

1 Article

2 Human Endogenous Retrovirus K Rec forms a 3 regulatory loop with MITF that opposes the 4 progression of melanoma to an invasive stage

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11 **Abstract:** In the human genome, HERV-K(HML2) is the most recently endogenized retrovirus
12 (ERV). While HERV-K(HML2) transcription is observed in healthy tissues, various cancers showed
13 the upregulation of retroviral derived endogenized accessory products (e.g., envelope (Env), Np9
14 and Rec). Still, it is not clear whether the different HERV-K-derived genes contribute to a disease,
15 or they are mere by-products. Here, we focus on the potential role of Rec in melanoma. Our in vitro
16 model and high throughput data mining, including single-cell transcriptome analyses of patient's
17 material, reveal that Rec expression marks the proliferative (still controllable) stage of melanoma,
18 and is involved in maintaining a delicate balance between cell proliferation and invasion. Thus,
19 similar to melanocyte-inducing transcription factor (MITF), Rec is a sensitive marker of melanoma
20 progression. Our Rec-knockdown in vitro system can faithfully model a subpopulation (MITF
21 malignancy) of melanoma cells in human patients. Like Env, Rec modulates an endothelial-
22 mesenchymal transition (EMT)-like process of cancer progression; however, they seem to affect the
23 phenotype switch inversely. Rec inhibits the transition to the invasive state by altering the
24 expression level of some key determinants of the EMT-like process, including MITF that directly
25 binds the LTR5_Hs of HERV-K. The Hominoid-specific HERV-K products might explain certain
26 species-specific features of melanoma progression, and pinpoint to the limitation of using animal
27 models in melanoma studies.

28 **Keywords:** HERV-K, Rec, Melanoma, Metastasis, and MITF

30 1. Introduction

31 Endogenous retroviruses (ERVs) are remnants of retroviruses that once infected the germline
32 and became vertically inherited as part of the host genome. Sequences derived from various ERVs
33 account for 8% of the human genome [1], reflecting multiple waves of retroviral invasion in the
34 human lineage. In the human genome, HERV-K(HML2) is the most recently endogenized HERV, and
35 several copies of this subgroup still express retroviral open reading frames (e.g., Gag, Pro-Protease,
36 Pol-Polymerase, Env-Envelope), and are even capable of producing (non-infective) viral particles [3].
37 The canonical function of HERV-K Env is to enable the retrovirus to traffic through the endosomal
38 membrane of the host cells or directly enter cells by fusing with their membranes. The endogenization
39 process of HERV-K(HML2) (HERV-K thereafter) included the emergence of the accessory proteins,
40 Np9 and Rec, translated from splicing products of the Env mRNA [3, 4]. Env, Np9, and Rec interact
41 with different host-encoded cellular factors and have distinct functional activities. Rec is a small
42 RNA-binding protein considered to be a functional homolog of the HIV Rev accessory protein [5].
43 Through its interaction with the CRM1 nuclear export factor [4, 6], Rec is involved in exporting un-
44 spliced HERV-K RNA from the nucleus [3, 7]. Also, Rec can directly modulate cell signaling via
45 binding to the promyelocytic leukemia zinc finger (PLZF) protein, a transcriptional repressor of the
46 c-MYC proto-oncogene [8]. Rec also binds the TZFP (testicular zinc-finger protein) and the hSGT
47 (human small glutamine-rich tetratricopeptide repeat protein), which are transcriptional repressors

48 of the androgen receptor [9, 10]. While it is evident that Rec must have first evolved to facilitate
49 HERV-K replication, there is speculation that the protein may have been coopted for physiological
50 function, such as spermatogenesis [6, 11] and defense against viral infections in the early human
51 embryo [12].

52 It has been reported that at least 18 HERV-K genomic loci can be transcribed in healthy human
53 tissues and express potentially-coding Rec or Np9 mRNAs (alone or in combination with retroviral
54 genes). However, the landscape of transcribed HERV-K loci differs considerably between cell/tissue
55 types [13]. Rec RNA/protein expression has been observed in human embryonic tissues, placenta,
56 and retina [14, 15]. Interestingly, HERV-K is expressed in both germinal- and pluripotent stem cells,
57 providing a particular link between these cell types [16]. While HERV-K transcription has been
58 observed at low levels in various healthy tissues, it is strongly induced upon environmental stress,
59 such as ultraviolet irradiation (e.g., UVB and UVC), starvation, or viral infection that may manifest
60 the global DNA hypomethylation [17-21]. Furthermore, many studies have reported robust mRNA
61 upregulation of several genomic loci of HERV-K in various disease states, including certain
62 autoimmune diseases and several cancers, especially lung, breast cancers, germ cell tumors, and
63 melanoma [18, 22, 23] and reviewed in [24, 25]. Moreover, transcriptional activation and translation
64 of various HERV-K products [22, 26] and even virus-like particles have been observed in specific
65 cancer cells such as teratoma, embryonic carcinoma, and melanomas [3, 27-29].

66 Whether and how the overexpression of HERV-K products contributes to the progression of
67 these diseases is the subject of many studies, debates, and speculations. Several mechanisms have
68 been proposed by which HERV-K might contribute to disease. The activated LTRs could act as
69 alternative promoters and de-regulate tumor suppressor genes or proto-oncogenes (reviewed in [35,
70 36]). Furthermore, the Env protein of HERV-K, via its fusogenic property, is capable of inducing cell-
71 cell fusion and could, therefore, contribute to tumor invasiveness [18, 37, 38]. Env could also have
72 oncogenic properties through direct interference with cellular signaling pathways (e.g.,
73 RAS/MEK/ERK) [39, 40]. Indeed, the overexpression of the HERV-K Env protein has been reported
74 to induce an epithelial to mesenchymal transition (EMT)-like process [39, 41], a crucial event in
75 oncogenesis leading to a more malignant phenotype. In addition, Env was suggested to promote
76 tumorigenesis via modulation of the immune response [42-44]. Confusingly, HERV-K may have
77 either a positive or negative effect on the immune system [45, 46]. Similar to Env, the expression of
78 the accessory genes, Rec and Np9 were readily increased in pathological conditions [47], including
79 germ cell tumors and melanoma [4, 6, 22, 27, 28, 48-52]. Still again, it was not clear whether and how
80 these factors could contribute to tumorigenesis and other disease states.

81 To begin answering this question, we investigate the oncogenic properties of HERV-K Rec (Rec
82 thereafter) in melanoma. We used in vitro models as well as high throughput data mining, including
83 single-cell transcriptome analyses of patient samples, to examine the impact of Rec expression in the
84 spatiotemporal progression of melanoma. We found that Rec marks the proliferative state of
85 melanoma, and similarly to Env [39], modulates the EMT-like process of cell transformation.
86 However, surprisingly, in contrast to Env [39], Rec is inhibiting and not activating the transition from
87 proliferative to invasive state and thus might be, in fact, a protective factor in melanoma.

88 2. Materials and Methods

89 2.1. Construction of the KD constructs

90 All 3 KD targeting the ERVK6(HML2.HOM) locus. KD1 targets 3'UTR, KD2 3'UTR, and KD3 the
91 gene body of Rec.

92 KD1 construct 1 (3'UTR_I): (as) 5'-ATCCATTCAACTCTGAGTGGA-3'

93 KD2 construct 2 (5'UTR_I): (as) 5'-TAAGGCTGACTGTAGATGTAC-3'

94 KD3 construct 4 (Rec): (as) 5'-CAACGGTGCTCGATTGCGATG-3'

95 2.2. Cell Culture

96 The melanoma cell line, A375 (ATCC CRL-1619) was cultivated in RPMI1640 (Thermo Fisher
97 Scientific) supplemented with 10% fetal bovine serum (FBS; PAA Laboratories, Pasching, Austria),
98 80 U/mL penicillin and streptomycin (Lonza, Basel, Switzerland) at 37°C in a humidified atmosphere

99 of 95% air and 5% CO₂. The melanoma cell line, SKMel-28 (ATCC HTB-72) was maintained in
 100 Dulbecco's modified Eagle's medium (DMEM, Life Technologies, England) containing GlutaMAX™-
 101 I supplement (Gibco, catalog number: 31966-021), with 10% FBS and penicillin and streptomycin in
 102 the same condition as above.

103 2.3. Transfection of melanoma cells and cell sorting

104 To knock down Rec, melanoma cells were transfected with pT2-MP71-KD1-Rec-EGFP, pT2-
 105 MP71-KD2-Rec-EGFP, pT2-MP71-KD3-Rec-EGFP plasmids in the presence of pT2-CAGGS-SB100X,
 106 using the Neon transfection system (Life technologies). A piggyBac transposon-based vector,
 107 targeting GFP, was used as a control. 10µl Kit with the electroporation setting, 1350 V (pulse voltage),
 108 20ms (pulse width), two pulses. 2×10⁵ cells in 11 µL resuspension buffer R were combined with 2 µL
 109 of purified plasmid mixture (50 ng transposase and 500 ng transposon). Transfected cells were
 110 transferred to 6-well tissue culture plates containing 2 mL culture medium. EGFP⁺ cells were sorted
 111 at weeks 1 and 3 post-transfection by FACS Aria II cell sorter (Becton).

112 2.4. Quantitative Real-Time PCR and semi-quantitative PCR

113 Total RNA was extracted using the Direct-zol RNA MiniPrep kit (Zymo Research) according to
 114 the protocol of the manufacturer. Reverse transcription was performed from 1µg total RNA with the
 115 High Capacity RNA-to-cDNA kit (Applied Biosystems). The isolated RNA would be treated with
 116 additional DNaseI (Invitrogen), to get rid of potential DNA contamination. Quantitative real-time
 117 PCR (qRT-PCR) was carried out on ABI7900 with PowerUp SYBR Green Master Mix kit (Applied
 118 Biosystems), according to the recommendations of the manufacturer. For quantification of mRNA
 119 expression levels, real-time PCR was run in triplicates for each cDNA sample, using GAPDH and 18s
 120 RNA as the internal controls for SKMel-28 and A375 cells, respectively, for primers and annealing
 121 temperatures see [Table 1](#). Data were analyzed using the comparative CT (2-ΔΔCT) method, which
 122 describes relative gene expression.

123 Table 1. The primers/oligos used in this study.

Name	Application	Sequence (5' – 3')	Tm(°C)
HML-2-Env	Real-Time qPCR	F: GCTGCCCTGCCAAACCTGAG R: CCTGAGTGACATCCCGCTTACC	60
HML-2-Gag	Real-Time qPCR	F: AGCAGGTCAGGTGCCTGTAACATT R: TGGTGCCGTAGGATTAAGTCTCCT	60
HML-2-Np9	Real-Time qPCR	F: AGATGTCTGCAGGTGTACCCA R: CTCTTGCTTTTCCCCACATTTC	60
HML-2-Rec	Real-Time qPCR	F: ATCGAGCACCGTTGACTCACAAGA R: GGTACACCTGCAGACACCATTGAT	60
MITF-M	Real-Time qPCR	F: ATGCTGGAAATGCTAGAATATAATCACT R: GAATGTGTGTTTCATGCCTGG	60
SPANXB1/B2	Real-Time qPCR	F: AGGCCAATGAGGCCAACAAGAC R: TCCTCCTGTAGCGAACCCTAG	60

18S RNA	Real-Time qPCR	F: GTAACCCGTTGAACCCCAT R: CCATCCAATCGGTAGTAGCG	60
GAPDH	Real-Time qPCR	F: CAATGACCCCTTCATTGACCTC R: AGCATCGCCCCACTTGATT	60

124 2.5. RNA sequencing and data analysis

125 The concentration of RNA was measured on NanoDrop Spectrophotometer ND-1000, and the
126 quality of RNA was analyzed using Agilent RNA 6000 Nano Kit on Aligent 2100 Bioanalyzer
127 machine. The RNA sequencing library was prepared from 550 ng of RNA, using Illumina TruSeq
128 Stranded mRNA LT Set A kit (Cat. no. RS-122-2101), according to TruSeq Stranded mRNA Sample
129 Prep LS Protocol. Sequencing was performed on an Illumina HiSeq 2000 platform as 100 bp first
130 strand-specific paired-end reads.

131 Sample-specific barcoded sequencing reads were de-multiplexed from multiplexed flow cells
132 and by using CASAVA. 1.8.2 BCL files were converted to FASTQ format files. The quality of the raw
133 sequence reads was determined by using the FastQC. Reads with a quality score below 30 were
134 removed. We removed the highly variable two nt from the ends of the remaining sequencing reads
135 and mapped them over the reference genome (Human hg19/GRCh37) and transcriptome model
136 (hg19.refseq.gtf). hg19/GRCh37 and hg19.refseq.gtf that were downloaded from USCS tables
137 (<http://hgdownload.cse.ucsc.edu/goldenPath/hg19/bigZips/>) by using Bowtie 2.0.5.0, Samtools
138 0.1.17.0 and TopHat v2.0.8 with parameters: "tophat2 -p 8 -r 150--mate-std-dev 140 --library-type fr-
139 first-strand". Transcript assembly for each sample was conducted with Cufflinks v2.0.8, generating
140 FPKM values. In the cross-study or /and cross-platform comparisons, we normalized the batch effect
141 using the 'combat' package from R. Differentially expressed genes (DEGs) were calculated as counts
142 per million (CPM) using featureCount and algorithms from "DESeq2". This strategy provided both
143 quantification and statistical inference of systematic changes between conditions (with at least three
144 replicates). We had generated various transcriptomes from A375 cells (e.g., A375-untransfected,
145 A375-scambled transfection control, A375-knockdowns targeting HERV-K(HML2) Rec using three
146 distinct RNAi constructs, Rec-KD1,2,3). We performed similar studies in SK-MEL28 cell lines. As an
147 additional control, and to increase statistical power for DEGs identified in our transcriptomes upon
148 Rec-KD, we also used publicly available A375 RNA-seq datasets (GSE110948). To analyze single-
149 replicate RNA-seq datasets, we utilized the "GFOLD" algorithm for normalization, which calculates
150 a variance of fold-changes from unreplicated RNA-seq data. Canonical pathways and biological
151 function of the differentially expressed genes (DEGs) were further subjected to KEGG and Gene Set
152 Enrichment Analyses (GSEA).

153 2.6. Single-cell RNA-seq data processing

154 We got the single-cell count matrix from GSE72056. We calculated the activity of genes in every
155 cell at TPM expression levels. We considered samples expressing over 1000 genes with expression
156 levels exceeding the defined threshold ($\text{Log}_2 \text{TPM} > 1$). We used Seurat_3.1.1, a package from R to
157 normalize the datasets at the logarithmic scale using "scale.factor = 10000". After normalization, we
158 calculated scaled expression (z-scores for each gene) for downstream dimension reduction. We used
159 the original annotations of datasets to classify the malignant, non-malignant, and heterogenous cell-
160 types. To define cell population clusters, we employed the FindClusters function of "Seurat" using
161 "PCA" as a reduction method. The specific markers for each cluster identified by "Seurat" were
162 determined by the "FindAllMarkers" function, using "roc" as a test for significance. This provided us
163 two lists of gene sets, 1) Malignant vs. Non-Malignant differentially expressed genes and 2) genes
164 differentially expressed between MITF-High and MITF-low tumors, which we applied for comparing
165 the DEGs from Rec-KD RNA-seq. Feature plots, violin plots, and heatmaps were constructed using
166 default functions, except for the color scale that was set manually. The annotated cells were re-
167 clustered using the methodologies described above and visualized on the UMAP coordinates.

168 2.7. ATAC-seq and ChIP-seq data analyses

169 ATAC-seq and ChIP-seq raw datasets in sra format were downloaded from the listed studies
170 and converted to fastq format using sratools function fastq-dump --split-3. Fastq reads were mapped
171 against the hg19 reference genome with the bowtie2 parameters: --very-sensitive-local. All
172 unmapped reads with MAPQ < 10 and PCR duplicates were removed using Picard and samtools. All
173 the ATAC-seq peaks were called by MACS2 with the parameters --nomodel -q 0.01 -B. Blacklisted
174 regions were excluded from called peaks
175 (<https://www.encodeproject.org/annotations/ENCSR636HFF/>). To generate a set of unique peaks,
176 we merged ATAC-seq peaks using the mergeBed function from bedtools, where the distance between
177 peaks was less than 50 base pairs. We then intersected these peak sets with repeat elements from hg19
178 repeat-masked coordinates using bedtools intersectBed with a 50% overlap. To calculate the
179 enrichment over the given repeat elements, we first extended 5KB upstream and 5KB downstream
180 coordinates from the left boundary (TSS) of respective elements in a strand-specific manner. These
181 10KB windows were further divided into 100 bps bins, and tags (bedGraph output from MACS2)
182 were counted in each bin. Tag counts in each bin were normalized by the total number of tags per
183 million in given samples and presented as Counts Per Million (CPM) per 100 bps. We averaged CPM
184 values for each bin between replicates before plotting the figures. To find the MITF binding motifs,
185 25 bps sequences were extended from either side of ChIP-seq peak summits. The extended sequences
186 were analyzed by the RSAT tool (<http://rsat.sb-roscoff.fr/>). The TF binding motifs were calculated
187 from JASPAR libraries of human TF motifs.

188 2.8. Cell invasion assay

189 The cell invasion assays were performed using transwell chambers (8 μ m pore size; Corning
190 Costar) according to the vendor's instructions. Briefly, the insert of the wells was first coated with 50
191 μ l BD matrigel. A375 cells were resuspended with RPMI1640 medium containing 0.5% FCS to reach
192 a concentration of 5×10^5 cells/ml. Then 100 μ l cells from each group were seeded into the upper
193 chamber of the insert, with adding DMEM containing 10% FCS to the lower chamber. After
194 incubation at 37 °C in a humidified atmosphere of 5% CO₂ for 24 h, non-invaded cells were removed
195 with gentle swabbing while the invaded ones were stained. Then images were taken with
196 microscopy. Cell numbers were calculated with ImageJ.

197 2.9. Accession of datasets used in this study:

198 Encode chromHMM datasets:

199 <ftp://hgdownload.cse.ucsc.edu/goldenPath/hg19/encodeDCC/wgEncodeBroadHmm>

200 Encode TF ChIP-seq datasets:

201 <ftp://hgdownload.cse.ucsc.edu/goldenPath/hg19/encodeDCC/wgEncodeSydhTfbs>

202 GSE60663: H3K27Ac Primary Melanoma

203 GSE60663: H3K4Me3 Primary Melanoma

204 GSE60663: MITF ChIP-seq Primary Melanoma

205 GSE60664: RNA-seq Primary Melanoma

206 GSE110948: A375 RNA-seq

207 GSE46817: RNA-seq of 7 distinct melanoma lines

208 GSE46805: RNA-seq Melanocyte BRAF overexpression

209 GSE50681: MITF ChIP-seq Melanoma and Melanocyte post-treatment

210 GSE82330: ATAC-seq Melanoma A375

211 GSE72056: Patient's Single cell RNA-seq data

212 3. Results

213 3.1. LTR5_Hs loci form active chromatin in cancer and pluripotent cell lines

214 The regulatory region of the youngest subfamily of HERV-K is the human-specific long terminal
215 repeat 5 (LTR5_Hs). To dissect the regulation of HERV-K transcription in different cell types, we
216 adopted a systematic genome-wide approach using publicly available data. For this, we investigated

217 the chromatin state at ~600 full-length LTR5_Hs sequences using the uniquely mappable reads in 9
218 different cell types from the ENCODE project [50]. Analysis of the chromatin states suggested that a
219 substantial fraction ($n = 227$) of LTR5_Hs sequences overlap with active or permissive chromatin
220 states (Figure 1A). When compared to differentiated somatic cells, these LTR5_Hs genomic loci
221 showed features of active ('open') chromatin state in human embryonic stem cells (H1_ESCs) and in
222 cancer cell lines (Figure 1A).

223 Various transcription factors (TFs) have been reported to bind LTR5_Hs/HERV-K, including the
224 pluripotency factors such as OCT4 [12, 51] or the melanocyte inducing TF (MITF) [52]. In a systematic
225 approach, we mapped the peaks from 142 ChIP-seq TF datasets from 7 cell lines (ENCODE) over
226 LTR5_Hs genomic loci ($n \sim 600$). Our integrative analysis of various TF occupancy revealed that
227 LTR5_Hs recruits significantly more TFs in H1 embryonic stem cells (H1_ESCs) and leukemia K562
228 cells, compared with HepG2, GM12878 or HUVEC cells (Figure 1B), which may indicate elevated
229 levels of HERV-K transcription in embryonic stem cells and cancer cells. While in H1_ESCs, LTR5_Hs
230 was bound prominently by pluripotency specific TFs (e.g., NANOG) (Figure 1B-C), the cancer line
231 (K562) displays the binding of multiple TFs that control the cell cycle and proliferation (e.g., c-MYC,
232 MAX, COREST, P300, PU1, GATA2, and JUND) (Figure 1B-C and Table S1). Intriguingly, NANOG
233 binding over LTR5_Hs is overrepresented in 3iL naïve conditions (Figure 1C). The observed HERV-
234 K virion particles in the human blastocyst might be the products of HERVK driven by NANOG [12].
235 The active chromatin states and TF bindings over LTR5_Hs in cancer lines might be associated with
236 the oncogenic phenotype.

237 3.2. MITF regulated LTR5_Hs/HERV-K expression is a hallmark of the 'proliferative' type of 238 melanoma

239 It has been previously reported that in melanoma, the melanocyte/melanoma-specific isoform,
240 MITF-M may bind LTR5_Hs, and promotes the expression of HERV-K transcripts [52]. MITF(-M) is
241 a critical transcription factor associated with melanoma progression [53, 54], and is a sensitive marker
242 of melanoma invasiveness; highly expressed in the melanocytes and the proliferative state of
243 melanoma (e.g., MITF-high) but lowly expressed in the invasive state (e.g., MITF-low) [55].

244 To investigate how HERV-K is controlled in melanoma, we mined ChIP-seq and RNA-seq data
245 from melanocytes, various melanoma cell lines, and primary melanoma cultures (Methods).
246 Importantly, characterizing primary melanoma cultures according to their MITF levels (Figure 1D)
247 revealed a positive correlation between MITF-regulated LTR5_Hs/HERV-K transcription and
248 invasiveness (Figure 2A). To see if additional transposable elements (TEs) respond to melanoma
249 proliferative/invasive status, we extended the systematic analysis over all of the TE families. This
250 analysis revealed that the expression of certain ERVs, including LTR5_Hs/HERV-K, LTR2C, and
251 LTR13, was correlated with proliferative melanoma associated genes (Figure S1A). Nevertheless,
252 when compared to the overall expression of other TE families, LTR5_Hs/HERVK was the most
253 abundantly expressed TE family and highly correlated with MITF level ($\rho = 0.43$, corrected p-value
254 $< 0.2e-9$) in the melanoma primary cultures ($N=10$) (Figure 2B). These data suggest that
255 LTR5_Hs/HERV-K expression can be used as a marker that correlates negatively with melanoma
256 invasiveness. Next, we characterized LTR5_Hs loci activated in the proliferative type of melanoma
257 cells by layering ChIP-seq occupancy signals of H3K4Me3, H3K27Ac, and MITF (Figure 2C and S1B-
258 C). We found that MITF binding at LTR5_Hs loci coincides with the presence of the canonical E-box
259 motif (CA(C/T)GTG), which is recognized by MITF as well as c-MYC, and MAX TFs [56] (Figure 2C).

260 We also investigated the regulation of HERV-K transcription in the BRAF^{V600E} mutant, an
261 invasive type of melanoma. PLX4032, a commonly used BRAF^{V600E} inhibitor in the clinic, enhances
262 the expression of MITF by several folds that revert melanoma from an invasive to the proliferative
263 state [59]. To examine how PLX4032 treatment affects HERV-K expression, we reanalyzed the
264 publicly available MITF ChIP-seq datasets of primary melanocytes and a BRAF^{V600E} mutant
265 melanoma cell line (COLO829) with and without PLX4032 treatment (GSE50681). We observed that
266 PLX4032 treatment results in a substantial enrichment of MITF ChIP-seq peaks over LTR5_Hs
267 elements (123 unique loci were bound) (Figure 2D). When compared to other TE families, the gain of
268 MITF binding occurred specifically over LTR5_Hs (Figure 2E). Importantly, while MITF is expressed
269 in healthy pigmented cells, we found no elevated MITF ChIP-seq signal over LTR5_Hs elements upon

270 PLX4032 treatment in normal, pigmented melanocytes (Figure 2D). Thus, MITF binding to LTR5_Hs
271 is specific to the proliferative state of melanoma.

272 Collectively, the MITF binding may lead to LTR5_Hs activation, not typical in healthy
273 melanocytes, but in the proliferative type of melanoma, thus can be considered as a sensitive marker
274 of the proliferative vs. invasive phenotype of melanoma.

275 3.3. Depleting HERV-K-Rec induces an EMT-like process in A375 melanoma cells

276 The ERVK6 locus (located on the Chr7 p22.1) produces both retroviral ORFs (Gag and Env) and
277 the accessory HERV-K product, Rec [13, 28]. To see how this specific locus responds to MITF in
278 proliferative (MITF-High), invasive (MITF-Low) primary melanoma lines, we analyzed a published
279 dataset for H3K27ac and MITF ChIP-seq (GSE60663), and also included the proliferative type A375
280 melanoma cell line in the analysis (GSE82330). This locus showed a higher H3K27Ac signal in both
281 proliferative MITF-High and A375 cells relative to MITF-Low cells, and also a significant ATAC-seq
282 signal in A375 (Figure 3A), indicating that this locus is preferentially active in a proliferative type of
283 melanoma. Moreover, ATAC-seq and active histone mark analysis (e.g., H3K27ac and H3K4Me1)
284 support the accessibility of multiple LTR5_Hs in A375 (Figure 3B-C), suggesting that A375 cell line
285 might be an adequate model for this type of melanoma.

286 To decipher the underlying difference of the invasiveness of various melanoma cells and the
287 potential role of Rec in melanoma, we first used an RNAi approach to deplete Rec expression in two
288 melanoma cell lines (e.g., A375 and SKMel-28) of different invasiveness. A375 and SKMEL-28, both
289 wild type for the tumor suppressor PTEN and carry the BRAF^{V600E} mutation, but A375 have a higher
290 proliferation rate, whereas SKMEL-28 is more invasive [62]. To knockdown (KD) Rec, we designed
291 three RNAi constructs. These constructs were delivered using Sleeping Beauty as a stable vector [63],
292 and also expressed a fluorescence reporter (GFP). To generate stable KD cell lines for both A375 and
293 SKMel-28, the KD constructs were transfected together with the SB100X transposase [64]. The stable
294 KD-Rec lines were selected in two-rounds by FACS sorting for the GFP-reporter signal. Real-time
295 qRT-PCR showed that Rec transcript levels were strongly depleted in each of the three independent
296 KD cell lines isolated for both A375 and SKMel-28 (Figure 3D). Notably, as a side effect, knocking
297 down Rec also led to an increased level of alternative retroviral HERV-K transcripts, Gag and Env in
298 SKMel-28, and A375, respectively (Figure 3E).

299 To detect global transcriptional changes in an unbiased way, we used RNA-seq analysis of the
300 stable KD-Rec cell lines. The study of individual HERV-K genomic loci revealed that our KD strategy
301 (using three biological replicates) significantly affected seven Rec expressing loci in KD-Rec_A375
302 cells (Figure 3F). SKMel-28, by contrast, has only three HERV-K loci expressing Rec (not shown) [28].

303 Having validated our Rec KD lines, we performed a global analysis of differentially expressed
304 genes (DEGs) ($|2|$ -fold and FDR < 0.05, (Figure S1E, Table S1, see Methods) between the KD lines
305 and the parental cell lines. The list of the DEGs was different between the A375 and SKMel-28 knock-
306 downs, which could be in part explained by the distinct patterns of active HERV-K loci in the two
307 melanoma lines. In KD-Rec_SKMel-28, DEGs (Table S1) did not include MITF and were not
308 significantly enriched for any Gene Ontology (GO) categories, and formed no discernible pattern,
309 suggesting that knocking-down Rec in this particular (invasive) melanoma line was not instructive
310 of biological process alterations. The smaller number of Rec expressing HERV-K loci and the
311 antagonistic elevation of the alternative retroviral product (e.g., Rec) in KD-Rec_SKMel-28 might, at
312 least partially, explain the lack of distinct pattern.

313 In contrast, GO analysis of 1120 DEGs in KD-Rec_A375 revealed that most of the dysregulated
314 genes were associated with cell communication, followed by the cell cycle, cell proliferation (Figure
315 4A). Narrowing down the list of DEGs by excluding genes of the category of system development,
316 the remaining genes were enriched in clusters of cell differentiation, stem cell differentiation, cell
317 death, and system development. Genes in the stem cell differentiation and system development
318 categories could be linked to the WNT signaling pathway. Among DEGs in KD-Rec_A375, we
319 identified genes involved in an epithelial-mesenchymal transition (EMT)-like process, which has
320 been observed to play a critical role in phenotype switching in the proliferative to invasive state [33,
321 66, 67]. Intriguingly, this set of DEGs included matrix metalloproteinase 2 (MMP2), a classical marker
322 of cell invasion and additional four genes from the list of the 16 critical markers of the canonical EMT

323 process [65] (e.g. N-Cadherin (CDH2), zinc finger protein (SNAI2), forkhead box C2 (FOXC2) and
324 gooseoid Homeobox (GSC) (Figure 4B-C).

325 Nevertheless, as the melanocytes and melanoma cells differ from epithelial and mesenchymal
326 cells, respectively, the EMT-like process in melanoma phenotype switching is characteristically
327 different from the canonical EMT process [33]. In melanoma metastasis, the TF network switches to
328 the melanoma-specific $SNAI2^{low}/ZEB2^{low}/ZEB1^{high}$ phenotype [69-71], that we also observed in our
329 KD-Rec_A375 cells (Figure 4B-C), suggesting that Rec modulates the melanoma-specific EMT-like
330 phenotype switching. The elevated level of EMT markers in KD-Rec_A375 cells suggests that Rec
331 inhibits the EMT-like process.

332 Beside canonical EMT markers, we also observed the upregulation of further factors in KD-
333 Rec_A375 cells, known to act as inducers of the EMT-like process. For example, non-canonical WNT
334 signaling via WNT5A and GSK3B, which is markedly upregulated in KD-Rec_A375 cells (Figure 4D),
335 is critical for the switch to an EMT-like invasive phenotype when melanoma gets relapsed [72, 73].
336 Furthermore, the most extensively studied inducer of EMT, TGF- β [74, 75], reported to control SNAI2
337 [76], was also upregulated in our KD-Rec_A375 transcriptomes (Table S1).

338 In addition, among the top DEGs, we observe a strong upregulation of several members of the
339 SPANXC (sperm protein associated with the nucleus in the X chromosome) family of genes (Figure
340 4D-E), which are typically expressed in the germline. The upregulation of SPANXB1/2, clinically
341 relevant cancer-testis antigens, has been previously reported in melanoma [75] and was also
342 validated by qRT-PCR in our KD-Rec_A375 samples (Figure 4E). Simultaneous upregulation of
343 multiple genes physically located within the SPANX (B/C) chromosomal cluster suggests an
344 epigenetic disturbance affecting the entire locus. Indeed, the epigenetically sensitive Polycomb
345 repressor complex 2 (PRC2) has been implicated in maintaining SPANXB in a transcriptionally silent
346 state in differentiated cells [76]. Our data suggest that Rec may exert directly or indirectly an effect
347 on the epigenome of melanoma, an aspect that we did not follow up in this study.

348 Importantly, in our KD-Rec_A375 cells, we detected a robust transcriptional decrease in the level
349 of MITF-M, the governor of the melanocyte differentiation program (Figure 5A), confirmed by qPCR.
350 In addition to MITF, we observed a decreased expression of further melanocyte differentiation
351 markers (e.g., TYR, PMEL) [77] (Figure 5B).

352 Collectively, our transcriptome analysis in KD-Rec_A375 cells suggests that Rec might function
353 as a cellular factor inhibiting the melanoma phenotype switching to the invasive state.

354

355 3.4. Rec is a suppressor of cell invasion in melanoma

356 Our $SNAI2^{low}/ZEB2^{low}/ZEB1^{high}$ phenotype, attributed to aggressive melanoma, suggested that
357 knocking down Rec, via induction of an EMT-like process, might affect the invasiveness of A375 cells.
358 Further on this line, the decreased level of MITF, and the transcriptome-wide DEGs of invasive vs.
359 proliferative melanoma markers also predicted enhanced invasiveness of KD-Rec_A375 cells. To test
360 these predictions, we performed a trans-well invasion assay to compare the invasiveness of KD-
361 Rec_A375 cells to their parental line. The results showed that all three KD-Rec_A375 lines exhibited
362 significantly elevated invasiveness (Figure 5C-D). The enhanced metastatic potential of the
363 melanoma upon Rec KD supported the idea that Rec functions as a suppressor of the EMT-like
364 transition process, which modulates the invasiveness of melanoma.

365 3.5. The KD-Rec_A375 in vitro model mimics the MITF type malignancy in patients

366 Next, we sought to examine whether some of the genes dysregulated upon Rec KD in A375 cells
367 were also differentially regulated in malignant cell types. To assess this, and to monitor the dynamics
368 of Rec-regulated genes in the progression of tumors, we performed a single comprehensive cell
369 (sc)RNA-seq analysis (n=4645) derived from melanoma patients (n=19) [78]. Congruent with the
370 original study [78], our analysis with default parameters from the 'Seurat' algorithm distinguishes
371 clusters of non-malignant and malignant cell types (Figure 6A). The five distinct malignant cell types
372 were marked by high expression levels of MAGEC2, MITF, APOE, VIM, and SPP1, respectively
373 (Figure 6A-B).

374 To see how faithfully our KD-Rec_A375 model mimics in vivo processes observed in melanoma
375 patients, we first compared the ~1500 DEGs identified between non-malignant and malignant cell
376 types (all five), to those identified in our KD-Rec_A375 experiments (Figure 7A). We found that ~200
377 genes overlapped between the two analyses in the opposite direction (Figure 7B), a significant
378 enrichment over the random expectation (p-value < 0.00001, see Methods).

379 Importantly, the expression levels of MITF, APOE, and SPP1 (but not MAGEC2, and only
380 modestly VIM) were also significantly depleted upon Rec knockdown in A375 cells, suggesting that
381 the KD-Rec_A375 might recapitulate certain aspects of the melanoma process in patients (Figure 7C-
382 D). The affected MITF, APOE (Apolipoprotein E), and SPP1 (osteopontin, cytokine) highlight
383 different aspects of melanoma progression, crosstalk of differentiation, angiogenesis [79] and
384 inflammation [80], respectively.

385 As MITF directly regulates HERV-K (via binding LTR5_Hs), we next focused on the MITF
386 malignancy sub-cluster of the scRNA-seq dataset [78] (Figure 6B). We took the top 100 MITF-
387 correlated genes and determined their expression in our Rec-KD_A375 data. This approach revealed
388 a highly significant (Wilcoxon-test, p-value < 2e16) reverse differential expression pattern between
389 MITF-type malignancy and Rec-KD_A375 (Figure 7E), indicating an anti-correlation between the
390 expression of MITF-target gene expression and Rec depletion. Thus, our KD-Rec_A375 model
391 appears to recapitulate MITF-dependent aspects of melanoma in patients.

392 4. Discussion

393 HERV-K resembles "complex" retroviruses such as HIV-1 by its ability to encode multiple
394 accessory proteins, including Rec, through alternative splicing of its Env transcript. While Env has
395 the typical structure of a transmembrane protein (e.g., extracellular, transmembrane, cytoplasmic
396 domains), Rec lacks the majority of the domains required for a membrane protein function (Figure
397 8A). Still, it carries nuclear localization/export signals [3, 7]. Although Env and Rec are utterly
398 different in sequence and function, our results suggest that Rec, like Env [39], exerts a modulatory
399 effect on the EMT-like process in cancer progression. However, while Env affects signaling via
400 ERK1/2 activation, through the cytoplasmic tail of the transmembrane Env protein [39], this domain
401 is missing from Rec (Figure 8A). Rec, the splice variant of Env, inhibits the EMT-like process by
402 affecting the expression levels of critical determinants of the EMT-like process, and certain upstream
403 regulators. Thus, the two factors appear to act in the opposite direction. While Env overexpression
404 (both RNA and protein) may promote tumor progression [39], depletion of Rec seems to result in a
405 comparable phenotype. Curiously, similar to Env, the retroviral gene product, Gag also increases the
406 tumorigenic potential of melanoma cells [38], raising the possibility that retroviral and accessory
407 genes might generally act inversely, deciding on a long-lasting debate on the potential oncogenicity
408 of a retroviral versus accessory genes of HERV-K.

409 In about 50% of melanomas, the protein kinase BRAF is mutated (BRAF^{V600E}) [84]. MITF is
410 considered as a crucial regulator of melanoma invasiveness [85], and plays a critical role in controlling
411 BRAF^{V600E} melanoma [86, 87]. Accordingly, the expression of MITF has been widely used as a marker
412 to distinguish between the proliferative and invasive types of melanoma cells [61, 85, 86, 88]. Reduced
413 MITF expression generates invasive melanomas, with tumor-initiating properties [86]. Importantly,
414 our KD-Rec_A375 in vitro system appears to recapitulate a subpopulation of melanoma cells (MITF
415 malignancy) in human patients. Our data suggest that MITF activates LTR5_Hs only in melanoma
416 (not in melanocytes), but Rec expression specifically marks the proliferative type of melanoma cells.
417 Importantly, the proliferative phase of melanoma is still a better controllable stage of melanoma
418 progression, by contrast to the invasive stage that gets frequently relapsed. If Rec expression is
419 involved in maintaining a delicate balance between cell proliferation and invasion, as this study
420 suggests, then Rec activation might be used as a sensitive marker to distinguish between the
421 proliferative vs. invasive phenotypes of melanoma, not expressed in normal melanocytes.

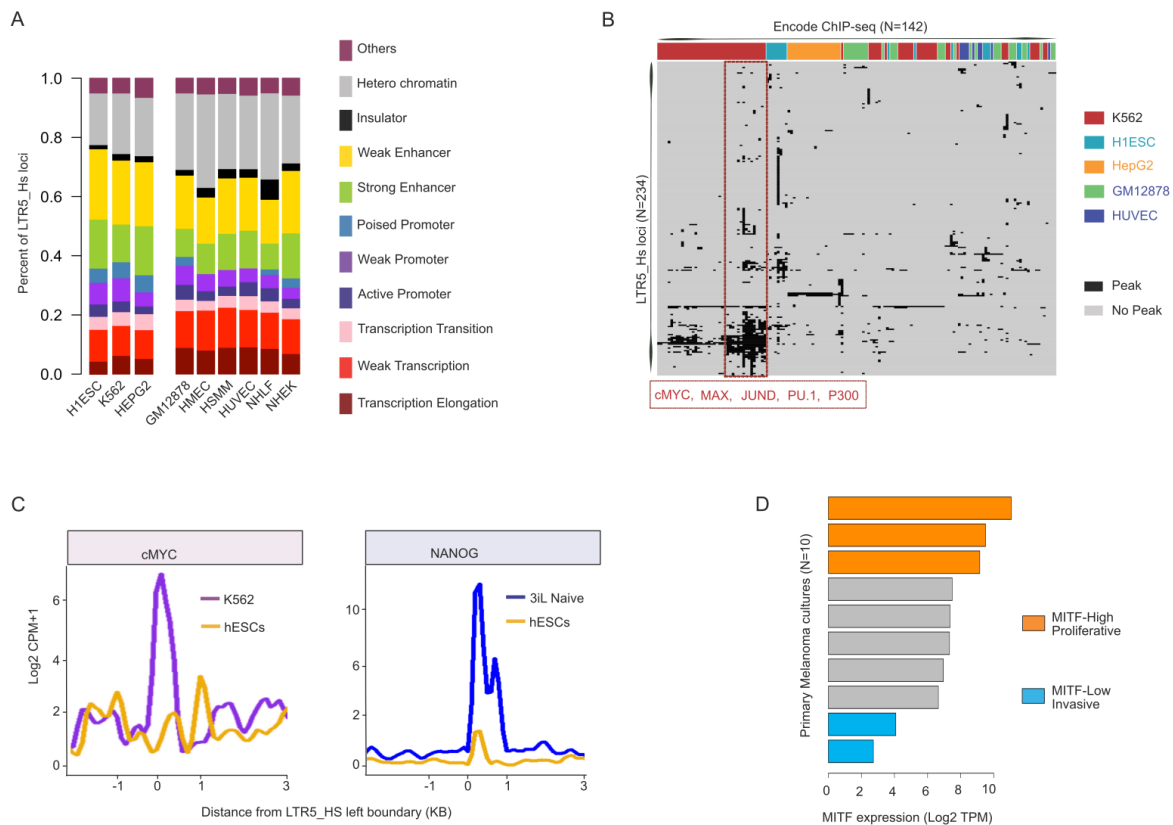
422 To control cell plasticity during melanomagenesis, the EMT-like network operates upstream of
423 MITF. In cells harboring the SNAI2^{low}/ZEB2^{low}/ZEB1^{high} phenotype, the depleted SNAI2 and ZEB2,
424 expressed in normal melanocytes and function as tumor-suppressors, would fail to activate the MITF-
425 dependent melanocyte differentiation program [34, 87]. In parallel, the upregulated ZEB1 induces an
426 invasion-associated cascade that operates in concert with downregulating MITF.

427 Our study reveals that depletion of Rec in a BRAF^{V600E} mutant melanoma cells (A375) results in
428 a decline in the MITF level. Thus, our KD-Rec_A375 cells suggest a model whereby a MITF-
429 dependent regulatory loop is disrupted through (i) decreased MITF binding to LTR5_Hs, which leads
430 to (ii) reduced Rec levels and (iii) a further decline in MITF level, contributing to (iv) escalated tumor
431 aggressiveness (Figure 8B). The observed cross-regulation between Rec and MITF reveals an
432 inhibitory effect of Rec on the invasive transformation of melanoma. Our data suggest that a high
433 level of Rec expression marks the proliferative (still controllable) state of melanoma cells, and opposes
434 the molecular switch to the invasive state. Future research is required to decipher the exact
435 mechanism of Rec control over MITF, and to test whether therapeutically induced Rec transcription,
436 similar to enhanced MITF expression (e.g., PLX4032 treatment), results in a reversion of the invasive
437 melanoma phenotype.

438 Under healthy physiological conditions, only a limited number (n=18, or often less) of HERV-K
439 loci appear to be active [13], whereas, in melanoma patients/cell lines, the number of transcribed
440 HERV-K loci is higher (n~24) [28], indicating that specific HERV-K loci are transcribed only under
441 pathologic conditions. Several loci express multiple HERV-K-derived products (both core and
442 accessory replication factors). Although forced expression of MITF-M in non-malignant cells has been
443 shown to enhance the levels of numerous HERV-K derived transcripts (e.g., Gag, Env, and Rec) [52],
444 the activated HERV-K loci might differ in both intensities of expression and the composition of their
445 HERV-K-derived transcripts. In line with this, HERV-K loci are variably activated and in various
446 combinations in melanomas [28, 89], suggesting that variability in the amounts of expressed HERV-
447 K products might contribute to melanoma heterogeneity [22, 27], and possibly the progression and
448 outcome of the disease.

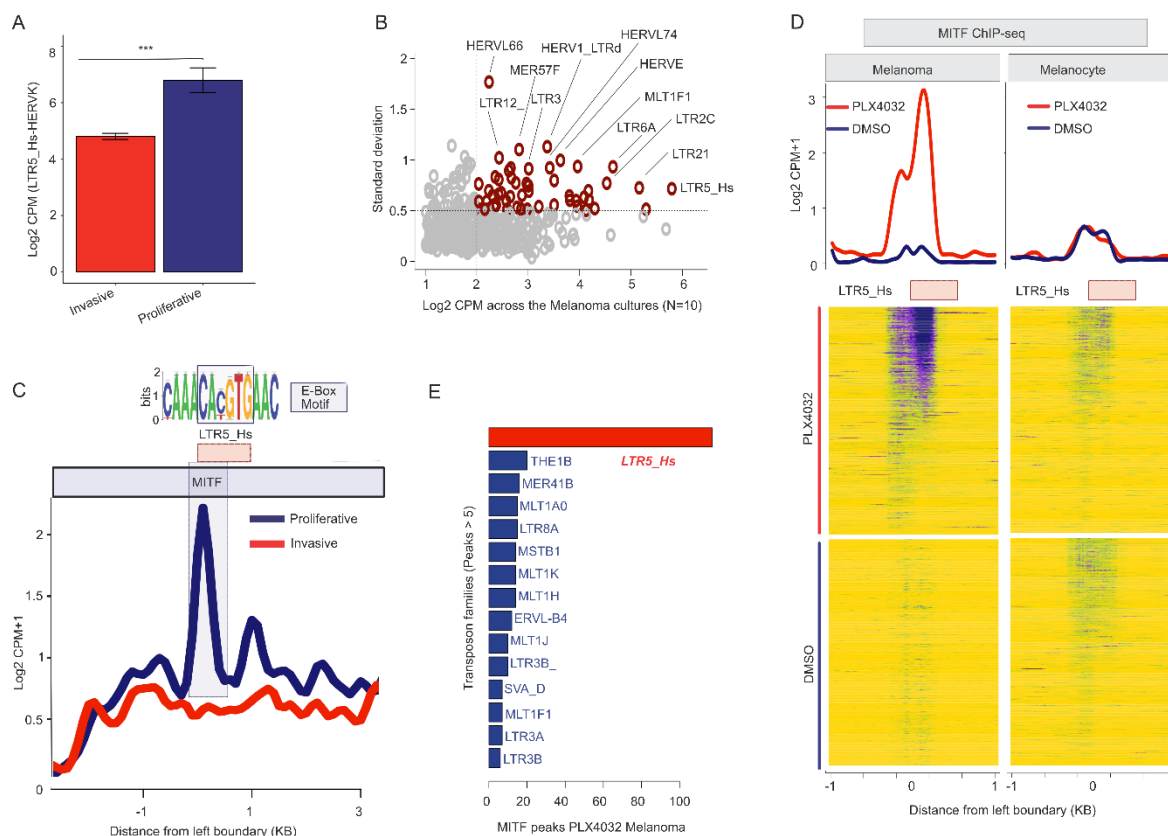
449 It has been widely discussed how precisely melanoma can be recapitulated in animal models.
450 Interestingly, our analysis of single-cell transcriptome data from multiple human patients suggests a
451 distinct separation of proliferative and invasive types of cells within a patient. In contrast, these two
452 phases co-occur within the same melanoma cell in mice [88] As Rec is hominid-specific, our study
453 also has an evolutionary perspective that might explain certain species-specific features of melanoma
454 progression in human patients, and help us to understand the limitation(s) of using animal models
455 in melanoma studies.

456 **Figure legends**



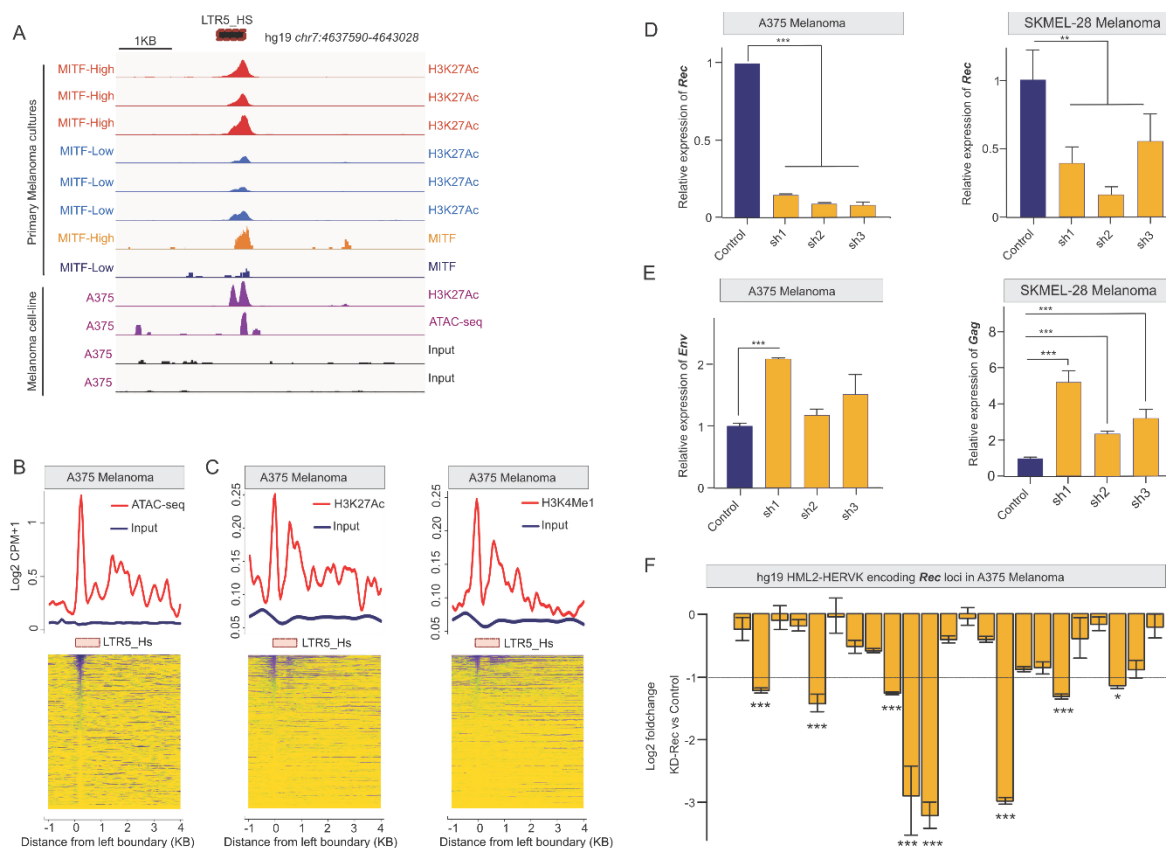
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458 **Figure 1.** (A) Stacked barplots show the chromatin state (chromHMM) of the LTR5_Hs
 459 genomic loci (human Refseq genome) across 9 cell types. (B) Heatmap summarizing the
 460 transcription factor (TF) occupancy (ChIP-seq peaks, ENCODE) over individual LTR5_Hs
 461 loci in five human cell lines. This plot includes 234 out of 615 LTR5_Hs loci annotated in the
 462 human Refseq genome, which is occupied by at least one ChIP-seq peak. Each row
 463 represents an individual locus of LTR5_Hs. Each column shows TF ChIP-seq peak
 464 occupancy of a different cell line. Grey denotes the absence, whereas black is the presence
 465 of peaks in a given locus. Various TFs encompassing LTR5_Hs loci are manually annotated
 466 in a given cell line. The cluster of TFs binding over a subset of LTR5_Hs loci is shown in the
 467 red box. C. Line plots showing the distribution of normalized ChIP-seq tag counts of cMYC
 468 and NANOG in K562 and naive ESCs, respectively. The ChIP-seq tag counts are calculated
 469 relative to primed H1_ESCs, in a 3kb genomic window at the left boundaries of LTR5_Hs.
 470 (D) Characterizing primary melanoma cultures according to their MITF expression levels.
 471 Barplot is showing the level of MITF expression (Log2 TPM) in primary melanoma cultures
 472 (n=10). According to their MITF expression level, cultures are defined as proliferative
 473 melanoma (MITF-High) and invasive melanoma (MITF-Low) in vitro models.



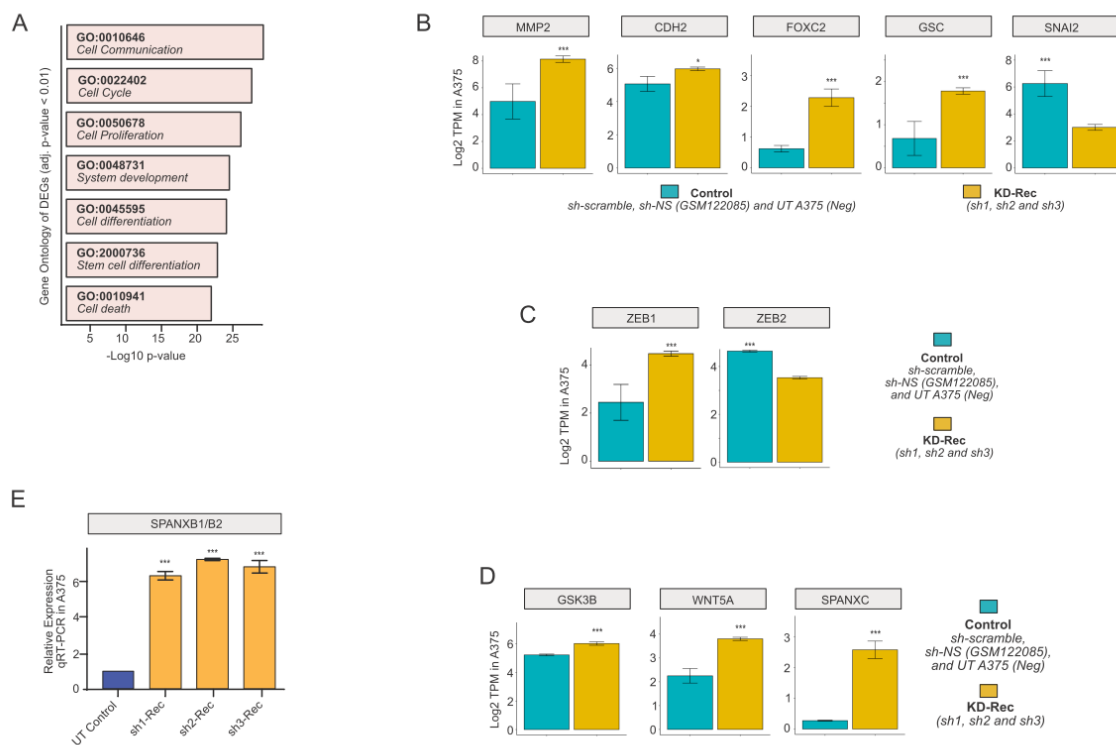
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475 **Figure 2.** (A) Barplot is showing the LTR5_Hs/HERV-K-int expression (Log₂ CPM) levels
 476 in proliferative melanoma (MITF-High) and invasive melanoma (MITF-Low) cell lines
 477 (GSE60664). (B) A Scatter plot visualizes the average expression (Log₂ CPM) (X-axis) and
 478 standard deviation from the mean (Y-axis) of transposable element (TE) families in various
 479 primary melanoma cultures (n=10). (C) Line plot showing the MITF ChIP-seq signal
 480 occupancy in proliferative melanoma (MITF-High) and invasive melanoma (MITF-Low)
 481 cell lines averaged over all of the LTR5_Hs loci. The identified E-Box motif in MITF bound
 482 LTR5_Hs in A375 cells is shown. Note that the E-box motif was found using the sequences
 483 of LTR5_Hs loci with MITF peaks. (D) The effect of PLX4032 treatment on MITF binding at
 484 LTR5_Hs loci. Upper panel: Line plot showing the MITF ChIP-seq signal averaged over
 485 LTR5_Hs loci in primary melanocytes and melanoma cells with and without the treatment
 486 of PLX4032. Lower panel: Heatmap of MITF ChIP-seq signals. Note: MITF occupies
 487 LTR5_Hs genomic loci upon PLX4032 treatment, specifically in melanoma, but not in
 488 melanocytes (over 100 loci). (E) Barplot is showing the number of MITF peaks detected over
 489 the genomic loci of various TE families in melanoma cells treated with PLX4032. This plot
 490 indicates only those families which have at least 5 peaks over the individual locus.



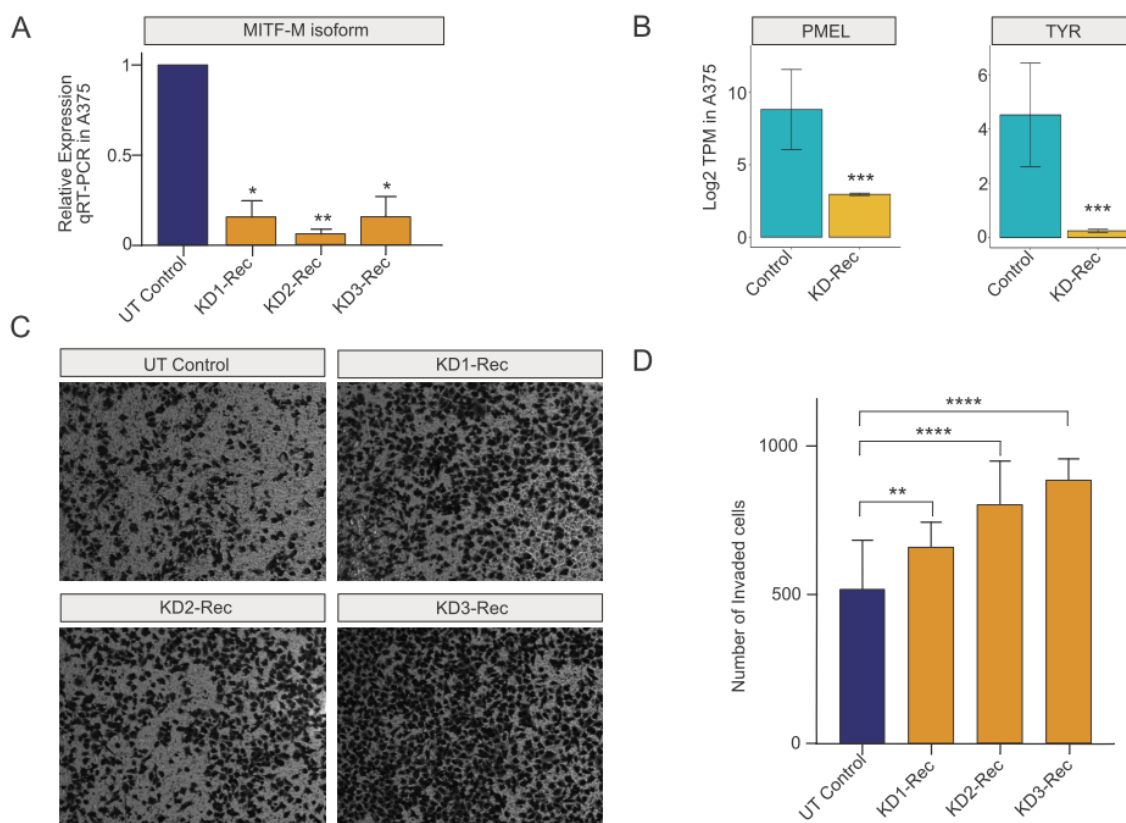
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492 **Figure 3.** (A) Genome browser tracks showing the H3K27Ac, ATAC-seq, and MITF signals
 493 at a specific LTR5_Hs-HERVK locus (ERV6, known to produce Rec) in MITF-High
 494 primary melanoma cultures and A375 cell line (proliferative) and MITF-low (invasive)
 495 melanoma primary cultures. (B) Normalized ATAC-seq (nucleosome-associated) signal
 496 averaged at LTR5_Hs genomic loci in A375 cells. (C) Normalized ChIP-seq signal of
 497 H3K4Me1 and H3K27Ac histone marks (corresponding to active chromatin states)
 498 averaged over LTR5_Hs genomic loci in A375 cells. (D) Knocking down (KD) Rec in A375
 499 and SKMEL-28 cells using RNA interference. Stable KD lines were selected in two-rounds
 500 by FACS sorting for the GFP-reporter signal. Barplots are showing the normalized RT-
 501 qPCR quantification of Rec mRNA levels with three KD-Rec constructs. (E) Knocking down
 502 Rec affects the transcription of alternative HERV-K products. Barplot is showing the effect
 503 of knocking down Rec (KD-Rec) on the expression of alternative HERVK products,
 504 determined by real-time qPCR. Note: KD-Rec led to an increased level of Gag in SKMel-28
 505 (all the three biological replicates), whereas Env in A375 (KD1 only). (F) Knocking down
 506 Rec in A375 affects at least seven genomic HERV-K loci. Combined barplots showing the
 507 specificity of the RNAi strategy against the Rec subunit. Relative quantification of HERV-K
 508 Rec genomic loci compared with negative and scrambled controls indicates that all three
 509 KD constructs significantly affected at least 7 Rec expressing loci in A375 cells.



510

511 **Figure 4.** (A) Barplots of significant Gene Ontology (GO) Biological Process terms
512 enrichment analysis of DEGs in KD-Rec_A375. Values are negative logarithms of the
513 corrected p-values (Benjamini Hochberg FDR). (B) Barplots representing means ± SEM from
514 RNA-seq expression values (Log₂ TPM) for selected DEGs in KD-Rec_A375 (e.g., Matrix
515 metalloproteinase 2 (MMP2), a classical marker of invasion; N-Cadherin (CDH2), Zinc
516 finger protein SNAI2 (SNAI2), Forkhead box C2 (FOXC2) and Goosecoid Homeobox (GSC)
517 are among the vital gene regulators of the canonical EMT transition. (C) Barplots
518 representing means ± SEM from RNA-seq expression values (Log₂ TPM) for DEGs in KD-
519 Rec_A375 vs. control, involved in the EMT-like process in melanoma [34] (e.g., SNAI2,
520 ZEB2, and ZEB1). (D) Barplots representing means ± SEM from RNA-seq expression values
521 (Log₂ TPM) for selected DEGs in KD-Rec_A375 vs. control, known as inducers of the EMT-
522 like process (e.g., WNT5A and GSK3B) and SPANXC (sperm protein associated with the
523 nucleus in the X chromosome). (E) Barplots are showing the effect of knocking down Rec
524 in A375 vs. control on SPANXB1/B2 genes, detected as DEG in RNA-seq experiments, and
525 validated using real-time qPCR.



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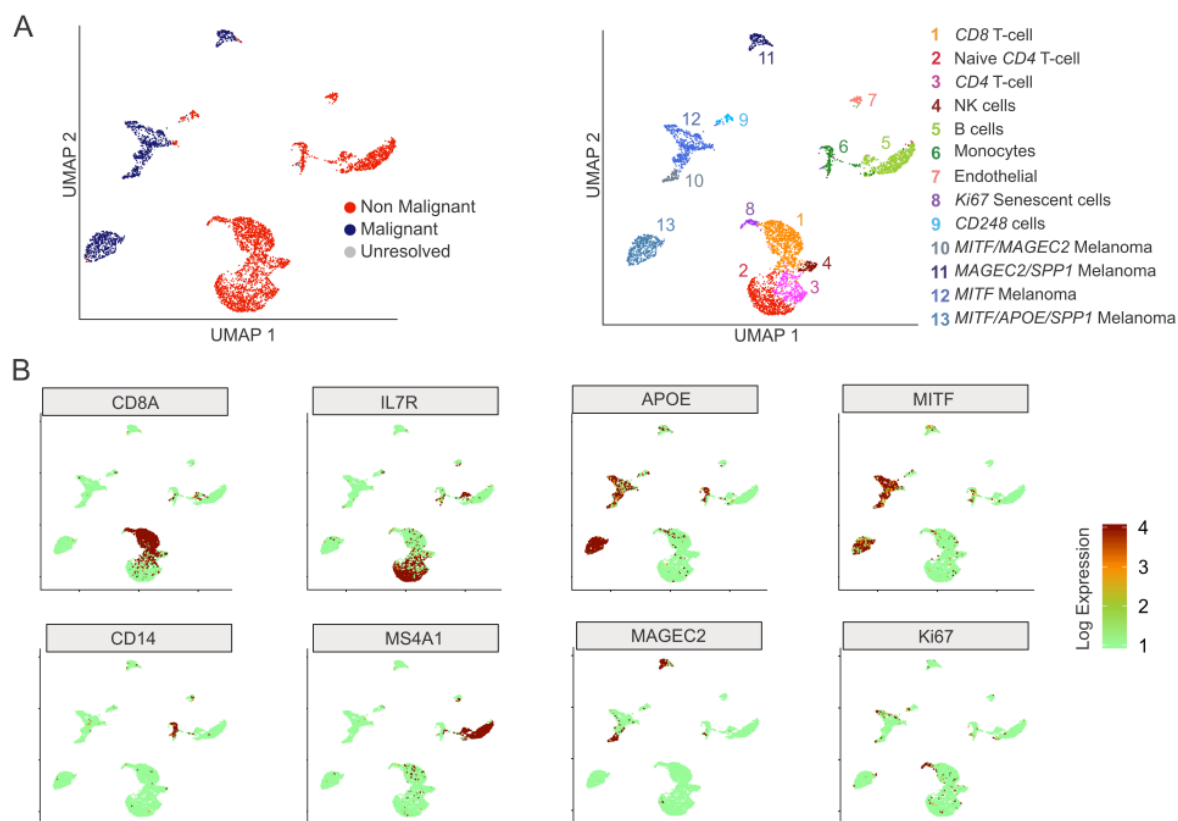
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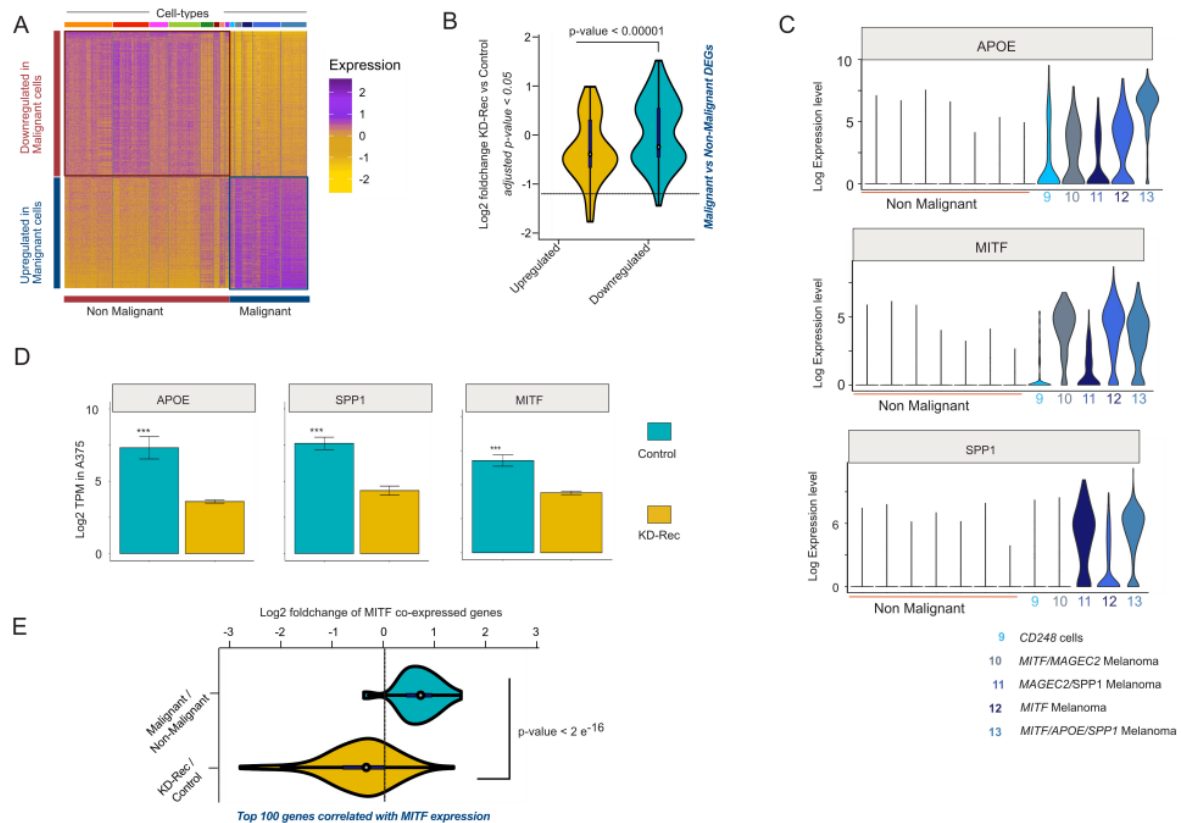
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Figure 5. (A) Quantifications transcriptional variation of MITF-M by KD-Rec in A375 cells using RNA-seq and by real-time qPCR. (B) Barplot representing means \pm SEM from RNA-seq expression values (Log2 TPM) for melanocyte markers (e.g., TYR and PMEL) upon Rec-KD in A375. (C) Representative inverted light microscope images of trans-well invasion assay performed in A375 melanoma cells upon knocking-down Rec by three KD constructs (KD1-3). UT, untransfected control. Scale bars, 400 μ m. (D) Quantification of cells invading in the trans-well invasion assay (C). ImageJ counted the number of invaded cells. Columns indicate the average number of invaded cells per field from two independent experiments. Error bars represent the means \pm s.d. of two independent experiments. Mann Whitney test; ** $P \leq 0.01$, **** $p \leq 0.0001$ (See methods for details).



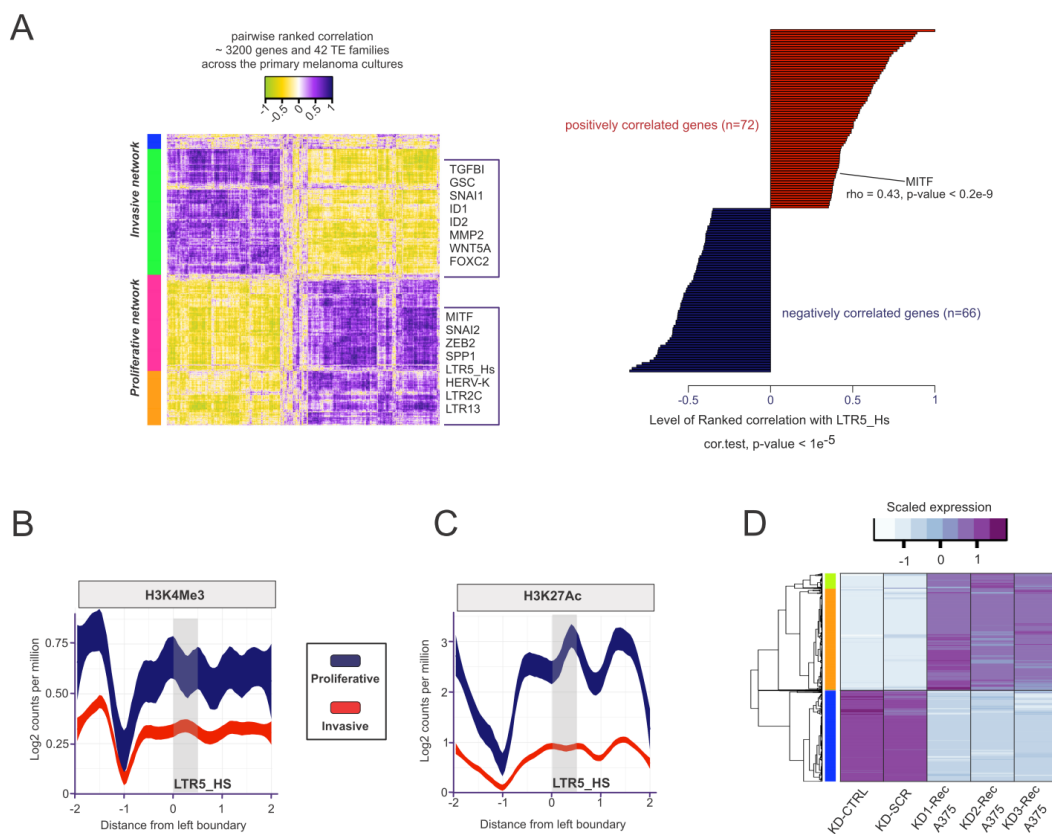
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538 **Figure 6.** (A) Various plots with a maximum of thirteen distinct clusters are visualized on
539 UMAP coordinates using 10XGenomics scRNA-seq [78] and their original annotations. The
540 left panel shows the Malignant and Non-Malignant cell populations, whereas the right
541 panel is displaying all the clusters obtained that were classified using their original
542 annotations. (B) Feature plots based on the UMAP plot shown on (A) visualizing the
543 expression of selected markers used to identify the distinct cell-types in the melanoma
544 population. The color intensity gradient indicates the expression of the depicted marker
545 gene. Each dot represents an individual cell. Dots in green denote lower, whereas in dark
546 red, a higher level of gene expression in a given single cell. This resulted in five distinct
547 malignant cell types, marked by MAGEC2, MITF, APOE, and Ki67, respectively (See [Fig.](#)
548 [7A](#) for SPP1 expression).



549

550 **Figure 7.** (A) Heatmap visualization of scaled expression [log TPM (transcripts per million)]
 551 values of a distinctive set of ~ 1500 genes (log₂ fold change > one and > 50% of cells
 552 expressing either in healthy or malignant cells), which are differentially expressed in
 553 scRNA-seq data. Colour scheme is based on Z-score distribution from -2.5 (gold) to 2.5
 554 (purple). Left margin color bars highlight representative gene sets specific to the respective
 555 clusters. (B) The Violin plot visualizes the density and distribution of expression (Log₂ TPM
 556 values) of ~ 200 DEGs upon Rec-KD in A375 cells, which are common in the set of genes
 557 shown in the figure above (C). (p-value calculated by Wilcoxon test). (C) Violin plots
 558 visualize the density and distribution of expression of distinct marker genes for malignant
 559 melanoma clusters. (D) Barplots with +/- SEM show the down-regulation of MITF, SPP1,
 560 and APOE upon knockdown of Rec in A375 cells. (E) Violin plot showing the comparison
 561 of previously identified gene set as "MITF-high," consisting of MITF itself and the top 100
 562 genes correlated with MITF expression between malignant and non-malignant cells (blue)
 563 and upon Rec-KD in A375 by individual shRNA constructs (gold). (p-value calculated by
 564 Wilcoxon test).



576

577 **Figure S1.** (A) (Left panel) Ranked correlation matrix of genes and 42 transposable elements
578 (TE) families, which are differentially expressed between proliferative and invasive
579 primary melanoma cultures. Genes and TE families are manually annotated. Color codes
580 on the left side represent the unsupervised clusters of most variable genes and TEs across
581 the samples. On the right panel, selected genes are listed that are positively or negatively
582 correlated with LTR5_Hs expression across the melanoma primary cultures. (B)
583 Distribution of ChIP-seq signal of the H3K4Me3 histone mark occupancy, corresponding to
584 active promoters averaged over LTR5_Hs loci in MITF-High (proliferative) vs. MITF-Low
585 (invasive) state of primary melanoma cultures. (C) Distribution of ChIP-seq signal of the
586 H3K27Ac histone mark occupancy (lower panel) averaged over LTR5_Hs loci in MITF-
587 High (proliferative) vs. MITF-Low (invasive) state of primary melanoma cultures. (D)
588 Heatmap displays the DEGs upon KD-Rec in A375 cells.

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591 visualization, A.K.; supervision, Z.I. All authors have read and agreed to the published version of the
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