−</sup> cell line after 20 passages. Therefore, we estimate that between 1 and 20 new active copies of L1_Tf were generated per day (i.e. 2 cell divisions) in the Dcr<sup>−/−</sup> background.

To ascertain the above PCR-based results, we adapted the gain-of-GFP retrotransposition assay previously developed by Prak and colleagues [30] and validated in WT mESCs [31]. To score de novo L1 retrotransposition events in the Dcr<sup>F<sup>x</sup>F<sup>x</sup></sup> and Dcr<sup>−/−</sup> mESC lines, a human L1 modified to contain an intronic, split eGFP reporter was stably integrated into the genome of Dcr<sup>F<sup>x</sup>F<sup>x</sup></sup> and Dcr<sup>−/−</sup> cells transformed with WT eGFP-tagged L1 (Figure S2D) or in WT cells (data not shown). Amplification of eGFP DNA was also only observed in Dcr<sup>−/−</sup> cells transformed with WT eGFP-tagged L1 (passage 6; Figure 2C), a method also previously employed to validate active retrotransposition [32]. Finally, similar results were also obtained using a gain-of-Luciferase retrotransposition assay [33] (data not shown). We conclude that DCR negatively controls L1 transcript accumulation and retrotransposition in undifferentiated mESCs.
L1 sRNAs form overlapping populations of DCR-dependent and -independent species

Given the DCR-dependent control of L1, we next investigated whether L1_5'-UTR sRNAs are DCR products. Total RNA from Dcr<sup>-/-</sup> mESCs was subjected to ILLUMINA sequencing. As expected, loss-of-DCR activity caused a dramatic decline in cellular 21-23-nt RNAs including, chiefly, miRNAs, representing most sRNAs in WT mESCs. Consequently, the relative proportion of repeat-derived sRNAs was seemingly increased in Dcr<sup>-/-</sup> compared to WT cells (Figure 3A). However, read-size analysis and genomic mapping revealed a specific depletion in sense and antisense L1-derived 22-nt sRNAs in Dcr<sup>-/-</sup> mESCs (Figure 3A); it was, however, clearly enriched in 22-nt sRNAs are DCR products. Total RNA from Dcr<sup>-/-</sup> mESCs was subjected to ILLUMINA sequencing. As expected, loss-of-DCR activity caused a dramatic decline in cellular 21-23-nt RNAs including, chiefly, miRNAs, representing most sRNAs in WT mESCs. Consequently, the relative proportion of repeat-derived sRNAs was seemingly increased in Dcr<sup>-/-</sup> compared to WT cells (Figure 3A). However, read-size analysis and genomic mapping revealed a specific depletion in sense and antisense L1-derived 22-nt sRNAs in Dcr<sup>-/-</sup> mESCs (Figure 3A). To test if some L1-derived sRNAs were effectively loaded into cognate RNA silencing effectors, we analysed the sRNA content of immunoprecipitates from endogenous AGO1 and AGO2, the RNA silencing effectors, we analysed the sRNA content of immunoprecipitates from endogenous AGO1 and AGO2, the only Agos we found significantly expressed at the protein level in undifferentiated mESCs, in agreement with available mESC RNA-seq data [34]. Using qRT-PCR, we found that the most abundant sense and antisense L1_5'-UTR sRNAs were specifically loaded into AGO2, as were several abundant miRNAs tested (Figure 3C). To obtain a comprehensive and unbiased view of AGO2-loaded L1-derived sRNAs, we used a Mi-gene expression vector that targets RNAi gene clusters of interest. (Figure 4A and S4A). The results presented are for Xnr2; similar effects were observed in Rpp6_KD cells (Figure S4A and S4C), while they were much less pronounced in Xnr1_KD cells (data not shown). L1 transcripts and ORF1 protein were found significantly up-regulated in Xnr2_KD mESCs, (Figure 4A–B and S4D), correlating with reduced accumulation of the most abundant sense and antisense L1-derived sRNAs (Figure S4B). Copy-number analysis (as in Figure 2A) showed, however, that neither the Xnr2_KD nor the Rpp6_KD cell lines showed enhanced L1 mobilization (Figure 4C and S4G). Thus, RNA-surveillance pathways likely contributed to the heterogeneous mESC L1-derived sRNAs, which are presumably degradation intermediates of exosome/miRNA degradation of the longer sense and antisense transcripts derived from the L1_5'-UTR. Loss of these RNA-surveillance pathways did not, however, impact on L1 retrotransposition. These results thus support a role for siRNA-mediated RNAi in the control of L1 mobility, although we could not rule out an indirect contribution of DCR-dependent miRNAs, which regulate hundreds of cellular transcripts. To address this, we examined Dicer<sup>-KO</sup> mESCs, in which production of even the most abundant mESC miRNAs,
including miR-295, is abrogated [37] (Figure 4D). Accumulation of endo-siRNAs and potential DGCR8-independent (i.e. non-canonical) miRNAs should remain in these cells [13,35] (Figure S4E). As shown in Figure 4E and 4F, Dgcr8-KO cells unexpectedly displayed enhanced L1 mRNA accumulation, possibly explained by the hypomethylation status of L1_5'9-UTR in these cells (Figure S2A–C). However, there was no increase in L1 copy number (Figure 4F), ruling out the contribution of canonical miRNAs to the observed DCR-dependent control of L1 retrotransposition.

AGO2 is crucial for L1 silencing and strongly destabilized in Dcr2/2 mESCs

Although we could not formally exclude a role for some unknown DGCR8-independent miRNAs in L1 retrotransposition control, the above results pointed to the likely contribution of DCR-dependent, 22-nt siRNAs derived from the L1_5'9-UTR region of overlapping sense-antisense transcription (Figure 3A and S3B); their strong loading-bias in AGO2 thus predicted a crucial role for this silencing effector in L1 regulation (Figure 3C and 3E).

To test this idea and avoid functional redundancy with AGO1 as previously observed with miRNAs [38,39], we used an established quadruple Ago1,2,3,4_KO mESC line, in which a stably expressed hAgo2 transgene can be deleted upon tamoxifen treatment [38] (Figure S4F). MiR-295 levels were strongly reduced at 2 d, and at 5 d post-tamoxifen treatment; a corresponding increase in microRNA target levels confirmed cellular depletion of hAgo2, as reported [38] (Figure 4G and S4G). As in Dcr2/2 cells, tamoxifen-induced Ago1,2,3,4_KO mESCs displayed strong up-regulation of L1 transcripts and increased L1 copy-number, unlike their untreated counterparts (Figure 4H–I and S4H–I), supporting a key contribution of AGO2 in L1 silencing in undifferentiated mESCs.

The L1 copy-number increase in Ago1,2,3,4_KO cells was noticeably less pronounced than in Dcr2/2 cells (Figure 4I and 2A) however, possibly reflecting intrinsic differences in the relative initial L1 copy-number of non-treated Ago1,2,3,4_KO and DcrFlx/Flx cell lines. Alternatively, cellular depletion of Dcr may have had additional, unanticipated effects that would lead to more potent...
L1 retrotransposition (Figure 2A). A survey of several key RNAi components indeed revealed a specific and dramatic reduction of AGO2 in Dcr2/2 mESCs in multiple experiments, also reported recently in Dgcr8_KO mESCs [40] (Figure 5A). This effect was observed only at the protein level, as Ago2 mRNA remained expressed (Figure S5A); it was also specific, since AGO1 protein levels remained unchanged (Figure 5A). As the prevalent effector of DCR-dependent miRNAs (Figure 3C), representing alone up to 70% of all mESC miRNAs (Figure S3G), we reasoned that AGO2 might have been destabilized and degraded in Dcr2/2 mESCs due to the loss of its main sRNA cargoes; such an effect was documented for the Arabidopsis miRNA-effector AGO1 [41]. Indeed, we found AGO2 levels to be significantly up-regulated upon treatment of Dcr2/2 mESCs with the 26S-proteasome inhibitor MG132, an effect previously reported for miRNA-depleted hAgo2 [40,42] (Figure S5B). Also consistent with a loss-of-miRNA-dependent effect, AGO2 levels, unlike those of AGO1, were also reduced in Dgcr8_KO mESCs, albeit consistently less than in Dcr2/2 cells (Figure 5A). This, incidentally, possibly explained the results on L1 silencing obtained in Dgcr8_KO mESCs before and after hAgo2 deletion. *: p-value<0.1.

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Figure 4. L1 mRNA levels and genomic copy-number in various knock-out and knock-down mESC lines. A. Western analysis of XRN2 and L1_ORF1 accumulation in WT and Xrn2_KD mESCs; CM: Coomassie staining of total protein. B. qRT-PCR analysis of L1_ORF2 mRNA levels in WT and Xrn2_KD mESCs. C. qPCR analysis of L1_Tf copy-number in WT and Xrn2_KD mESCs. D–E. qRT-PCR analysis of miR-295 (D) and L1_ORF2 mRNA (E) levels in WT and Dgcr8_KO mESCs. F. qPCR analysis of L1_Tf copy-number in WT and Dgcr8_KO mESCs. G–H. qRT-PCR analysis of miR-295 (G) and L1_ORF2 mRNA (H) levels upon hAgo2 deletion in Tamoxifen-treated Ago1,2,3,4_KO mESCs. I. qPCR analysis of L1_Tf copy-number in Ago1,2,3,4_KO_hAgo2 mESCs before and after hAgo2 deletion. *: p-value<0.1.

Regulation of LINE1 Mobility in mESCs

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the absence of its main cargoes, the miRNAs [40]. We thus resorted to stably complemented Dcr−/− mESCs with a human Dcr (hDcr) transgene. During their early propagation, several independent puromycin-selected clones displayed endogenous AGO2 levels consistently higher than in non-complemented Dcr−/− mESCs; moreover, L1 silencing, measured by ORF1 and mRNA accumulation, was restored in these cells to almost the levels seen in DcrFlx/Flx cells (Figure 5B and 5C). Strikingly, however, in nearly all these clones, mature miRNA levels were only rescued to approximately 10% of WT levels, which is likely below physiological significance, because all validated miRNA targets tested accumulated ectopically in these cells (Figure 5D and 5E). The levels of miRNAs and their targets were eventually restored to WT levels, as previously described [17], but only after extended periods of culture involving more than ten cell passages, during which the poor fitness of cultured Dcr−/− mESCs [22] presumably resulted in selection for cell variants with higher DCR levels. Nonetheless, the early passage data demonstrate that L1 silencing could be achieved in undifferentiated mESCs displaying as little as 10% total miRNAs, suggesting that RNAi silencing L1s.

Complemented, miRNA-defective Dcr−/− mESCs differentiate normally

These data prompted us to re-evaluate the proliferation and differentiation defects of Dcr−/− cells [17,22,37]. Having now uncovered a potential role for DCR and AGO2 in L1 silencing in addition to their known regulatory functions via miRNAs, we explored to what extent the Dcr−/− cell defects were attributable to defective miRNA, as opposed to siRNA, biogenesis or action. DcrFlx/Flx, Dcr−/− and hDcr-complemented Dcr−/− cells (early passages) could all undergo the formation of Embryoid Bodies (EBs), although this was achieved with a 1–2 d delay in Dcr−/− cells. 6 d after the onset of differentiation, EBs were plated onto adherent flasks and monitored until d10 of differentiation. Microscopy and quantitation of key pluripotency markers confirmed that Dcr−/− cell-derived EBs were unable to differentiate, even if they attached to the flasks’ surface [17] (Figure 6A, 6B and Figure S6A). In contrast, the growth rate and morphology of cells differentiated around attached EBs were similar in DcrFlx/Flx and hDcr-complemented Dcr−/− cells (Figure 6A). Furthermore, 10 d post-differentiation of hDcr-complemented Dcr−/− cells, AGO2 accumulation was partially rescued, and the levels of pluripotency and differentiation markers were similar to those of DcrFlx/Flx cells (Figure 6B and Figure S6A). MiRNA accumulated to only 5–7% of WT levels in hDcr-complemented Dcr−/− cells, which displayed, accordingly, ectopic miRNA target accumulation (Figure S6A and S6B). However, L1 transcript accumulation in these cells was as low as in differentiated DcrFlx/Flx cells (Figure S6A), demonstrating rescue of L1 silencing. These results strongly suggest that miRNAs alone are unlikely to underpin mESC genome integrity by silencing active retrotransposons, including L1. Consistent with this idea, Dgcr8 KO cells that lack all canonical miRNAs but, unlike Dcr−/− cells, suppress L1 mobilization, could partially differentiate in the same experimental setting, agreeing with previous findings [37]; Xm22_KD cells, which also are L1-silencing proficient, differentiated similarly to DcrFlx/Flx cells (Figure 6C).

**Discussion**

Our results support a role for DCR-dependent L1-derived siRNAs in taming endogenous L1 retrotransposition in undifferentiated mESCs. They are thus consistent with RNAi safeguarding genome integrity during a time window of mouse development.
when DNA hypo-methylation coincides with L1 mobilization [7]. A role for RNAi in correcting DNA methylation defects of TEs is fully supported by previous work in Arabidopsis [8,9], in which intricate and opposing interactions between the RNAi and RNA-surveillance pathways have also been documented [43]. A parallel can be further established between our results and those of recent work in S. pombe, showing that RNAi at several loci, including T2 retroelements, is confounded by the 3′-5′ exonuclease activity of the exosome; genetic ablation of Rrp6 was, accordingly, sufficient to uncover siRNAs accumulating at these loci, showing, in that case, selective competition between the two pathways [44]. Human L1 transcription has been associated with the production of abundant non-polyadenylated and possibly uncapped RNAs of both strands accumulating in the nucleus [45]. Similar RNAs produced from the mouse L1_5′-UTR region likely provide the bulk of templates for Xrn2 and the Rrp6-associated exosome, known to degrade aberrant transcripts in the nucleus [46]; the resulting degradation intermediates form an important source of endo-siRNAs, in particular, might be crucial in preventing widespread double-strand break lesions and insertional mutagenesis, foreseebly detrimental to mESC proliferation and differentiation. This might also explain why Dgcr8 KO cells, unlike Der−/− cells, retain an ability to differentiate partially [17,37] (Figure 6C). Indeed, Dgcr8 KO cells, unlike their Der−/− counterparts, exhibit detectable levels of AGO2 (Figure 5A), which must be stabilized by the loading of endo-siRNA including L1-derived siRNAs and/or non-canonical miRNAs. Transposon taming and/or endogenous regulation by these molecules might be sufficient to rescue, at least partly, the differentiation defects of Dgcr8 KO cells. Assessing the extent to which RNAi-dependent control of active TEs, including L1s, contributes to the integrity of mESCs proliferation and differentiation, and thus to early mammalian embryogenesis, is an attractive prospect for future investigation.

Conclusions

This study unravels how multiple RNA silencing pathways might cooperate to dampen the expression and mobilization of an active family of transposable element family in mammalian cells. It not only echoes previously findings made in plants, fungi and invertebrates [44,48,49], but also rationalizes the complex patterns of small RNAs uncovered in studies originally conducted in mouse oocytes [12,50] and, more recently, in Human stem cells [51]. On a final note, although the mechanisms uncovered here in mESCs were tied in within the frame of early embryonic development, they may well also apply to other stem cell niches formed post-embryonically and present in many tissues of adult mammals. The states of pluripotency and multi-potency seem generally associated with a deficit or absence of protein-based immunity, which includes the IFN response to exogenous and endogenous dsRNA. This might explain, at least partly, why these cells, unlike many other somatic cells, appear to accommodate RNAi triggered by long dsRNA [52,53]. In this context, we contend that siRNA-based RNAi has persisted in vertebrates as a primordial mechanism that protects progenitor cells of developing and adult organisms from the harmful effects of transposons and exogenous viruses [54]. This proposed RNAi-based defence is anticipated to be important, because genomic instability or viral infections in progenitor cells would have long-lasting detrimental consequences throughout the entire lineages derived from them. Defensive, as opposed to regulatory roles for mammalian RNAi have been somewhat overlooked thus far, but we are optimistic that the work reported here and elsewhere [54] will shed new light on this specific and fascinating aspect of RNA silencing.
Materials and Methods

Culture and in vitro differentiation of ESCs

mESCs were cultured in Dulbecco’s Modified Eagle Media (DMEM) (Invitrogen), containing 15% of a special selected batch of fetal bovine serum (FBS; Life Technologies) tested for optimal growth of mESCs (Life Technologies), 0.05 mg/mL of streptomycin, and 50 U/mL of penicillin (Sigma) on a gelatin coated support in the absence of feeder cells. Embryoid body cultures were established by aggregation of mESCs in a low-adherent tissue culture dish into LIF-free DMEM, 10% FBS medium, from day 1 until day 6 and reattached on adherent flasks at day 10 of differentiation. The culture medium was changed daily. All cells were grown at 37°C in 5% CO2.

The male E14 mESC line ([29/01a background]) [55] was used for Illumina deep sequencing of WT mESC. E14_FHA-hAgo2 cells were created by stable transfection of plasmid pRESneo-FLAG/HA Ago2 corrected (Addgene plasmid 10822) [56] and selection on G418-containing medium. TKO mESCs were described in ref. [27]. Dgcr8_KO mESCs were purchased from Novus Biologicals (NBA1-19549). New CreERT2-Dm_Pdx/Pks mESCs were isolated from the cross of floxed Dm_Pdx/Pks mice [22, 57] and ROSA-CreERT2 mice [58]. The Der-/- mESC line was established from Dm_Pdx/Pks mESC after induction with Tamoxifen (more than 15 days) and routinely controlled for the loss of microRNA accumulation. Genotyping primers used for the characterization of these cell lines are presented in Table S1. The inducible mESC line deficient for the four mouse Argonautes and carrying a floxed human Ago2 transgene (Ago1,2,3,4_KO) was described previously [38] and validated in the laboratory according to the author instructions. Der and hkg2 deletions were induced with 4-OHT (Tam) stock solution (1 mM, dissolved in 100% ethanol) diluted 1:1000 in cell culture medium to a final concentration of 1 μM for 6 and 12 days (Der) and 2 and 5 days (hkg2). Transgenesis of WT and mutated version of the human L1_cGFP (RP = TgWT, JM111 = Tg1050 and 2980 = Tg5’UTR) [30] was carried out using 5 μg of each plasmids and Lipofectamine 2000 (Life Technologies) in E14 and Der-/- mESCs. Stable clones were selected on puromycin-containing medium (1 μg/mL; Sigma) 24 h post-transfection and analysed after 4 and 6 passages of the cells. Xim2_KD mESC lines were generated using the psUPER-puro vector (OligoEngine, http://www.oligoengine.com) engineered to produce the active shRNA 5’-CTCGAGAGAGAA-CAGGAGAAAT-3’ (Xim2_KD). Upon transfection of PGK mESCs [59], cells were selected on puromycin-containing medium. Control cell lines were generated by integration of an empty psUPER-puro vector into PGK mESCs. Dgcr8_KO/Xim2_KD mESC lines were generated using the psUPER-puro vector engineered to produce the active shRNA 5’-CTCGAGAGAGAA-CAGGAGAAAT-3’ and 5’-CTCGGGAGATACAGTTGAGATT-3’. Upon transfection of the Dgcr8_KO transgene, cells were selected on puromycin-containing medium. The hDcr-complemented Der-/- cell line was created by the transfection of plasmid pDES1mycDicer (Addgene plasmid 19873) [60] into Der-/- mESCs. Stable Der-/-hDcr mESCs were selected on G418-containing medium and analysed at early passages (<P5) and late passages (>P10). MG192 (Z-Leu-Leu-Leu-; Sigma, C2211) was dissolved DMSO and added to the cells for 7 h to a final concentration of 0.5 μM.

Deep-sequencing

Total cellular RNA (5 μg), extracted using IsolRNA Lysis Reagent (PRIME) was processed into sequencing libraries using adapted Illumina protocols and sequenced at Fasteris (http://www.fasteris.com, Switzerland) using the HiSeq 2000 sequencer. All next-generation sequencing data have been deposited to the NCBI Gene Expression Omnibus (GEO) and are accessible with the accession n° GSE43110 (WT and Der-/-) and GSE43153 (IP_FHA-hAgo2).

sRNA analysis

The sRNA-seq analyses were performed using the ncPRO pipeline [24]. Briefly, the reads were aligned on the mm9 genome using the Bowtie software and allowing multiple matches. Profiling of repeats was estimated from the intersection of the mapped reads with the RepeatMasker annotation. As annotated L1Md_T1 L1 repeats are often truncated or have different full length, the median size of full length was considered, and all LdMd_Tf L1 repeats were scaled to this median size when computing positional read coverage. The positional read coverage was computed by summing up the normalized counts (RPm) of reads covering each position, which was further normalized to the proportion of L1Md_Tf L1 repeats in the genome containing the position.

PCR

Strand-specific RT-PCR was performed using the Transcriptor Reverse Transcriptase kit (Roche) using 1 μg total RNA and following the manufacturer’s instructions. PCR using primer for the specific Ti LINE from chromosome 17 were conducted at 95°C for 10 min, followed by 35 cycles at 95°C for 15 s, 60°C for 30 s, 72°C for 30 s and 10 min at 72°C and revealed on 1% agarose gel. Real-time PCR reagents for miRNAs, 5’_UTR sRNAs and control U6 snRNA were from Qiagen. 5’_UTR sRNAs sense and antisense discrete sequences have been extracted from deep-sequencing data and chose because their higher level of expression. For RT reactions, 1 μg total RNA was reverse-transcribed using the miScript Reverse Transcription Kit (Qiagen) according to the manufacturer’s instructions. Following the RT reactions, cDNA products were diluted five times in distilled water, and 2 μL of the diluted cDNAs was used for PCR using Quantitect SYBR Green PCR Master Mix and miScript Universal Primer (Qiagen). PCR reactions were conducted at 95°C for 10 min, followed by 40 cycles at 95°C for 15 s and 60°C for 30 s on a LightCycler 480 real-time PCR machine (Roche). Real-time PCR for mRNAs was performed as described in [36] using the Rrn2 as a reference gene. L1 copy-number analysis was conducted on 50 ng of DNA and normalized with Rrn2 gene (a single-copy gene). Differences between samples and controls were calculated based on the 2-△CT method. Each Real-time PCR reaction was carried out in triplicates using samples from three or five independent differentiation events or cell lines for all mESC experiments, unless otherwise stated. Student’s T-Test was used to evaluate the statistical significance of Q-PCR analysis of L1 copy Number. Primers used in this study are all listed in Table S1.

L1 copy number analysis

Using the ePCR package from NCBI (http://www.ncbi.nlm.nih.gov/sutils/e-pcr/) we identified 10 806 hits on the mouse mm9 reference genome using the L1_Tf specific primers as designed on the L1spa N‘. AF016099 [29]. These primers generate 67 bp amplicons, present in the L1_Tf 5’_UTR repeated regions. Real-time quantitative PCR analysis of the L1_Tf copy number in Dm_Pdx/Pks mESCs provided a figure of 9,478 at P10 and 10,465 at P30 PCR hits, remarkably close to the ePCR estimation (10,806). The small difference could be explained by the hybrid background of the Dicer mESC line used compared to the genome reference in mm9. The copy number assay shown in Figure 2A, involved a comparison of Dm_Pdx/Pks mESCs sampled at

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passage 10 (9,478 amplicons detected) and at passage 30 (10,465 amplicons detected) with Der−/− mESCs sampled at passage 30 (13,021 amplicons detected). Therefore, we estimate that (13,021 - 10,465) = 3,556 new PCR amplicons were generated, corresponding to 3,556/9.9 = 360 new full length insertion after 20 passages in the Der−/− background. Since each passage represents 2 days of culture (40 days in total), 860/40 = 21.51 full length L1_Tf insertions were generated on average every day in Der−/− mESCs, although the fraction of active copies among these insertions is unknown. We conclude, therefore, that Der−/− mESCs undergo between 1 and 20 L1_Tf retrotransposition events per day.

Cell lysates and immunoprecipitations
E14_FHA-hAgo2 mESCs were scraped in cell lysis buffer (25 mM Tris, pH 7.9, 250 mM KCl, 0.2 mM EDTA, 20% glycerol and Roche Complete Protease Inhibitor without EDTA). Cells were lysed 10 min on ice, sonicated and centrifuged (10 000 rpm, 10 min at 4°C) before Western analysis or immunoprecipitation. Lysates were incubated at 4°C with 20 μL of FLAG-beads (Invitrogen) for 12 h. Beads were collected by centrifugation (2,000 rpm, 1 min). After at least three washes in 1 mL lysis buffer, beads were incubated with 100 μL 0.1 M glycine pH 2.5 for 10 min RT on a shaker. Ten μL 1 M Tris-HCl pH 8 was added to neutralize the elution buffer. Immunoprecipitated RNAs was then extracted from eluted proteins with IsolRNA Lysis Reagent (5PRIME).

Bisulfite sequencing-based DNA methylation analysis
Genomic DNA was extracted using Isol-RNA Lysis Reagent (5PRIME). Bisulfite treatment was performed using the EpiTect Bisulfite Kit (Qiagen). Bisulfite-treated DNA was then amplified using the DreamTaq DNA Polymerase and primers listed in see accompanying primer list. PCR cycling conditions and primers design were made following the recommendations in [61]. PCR fragments were purified and cloned into pGEM-T Easy (Promega) and individual colonies were sequenced using M13 primers. Sequences were then analysed using Kismeth and BISMA online softwares [62,63] to obtain the percentage of methylated sites for each sequence context. Results shown were obtained in two independent experiments.

Antibodies
The following antibodies were used: anti-L1_ORF1 (gift of Dr Alex Bortvin, Carnegie Institution for Science, USA), anti-AGO1 (D84G10, Cell Signaling Technology, Beverly, MA, USA), anti-mouse AGO2 (clone 6F4, gift of Dr Gunter Meister, University of Regensburg, Germany), anti-XRN2 (A301-101A, Lubio Science, Switzerland), anti-EXOSC10 (Rrp6) (ab50558, Abcam, Cambridge, UK) and anti-OCT4 (ab19857, Abcam, Cambridge, UK).

Supporting Information
Figure S1 L1 elements are up-regulated in Der−/− mESCs. A. Number of sRNA reads and distinct sequences matching full length retrotransposon of LINE1 from L1Md_T, L1Md_A and L1Md_Gf families. B. Detection of overlapping sense and antisense L1 transcription at the L1_5′-UTR region using strand-specific RT-PCR in WT mESCs. The primer sets used are depicted. C. Accumulation of the Hmga2 and Btg2 mRNAs, respectively known targets for mmu-miR-196a and mmu-let-7a/mmu-miR-132, analyzed by qRT-PCR before and after Der deletion. D. L1_Tf, Gf and A sub-type mRNAs accumulation detected by qRT-PCR before and after Der deletion. Polymorphism in the repeated region indicated in the scheme was used to distinguish subtypes. (EPS)

Figure S2 Methylation and retrotransposition in Der−/− mESCs. A. Western analysis of DNMT1 & 3b proteins levels in Der−/− mESCs; CM: Coomassie staining of total protein. B. L1_ORF2 mRNA accumulation detected by qRT-PCR in Der−/− mESCs. C. Bisulfite sequencing-based methylation analysis at the L1_5′_UTR in Der−/− mESCs carrying the human eGFP-tagged L1 transgene after 4 (P4) and 6 (P6) passages post-puromycin treatment for selection of stable transformants. L1 constructs lacking 5′UTR (TgA5′UTR) or ORF1 (TgΔORF1) were used as negative controls for retrotransposition. Note that TgWT = RP, TgΔORF1 = JM111 and TgA5′UTR = 2980 according to the previous nomenclature established in [30]. (EPS)

Figure S3 Deep-sequencing analysis of small RNA libraries. A. Compared size distribution of all deep sequencing reads mapping to the mm9 genome in WT and Der−/− mESCs libraries. B. Pie chart distributions of non-coding RNAs, as annotated by the ncPRO pipeline, in WT and Der−/− mESCs libraries. C. Relative proportions of reads mapping to pre-miRNAs in WT and Der−/− mESCs libraries, as annotated by the ncPRO pipeline. D. 22-nt sequence coverages of L1_Tf elements from WT, Der−/− and immunoprecipitated E14_FHA-hAgo2 mESCs, normalized to the total amount of 22-nt reads from corresponding library. E. Size distribution of all reads of RNA isolated from hAgo2 immunoprecipitates mapping to the mm9 genome. F. Same as in (B) for hAgo2-bound sRNAs. G. Same as in (C) for hAgo2-bound sRNAs. (EPS)

Figure S4 L1 expression and genomic copy-number in various knock-out and knock-down mESC lines. A. Western analysis of RRP6 and L1_ORF1 accumulation in WT and RRP6 KO mESCs; CM: Coomassie staining of total protein. B. Accumulation of Tf_5′-UTR (+) and (−) sRNAs detected by qRT-PCR in WT and Xn2 KO mESCs. C. PCR analysis of L1_Tf copy-number in WT and RRP6 KD mESCs. D. L1_ORF2, Tf, Gf and A sub-type mRNAs accumulation detected by qRT-PCR in Xn2 KO and RRP6 KD mESCs. E. Accumulation of miR-320 detected by qRT-PCR in WT and Dgcr8 KO mESCs. F. Western analysis of Ago2 accumulation in WT and Ago1,2,3,4 KO hAgo2 mESCs before and after hAgo2 deletion induced by tamoxifen; CM: Coomassie staining of total protein. G. Accumulation of the Hmga2 and Btg2 mRNAs, respectively targeted by mmu-miR-196a and mmu-let-7a/mmu-miR-132, analyzed by qRT-PCR before and after deletion of hAgo2. H. mRNA accumulation of L1_Tf, _Gf and _A sub-types detected by qRT-PCR before and after hAgo2 deletion. I. mRNA accumulation of a single Tf_L1 subtype located on chromosome 17, analyzed by semi-quantitative RT-PCR before and after hAgo2 deletion. (EPS)

Figure S5 Expression of AGO2 in Der−/− ESCs and microRNA expression in hDer-complemented Der−/− ESCs. A. Accumulation of the Ago2 mRNA analyzed by qRT-PCR in WT, Der−/− and Dgcr8 KO mESCs. B. Endogenous AGO2 protein accumulation in DMSO- and MG132-treated in Der−/− mESCs. The data depicted are from two independent treatments. C. MiR-302d and
miR-21 accumulation detected by qRT-PCR in \(Dcr^2/2\), \(Dcr^{-/-}\), and hDcr-complemented \(Dcr^{-/-}\) mESCs. (EPS)

**Figure S6** mRNA and microRNA expression in hDcr-complemented \(Dcr^{-/-}\) ESCRs before and after differentiation. A. Accumulation of Fg5 (ectodermal marker), Hmg2a, Sox2 and L1_ORF2 mRNAs detected by qRT-PCR before (d0) and 10 days after differentiation (d10) of \(Dcr^2/2\), \(Dcr^{-/-}\), and hDcr-complemented \(Dcr^{-/-}\) mESCs. B. Accumulation of miR-295, miR-302d, miR-21 and miR-16 analyzed by qRT-PCR before and 10 days after differentiation of \(Dcr^2/2\), \(Dcr^{-/-}\), and hDcr-complemented \(Dcr^{-/-}\) mESCs. (EPS)

**Table S1** Primers table. (DOCX)
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