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1 LSD1/KDM1A Maintains Genome-wide Homeostasis of Transcriptional Enhancers

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16 Abstract

Transcriptional enhancers enable exquisite spatiotemporal control of gene expression in metazoans. 17 Enrichment of mono-methylation of histone H3 lysine 4 (H3K4me1) is a major chromatin signature 18 that distinguishes enhancers from gene promoters. Lysine Specific Demethylase 1 (LSD1, aka 19 20 KDM1A), an enzyme specific for demethylating H3K4me2/me1, has been shown to "decommission" 21 stem cell enhancers during the differentiation of mouse embryonic stem cells (mESC). However, the roles of LSD1 in undifferentiated mESC remain obscure. Here, we show that LSD1 occupies a large 22 23 fraction of enhancers (63%) that are primed with binding of transcription factors (TFs) and H3K4me1 24 in mESC. In contrast, LSD1 is largely absent at latent enhancers, which are not yet primed by TF 25 binding. Unexpectedly, LSD1 levels at enhancers exhibited a clear positive correlation with its 26 substrate, H3K4me2 and enhancer activity. These enhancers gain additional H3K4 methylation upon 27 the loss of LSD1 in mESC. The aberrant increase in H3K4me at enhancers was accompanied with 28 increases in enhancer H3K27 acetylation and expression of enhancer RNAs (eRNAs) and their 29 target genes. In post-mitotic neurons, loss of LSD1 resulted in premature activation of enhancers and genes that are normally induced after neuronal activation. These results demonstrate that LSD1 30 31 is a versatile suppressor of primed enhancers, and is involved in homeostasis of enhancer activity.

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34 Introduction

Transcriptional enhancers were discovered as potent gene regulatory elements that act independently of the distance and orientation to the target promoters ^{1, 2}. A broad range of physiological and developmental processes rely on coordinated actions of transcriptional enhancers to achieve cell type-specific and temporally-controlled gene expression ^{3, 4}. Numerous non-coding variants associated with a variety of human traits have been observed at enhancers, implicating their importance in normal physiology and disease pathogenesis ⁵⁻⁷.

Recent studies have begun to reveal how the life cycle of enhancers progresses to induce
 gene expression changes during development ⁸. Genome-wide discovery of thousands of potential

enhancer elements has been facilitated by profiling 1) binding of pioneer transcription factors (TFs),
2) chromatin accessibility as measured by hypersensitivity to DNase I, and 3) patterns of histone
modifications (reviewed in ⁹). Monomethylation of histone H3 lysine 4 (H3K4me1) can distinguish
enhancers from promoters, which in contrast are modified with H3K4me3 ^{10, 11}. In response to
various environmental and developmental cues, TFs bind to specific DNA elements ^{12, 13}, and
subsequent recruitment of methyltransferases KMT2C and KMT2D (aka MLL3 and MLL4,
respectively) leads to H3K4me1 at enhancers ¹⁴⁻¹⁶.

Once installation of H3K4me1 "primes" enhancers, they can become either "active" or 50 "poised", depending on the acetylation or tri-methylation of H3 lysine 27 (H3K27ac or H3K27me3)^{17,} 51 ¹⁸, respectively. A recent report showed that active enhancers can be negatively regulated by 52 RACK7-mediated recruitment of KDM5C, an H3K4me3/2 demethylase ¹⁹. When genes need to be 53 turned off, e.g. pluripotency genes during differentiation of stem cell, their enhancers undergo 54 "decommissioning" by LSD1-mediated removal of the priming mark, H3K4me1²⁰. Notably, "latent" 55 enhancers, i.e. DNA elements that lack TF binding or H3K4me1, can gain enhancer-like marks in 56 response to extra-cellular stimuli and promote gene expression in fully-differentiated macrophages ²¹. 57 These findings highlight the dynamic H3K4 methylation of an enhancer during its life cycle. 58

59 Two H3K4 demethylases, LSD1 and KDM5C, have been shown to play important roles in regulation of enhancers ^{19, 20, 22}. While KDM5C reverses H3K4me3/2 leaving H3K4me1 intact ^{23, 24}, 60 LSD1 can demethylate only H3K4me2/1²⁵. The distinct substrate specificities raise a possibility that 61 these two H3K4 demethylases may cooperate to generate and/or maintain the balance of H3K4me 62 landscape at different classes of enhancers. For example, absence of H3K4 methylation at latent 63 enhancers could potentially be attributed to LSD1-mediated demethylation of H3K4me1. Besides the 64 decommissioning of stem cell genes and enhancers during differentiation, LSD1 has also been 65 shown to repress developmental genes ^{26, 27} and retrotransposons ²⁸ in ES cells. However, it 66 remains unclear whether LSD1 and KDM5C play any role at other classes of enhancers. 67 In the present study, we demonstrate that in addition to active enhancers, LSD1 also 68

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occupies poised enhancers, some of which are quickly activated (inducible enhancers) upon

differentiation of mESC or depolarization of post-mitotic neurons. Interestingly, LSD1 does not bind to latent enhancers, e.g. neuron-specific enhancers that are unprimed in mESC, and LSD1 occupancy shows a clear positive correlation with its substrate, H3K4me2. Loss of LSD1, but not KDM5C, leads to a global upregulation of enhancer RNAs accompanied with increased H3K4 methylation and H3K27ac at active, poised, and inducible enhancers, and their target genes. These results indicate that LSD1 is a pervasive suppressor of primed enhancers, involved in negativefeedback mechanisms to maintain homeostasis of histone-modification landscapes at enhancers.

78 Results

79 LSD1 occupies a large fraction of primed enhancers

80 To study the role of LSD1 in regulation of enhancers and gene expression, we first examined the genome-wide distribution of LSD1 at various regulatory elements. We analyzed the previously 81 published ChIP-Seq datasets of LSD1 ²⁰, p300 ^{29, 30}, CTCF ^{29, 31}, DNase-Hypersensitivity (DHS) ³² 82 and other histone modifications (see Supplementary Table 1). p300, a histone acetyltransferase and 83 a transcriptional coactivator, has been shown to occupy both promoters and enhancers ^{10, 33}, 84 whereas CTCF binding sites anchor chromatin loops ³⁴ and insulating domains ³⁵⁻³⁷. By examining 85 the overlaps of binding sites of LSD1 (109,541, q < 0.05), p300 (86,426, q < 0.01), CTCF (58,899, p 86 < 10⁻¹²) and DHS sites (299,799, q < 0.05), we found that 1) a majority of p300 binding sites (70.5%, 87 Figure 1a) were co-occupied by LSD1, 2) in contrast, only 14.7% of non-p300 CTCF-binding sites 88 89 were occupied by LSD1, and 3) most of the LSD1 binding sites (86%) showed an overlap (± 250 bases) with DHS sites. The higher degree of overlap of LSD1 with p300 compared to CTCF-only 90 sites was observed at promoter, genic, and intergenic regions (Supplementary Figure 1). These 91 observations indicate that LSD1 occupies a large fraction of primed enhancers. 92

Next, we sought to identify regulatory elements that could potentially act as enhancers.
 Previous studies have utilized a high H3K4me1:me3 ratio, either alone ^{10, 17} or in conjunction with TF
 binding ^{38, 39}, DHS or binding by CBP/p300 ^{40, 41}, to distinguish enhancers from promoters in a given
 cell-type. H3K4me2 is observed at both promoters and enhancers and has been shown to be a

signature to predict enhancers ³⁸. We therefore included H3K4me2 data to increase the sensitivity 97 98 and precision of enhancer mapping. Enhancers also differ from promoters in that promoters are associated with stable transcripts ⁴² while active enhancers are associated with expression of 99 enhancer RNA transcripts (eRNAs)⁴²⁻⁴⁴, which are short-lived due to exosome-mediated 100 degradation ⁴⁴⁻⁴⁶. This degradation of nascent transcripts from enhancers results in a very low, albeit, 101 102 detectable levels of eRNAs in RNA-Seq (Figure 1b, right panel). Global Run-On, an in vitro assay, followed by high-throughput sequencing (GRO-Seq)⁴⁷ enables a sensitive and quantitative 103 104 evaluation of transcriptionally-engaged RNA polymerase molecules. GRO-Seq, thus, serves as an 105 indirect measure of nascent transcription at promoters and enhancers, irrespective of the subsequent stability of the transcripts ⁴². Therefore, we employed a high ratio of GRO-Seq:RNA-Seq 106 signals to further refine the prediction of enhancers in mESC. We focused on only intergenic 107 enhancers as we found it difficult to differentiate the eRNAs from gene-coding and promoter-108 upstream 46 transcripts. In summary, intergenic enhancers were defined as ± 500 base regions 109 around p300/DHS summits with i) H3K4me1 enrichment ($rpkm \ge 1$ and ChIP:Input > 1.5), ii) 110 H3K4me3 lower than either H3K4me1 or H3K4me2, iii) a low rate of transcription (RNA-Seg fpkm < 111 112 (0.5), iv) a GRO-Seq:RNA-Seq ratio > 5, and v) a high average mappability to exclude repetitive 113 regions. This pipeline predicted a total of 22,047 intergenic enhancers in mESC (Supplementary 114 Table 2).

LSD1 has been shown to occupy enhancers in various cell types ^{20, 48, 49}. However, the 115 genome-wide relationship between LSD1 binding and chromatin states at enhancers, such as 116 117 histone-modification landscapes and eRNA transcription, remains unclear. To address this issue, we first subdivided the 22,047 predicted intergenic enhancers into guartiles (Q1-Q4, Figure 1b) based 118 on the enrichment of H3K4me2 relative to H3K4me1. Similar to a previous observation in K562 cells 119 ⁴², we noted a positive correlation between eRNA levels, measured by GRO-Seq, Nuclear RNA-Seq 120 121 or RNA-Seq, and H3K4me2 levels (Figure 1b). Acetylations of H3K9 and H3K27 and eRNA expression have been established as signatures of active enhancers ^{9, 17, 18}. Consistently, we also 122

observed that enhancers with higher transcription levels displayed higher acetylation levels of H3K9
 and H3K27 relative to trimethylation (Supplementary Figure 2).

We then determined the extent of LSD1 binding across various enhancer classes and found 125 that a large fraction (63.2%) of the predicted 22,047 enhancers is bound by LSD1 (Figure 1c). 126 127 Surprisingly, we found that LSD1 occupancy at enhancers increased with increasing levels of 128 H3K4me2 or increasing levels of GRO-Seg signals (Supplementary Figures 3 and 4a). We then calculated the correlation coefficients between LSD1 levels and levels of various histone 129 130 modifications at promoter distal regions, i.e. excluding TSS ± 1500 bases. Compared to H3K4me1 (r = 0.5745) and H3K4me3 (r = 0.486), we found that LSD1 levels showed the highest correlations with 131 132 its primary substrate, H3K4me2 (r = 0.627, Supplementary Figure 4b), and H3K27ac (r = 0.604), a 133 marker for enhancer activity. In contrast, H3K27me3 and H3K9me3 were inversely correlated with LSD1 levels (Supplementary Figure 4b). We also classified 22.047 intergenic enhancers into poised. 134 135 active, and intermediate enhancers based on their H3K27me3 and H3K27ac levels, according to the previous report ¹⁸. We found that LSD1 occupies substantial fractions of each of the three enhancer 136 classes with increased occupancy of active enhancers compared to other classes (Figure 1d). 137 138 Similar patterns were observed when we used the levels of H3K9me3 and H3K9ac to classify enhancers as described previously ⁴¹(Figure 1e). These results indicate that LSD1 binds to multiple 139 140 enhancer classes with positive correlations to H3K4me2, H3K27/K9 acetylation and eRNA levels.

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142 LSD1 rarely binds to cell-type specific "latent" enhancers

Higher LSD1 occupancy at more active enhancers may contradict with the LSD1's classical
role as a transcriptional repressor of neuron-specific genes in non-neuronal tissues ^{25, 50}. RE1Silencing Transcription factor (REST) is known to be expressed in non-neuronal cells with the role of
repression of neuronal genes in these cell-types through the Corepressor of REST(CoREST)
complex ⁵⁰. We analyzed the previously published REST ChIP-Seq dataset ²⁰ and found that only
1.31% of predicted enhancers (288 out of 22,047) were bound by REST in mESC. However, a
majority (91%) of these REST-positive enhancers were bound by LSD1. These data suggest that

REST/LSD1-mediated suppression is not the primary mechanism of enhancer regulation in mESC. 150 Enhancers that are inert, free of TFs, and thus, insensitive to DNase I, are referred to as "latent" 151 enhancers in a given cell type ²¹. The low occupancy of primed enhancers by REST/LSD1 prompted 152 us to test if LSD1 contributes to regulation of latent enhancers. We first looked at the mir290 cluster, 153 which is specifically expressed in mESC and early developmental stages ⁵¹. In mESC, several 154 155 enhancers upstream of its promoter, show high DHS, p300 binding and high GRO-Seg signals accompanied with strong LSD1 binding events (Figure 2a). These mir290 enhancers lack brain-156 157 derived DHS, GRO-Seq signal and H3K4 methylation in cortical neurons (CN), demonstrating that these enhancers are primed in mESC but are latent in CN. LSD1 ChIP-Seg data from neural stem 158 cells (NSC)⁵², however, showed a lack of LSD1 binding at these latent enhancers. Conversely, two 159 enhancers upstream of Npas4 (marked with asterisks, Figure 2b), a gene predominantly expressed 160 in the brain, showed brain-specific DHS and LSD1 occupancy, GRO-Seg signals and high H3K4me1, 161 162 specifically in the neuronal cell types (NSC or CN). In mESC, LSD1 is absent at these brain-specific DHS sites upstream of the Npas4 promoter (Figure 2b). These two examples suggest that LSD1 163 could primarily be recruited to primed enhancers in a given tissue in a TF-binding dependent manner. 164 165 To ascertain this specificity of LSD1 recruitment to primed enhancers on a genome-wide 166 scale, we sought to identify genomic elements that are latent in mESC but are primed in other cell 167 types. We identified DHS sites from mESC (398,675, q < 0.01) and four additional mouse tissues, including adult brain (415,400), heart (320,416), liver (207,046), and lung (358,575), using Hotspot 168 (v4.1)⁵³. Similar to our earlier observation (Supplementary Figure 1), we found that most of mESC 169 170 LSD1-binding sites (86%) overlapped with mESC hotspots (Figure 2c). Next, we performed an intersection of hotspots from the five tissues. This resulted in tens of thousands of hotspots, which 171 172 could potentially act as tissue-specific enhancers in a given tissue and latent in others (Figure 2d, e). 173 Motif analysis on promoter-distal hotspots revealed that these tissue-specific hotspots are indeed 174 enriched with binding sites for lineage-specific TFs (Supplementary Figure 5). In agreement with the mir290 and Npas4 loci, mESC LSD1 binding sites showed negligible overlaps with tissue-specific 175 hotspots (0.40-0.69%), whereas 14.31% of mESC-specific hotspots were bound by LSD1 (Figure 2d, 176

e). Based on these data, we concluded that LSD1 is predominantly recruited to primed enhancers

- and is not actively involved in maintaining inactivity of latent enhancers in mESC.
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Loss of LSD1 results in a genome-wide increase in enhancer H3K4 methylation and H3K27

181 acetylation

The unexpected positive correlation between LSD1 binding and enhancer H3K4me2 levels raises a possibility that LSD1 may not be demethylating H3K4me2 at enhancers. LSD1 has been implicated in demethylation of H3K9 instead of H3K4 when it binds androgen receptors ^{54, 55}, though a recent study reported otherwise ⁵⁶. Phosphorylation of H3T6 appears to interfere with LSD1mediated H3K4 demethylation ⁵⁷. Alternatively, the positive correlation may reflect a negative feedback mechanism, in which LSD1 searches for and binds to genomic regions with high H3K4me2 levels and reverses this modification to regulate optimal enhancer activity.

189 To test whether LSD1 is involved in maintaining precise levels of H3K4 methylation at enhancers, we investigated the previously generated mESC line that lacks LSD1 due to the insertion 190 of a gene-trap cassette (*Lsd1*-GT)²⁸. Western blot analysis of mESC carrying either wild-type (WT) 191 Lsd1 or Lsd1-GT did not show any detectable differences in total H3K4me1, H3K4me2, H3K4me3 or 192 193 H3K27ac levels (Supplementary Figure 6). We then performed ChIP-Seq to measure H3K4me 194 levels across the genomes of these two mESC lines. Since LSD1 is known to associate with multiple HDAC-containing co-repressor complexes, including the CoREST ^{50, 58} and NuRD ⁵⁹ complexes, we 195 196 also included H3K27ac and HDAC1 in our ChIP-Seq analysis.

Genome-wide localization analysis (ChIP-Seq) profiles, which reflect the spatial distribution of
these marks, looked highly similar between the two genotypes at most of the loci. Upon the loss of
LSD1, however, H3K4 methylations displayed statistically-significant increases at active, poised, and
intermediate LSD1-target enhancers, which were accompanied with conspicuous increases in
H3K27ac (Figure 3a, Supplementary Figure 7a). Similar changes were also observed at enhancers
that showed a significant increase in eRNA expression (see next section) in the *Lsd1*-GT mESC
(Supplementary Figure 7). Interestingly, HDAC1 levels did not change significantly at poised

204 enhancers, while active or poised enhancers showed a small but significant increase in HDAC1 205 binding (Figure 3a), which could be attributed to either experimental variations or unknown mechanisms to compensate for the loss of LSD1. The inability of HDAC1 to remove H3K27ac in 206 Lsd1-GT cells is consistent with the previous observations that HDAC activity is negatively 207 influenced by the presence of H3K4me^{27,60}. Representative genes *Pou5f1* (Figure 3b) and *CbIn4* 208 209 (Figure 3c), which are normally active or poised in undifferentiated mESC, respectively, showed relatively higher H3K4me and H3K27ac at both promoters and enhancers in Lsd1-GT mESC. We 210 211 also observed a concomitant increase in both promoter- and enhancer- associated GRO-Seq signals 212 at these loci in Lsd1-GT mESC (Figure 3b, c). The increases in H3K27ac and nascent transcription 213 at these poised and intermediate enhancers upon the loss of LSD1 suggest a shift in their identity 214 towards active enhancers. These results indicate that LSD1 functions as an H3K4 demethylase at enhancers, and is required for maintenance of optimal H3K4me and H3K27ac levels in mES cells. 215

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Loss of LSD1 but not KDM5C results in aberrant activation of transcriptional enhancers 217

In the above ChIP-Seg study, we found a genome-wide elevation of all three H3K4me 218 219 statuses, including H3K4me3, at LSD1-target enhancers in Lsd1-GT mESC (Figure 3a, 220 Supplementary Figure 7a). This increase of H3K4me3 at enhancers cannot be explained directly by the loss of LSD1, as LSD1 is incapable of demethylating H3K4me3²⁵; therefore, one or more 221 H3K4me3 demethylases might be involved in maintaining low levels of H3K4me3 at enhancers. 222 LSD1 and KDM5C. an H3K4me3/me2 demethylase ²³, have been previously shown to be in the 223 same complex ¹⁹ and that KDM5C suppresses over-activation of active enhancers in breast cancer 224 cells¹⁹. To elucidate the interrelationship between LSD1 and KDM5C in suppression of enhancer 225 activity, we first performed KDM5C ChIP-Seq in mESC and identified 113,166 KDM5C binding sites 226 227 (MACS2, q < 0.05). Most of the 22.047 predicted intergenic enhancers (78.3%) were bound by either LSD1 or KDM5C and 52.1% of total were bound by both (Figure 4a). 228

We generated Kdm5c-knockout (KO) mESC by transfecting a Cre-expression plasmid into 229 the mESC harboring the floxed exons 11 and 12, which encode the catalytic JmjC domain ^{61, 62}, and 230

231 confirmed the loss of KDM5C (Supplementary Figure 8). We then asked if the loss of either LSD1 or 232 KDM5C leads to aberrant enhancer activity by guantifying changes in GRO-Seg signals at enhancers. To identify misregulated enhancers, we calculated the number of GRO-Seq reads 233 mapping within ± 500 bases of the center of the predicted enhancers and normalized them against 234 199,209 p300/DHS sites across the whole genome using DESeq ⁶³. Upon the loss of LSD1, a large 235 236 fraction (24.8%, 5,471) of total intergenic enhancers showed a significant elevation in associated GRO-Seq transcripts, while a small number 674 (3.06%) displayed a reduced activity with a stringent 237 238 cutoff of q < 0.05 (Figure 4b). Next, we tested if this elevation of GRO-Seq signals is specific to 239 poised, intermediate or active enhancers. We found that all three enhancer classes showed a 240 significant increase in associated nascent transcripts (p < 2.2e-16, Wilcoxon signed-rank test, Figure 241 4c), indicating that LSD1 is required for genome-wide suppression of aberrant enhancer activities. Using the same DESeg cutoff, however, we were not able to identify any misregulated 242 243 enhancers in Kdm5c-KO mESC. After relaxing the cutoff to p < 0.05, we could identify only 63 upregulated and 102 downregulated enhancers upon the loss of KDM5C (Figure 4d). To confirm that 244 these observations were not dependent on differences in sequencing depths or inter-replicate 245 variability, equal number of reads were randomly selected from each GRO-Seg sample and pairwise 246 247 DESeg comparisons between individual replicates of either genotypes were repeated. Thus, in 248

contrast to the crucial role of LSD1, KDM5C is largely dispensable for enhancer suppression in
 mESC.

Since GRO-Seq is an *in vitro* transcription assay, we sought to validate this global 250 upregulation of enhancers upon LSD1 depletion in mESC under physiological conditions by 251 252 sequencing total cellular RNAs (RNA-Seg) and nuclear RNAs (Nuclear RNA-Seg). Either RNA-Seg or Nuclear RNA-Seq could not provide sufficiently high eRNA signals to call differentially-expressed 253 254 enhancers likely due to the aforementioned exosome-mediated degradation of eRNAs. However, when we evaluated eRNA levels at all the intergenic enhancers as a group, RNA-Seg and Nuclear 255 256 RNA-Seq corroborated our GRO-Seq results (Supplementary Figure 9). These data demonstrate that LSD1, but not KDM5C, is required for suppression of aberrant enhancer activities in mESC. 257

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Aberrant changes in enhancer activity are associated with misregulation of physically interacting genes

The standard approach to gauge the influence of enhancer misregulation on gene 261 262 expression has been to quantify changes in expression of genes that are located in proximity to the 263 enhancers of interest. However, recent advances in genome-wide profiling of chromatin interactions ⁶⁴⁻⁶⁶ have paved the way for a more precise determination of enhancer-promoter interactions. To 264 265 identify genes that physically interact with our set of predicted enhancers, we utilized the recentlypublished "HiCap" data set, which is a high-resolution map of promoter-anchored chromatin 266 interactions in mESC ⁶⁷. For instance, our enhancer prediction identified a ~ 6 kb-wide enhancer 267 cluster downstream of Dusp5 and the analysis of HiCap data revealed that one of the three 268 individual enhancers within the cluster appears to interact with the *Dusp5* promoter (Figure 5a). This 269 270 enhancer cluster was significantly upregulated in Lsd1-GT mESC and showed a pronounced increase in H3K4me2 and H3K27ac levels, and *Dusp5* transcription (Figure 5a). A concomitant 271 misregulation of enhancers and the interacting gene was also observed for the aforementioned 272 273 mir290 cluster (Supplementary Figure 10a).

274 To evaluate the genome-wide impact of enhancer misregulation on gene expression, we first categorized enhancers based on the statistical significance of their differential expression in Lsd1-275 GT mESC: significantly misregulated (q < 0.05) and moderately misregulated ($0.05 \le q < 0.25$) 276 277 enhancers from our GRO-Seg analysis. We then retrieved the physically-interacting promoters from 278 the HiCap data, and plotted the changes in mRNA levels (RNA-Seq, Figure 5b) or rates of nascent transcription (GRO-Seq, Supplementary Figure 10b). We observed a general trend that genes 279 280 associated with upregulated enhancers showed an increased expression and vice versa, and the 281 genes that are anchored to unaffected enhancers did not exhibit any significant changes in 282 expression in Lsd1-GT mESC (Figure 5b, Supplementary Figure 10b, c). Importantly, for each category, the magnitude and the statistical significance of median change in gene expression 283 correlated positively with those of changes in enhancer activity (Supplementary Figure 10c). 284

Additionally, when interacting genes were called on the basis of genomic proximity to the enhancers, we observed a similar trend (Supplementary Figure 11). These results indicate that LSD1's role at enhancers is important for a precise transcription of their cognate genes.

To further corroborate if LSD1 and its catalytic activity are required for suppression of 288 289 enhancer activity and associated genes, we utilized luciferase reporter assays in Lsd1-GT mESC. 290 We selected 11 enhancers with two latent enhancers and at least one enhancer from each of poised, intermediate, and active enhancers that showed significant upregulation in Lsd1-GT mESC 291 292 compared to WT-mESC and also showed an upregulation of the associated gene. 1.0 ~ 1.2 kb of the 293 enhancer-containing regions were cloned downstream of the HSV-Thymidine Kinase promoter-294 driven firefly luciferase gene. Lsd1-GT mESC were transfected with a control plasmid or plasmids expressing either human LSD1 or the catalytically inactive LSD1-K661A mutant ⁶⁸ along with the 295 reporter plasmids. We found that LSD1's catalytic activity is indeed required for suppression of all 296 297 the active enhancers tested (p < 0.1, Student's *t*-tests, Supplementary Figure 12), consistent with high levels of LSD1 at these enhancers in mESC. In contrast, one of the Nanog enhancers, which 298 had not displayed a change upon the loss of LSD1 in mESC, was unaffected by LSD1 expression. 299 300 We observed lower enhancer activities of the latent, poised, and intermediate enhancers compared 301 to the active enhancers, indicating that our enhancer classification could accurately predict enhancer 302 activity. However, we found it difficult to interpret the effect of LSD1 or its catalytic activity at these 303 weak enhancers as they failed to enhance the activity of the promoter.

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305 Both mESC-specific and differentiation genes are upregulated upon the loss of LSD1 in

306 undifferentiated mES cells

A previous study has implicated LSD1 in decommissioning of enhancers of pluripotency genes during differentiation of mES cells ²⁰. However, the roles of LSD1 in undifferentiated mES cells remain elusive. The global upregulation of enhancers (Figure 4b), prompted us to investigate if the loss of LSD1 in undifferentiated mES cells affected the expression of pluripotency and/or differentiation genes. To this end, we first analyzed a published RNA-Seq datasets for mESC and

epiblast stem cells (EpiSC), which were derived from mESC by treatment with Activin A and FGF2 312 for 4 days ⁶⁹. We first selected the genes that showed a significant (q < 0.01, DESeg) and at least 5-313 314 fold change in expression during differentiation. This analysis yielded 710 induced and 745 downregulated (decommissioned) genes during the differentiation of mESC to EpiSC (Figure 6a). 315 316 mESC and EpiSC represent two consecutive stages of embryonic development, namely pre-317 implantation and post-implantation, respectively. Therefore, these sets of upregulated and downregulated genes may represent the earliest transcriptional response of mES cells to the 318 319 differentiation cue.

Compared to WT mESC, Lsd1-GT mESC displayed roughly equal number of genes being 320 321 significant-upregulated or -downregulated (55% vs. 45%, 1493 upregulated and 1203 downregulated, 322 respectively, q < 0.05). Quantitation of gene expression changes of the induced and the decommissioned genes, using our RNA-Seg and GRO-Seg datasets revealed that many of these 323 324 genes are upregulated in undifferentiated Lsd1-GT mESC and both of these gene sets showed statistically-significant upregulation as group (p < 2.2e-16, Wilcoxon signed-rank test, Figure 6b, c). 325 For example, *Hmga2* is a gene which is induced upon differentiation of mES cells and is required for 326 the exit from naïve pluripotency ⁷⁰. As shown in Figure 6d, LSD1 loss led to a marked increase in 327 328 Hmga2 expression which was also associated with increased H3K4 methylations, H3K27ac, and 329 GRO-Seq signals at nearby enhancers. We have shown earlier that some pluripotency genes 330 including *Pou5f1* (Figure 3b) and *mir290* (Supplementary Figure 10a) and their nearby enhancers 331 were upregulated in *Lsd1*-GT mESC. Upregulation of both pluripotency and differentiation genes 332 upon the loss of LSD1 in mES cells suggests that LSD1 does not instruct the fate of mES cells to a 333 particular direction.

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335 LSD1 is required for suppression of inducible enhancers in terminally-differentiated neurons

We next sought to test if LSD1-mediated regulation of enhancers plays a role in gene

- 337 expression program of terminally-differentiated cells using cortical neuron (CN) culture as a model.
- 338 Using lentiviral delivery of two independent short hairpin RNAs (shRNAs) at 7 days in vitro (DIV), we

knocked down (KD) LSD1 in primary cultures of mouse CN (Figure 7a). We employed BrU-Seq, a 339 recently-developed nascent-RNA sequencing technique ⁷¹, that allows an accurate evaluation of any 340 changes in active transcription of both mRNAs and eRNAs. At DIV 11, i.e. after 4 days of control or 341 Lsd1 shRNA delivery, neuronal cultures were treated with 5-bromouridine for 32 min, followed by 342 343 enrichment of BrU-containing nascent transcripts using anti-BrdU beads and high-throughput 344 sequencing. DESeq analysis indicated a significant misregulation of 1,500 genes (q < 0.05, 778 downregulated and 722 upregulated). Interestingly, many well-characterized activity-regulated genes 345 (ARGs)⁴³, including Arc, Fos, Fosb, Npas4, Egr1-4, and Nr4a1-3, were among the most 346 significantly-upregulated genes upon LSD1-KD in unstimulated neurons (Figure 7b). ARGs are 347 348 expressed at low levels in resting neurons and are rapidly induced by depolarization of neurons via 349 sensory inputs, thereby representing a stimulus-responsive gene regulatory program. Since products of ARGs play important roles in synaptic plasticity underlying cognitive development, learning and 350 351 adaptive processes ⁷²⁻⁷⁴, we narrowed our focus on these inducible genes.

To evaluate this ARG upregulation on a genome-wide scale, we analyzed our previously 352 published RNA-Seq data set ⁷⁵ and identified 140 ARGs that were induced by KCI-mediated 353 depolarization of CN in culture. Both of the two independent Lsd1 shRNAs led to a spurious 354 355 induction of many ARGs in the resting neurons (Figure 7b, Supplementary Figure 13), indicating that 356 LSD1 suppresses premature induction of ARGs in CN. We next examined the Npas4 locus to check if enhancer misregulation upon the loss of LSD1 could be involved in the premature induction of 357 ARGs. We identified three putative enhancers upstream of the Npas4 promoter based on DHS and 358 H3K4me1 enrichment (Figure 7c). These three enhancers appear to respond to membrane 359 depolarization, as they show activity-dependent increases in NPAS4 binding ⁴³ and H3K27ac levels 360 ⁷⁶. These activity-regulated *Npas4* enhancers are bound by LSD1 in NSC ⁵². An increase in nascent 361 362 transcription across these enhancers, concomitant with an increased Npas4 expression, indicates that these enhancers are deregulated upon the loss of LSD1 (Figure 7c). A previous study had 363 reported more than ten thousand putative activity-regulated enhancers based on increased CBP 364 binding in response to membrane depolarization ⁴³. Subsequent work categorized these candidate 365

enhancers into four groups on the basis of activity-dependent changes in H3K27ac⁷⁶ (Figure 7d). 366 The study found that only the enhancers that displayed activity dependent changes in H3K27ac 367 were involved in promoting ARG transcription ⁷⁶. Next, we investigated if the premature upregulation 368 of ARGs in Lsd1-KD neurons was accompanied with misregulation of any of these activity-regulated 369 370 enhancer groups. Analysis of BrU-Seg data revealed that loss of LSD1 did not have a significant 371 impact on enhancers that do not display any activity-dependent changes in H3K27ac (Wilcoxon signed-ranked test, Figure 7d). However, Lsd1-KD led to a significant upregulation of eRNA levels at 372 373 the enhancers that gain or lose H3K27ac upon KCI treatment (Figure 7d, Supplementary Figure 14a). 374 Interestingly, the group of enhancers with no H3K27ac either before or after depolarization, and are 375 presumably poised neuronal enhancers, also showed an upregulation upon the loss of LSD1 (Figure 376 7d, Supplementary Figure 14a). Similar to our earlier observations with RNA-Seg and Nuclear RNA-Seg in mESC, the eRNA signals with BrU-Seg were considerably lower than those with mESC GRO-377 378 Seq to obtain sufficiently-high statistical power for comparison; therefore, we aggregated eRNA 379 signals from the two control and the two Lsd1-KD experimental groups for this analysis (Figure 7d, Supplementary Figure 14a). Similar trends were observed in analysis without grouping the samples 380 381 (Supplementary Figure 14b). These data indicate that LSD1 is required for genome-wide 382 suppression of premature enhancer activation in resting neurons.

Activation of ARGs upon *Lsd1*-KD could also be a result of extraneous activation of signaling pathways upstream of ARG induction. Extracellular signal-regulated kinases 1 and 2 (ERK1/2) are rapidly phosphorylated in response to a variety of extracellular stimuli, including membrane depolarization, and play critical roles to mediate the transcriptional response ^{72, 77}. A lack of noticeable differences in phosphorylation levels of ERK1/2 upon *Lsd1*-KD (Supplementary Figure 14c), further support a direct role of LSD1 in suppression of activity-regulated enhancers and genes.

390 **Discussion**

Early embryonic lethality of homozygous *Lsd1*-KO mice indicates an essential role of LSD1
 in development ⁷⁸. However, the roles of LSD1 in early embryogenesis have not been fully

elucidated. A previous study has shown that the silencing of pluripotency genes during differentiation 393 of mES cells is mediated by the decommissioning of pluripotency enhancers by LSD1²⁰. This study 394 employed Tranylcypromine (TCP), a pharmacological agent to block LSD1's enzymatic activity ²⁰. 395 However, TCP also inhibits the H3K4 demethylase activity of LSD2 (aka KDM1B)⁷⁹, the paralog of 396 LSD1, which is involved in regulation of transcriptional elongation ⁸⁰. Thus, it remains unclear 397 398 whether the observed impact of TCP treatment on enhancer dysregulation in mES cells was 399 mediated by inhibition of either LSD1 or LSD2 or both. By employing genetic ablation of Lsd1 in 400 mES cells, we demonstrate that LSD1 suppresses the activity of a large fraction of primed enhancers, including the pluripotency enhancers and poised enhancers of differentiation genes. 401 402 Notably, several of these key pluripotency enhancers and genes are already upregulated in 403 undifferentiated Lsd1-deficient mESC (Figures 3 and 6). Similar to our observations, another group had found that Lsd1-KD by siRNA led to an upregulation of several stem cell genes in 404 undifferentiated mES cells⁸¹. Loss of LSD1 in stem cells has been implicated in multiple 405 differentiation defects, including de-differentiation of the pluripotent mESC state towards the 406 totipotent 2-cell state ⁸², or the premature differentiation of human ES cells to endodermal and 407 mesodermal lineages ²⁶. These observations could be reconciled by our findings that LSD1 is 408 409 required for suppressing both pluripotency genes and differentiation genes in mES cells, possibly 410 through maintenance of proper enhancer activity.

We provide several lines of evidence that LSD1 plays an essential role in genome-wide 411 412 homeostasis of primed enhancers. We show that recruitment of LSD1 correlates positively with levels of enhancer H3K4me2, H3K27ac and eRNA transcription (Figure 1) and this recruitment is 413 specific to primed enhancers (Figure 2). Loss of LSD1 led to an upregulation of a large number of 414 enhancers, as demonstrated by increased H3K4 methylation, H3K27ac (Figure 3), and eRNA 415 416 transcription (Figure 4), concomitant with an upregulation of the associated genes (Figure 5). These results support the following model of LSD1-mediated homeostasis of the histone modification 417 landscape during the life cycle of an enhancer. Binding of TF and subsequent recruitment of MLL3/4 418 ¹⁴⁻¹⁶ prime the enhancers with H3K4me1/me2, which attract LSD1 irrespective of whether the 419

enhancers are destined to be either "active" or "poised" (Supplementary Figure 15). LSD1 then 420 421 counteracts with MLL3/4 to maintain an optimal H3K4me levels. Enhancers with a relatively low H3K4me2 may represent early stages of priming by TFs and MLLs. It is possible that enhancers with 422 low levels of H3K4me2 recruit little LSD1, which is not detectable by ChIP-Seg (Q1, Figure 1b). 423 424 When gene expression needs to be increased, recruitment of additional factors and/or MLL3/4 may 425 convert these less active enhancers to more active enhancers with higher H3K4 methylation and H3K27ac, which would then require higher levels of LSD1. LSD1's recruitment might also serve as a 426 427 surveillance mechanism to suppress ectopic installation of H3K4 methylation and spurious activation 428 of enhancers.

During differentiation of mES cells, the pluripotency enhancers may be unprimed by the loss of ES-specific TFs followed by the loss of MLL3/4 and H3K4 methylation. Our model is not mutually exclusive to LSD1-mediated decommissioning of enhancers, as LSD1 could remove remnant H3K4me2/me1 to completely disengage the enhancer from active regulation. To further elucidate the mechanisms of decommissioning of pluripotency enhancers, it will be important to determine how early differentiation cues shift the balance of MLL3/4-mediated H3K4 methylation and LSD1mediated demethylation.

436 Enrichment of H3K4me1 and depletion of H3K4me3 was the first combination of chromatin signatures to predict a large number of transcriptional enhancers in a mammalian genome ^{10, 11}. 437 More recent studies have shown H3K4me3 to be present at a subset of active enhancers ⁸³ with a 438 positive correlation between the H3K4me3/me1 ratio and enhancer transcription levels ⁴². We found 439 that KDM5C and LSD1 can co-occupy enhancers in mES cells (Figure 4a). However, only the loss of 440 LSD1, but not KDM5C, displayed significant changes in enhancer activity and gene expression, 441 highlighting an essential and non-redundant role of LSD1 in mES cells. KDM5C has been implicated 442 in both promotion of enhancer activity by generating H3K4me1 in mES cells ²², and suppression of 443 over-activation of enhancers in breast cancer cells ¹⁹. Consistent with the former study, our analysis 444 found a small reduction in eRNA levels in Kdm5c-KO mESC (Supplementary Figure 9). In addition to 445 Kdm5c, other KDM5 family members, Kdm5a and Kdm5b, are also expressed in mES cells at similar 446

levels and could possibly compensate for the loss of KDM5C. These observations suggest 447 differential requirement of KDM5C in context of either different enhancers or different cell types. 448 Repeated "write-and-read" of histone modifications can form a feed-forward loop to allow TF-449 independent maintenance and propagation of chromatin status. Such models have been well 450 established for the propagation of H3K27me3⁸⁴ and H3K9me3⁸⁵. Maintenance and propagation of 451 H3K4me epigenetic memory across generations by LSD1 have been observed in worms ⁸⁶ and mice 452 ⁸⁷. PHF21A (aka BHC80), another member of the LSD1 complex ^{50, 58}, was the first known reader 453 protein to recognize unmethylated H3K4⁸⁸. This unique combination of an H3K4 demethylase and a 454 reader of unmethylated H3K4, makes the LSD1-PHF21A complex an ideal candidate to exert a self-455 456 perpetuating "erase-and-read" mechanism. However, a positive correlation between LSD1 and 457 H3K4me2 and LSD1's absence at latent enhancers suggest that the role of LSD1 in maintaining the epigenetic memory could be limited to other genomic elements and warrants further investigation. 458 LSD1's role in suppression of primed enhancers does not appear to be restricted to mES cells. 459 Similar to our observations in mESC, our BrU-Seg analyses in post-mitotic neurons revealed that 460 LSD1 suppresses premature activation of neuronal activity-regulated genes and enhancers (Figure 461 7). LSD1 has a neuron-specific isoform (neuroLSD1 or LSD1n) with four extra amino acids in the 462 catalytic domain⁸⁹ and an altered substrate specificity which remains ambiguous^{49,90}. Since our 463 RNAi approach depleted both neuroLSD1 and canonical LSD1 in CN, it remains unclear if one or 464 both of LSD1 isoforms mediate the suppression of activity-regulated enhancers and ARGs. Given 465 that the genetic ablation of neuroLSD1 led to a downregulation of ARG expression ^{49, 91}, it is more 466 likely that the canonical LSD1, and not neuroLSD1, is involved in the suppression of activity-467 regulated enhancers. Loss-of-function LSD1/KDM1A mutations have been genetically associated 468 with several neurodevelopmental conditions ⁹²⁻⁹⁴. These disorders could possibly be attributed to 469 470 uncontrolled activation of activity-regulated genes and enhancers upon the loss of LSD1 and/or neuroLSD1. LSD1-mediated homeostasis of transcriptional enhancers, therefore, underlies various 471 physiological processes including embryonic development and human cognitive function. 472

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474 Methods

475 See supplementary methods for details.

476 Cell culture

477 *Lsd1*-WT and *Lsd1*-GT mESC have been described previously ²⁸. *Kdm5c*-KO mESC were 478 derived from the previously described mESC that carry the floxed *Kdm5c* allele ⁷⁵ by Cre-mediated 479 deletion of exons 11 and 12, which encode the enzymatic JmjC domain. mESC were grown on 480 gelatin coated plates.

481 Western blot analysis

482 mESC or CN were lysed in Laemmli sample buffer, sonicated, and subjected to SDS-PAGE.

483 Western blot analyses were carried out using standard protocols using anti-H3K4me1 (ab8895,

Abcam), anti-H3K4me2 (ab7766, Abcam), anti-H3K4me3 (ab8580, Abcam), anti-H3K27ac (39135,

Active Motif), anti-KDM5C⁷⁵, anti-LSD1 (ab17721, Abcam)²⁰ and anti-phospho-ERK1/2 (4370, Cell

486 Signaling Technology).

487 Lsd1 knockdown in mouse cortical neurons

488 Primary cultures of cortical neurons were carried out as described previously ⁷⁵. *Lsd1*-KD in

489 CN was achieved by lentiviral delivery of either scramble shRNA (SHC202, Sigma) or Lsd1-shRNAs

490 (A: TRCN0000071375 and B: TRCN0000071376, Sigma) ⁹⁵ on 7 days *in vitro* (DIV) and 5-

Bromouridine incorporation was performed on DIV 11.

492 ChIP-Seq

493 Antibodies used for chromatin immunopreciptation (ChIP) were anti-H3K4me1 (ab8895,

494 Abcam and 07-436, EMD Millipore), anti-H3K4me2 (05-790, EMD Millipore), anti-H3K4me3 (04-745,

EMD Millipore), anti-H3K27ac (39135, Active Motif), anti-HDAC1 (A300-713A, Bethyl Laboratories

496 and sc-6298, Santa Cruz Biotechnology) and anti-KDM5C⁷⁵. KDM5C ChIP-Seq experiments were

⁴⁹⁷ performed as described previously ⁷⁵. Other ChIP experiments were performed as described

498 previously ⁹⁶ with minor modifications.

499 RNA-Seq and Nuclear RNA-Seq

500	RNA-Seq libraries have been described in detail previously ⁹⁷ . For sequencing of nuclear
501	RNA, nuclei were isolated as described previously ⁹⁸ with minor modifications. Libraries from rRNA-
502	depleted RNA were prepared using Direct Ligation of Adapters to First-strand cDNA (DLAF) ⁹⁷ .
503	Global Run-On
504	GRO was modified from the method described previously ^{47, 98} . In addition to the presence of
505	0.2% IGEPAL CA-630, GRO on <i>Kdm5c</i> mESC, <i>Lsd1</i> mESC and CN were done in presence of 0.5%,
506	0.25% and 0.2% of <i>N</i> -Lauroylsarcosine, respectively for 8 min at 30°C.
507	BrU-Seq
508	Cortical neurons (DIV 11), after shRNA treatment for four days, were incubated with 2 mM 5-
509	Bromouridine (850187, Sigma) for 32 min at 37°C. To reduce the number of steps for library
510	preparation, we developed Direct Ligation of Adaptor to the 3' end of RNA (DLAR), a method
511	suitable for preparation of libraries for BrU-Seq.
512	All sequencing experiments were conducted in biological duplicates concurrently with
513	different genotypes to minimize technical variations.
514	Sequencing and Alignment
515	Multiplexed libraries were subjected to single-end sequencing on Illumina HiSeq 2000/2500
516	instruments using standard oligonucleotides designed for multiplexed paired-end sequencing, except
517	that BrU-Seq indices were sequenced with DLAR_Index_Read:5'-
518	CATAGGAAGAGCACACGTCTGAACTCCAGTCAC-3'. ChIP-Seq reads were mapped to the mm9
519	genome using Bowtie1 (v1.1.2) ⁹⁹ allowing for up to two mismatches. PCR duplicates from ChIP-Seq
520	reads were removed using samtools rmdup utility (v1.3) 100 and coverage along the genome was
521	calculated using BEDTools (v2.25.0) ¹⁰¹ after extending the ChIP-Seq reads to a total length of 180
522	bases. RNA-Seq libraries were mapped to the mm9 genome and transcriptome using TopHat2
523	
	(v2.1.0) ¹⁰² with Bowtie2 (v2.2.6) ¹⁰³ . For GRO-Seq and BrU-Seq, full length reads were first aligned
524	(v2.1.0) ¹⁰² with Bowtie2 (v2.2.6) ¹⁰³ . For GRO-Seq and BrU-Seq, full length reads were first aligned using Bowtie1 or Tophat2, respectively. Adaptor sequences were trimmed from the unmapped reads
524 525	

526 Only uniquely mapping reads were retained for further analysis and libraries were normalized to total 527 number of non-mitochondrial and non-ribosomal reads.

528 Analysis

MACS2 (v 2.1.0)¹⁰⁵ was used to call DHS or ChIP-Seq peaks. For selection of candidate 529 530 p300/DHS sites for enhancer prediction, we first scanned the genome for the strongest (with highest 531 MACS2 signal) p300 or DHS site in a 1,250 base sliding window. When both p300 and DHS sites were present in the same window, p300 binding site was given higher precedence over any DHS 532 533 sites. Intergenic p300/DHS sites were defined as sites that were outside of 1.25 kbp upstream to 3 kbp downstream of the genes. LSD1 has been shown to be involved in silencing of repetitive 534 elements including endogenous retroviral elements (ERVs)²⁸. Therefore, to focus on prototypical 535 enhancers in this study, we excluded p300/DHS sites with a low mappability ($M_1 < 0.75$ and $M_2 < 0.75$ 536 0.75), where M_1 and M_2 indicate the fraction of uniquely mapping bases ¹⁰⁶ within ± 500 and ± 100 537 538 bases, respectively, of the p300/DHS site. p300/DHS sites within the ENCODE blacklisted regions ⁵ were also excluded. 539

FeatureCounts¹⁰⁷ was used for calculating the number of reads overlapping various 540 genomic features. Intersection analyses were done using BEDTools. DESeq (v1.22.1)⁶³ was used 541 542 for normalization and differential gene expression analysis. 10-20 genes with exceptionally high expression and miRNAs and were excluded from further analysis. ChIP-Seq enrichment for 543 H3K4me2, H3K4me3 and H3K27ac were normalized using MAnorm¹⁰⁸ with the fraction of reads 544 aligning within the common peaks of WT and Lsd1-GT mESC samples from each replicate. ChIP-545 Seq coverage profiles from only one replicate, which did not require MAnorm normalization, were 546 547 used in the browser snapshots in the figures. Prioritization of enhancer assignment is detailed in the supplemental information. Activity-regulated genes were identified as genes showing significant 548 549 upregulation (p < 0.05, DESeq) in each of the two independent replicates of previously published RNA-Seg datasets from untreated and KCI-treated CN⁷⁵. Wilcoxon signed-rank tests were 550 performed after log transformation of changes in expression or ChIP enrichment. The Perl scripts 551 used for analyses are available upon request. 552

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553 Accession Numbers

554 Raw and processed sequence data files are available on the Gene Expression Omnibus

(GEO) under accession GSE93952. The data can be accessed by the reviewers at:

- 556 https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?token=ulchsiocxvojtaj&acc=GSE93952
- 557

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569 Author contributions

570 SA and BR conceived the project and designed the experiments. SI and SA performed the 571 RNA-Seq, Nuclear RNA-Seq, and GRO-Seq experiments. SA, EB, and TSM performed the ChIP-572 Seq experiments. SI, PMG, and SA designed and performed the BrU-Seq experiment. SA and RSP 573 performed the luciferase reporter assays. YMN, PMG, and SA performed the western blot analyses. 574 SA established the protocols and performed the computational analysis. SA and SI designed the 575 analysis and wrote the manuscript. All authors approved and edited the manuscript.

576

577 **Competing financial interests**

578 The authors declare no competing financial interests.

579

580 Figure legends

581 Figure 1. LSD1 occupies a large fraction of primed enhancers in mES cells. (a) Overlap of binding sites of p300, CTCF, and LSD1 in mESC. (b) Intergenic enhancers were divided into 582 583 quartiles (Q1-Q4) based on the enrichment of H3K4me2 relative to H3K4me1 (left panel). Boxplots 584 of enrichment of indicated histone modifications, LSD1, and p300, as measured by ChIP-Seq, and 585 eRNA levels (GRO-Seq, Nuclear RNA-Seq, and RNA-Seq) at each quartile of intergenic enhancers. Levels of LSD1 show positive correlations with increases in H3K4me2 and eRNA expression from 586 587 Q1 to Q4. (c) The percentage of intergenic enhancers with LSD1 peaks. (d, e) LSD1 occupancy at 588 active, poised, and intermediate enhancers classified based on enrichment of either trimethylation or 589 acetylation of H3K27 (d) or H3K9 (e). LSD1 occupancy at enhancers increases with higher activity. 590 In all figures, the bottom and top boxes signify the second and third guartiles, respectively, and the middle band represents the median of the population. Whiskers represent 1.5 times the inter-quartile 591 592 range (IQR) and the notch represents the 95% confidence interval of the median.

593

Figure 2. LSD1 rarely binds to cell-type specific "latent" enhancers. (a) UCSC genome browser 594 595 snapshot of the *mir290* locus. LSD1 ChIP-Seq peaks in mESC coincide with enhancer signatures, 596 including DHS, H3K4me1, and divergent GRO-Seg signals, upstream of the mir290 promoter in 597 mESC but not in neuronal cells. (b) LSD1 binding at the Npas4 locus in mESC and NSC. LSD1 is present at the two brain-specific DHS sites (marked by asterisks) in neuronal cells but not in mESC. 598 599 Note that the DHS sites common in adult brain and mESC are occupied by LSD1 in both mESC and NSC. NSC: Neural stem cells, CN: Cortical neurons. CTCF, DHS and LSD1 tracks were generated 600 from previously published datasets. (c) Fraction of LSD1 peaks overlapping with mESC hotspots. (d) 601 Fraction of mESC-specific hotspots overlapping with mESC-specific LSD1 peaks. (e) Fractions of 602 603 tissue-specific hotspots overlapping with LSD1 peaks with no mESC-derived DHS.

604

Figure 3. Loss of LSD1 results in increases in H3K4 methylation and H3K27 acetylation at
enhancers. (a) H3K4me1, H3K4me2, H3K4me3, H3K27ac and HDAC1 levels on LSD1-bound

607 enhancers in WT (gray boxes) and Lsd1-GT mESC (red boxes). Enhancers were classified into poised (P), intermediate (I), and active (A) enhancers based on the enrichment of either H3K27ac or 608 H3K27me3. Geometric mean of ChIP:Input ratios from the two independent ChIP-Seq replicates are 609 shown. P-values (p) from Wilcoxon signed-rank tests on differences, log2(Lsd1-GT/WT), are 610 611 denoted in blue beneath each panel. n indicates the number of enhancers in each category. (b) 612 Dysregulation of active enhancers at the Pou5f1 (aka Oct4) locus. A cluster of enhancers is cooccupied by p300 and LSD1. Some of the individual enhancers show an increase in H3K4me2, 613 614 H3K27ac, and GRO-Seq signals in Lsd1-GT mESC (red) compared to WT mESC (gray). (c) 615 Misregulation of a poised enhancer (red bar) at the *Cbln4* locus. This locus is decorated with a broad 616 H3K27me3 domain, and shows elevation in H3K4me1, H3K4me2, and GRO-Seg signals upon the 617 loss of LSD1. Gray bar: Predicted enhancer. Blue bar: significantly-upregulated enhancer in Lsd1-GT mESC compared to WT mESC based on changes in GRO-Seq signal (See Figure 4). 618 619

Figure 4. Loss of LSD1 but not KDM5C results in aberrant activation of enhancers. (a) 620 Fractions of intergenic enhancers bound by LSD1 and/or KDM5C in mESC. (b, d) Volcano plots of 621 GRO-Seq signals at all intergenic enhancers from DESeq analysis. While the loss of LSD1 resulted 622 623 in a large-scale increase in GRO-Seg signals at enhancers, deletion of KDM5C had a minimal impact. X-axis and Y-axis indicate the log2 fold-change and significance, respectively of differential 624 expression in WT and mutant mES cell lines. (c) Scatter plots of GRO-Seq levels at poised, 625 intermediate, and active enhancers classified of the basis of enrichment of either H3K27me3 or 626 627 H3K27ac. Significantly-upregulated and -downregulated enhancers (q < 0.05, DESeq) are shown in 628 blue and orange, respectively. Red curve indicates the LOWESS curve for each class of enhancers. Total number (n) of all, significantly-upregulated, and -downregulated enhancers in each group are 629 630 indicated in black, blue, and orange, respectively. Each class of enhancers shows a significant upregulation (p < 2.2e-16, Wilcoxon signed-rank test) in Lsd1-GT mESC compared to WT mESC. 631 632

Figure 5. Aberrant changes in enhancer activity are associated with misregulation of

physically-interacting genes. (a) An example of long-range promoter-enhancer interactions (top 634 track) obtained from the mESC HiCap data set ⁶⁷ at the *Dusp5* locus. One of the three significantly-635 upregulated enhancers (blue bars) interacts with the Dusp5 promoter. Upon the loss of LSD1, the 636 637 gene and the enhancers show upregulation of H3K4me2, H3K27ac and GRO-Seg signals in Lsd1-638 GT mESC (red) compared to WT mESC (gray). (b) Volcano plots of changes in mRNA levels (RNA-Seg) of genes that physically interact with misregulated enhancers. Based on changes in enhancer-639 640 associated GRO-Seq signals upon the loss of LSD1, enhancers were subdivided as significantly up (q < 0.05, DESeq), significantly down, moderately up $(0.05 \le q < 0.25)$, moderately down, and the 641 642 rest. When multiple enhancers showed interactions with a single promoter, assignment of the genes 643 to each enhancer subgroup was prioritized in the aforementioned order. Total number of associated genes (n) and p-values (p) from Wilcoxon signed-rank tests on differences between mRNA levels in 644 Lsd1-GT and WT mESC are shown beneath each panel. Note that more genes anchored to 645 upregulated enhancers are upregulated compared to genes that interact with downregulated 646 enhancers. 647

648

649 Figure 6. Both mESC-specific and differentiation genes are upregulated upon the loss of 650 LSD1 in undifferentiated mES cells. (a) Schematic showing the number of significantly "induced" and "decommissioned" genes upon differentiation of mESC to epiblast stem cells with Activin A and 651 FGF2⁶⁹. (**b**, **c**) Scatter plots of mRNA levels (b) and levels of nascent transcription (c), as measured 652 by RNA-Seq and GRO-Seq, respectively in WT and Lsd1-GT mESC. Number (n) of significantly-653 upregulated (q < 0.05) and -downregulated genes in each category are shown in blue and orange. 654 respectively. Upon the loss of LSD1 in mESC, both groups of "induced" and "decommissioned" 655 656 genes show a significant increase (p < 2.2e-16, Wilcoxon signed-rank test) in mRNA levels and nascent transcription. (d) Elevated transcription of Hmga2, a differentiation gene that plays an 657 important role in exit of mES cells from the ground pluripotency state ⁷⁰, and its nearby enhancers in 658

Lsd1-GT mESC. Gray bar: Predicted enhancer. Blue bar: significantly-upregulated enhancer in
 Lsd1-GT mESC.

661

Figure 7. LSD1 is required for suppression of inducible enhancers in terminally-differentiated 662 663 neurons. (a) Western blot analysis to confirm the knockdown (KD) of LSD1 in mouse cortical neurons (CN) at DIV 11, after 4 days of lentiviral-mediated delivery of either scrambled shRNA 664 (control) or two independent Lsd1 shRNAs (A and B). (b) Upregulation of activity-regulated genes 665 (ARGs) in Lsd1-KD CN. Scatter plots of transcription levels of ARGs (n=140), from BrU-Seq analysis, 666 in CN treated with either Lsd1 shRNAs (Y-axis) or control shRNA (X-axis). Significantly-upregulated 667 668 (q< 0.05, DESeq) and -downregulated ARGs are shown in blue and orange, respectively, and ARGs displaying greater than a 2-fold difference upon the loss of LSD1 are labeled with gene symbols. P-669 values (p) from Wilcoxon signed-rank tests are denoted in blue. (c) Aberrant induction of Npas4, an 670 ARG, upon Lsd1-KD in resting CN. Boxed P: Npas4 Promoter. Boxed E: Putative activity-regulated 671 enhancers as evident from presence of DHS³², high H3K4me1, low H3K4me3⁷⁵, activity-dependent 672 binding of NPAS4, and an increase in H3K27ac after KCI treatment ⁷⁶. *Npas4* mRNA and eRNA are 673 upregulated specifically in the Lsd1-KD neurons (red) (d) Increased eRNA levels at activity-regulated 674 675 enhancers in Lsd1-KD CN. These enhancers have been previously divided into four groups based on the activity-induced changes in H3K27ac⁷⁶. Three groups of enhancers showed a significant 676 increase in eRNA levels upon Lsd1-KD (red boxes) compared to control conditions (untreated CN or 677 control shRNA-treated CN, gray boxes). A+B: Geometric mean of eRNA levels in CN treated with 678 either Lsd1 shRNAs A or B. U+C: Geometric mean of eRNA levels in control neurons. P-values (p) 679 from Wilcoxon signed-rank tests are denoted in blue beneath each panel. 680

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Figure 1.

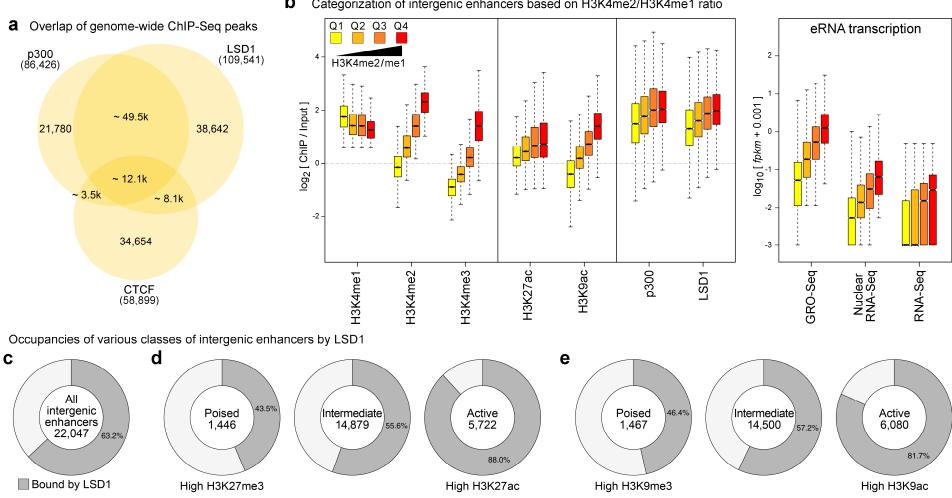


Figure 1. LSD1 occupies a large fraction of primed enhancers in mES cells. (a) Overlap of binding sites of p300, CTCF, and LSD1 in mESC. (b) Intergenic enhancers were divided into guartiles (Q1-Q4) based on the enrichment of H3K4me2 relative to H3K4me1 (left panel). Boxplots of enrichment of indicated histone modifications, LSD1, and p300, as measured by ChIP-Seq, and eRNA levels (GRO-Seq, Nuclear RNA-Seq, and RNA-Seq) at each quartile of intergenic enhancers. Levels of LSD1 show positive correlations with increases in H3K4me2 and eRNA expression from Q1 to Q4. (c) The percentage of intergenic enhancers with LSD1 peaks. (d, e) LSD1 occupancy at active, poised, and intermediate enhancers classified based on enrichment of either trimethylation or acetylation of H3K27 (d) or H3K9 (e). LSD1 occupancy at enhancers increases with higher activity. In all figures, the bottom and top boxes signify the second and third guartiles, respectively, and the middle band represents the median of the population. Whiskers represent 1.5 times the inter-guartile range (IQR) and the notch represents the 95% confidence interval of the median.

b Categorization of intergenic enhancers based on H3K4me2/H3K4me1 ratio

Figure 2.

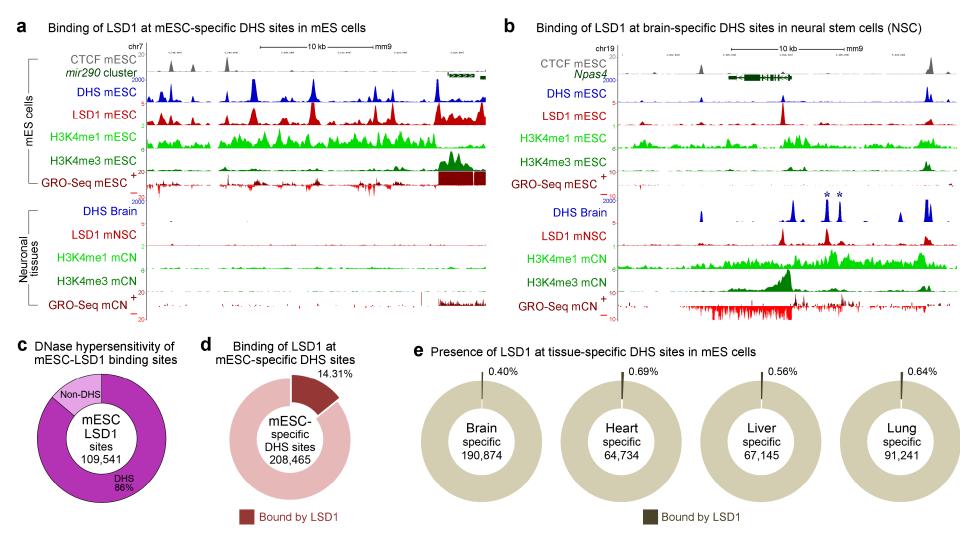


Figure 2. LSD1 rarely binds to cell-type specific "latent" enhancers. (a) UCSC genome browser snapshot of the *mir290* locus. LSD1 ChIP-Seq peaks in mESC coincide with enhancer signatures, including DHS, H3K4me1, and divergent GRO-Seq signals, upstream of the *mir290* promoter in mESC but not in neuronal cells. (b) LSD1 binding at the *Npas4* locus in mESC and NSC. LSD1 is present at the two brain-specific DHS sites (marked by asterisks) in neuronal cells but not in mESC. Note that the DHS sites common in adult brain and mESC are occupied by LSD1 in both mESC and NSC. NSC: Neural stem cells, CN: Cortical neurons. CTCF, DHS and LSD1 tracks were generated from previously published datasets. (c) Fraction of LSD1 peaks overlapping with mESC hotspots. (d) Fraction of mESC-specific hotspots overlapping with mESC-specific LSD1 peaks. (e) Fractions of tissue-specific hotspots overlapping with LSD1 peaks with no mESC-derived DHS.

Figure 3.

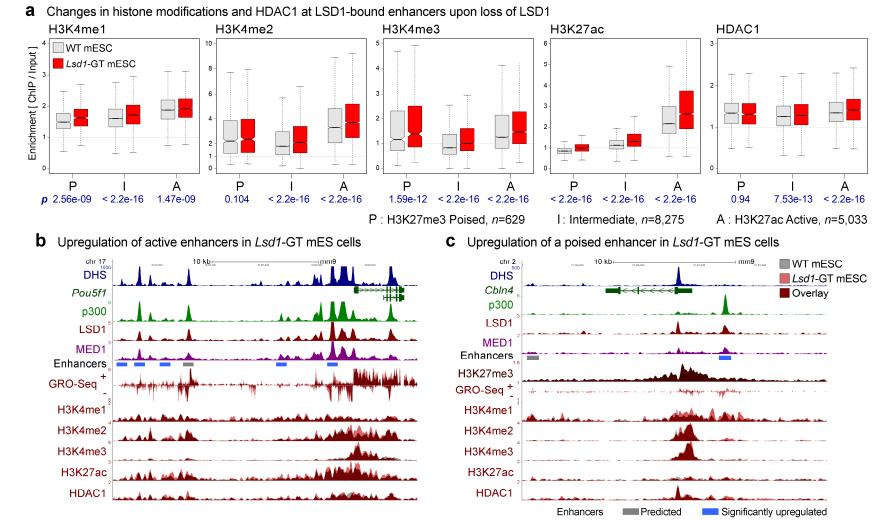


Figure 3. Loss of LSD1 results in increases in H3K4 methylation and H3K27 acetylation at enhancers. (a) H3K4me1, H3K4me2, H3K4me3, H3K27ac and HDAC1 levels on LSD1-bound enhancers in WT (gray boxes) and *Lsd1*-GT mESC (red boxes). Enhancers were classified into poised (P), intermediate (I), and active (A) enhancers based on the enrichment of either H3K27ac or H3K27me3. Geometric mean of ChIP:Input ratios from the two independent ChIP-Seq replicates are shown. *P*-values (*p*) from Wilcoxon signed-rank tests on differences, log2(*Lsd1*-GT/WT), are denoted in blue beneath each panel. *n* indicates the number of enhancers in each category. (**b**) Dysregulation of active enhancers at the *Pou5f1* (aka *Oct4*) locus. A cluster of enhancers is co-occupied by p300 and LSD1. Some of the individual enhancer show an increase in H3K4me2, H3K27ac, and GRO-Seq signals in *Lsd1*-GT mESC (red) compared to WT mESC (gray). (**c**) Misregulation of a poised enhancer (red bar) at the *CbIn4* locus. This locus is decorated with a broad H3K27me3 domain, and shows elevation in H3K4me1, H3K4me2, and GRO-Seq signals upon the loss of LSD1. Gray bar: Predicted enhancer. Blue bar: significantly-upregulated enhancer in *Lsd1*-GT mESC compared to WT mESC compared to WT mESC based on changes in GRO-Seq signal (See Figure 4).



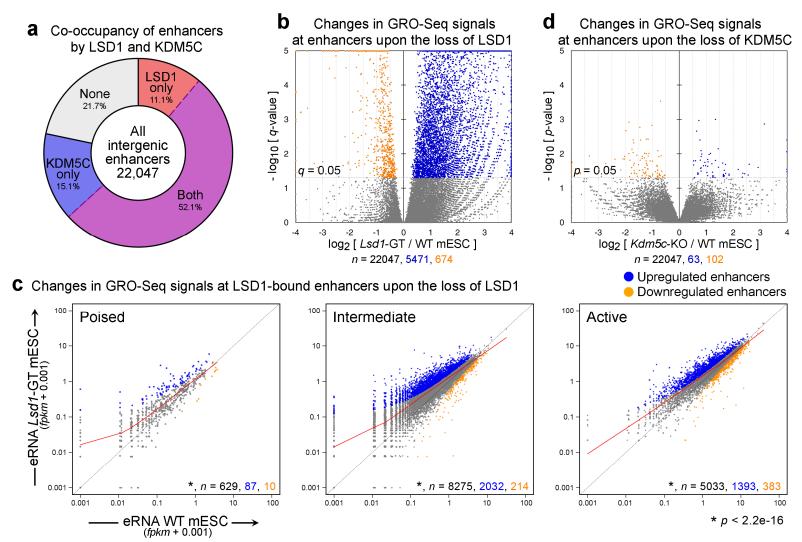
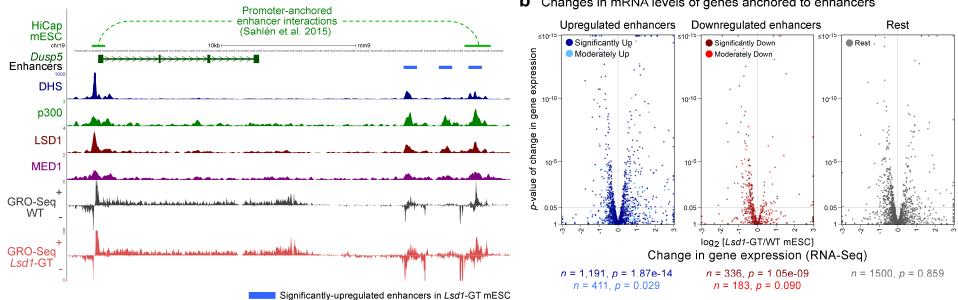


Figure 4. Loss of LSD1 but not KDM5C results in aberrant activation of enhancers. (a) Fractions of intergenic enhancers bound by LSD1 and/or KDM5C in mESC. (b, d) Volcano plots of GRO-Seq signals at all intergenic enhancers from DESeq analysis. While the loss of LSD1 resulted in a large-scale increase in GRO-Seq signals at enhancers, deletion of KDM5C had a minimal impact. X-axis and Y-axis indicate the log2 fold-change and significance, respectively of differential expression in WT and mutant mES cell lines. (c) Scatter plots of GRO-Seq levels at poised, intermediate, and active enhancers classified of the basis of enrichment of either H3K27me3 or H3K27ac. Significantly-upregulated and -downregulated enhancers (q < 0.05, DESeq) are shown in blue and orange, respectively. Red curve indicates the LOWESS curve for each class of enhancers. Total number (n) of all, significantly-upregulated, and -downregulated enhancers in each group are indicated in black, blue, and orange, respectively. Each class of enhancers shows a significant upregulation (p < 2.2e-16, Wilcoxon signed-rank test) in *Lsd1*-GT mESC compared to WT mESC.

Figure 5.



а Concomintant changes in enhancer activity and gene expression at Dusp5 locus

b Changes in mRNA levels of genes anchored to enhancers

Figure 5. Aberrant changes in enhancer activity are associated with misregulation of physically-interacting genes. (a) An example of long-range promoterenhancer interactions (top track) obtained from the mESC HiCap data set ⁶⁷ at the *Dusp5* locus. One of the three significantly-upregulated enhancers (blue bars) interacts with the Dusp5 promoter. Upon the loss of LSD1, the gene and the enhancers show upregulation of H3K4me2, H3K27ac and GRO-Seg signals in Lsd1-GT mESC (red) compared to WT mESC (gray). (b) Volcano plots of changes in mRNA levels (RNA-Seq) of genes that physically interact with misregulated enhancers. Based on changes in enhancer-associated GRO-Seg signals upon the loss of LSD1, enhancers were subdivided as significantly up (q < 0.05, DESeg), significantly down, moderately up (0.05 \leq g < 0.25), moderately down, and the rest. When multiple enhancers showed interactions with a single promoter, assignment of the genes to each enhancer subgroup was prioritized in the aforementioned order. Total number of associated genes (n) and p-values (p) from Wilcoxon signed-rank tests on differences between mRNA levels in Lsd1-GT and WT mESC are shown beneath each panel. Note that more genes anchored to upregulated enhancers are upregulated compared to genes that interact with downregulated enhancers.

Figure 6.

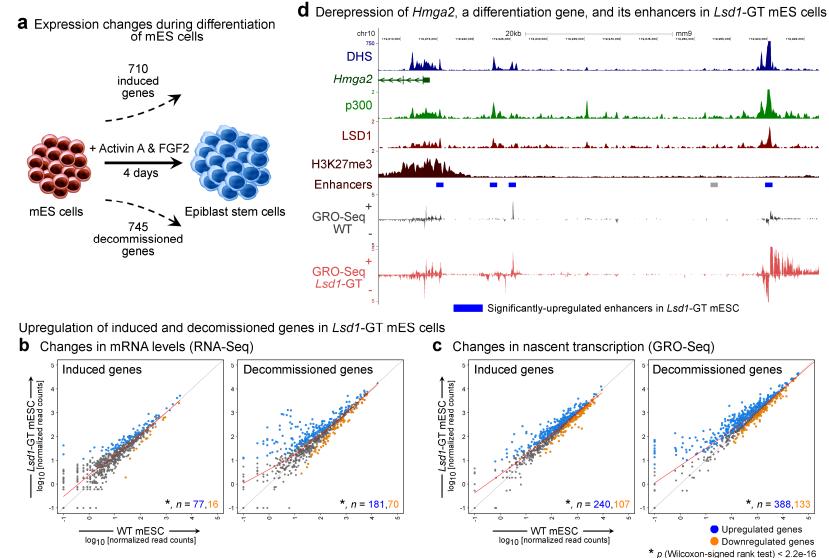
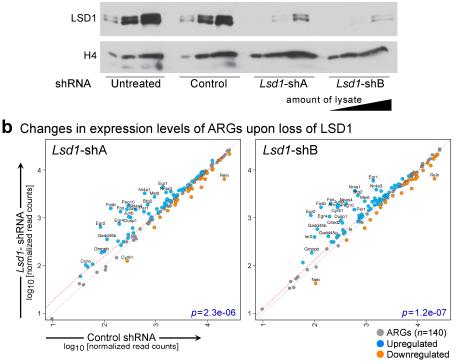


Figure 6. Both mESC-specific and differentiation genes are upregulated upon the loss of LSD1 in undifferentiated mES cells. (a) Schematic showing the number of significantly "induced" and "decommissioned" genes upon differentiation of mESC to epiblast stem cells with Activin A and FGF2⁶⁹. (b, c) Scatter plots of mRNA levels (b) and levels of nascent transcription (c), as measured by RNA-Seq and GRO-Seq, respectively in WT and *Lsd1*-GT mESC. Number (*n*) of significantly-upregulated (q < 0.05) and -downregulated genes in each category are shown in blue and orange, respectively. Upon the loss of LSD1 in mESC, both groups of "induced" and "decommissioned" genes show a significant increase (p < 2.2e-16, Wilcoxon signed-rank test) in mRNA levels and nascent transcription. (d) Elevated transcription of *Hmga2*, a differentiation gene that plays an important role in exit of mES cells from the ground pluripotency state ⁷⁰, and its nearby enhancers in *Lsd1*-GT mESC. Gray bar: Predicted enhancer. Blue bar: significantly-upregulated enhancer in *Lsd1*-GT mESC.

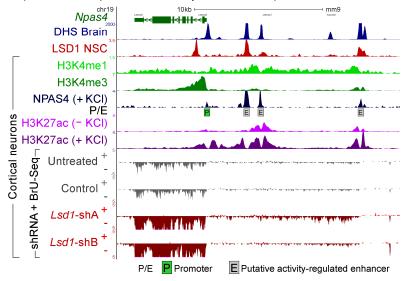
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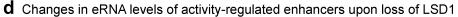
Figure 7.

a Knock-down of LSD1 in mouse cortical neurons



C Derepression of *Npas4* and nearby enhancers upon loss of LSD1





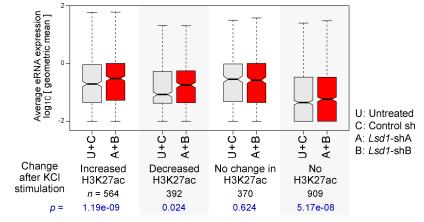


Figure 7. LSD1 is required for suppression of inducible enhancers in terminally-differentiated neurons. (a) Western blot analysis to confirm the knockdown (KD) of LSD1 in mouse cortical neurons (CN) at DIV 11, after 4 days of lentiviral-mediated delivery of either scrambled shRNA (control) or two independent Lsd1 shRNAs (A and B). (b) Upregulation of activity-regulated genes (ARGs) in Lsd1-KD CN. Scatter plots of transcription levels of ARGs (n=140), from BrU-Seq analysis, in CN treated with either Lsd1 shRNAs (Y-axis) or control shRNA (X-axis). Significantlyupregulated (q < 0.05, DESeq) and -downregulated ARGs are shown in blue and orange, respectively, and ARGs displaying greater than a 2-fold difference upon the loss of LSD1 are labeled with gene symbols. P-values (p) from Wilcoxon signed-rank tests are denoted in blue. (c) Aberrant induction of Npas4, an ARG, upon Lsd1-KD in resting CN. Boxed P: *Npas4* Promoter. Boxed E: Putative activity-regulated enhancers as evident from presence of DHS ³², high H3K4me1, low H3K4me3⁷⁵, activity-dependent binding of NPAS4, and an increase in H3K27ac after KCI treatment⁷⁶ Npas4 mRNA and eRNA are upregulated specifically in the Lsd1-KD neurons (red) (d) Increased eRNA levels at activityregulated enhancers in Lsd1-KD CN. These enhancers have been previously divided into four groups based on the activity-induced changes in H3K27ac⁷⁶. Three groups of enhancers showed a significant increase in eRNA levels upon Lsd1-KD (red boxes) compared to control conditions (untreated CN or control shRNA-treated CN, gray boxes). A+B: Geometric mean of eRNA levels in CN treated with either Lsd1 shRNAs A or B. U+C: Geometric mean of eRNA levels in control neurons. P-values (p) from Wilcoxon signed-rank tests are denoted in blue beneath each panel.