

1 **Disturbed mitochondrial dynamics in CD8⁺ TIL reinforce T cell exhaustion**

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37 **Abstract**

38 The metabolic challenges present in tumors attenuate the metabolic fitness and anti-tumor activity of
39 tumor-infiltrating T lymphocytes (TILs). However, it remains unclear whether persistent metabolic
40 insufficiency can imprint permanent T cell dysfunction. We found that TILs accumulated depolarized
41 mitochondria as a result of decreased mitophagy activity and displayed functional, transcriptomic and
42 epigenetic characteristics of terminally exhausted T cells. Mechanistically, reduced mitochondrial fitness
43 in TILs was induced by the coordination of T cell receptor stimulation, microenvironmental stressors and
44 PD-1 signaling. Enforced accumulation of depolarized mitochondria with pharmacological inhibitors
45 induced epigenetic reprogramming toward terminal exhaustion, indicating that mitochondrial deregulation
46 was causal of T cell exhaustion. Furthermore, supplementation with nicotinamide riboside enhanced T
47 cell mitochondrial fitness and improved responsiveness to anti-PD-1 treatment. Together, our results
48 reveal new insights on how mitochondrial dynamics and quality orchestrate T cell anti-tumor responses
49 and commitment to the exhaustion program.

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78 **Introduction**

79 Cancer immunotherapy elicits remarkable therapeutic outcomes in cancer patients and has become a
80 paradigm-shifting arsenal for cancer treatment. However, the tumor microenvironment (TME) imposes
81 various regulations to hamper the anti-tumor immunity of infiltrating immune cells^{1, 2}. Among these
82 microenvironmental regulations, metabolic restriction has been shown to suppress TIL anti-tumor
83 responses by interfering with transcriptional and translational regulations^{3, 4}. However, it remains
84 unexplored how TILs adjust their metabolic programs to cope with sustained metabolic challenges
85 imposed by the TME, and whether the inability to engage proper metabolic adaptation reinforces
86 persistent T cell dysfunction as a result of sustained metabolic insufficiency.

87 Mitochondrial dynamics, including mitochondria trafficking and remodeling of mitochondrial
88 architecture, mass and activity, are important drivers for sustaining metabolic fitness in response to
89 metabolic perturbations. During nutrient deprivation, increased mitochondrial fusion and biogenesis allow
90 cells to support metabolic demands⁵. However, damaged mitochondria accumulating during this process
91 must be cleaned up by mitophagy. The inability to operate mitophagy results in increased mitochondrial
92 mass associated with reduced mitochondrial membrane potential, a mitochondrial phenotype observed in
93 aged cells^{6, 7}. Accumulation of damaged mitochondria further reprogram epigenome and transcriptome
94 via altered retrograde signals that are controlled by metabolites generated from mitochondria and prevent
95 mitochondrial biogenesis^{8, 9}. Recently, mitochondrial dynamics have been suggested to modulate
96 generation of memory CD8⁺ T cells^{10, 11} and decreased mitochondrial biogenesis and robust mitochondrial
97 ROS production could promote T cell dysfunction in chronic viral infection and tumors^{12, 13, 14}. These
98 studies underscore the importance of mitochondrial function to tailoring T cell immune responses.

99 Prolonged exposure to antigens induces T cell exhaustion, a special differentiation state
100 characterized by increased expression of co-inhibitory receptors and declined proliferative capacity and
101 production of type I immune cytokines, in tumors and chronic viral infection^{15, 16, 17}. T cells with severe
102 exhausted features, referred as terminally exhausted T cells, sustain exhausted characteristics even after
103 antigen withdrawal^{18, 19} and are refractory to anti-PD-1 (programmed cell death protein 1) treatment^{6, 20}.
104 Terminally exhausted T cells have specialized DNA methylation pattern and chromatin architecture that
105 may lock T cells in a permanently dysfunctional state^{21, 22, 23}. Interestingly, a subset of CD8⁺ T cells
106 expressing the transcription factor T-cell factor 1 (TCF1) display distinct transcriptomic and epigenetic
107 landscapes compared to exhausted T cells^{24, 25}, and their stem-like phenotype contributes to a proliferative
108 burst upon PD-1 blockade treatment in tumors and chronic viral infection^{26, 27, 28, 29}. These findings
109 suggest that TILs may undergo distinct epigenetic reprogramming that dictates the severity of exhaustion
110 and stem-like features. However, the underlying triggers of distinct epigenetic reprogramming in TILs
111 remain unknown.

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113 **Results**

114 **Tumor-infiltrating CD8⁺ T cells accumulate dysfunctional mitochondria**

115 To investigate whether CD8⁺ T cells adjust mitochondrial dynamics and activity to counteract metabolic
116 stresses in the TME, we examined mitochondrial mass and membrane potential in activated CD8⁺ T cells
117 from spleens, draining lymph nodes (dLNs) and tumors from melanoma-engrafted mice by staining with
118 MitoTracker Green (MG) and MitoTracker Deep Red (MDR), respectively. CD8⁺ TILs increased
119 mitochondrial mass and membrane potential compared to T cells in spleens and dLNs, as reported in
120 human renal cell carcinomas (**Fig. 1a,b**)¹⁴. We also observed similar mitochondrial features in the
121 genetically engineered murine melanoma model (referred as Braf/Pten mice) (**Extended Data Fig. 1a-**
122 **c**)³⁰. However, the ratio of MDR to MG, an indication of mitochondrial activity per mitochondrial mass³¹,
123 was decreased in TILs, suggesting that TILs might fail to fully utilize mitochondrial activity (**Figure 1c**
124 and **Extended Data Figure 1d**). Despite electron microscopy confirmed that TILs possessed more
125 mitochondria compared to splenic T cells, we found that TILs contained lower copy numbers of
126 mitochondrial DNA (mtDNA) (**Figure 1d-f**), suggesting that mitochondrial quality in TILs might be
127 compromised. Importantly, mitochondria in TILs exhibited damaged phenotypes, including disrupted
128 membrane structures, cristae structure, and declined cristae number and length of crista per
129 mitochondrion (**Figure 1g-i**), implying that TILs contain poor quality mitochondria. Moreover, we found
130 that mitochondria in TILs displayed a physically close ultrastructure with reduced crista volume in a 3D-
131 reconstructed electron microscopy analysis (**Figure 1j-l**), indicating that mitochondria may undergo
132 certain dynamic changes to compensate for their insufficiency of mitochondrial activity. We also found
133 that mitochondria-associated membrane (MAM), which can be induced by mitochondrial stress signal³²,
134 was increased in TILs (**Figure 1m**). Mitochondrial reactive oxygen species (mtROS) was elevated in
135 TILs, whereas intracellular ROS remained similar between T cells from spleens and tumors (**Figure 1n-o**
136 and **Extended Data Figure 1e**). Collectively, these data reveal that CD8⁺ T cells are prone to
137 accumulating mitochondria with compromised mitochondrial membrane potentials in the TME.

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139 **Mitophagy defect forces accumulation of depolarized mitochondria**

140 Intriguingly, we found that CD8⁺ TILs contained two major subsets with distinct mitochondrial
141 morphology: one subset had relatively normal mitochondrial morphology accompanied by
142 autophagosome-like vesicles in the cytoplasm, whereas the other subset of TILs possessed disrupted
143 cristae (**Extended Data Figure 2a**). This heterogeneity in CD8⁺ TILs was also observed by examining
144 the ratio of MDR to MG. CD8⁺ T cells displayed higher MG staining, but lower MDR signal (referred as
145 MDR/MG^{lo}) was increased in tumors compared to T cells from spleens and dLNs of tumor-bearing mice

146 **(Figure 2a and Extended Data Figure 2b)**. By examining CD8⁺ T cells in peripheral blood mononuclear
147 cells (PBMCs) and tumor infiltrated lymph nodes (TILNs) from melanoma patients, we confirmed that
148 CD8⁺ TILs from the majority of patients contained more of the MDR/MG^{lo} population **(Figure 2b)**. To
149 further examine whether MDR/MG^{lo} cells can be seen in tumor-specific CD8⁺ T cells, we transferred OT-
150 I T cells (ovalbumin-specific TCR transgenic T cells) into mice engrafted with YUMM1.7 melanoma
151 cells overexpressing ovalbumin (YUMM1.7-OVA) and found that a higher fraction of MDR/MG^{lo} OT-I
152 TILs compared to splenic OT-I cells **(Extended Data Figure 2c)**. To scrutinize the mitochondrial
153 phenotypes in MDR/MG^{hi} and MDR/MG^{lo} populations, we examined mitochondrial ultrastructure of
154 MDR/MG^{hi} and MDR/MG^{lo} TILs and found that mitochondria in MDR/MG^{lo} TILs were disrupted with
155 fewer crista and decreased cristae length **(Figure 2c-e)**. We further found that MDR/MG^{lo} TILs displayed
156 higher MG signals, but contained less mtDNA and produced higher level of mtROS **(Figure 2f-h)**,
157 suggesting that the mitochondria accumulating in MDR/MG^{lo} TILs are depolarized and dysfunctional. To
158 investigate whether mitochondria in MDR/MG^{lo} TILs are functionally impaired, we treated cells with
159 oligomycin to inhibit electron transport chain (ETC) complex V, which can result in a lower increase in
160 mitochondrial membrane potential when the respiratory chain of mitochondria is ceased³³. Our results
161 showed that the MDR/MG^{lo} population had a lower fold change in mitochondrial membrane potential
162 upon oligomycin treatment **(Extended Data Figure 2d)**, suggesting that MDR/MG^{lo} TILs contain
163 depolarized mitochondria that exhibit reduced respiratory activity.

164 Since mitophagy is a critical cellular function for mitochondrial quality control and cells with
165 impaired mitophagy activity have been shown to accumulate depolarized mitochondria³⁴, we then
166 postulated that CD8⁺ TILs may have impaired mitophagy activity that impinges on the clearance of
167 damaged mitochondria. We generated an OT-I mouse strain stably expressing MitoQC reporter, which
168 enables visualization of mitophagy with a tandem mCherry-GFP-tagged FIS1 reporter³⁵, to illuminate
169 mitophagy *in vivo* by measuring GFP/mCherry fluorescence ratios. We found that OT-I TILs exhibited
170 lower mitophagy activity compared to splenic OT-I cells **(Figure 2i-j)**. Since mitophagy is a selective
171 autophagy, we then examined whether autophagy was also compromised by exploiting an autophagy
172 reporter system³⁶ and found OT-I TILs exhibited reduced autophagy events **(Figure 2k-l)**. To confirm the
173 contribution of a mitophagy defect to the development of the depolarization phenotype, we conditionally
174 ablated the expression of *Park2*, a gene encoding Parkin for controlling mitophagy³⁴, in P14 cells (gp33-
175 specific TCR transgenic T cells) (referred as *Park2*^{cko}) and examined mitochondrial phenotypes in
176 transferred cells. Our result showed that *Park2*-deficient P14 TILs acquired mitochondrial depolarization
177 faster and a more severe depolarization phenotype compared to wild-type P14 TILs **(Figure 2m)**,
178 suggesting that disruption of mitophagy machinery further enhances the mitochondrial depolarization
179 phenotype in CD8⁺ TILs.

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181 **CD8⁺ TILs with depolarized mitochondria are terminally exhausted**

182 Emerging evidence has revealed that T cells with mitochondrial abnormalities display impaired effector
183 functions^{13, 14, 37}. However, it remains unknown whether reduced mitochondrial fitness in CD8⁺ TILs
184 imprints permanent T cell dysfunction. We found that MDR/MG^{lo} TILs expressed higher levels of PD-1
185 and decreased T-bet expression (**Figure 3a-b**), suggesting that TILs accumulating depolarized
186 mitochondria may lose effector function. Indeed, MDR/MG^{lo} TILs produce less interferon- γ (IFN- γ) and
187 tumor necrosis factor (TNF) compared to the MDR/MG^{hi} population. Surprisingly, IL-2/IL-15 exposure
188 boosted the production of IFN- γ and TNF in MDR/MG^{hi} TILs, but not in MDR/MG^{lo} TILs (**Figure 3c-d**).
189 Since IL-15 treatment has been shown to restore effector function in partially exhausted, but not
190 terminally exhausted, CD8⁺ T cells^{21, 38}, our results suggest that MDR/MG^{lo} TILs might be terminally
191 exhausted. By examining the transcriptomic differences, we found that MDR/MG^{hi} TILs had higher
192 expression of genes associating with memory and effector T cells; however, MDR/MG^{lo} TILs up-
193 regulated gene hits linking with IFN- γ signature and high PD-1 expression (**Figure 3e**). Gene-set-
194 enrichment analysis (GSEA) confirmed that MDR/MG^{lo} TILs were enriched in gene signatures of
195 exhausted CD8⁺ T cells (**Figure 3f**). In support of down-regulated expression of TCF1-regulated genes in
196 memory T cells^{29, 39} in MDR/MG^{lo} TILs, we found that MDR/MG^{lo} TILs expressed lower levels of TCF1
197 compared to MDR/MG^{hi} population (**Figure 3g**). We next investigated whether MDR/MG^{lo} TILs display
198 characteristics of terminally exhausted T cells by transferring splenic OT-I cells and MDR/MG^{hi} and
199 MDR/MG^{lo} OT-I TILs isolated from melanoma-bearing mice into naïve C57BL/6 mice, followed by
200 infection with *Listeria monocytogenes* expressing OVA peptide (*Lm*-OVA). In this setting, CD8⁺ T cells
201 committing to terminal exhaustion will undergo less population re-expansion and the expanded
202 population will inherit exhausted features, including sustained expression of exhaustion markers and
203 compromised production of effector cytokines, upon *Lm*-OVA infection^{18, 19}. We found that MDR/MG^{lo}
204 TILs underwent less population expansion compared to MDR/MG^{hi} TILs and splenic OT-I cells (**Figure**
205 **3h**). Moreover, OT-I cells re-expanded from MDR/MG^{lo} TILs expressed higher amounts of PD-1 and
206 LAG-3, but produced less IFN- γ (**Figure 3i-k**), indicating that the exhaustion characteristics of
207 MDR/MG^{lo} TILs are permanent. Taken together, our data reveal that accumulation of depolarized
208 mitochondria in CD8⁺ TILs propels T cells towards terminal exhaustion and locks them in a permanent
209 dysfunctional state.

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211 **Depolarized mitochondria link with exhaustion epigenetic programs**

212 Terminally exhausted CD8⁺ T cells have been shown to exhibit distinct epigenetic landscapes, including
213 chromatin accessibility and DNA methylation patterns, from effector CD8⁺ T cells^{6, 20, 21, 22}. Therefore, we

214 investigated whether TILs accumulating depolarized mitochondria display alterations of epigenetic
215 landscapes. By examining chromatin accessibility with the Assay for Transposase-Accessible Chromatin
216 sequencing (ATAC-seq), we identified that 709 genomic regions characterized by higher chromatin
217 accessibility in MDR/MG^{hi} TILs, whereas 2564 regions had increased chromatin accessibility in
218 MDR/MG^{lo} TILs (**Figure 4a**). The regions that were more accessible in MDR/MG^{hi} TILs were mostly
219 located in the intronic regions and downstream of gene promoters, whereas most of the differentially
220 accessible loci in MDR/MG^{lo} TILs were located in the upstream regions and 5' UTR, which contain most
221 of the regulatory elements (**Figure 4b**). Interestingly, the differentially accessible peaks in MDR/MG^{lo}
222 TILs were enriched in gene signatures of exhausted CD8⁺ T cells (**Figure 4c**), indicating that MDR/MG^{lo}
223 TILs are more exhausted and less memory-like compared to MDR/MG^{hi} TILs. Ontology analyses of the
224 impacted genomic loci more accessible in MDR/MG^{hi} TILs showed significant enrichment of cellular
225 programs involved in PDGFR- β signaling and β -catenin-mediated signaling, but MDR/MG^{lo} TILs
226 exhibited more accessible gene loci coupled to the SMAD2/3 signaling, IFN- γ pathway and p53 signaling
227 pathway, which has been reported to be associated with T cell exhaustion in HCV-specific T cells⁴⁰
228 (**Figure 4d-e**). We next found that the regions more accessible in MDR/MG^{lo} TILs showed enrichment in
229 the consensus binding motifs of YY1 and ER-stress-responding TF motifs, which have been shown to
230 participate T cell exhaustion^{41, 42} (**Figure 4f**). Intriguingly, binding motifs for transcription factors
231 involved in memory T cell-related functions, including Foxo1 and Runx, were enriched in the genomic
232 regions differentially open in MDR/MG^{hi} TILs. We also observed that chromatin peaks in both *Tcf7* and
233 *Lef1* locus were less accessible in MDR/MG^{lo} CD8⁺ TILs (**Figure 4g**), suggesting that the TILs
234 accumulating depolarized mitochondria lost TCF1 expression and downstream signaling. Of note, a more
235 accessible peak was observed in *Hif1a* locus in MDR/MG^{lo} TILs, suggesting that CD8⁺ TILs with
236 depolarized mitochondria may endure hypoxic stress.

237 Furthermore, we performed whole genome bisulfite sequencing (WGBS) analysis and identified
238 differentially methylated CpG dinucleotides in MDR/MG^{lo} TILs compared to MDR/MG^{hi} population, and
239 vice versa. The distributions of differentially methylated CpG dinucleotides within gene loci were similar
240 between these two populations; however, more robust differences can be seen in CpG island and promoter
241 regions (**Extended Data Figure 3a-c**). Since methylations in CpG islands and promoter regions are
242 tightly linked to the repressive regulation of transcription^{22, 43}, we focused on differentially methylated
243 CpG islands and promoters for the following analyses. Ontology analyses of the impacted genes
244 hypomethylated in the promoter regions of MDR/MG^{hi} TILs also showed significant enrichment in β -
245 catenin-mediated signaling, but hypomethylated regions in MDR/MG^{lo} TILs were enriched in genes
246 coupled to the p53 signaling pathway and DNA repairing signaling (**Extended Data Figure 3d-e**). Motif
247 enrichment analysis revealed that the hypomethylated regions in MDR/MG^{hi} CD8⁺ TILs were enriched in

248 consensus binding motifs for transcription factors associated with T cell activation and memory T cell
249 formation (**Extended Data Figure 3f**). Collectively, our findings reveal that MDR/MG^{lo} CD8⁺ TILs
250 display epigenetic features, including chromatin accessibility and DNA methylation, that have been
251 reported to associate with terminal exhaustion.

252

253 **TCR and PD-1 signals drive accumulation of depolarized mitochondria**

254 We observed that TILs from more advanced tumor stages had a higher percentage harboring depolarized
255 mitochondria (**Figure 5a**), suggesting that mitochondrial activity in TILs decline in a tumor progression-
256 dependent manner. Next, we engrafted YUMM1.7 melanoma cells overexpressing either ovalbumin
257 (YUMM1.7-OVA) or glycoprotein 33 of lymphocytic choriomeningitis virus (YUMM1.7-gp33) in
258 different flanks of wild type mice. Then, we adoptively transferred both OT-I and P14 CD8⁺ T cells into
259 tumor-bearing mice to examine mitochondrial fitness of the transferred T cells, a setting allowing us to
260 determine whether the ability to recognize tumor antigens contributes to mitochondrial dysfunction in
261 CD8⁺ TILs. Our results showed that more OT-I cells infiltrating YUMM1.7-OVA tumors contained
262 depolarized mitochondria compared to P14 cells in the same tumors. In contrast, a higher fraction of P14
263 cells displayed mitochondrial dysfunction in YUMM1.7-gp33 tumors (**Figure 5b-c**); however, transferred
264 cells in both spleen and dLNs displayed similar mitochondrial fitness (**Extended Data Figure 4a**).
265 Together, these results suggest that TCR stimulation in the TME suppresses mitochondrial fitness in
266 TILs. We then speculated that TCR affinity to antigen might stimulate the formation of TILs with a
267 depolarized mitochondrial phenotype. We took advantage of OT-3 TCR transgenic mice, in which CD8⁺
268 T cells express TCR recognizing the OVA peptide-MHCI complex (pMHCI) with a 50-fold weaker
269 affinity as compared to OT-I cells⁴⁴. We co-transferred OT-I and OT-3 T cells into YUMM1.7-OVA
270 tumor-bearing mice and then examined their mitochondrial fitness. A higher percentage of OT-I TILs
271 harbored depolarized mitochondria compared to OT-3 TILs in the same tumor (**Figure 5d**), but OT-I and
272 OT-3 cells in spleens and dLNs displayed comparable mitochondrial fitness (**Extended Data Figure 4b**),
273 indicating that a higher affinity of TCR:pMHCI interaction facilitates mitochondrial dysfunction in TILs.
274 We also found that human TILs with a depolarized mitochondrial phenotype had higher clonality of the
275 TCR beta chain (**Figure 5e**). Since human TILs displaying a more restricted TCR repertoire (high TCR
276 clonality), which implies a better ability to recognize tumor antigens, exhibited more severe exhaustion⁴⁵,
277 these results suggested that TILs with better ability to recognize tumor antigens tend to accumulate
278 depolarized mitochondria, supporting commitment to T cell exhaustion. We next examined whether PD-1
279 expression, a co-inhibitory receptor that has been shown to support T exhaustion and metabolic
280 insufficiency^{12, 46}, could stimulate formation of TILs with depolarized mitochondria. We co-transferred
281 wild-type and PD-1-deficient (PD-1 KO) OT-I cells into YUMM1.7-OVA tumor-bearing mice. We found

282 that PD-1 KO TILs contained a smaller population with depolarized mitochondria accumulation (**Figure**
283 **5f**) even though PD-1 KO and wild-type cells in spleens and dLNs had similar mitochondrial fitness
284 (**Extended Data Figure 4c**). Taken together, our results identify factors suggested to drive T cell
285 exhaustion, including affinity of TCR:pMHC interaction and PD-1 signaling, that can abrogate
286 mitochondrial fitness in TILs.

287

288 **Metabolic stress coordinates with TCR signal to impair mitochondrial fitness**

289 We found that MDR/MG^{lo} TILs expressed lower amounts of hypoxia-suppressed genes (**Extended Data**
290 **Figure 5a**), suggested that MDR/MG^{lo} CD8⁺ TILs might be under hypoxic stress. Moreover, by
291 computationally weighting the metabolic programs of individual human CD8⁺ TILs⁴⁷, we observed that
292 terminally exhausted TILs expressed higher levels of hypoxia gene signatures (**Extended Data Figure**
293 **5b-c**). We reasoned that the coordination of TCR stimulation, hypoxia and tumor-derived factors could
294 induce a dysfunctional mitochondrial phenotype in CD8⁺ TILs. We found that stimulating Mito-QC CD8⁺
295 T cells with TCR stimulus and hypoxia, but not tumor cell-conditioned medium (TCM), suppressed
296 mitophagy (**Figure 6a** and **Extended Data Figure 5d**). We next found that TCR stimulation coordinated
297 with hypoxia and TCM to maximize the formation of MDR/MG^{lo} T cells in a time-dependent manner
298 (**Figure 6b** and **Extended Data Figure 5e-f**). Moreover, the MDR/MG^{lo} population generated in this *in*
299 *vitro* culture displayed disorganized crista morphology (**Figure 6c-e**). To determine whether *in vitro*-
300 generated MDR/MG^{lo} CD8⁺ T cells display terminally exhausted features, we adoptively transferred *in*
301 *vitro*-generated MDR/MG^{hi} and MDR/MG^{lo} OT-I cells into naïve mice followed by *Lm*-OVA
302 rechallenge. Our result showed that the *in vitro*-generated MDR/MG^{lo} CD8⁺ T cells displayed reduced
303 proliferative capacity, elevated expression of PD-1 and LAG-3, and reduced production of effector
304 cytokines compared to MDR/MG^{hi} CD8⁺ T cells (**Figure 6f-h**), indicating that our *in vitro* culture mimics
305 the tumor microenvironmental stress that is needed for disrupting mitochondrial fitness and reinforcing
306 the exhaustion program in T cells.

307 Hypoxia induces aerobic glycolysis to fulfill metabolic demands as a metabolic adaptation;
308 however, cells simultaneously experiencing both hypoxia and glucose deprivation elicit mitochondrial
309 dysfunction in a mtROS-dependent manner⁴⁸. We then speculated that scavenging mtROS might prevent
310 formation of MDR/MG^{lo} T cells. Indeed, supplementation with a mitochondria-targeted antioxidant,
311 MitoTempo, effectively ameliorated formation of MDR/MG^{lo} T cells (**Extended Data Figure 5g**).
312 Furthermore, we found that treatment with mitochondrial uncouplers to induce mitochondrial damage
313 plus TCR stimulation drastically boosted accumulation of depolarized mitochondria, but mitochondrial
314 uncouplers alone failed to affect mitochondrial fitness in CD8⁺ T cells (**Extended Data Figure 5h**),
315 suggesting that accumulation of depolarized mitochondria in T cells might result from the cooperation of

316 mitophagy impairment and mitochondrial damage. In support of this notion, treatment with oligomycin
317 plus Mdivi-1, an inhibitor that interrupts the initiation of mitophagy, stimulated formation of MDR/MG^{lo}
318 population in both murine (**Figure 6i**) and human CD8⁺ T cells (**Extended Data Figure 5i**). Of note, we
319 also found that glucose supplementation reduced accumulation of depolarized mitochondria in both
320 murine and human CD8⁺ T cells in the *in vitro* culture system (**Figure 6j** and **Extended Data Figure 5j**),
321 suggesting that preventing inappropriate metabolic reprogramming induced by oxygen and glucose
322 deprivation sustain mitochondrial fitness in TILs. Collectively, our data strongly demonstrate how TCR
323 stimulation coordinates with hypoxia and tumor cell-conditioned medium to impair mitochondrial fitness
324 in T cells.

325 326 **Dysfunctional mitochondria dictate exhaustion in CD8⁺ T cells**

327 To determine whether disturbed mitochondrial fitness instructs commitment to T cell exhaustion,
328 MDR/MG^{hi} and MDR/MG^{lo} OT-I cells generated by treatment with oligomycin plus Mdivi-1 for 6 h
329 without introducing TCR signaling and tumor derived were transferred into naïve mice which were
330 subsequently infected with *Lm-OVA*. We found that *in vitro* generated MDR/MG^{lo} OT-I cells displayed
331 reduced proliferative capacity, elevated expression of PD-1 and LAG-3, and reduced production of
332 effector cytokines compared to MDR/MG^{hi} OT-I cells (**Figure 7a-d**), implying that forced accumulation
333 of depolarized mitochondria is sufficient to reinforce a fixed exhaustion program in CD8⁺ T cells. We
334 further found that the differentially accessible genomic loci in the *in vitro* generated MDR/MG^{lo} T cells
335 were mainly located in the upstream regions and 5' UTR (**Extended Data Figure 6a**). GSEA of the
336 differentially accessible loci in MDR/MG^{lo} and MDR/MG^{hi} CD8⁺ T cells generated from the *in vitro*
337 culture also exhibited strong enrichments with the accessible loci derived from the comparison between
338 MDR/MG^{lo} and MDR/MG^{hi} CD8⁺ TILs (**Figure 7e**), indicating a high similarity between *in vivo* and *in*
339 *vitro* ATAC-seq results. We also found that memory-related TF binding motifs were enriched in
340 differentially accessible regions in MDR/MG^{hi} CD8⁺ T cells, whereas binding motifs for transcription
341 factors involved in ER-stress were enriched in MDR/MG^{lo} CD8⁺ T cells (**Figure 7f**). BioCarta pathway
342 analyses also revealed that p53 pathway were enriched in genes with differentially accessible peaks
343 between MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ T cells generated from the *in vitro* culture (**Extended Data**
344 **Figure 6b**). Importantly, both *Tcf7* and *Lef1* loci were also less accessible in the *in vitro* generated
345 MDR/MG^{lo} CD8⁺ T cells (**Extended Data Figure 6c**). Overall, these results provide evidence that
346 interrupting the mitochondrial fitness of CD8⁺ T cells is sufficient to orchestrate epigenetic
347 reprogramming associated with exhaustion establishment.

348 349 **Nicotinamide ribose prevents declined mitochondrial fitness**

350 Given that nicotinamide adenine dinucleotide (NAD) has been reported to stimulate mitophagy and in a
351 variety of cells, we speculated that supplementation precursors for generating NAD could prevent CD8⁺ T
352 cells from undergoing exhaustion and stimulate anti-tumor immunity⁴⁹. We found that the NAD level in
353 CD8⁺ T cells was elevated upon treatment with nicotinamide (NAM) and nicotinamide riboside (NR), but
354 not nicotinic acid (NA) (**Extended Data Figure 7a**). We further found that NR significantly reduced the
355 accumulation of depolarized mitochondria in a Drp-1-dependent manner and attenuated mtROS levels in
356 CD8⁺ T cells (**Figure 8a-c**), suggesting that mitophagy is required for NR-induced protection of
357 mitochondrial fitness in CD8⁺ T cells. Next, we examined whether NR could enhance the anti-tumor
358 responses of T cells within the TME. Strikingly, administration of alginate-mixed NR via intratumoral
359 injection induced robust suppression of melanoma growth, reduced the abundance of MDR/MG^{lo} TILs
360 accompanying with attenuated mtROS level, and boosted OT-I CD8⁺ TILs to produce effector cytokines
361 (**Figure 8d-g**), indicating that NR can sustain mitochondrial fitness and anti-tumor effector functions in
362 TILs. We next investigated whether oral treatment with NR could elicit anti-tumor responses and found
363 that CD8⁺ and CD4⁺ T cells were increased in NR-fed mice compared to chow diet control (**Extended**
364 **Data Figure 7b**). Moreover, melanoma and colon tumor growth was significantly impeded in NR-fed
365 mice and combined treatment with the NR diet and immune checkpoint blockade elicited additive anti-
366 tumor responses (**Figure 8h** and **Extended Data Figure 7c**). Importantly, NR treatment failed to
367 suppress tumor growth when we depleted CD8⁺ T cells in melanoma-bearing mice (**Figure 8i**),
368 suggesting that NR treatment induced anti-tumor responses in a CD8⁺ T cell-dependent manner.
369 Collectively, these findings reveal that supplementation with NR alleviates mitochondrial dysfunction and
370 further induces additive anti-tumor immunity in conjunction with ICB treatments.

371 372 **Discussion**

373 Here, we show that sustained metabolic restrictions plus TCR stimulation drive accumulation of
374 depolarized mitochondria in CD8⁺ TILs. We further reveal that forcing depolarized mitochondria
375 accumulation by disturbing mitochondrial dynamics reinforces phenotypic and epigenetic reprogramming
376 for T cell exhaustion. Lastly, treatment with nicotinamide riboside presents as a promising strategy to
377 prevent mitochondrial dysfunction and improve responsiveness to PD-1 blockade treatment. Together,
378 these results provide new insights into how distorted mitochondrial activity is induced in CD8⁺ TILs to
379 drive the regulatory circuit toward terminally exhausted T cells.

380 In response to glucose deprivation, cells engage mitochondrial fusion to boost oxidative
381 phosphorylation (OXPHOS)⁵. However, hypoxia stimulates aerobic glycolysis to support metabolic
382 demands. Cells simultaneously encountering these metabolic challenges force robust production of
383 mtROS in response to the metabolic chaos caused by the opposing metabolic programs⁴⁸. Since CD8⁺

384 TILs contain depolarized and physically close mitochondria, it is likely that CD8⁺ TILs initially increase
385 mitochondrial dynamics and activity to combat glucose deprivation in the TME. As a trade-off of this
386 action, mtROS may further damage mitochondria. This is supported by our results that supplementation
387 with glucose and mitochondria-targeted antioxidant, MitoTempo, ameliorates formation of MDR/MG^{lo}
388 population. We also observe that PD-1 signaling supports accumulation of depolarized mitochondria in
389 CD8⁺ TILs. Since PD-1 signaling can suppress glycolytic activity but stimulate OXPHOS⁴⁶, it is possible
390 the engagement of PD-1 signaling may elevate mtROS production and mitochondrial damage in the
391 hypoxic microenvironment by suppressing glucose utilization. Moreover, our results show that TCR-
392 driven mitophagy impairment contributes to mitochondrial dysfunction. Interestingly, TCR stimulation
393 activates mammalian target of rapamycin (mTOR), and elevated mTOR activity is known to suppress
394 autophagy and mitophagy activity. Of note, CD8⁺ TILs and exhausted T cells generated from chronic
395 lymphocytic choriomeningitis (LCMV) infection have been reported to display sustained mTOR
396 activation^{12, 14, 50}, and inhibiting mTOR during chronic LCMV infection reduced accumulation of
397 depolarized mitochondria in early activated virus-specific CD8⁺ T cells¹². Therefore, it will be of interest
398 to elucidate whether persistent TCR stimulation in CD8⁺ TILs impedes mitophagy in an mTOR-
399 dependent manner in future studies.

400 Accumulation of depolarized mitochondria is known to induce senescence, an altered secretome,
401 and metabolic vulnerability in aged cells by modulating nuclear events, including DNA replication,
402 transcription and damage responses, through retrograde signals generated from mitochondria⁹. Emerging
403 evidence indicates that epigenetic alterations might be the major regulatory mechanism to link
404 mitochondrial activity with nuclear reprogramming. Since our results imply that accumulation of
405 depolarized mitochondria in CD8⁺ T cells is sufficient to induce epigenetic reprogramming, we speculate
406 that altered retrograde signals caused by a decline in mitochondrial fitness might play a determinative role
407 in epigenetic reprogramming. Thus, identifying the metabolic differences and the underlying retrograde
408 signals responsible for epigenetic reprogramming would provide critical information for sustaining and
409 even re-reprogramming the epigenetic landscape to support productive T cell anti-tumor responses.

410

411 **Acknowledgments**

412 We thank W.-L. Lo, S.C.-C. Huang and L.-F. Lu for insightful comments. We thank A. Nemeš for
413 preparing the WGBS libraries, V. Gernedl for preparing the ATAC-seq libraries and the Biomedical
414 Sequencing Facility at CeMM for assistance with next generation sequencing. We also thank M.
415 Bosenberg (Yale University) for providing YUMM1.7 melanoma cells, T. Dawson (Johns Hopkins
416 School of Medicine) for providing *Park2*^{fllox/fllox} mice, I. Ganley (University of Dundee) for providing Mito-
417 QC mice and R. Ahmed (Emory University) for providing autophagy reporter. We thank the instrumental

418 supports from the EM facility of the biomedical sciences and the ASCEM in Academia Sinica. P.-C.H.
419 was supported in part by the SNSF project grants (31003A_163204 and 31003A_182470), the Swiss
420 Institute for Experimental Cancer Research (ISREC 26075483) and European Research Council Staring
421 Grant (802773-MitoGuide). N.V. was supported by the Kristian Gerhard Jebsen Foundation. Austrian
422 Science Fund (FWF) Special Research Programme grant, New Frontiers Group award of the Austrian
423 Academy of Sciences and ERC Starting Grant (679146) to C.B. P.-S.L. was supported by the Ministry of
424 Science and Technology grant (MOST-108-2320-B-400-025-MY3) and National Health Research
425 Institute grant (NHRI-CS-108-PP-09). L.T. was supported in part by Swiss National Science Foundation
426 (Project grant 315230_173243) and Swiss Cancer League (No. KFS-4600-08-2018). A.Z. was supported
427 by Cancer League Switzerland (KFS-3394-02-2014) and SNSF project grant (320030_162575). C.J. was
428 supported by the Swiss Cancer League (KFS-3710-08-2015), SNSF grant (PROOP3_179727) and the
429 Ludwig Institute for Cancer Research.

430

431 **Author Contributions**

432 Y.-R.Y., N.V. and P.-C.H. designed the research. Y.-R.Y., H.W., T.C., W.-C.C., and M.R.R. performed
433 in vitro and in vivo experiments. H.I. and C.B. conducted epigenome analyses and Z.X. and J.W.L.
434 performed computational analysis of single-cell RNA-sequencing. F.F., Y.-F.J. and P.-S.L. performed
435 electron microscopy analyses and confocal microscope analysis. M.G. and L.T. supported the production
436 of NR-loaded alginate hydrogel. C.J. and A.Z. provided human samples. R.G. and G.C. performed human
437 TIL TCR sequencing and analysis. Y.-R.Y., H.W., H.I. and N.V. analyzed the results. Y.-R.Y. and P.-
438 C.H. wrote the manuscript.

439

440 **Competing Interests Statement**

441 P.-C.H. is serving as a member of scientific advisory board for Elixiron Immunotherapeutics and
442 Acepodia and receiving research grants from Elixiron Immunotherapeutics, Roche and Novartis. P.-C.H.
443 received honorarium from Pfizer and Chugai.

444

445

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606

607 **Figure Legends**

608 **Figure 1. Tumor-infiltrating CD8⁺ T cells display depolarized mitochondria**

609 **a**, Mitochondrial mass and membrane potential of CD8⁺ T cells isolated from indicated tissues of
610 YUMM1.7 melanoma-bearing mice were examined by MitoTracker Green (MG) and MitoTracker Deep
611 Red (MDR), respectively. **b, c**, Relative fold changes of mitochondrial mass, membrane potential (**b**) and
612 the ratio of MDR to MG (**c**) in CD8⁺ T cells isolated from indicated tissues (**b**, Spleen and Tumor: n = 20,
613 dLN: n = 19; **c**, Spleen and Tumor: n = 24, dLN: n = 23). Fold changes were calculated by normalizing to
614 the average intensity of indicated molecular probe in splenic T cells. **d, e**, Representative electron
615 microscope images (**d**) and quantitative plots of mitochondrion number (**e**) in activated splenic and tumor-
616 infiltrating CD8⁺ T cells from tumor-bearing mice (n = 20 per group). Scale bars = 500 nm. **f**, The relative
617 copy number of mitochondrial DNA (mtDNA) in activated splenic and tumor-infiltrating CD8⁺ T cells
618 from tumor-bearing mice (**f**, n = 6 per group). Fold changes were calculated by normalizing to the average
619 copy number in splenic T cells. **g-i**, Representative electron microscope images (**g**) and quantitative plots
620 of crista number (**h**) and length (**i**) per mitochondrion in activated splenic and tumor-infiltrating CD8⁺ T
621 cells from tumor-bearing mice (**h**, n = 50 per group; **i**, n = 50 per group). Scale bars = 500 nm. **j-m**,
622 Representative 3D-electron microscope images (**j**) and quantitative plots of crista volume (**k**), normalized
623 crista volume (**l**) and mitochondria-associated membrane (**m**) in activated splenic and tumor-infiltrating
624 CD8⁺ T cells. Each color in 3D images indicates one mitochondrion. (Spleen: n = 26; Tumor: n = 16). **n**,
625 **o**, Mitochondrial ROS (**n**) and cytoplasmic ROS (**o**) in activated splenic and tumor-infiltrating CD8⁺ T
626 cells were determined by MitoSOX and CM-H2DCFDA staining, respectively (**n**, n = 11 per group; **o**, n
627 = 6 per group). All data are mean ± s.e.m. and were analyzed by two-tailed, unpaired Student's *t*-test.
628 Data are cumulative results from at least three independent experiments. Each symbol represents one
629 individual (**b, c** and **f**).

630

631 **Figure 2. Impaired mitophagy results in accumulation of depolarized mitochondria in CD8⁺ TILs**

632 **a**, Based on the ratio of MDR to MG, two distinct populations of CD8⁺ TILs were determined as
633 MDR/MG^{hi} (red) and MDR/MG^{lo} (blue) using flow cytometry (left panel), followed by the quantification
634 of the percentage of MDR/MG^{lo} populations in activated CD8⁺ T cells from spleens, dLNs and tumors of
635 YUMM1.7 melanoma-engrafted mice (Spleen and Tumor: n = 20, dLN: n = 19). **b**, MDR/MG^{lo}
636 populations were determined in human melanoma patients using flow cytometry (n = 11 per group). **c-e**,
637 Representative electron microscope images (**c**) and quantitative results of crista length (**d**) and number (**e**)
638 per mitochondrion in sorted MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ TILs (red arrowhead indicate crista)
639 (MDR/MG^{hi}: n = 19; MDR/MG^{lo}: n = 18). Scale bar = 500 nm. **f**, The mitochondrial morphology of
640 MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ TILs was detected by fluorescence confocal microscopy based on MG

641 staining. Scale bar = 2.5 μm . **g**, Copy number of mitochondrial DNA (mtDNA) of MDR/MG^{hi} and
642 MDR/MG^{lo} CD8⁺ TILs was measured by PCR amplification (n = 6 per group). Fold changes were
643 calculated by normalizing to the average copy number in splenic CD8⁺ T cells. **h**, Mitochondrial ROS
644 was measured by MitoSOX staining in MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ TILs (n = 11 per group).
645 Results were normalized to the average mean fluorescence intensity of MitoSOX in MDR/MG^{hi} TILs. **i, j**,
646 Mitophagy events in OT-I cells in the indicated tissues were detected by using MitoQC reporter system in
647 which the lower gating areas of representative flow plots represent cells undergoing mitophagy (**i**) and the
648 quantification of OT-I cells in indicated tissues engaging mitophagy (**j**) (n = 11 per group). **k, l**,
649 Autophagy events were measured according to the lower gating area of representative flow plots (**k**),
650 followed by the quantification of gated CD8⁺ T cells (**l**) (n = 9 per group). **m**, The representative flow
651 plots (left) and the quantitative results of MDR/MG^{lo} populations in WT P14 and *Park2*^{cko} P14 CD8⁺
652 TILs (right) were determined by flow cytometry three days or eight days after transfer (n = 6 per group).
653 All data are mean \pm s.e.m. and were analyzed by two-tailed, unpaired Student's *t*-test. Data are
654 cumulative results from at least three independent experiments. Each symbol or pair represents one
655 individual (**a, b, g, h, j** and **l**).

656

657 **Figure 3. CD8⁺ TILs accumulating depolarized mitochondria display characteristics of terminally**
658 **exhausted T cells**

659 **a, b**, Expression of PD-1 (**a**) and T-bet (**b**) in MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ TILs was determined by
660 flow cytometry (**a**, n= 13 per group; **b**, n = 6 per group). **c, d**, Production of TNF and IFN- γ in sorted
661 MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ TILs was measured by flow cytometry before and after *ex vivo*
662 treatments of IL-15/IL-2 (**c**), followed by the quantifications of cytokine-producing cells as indicated (**d**)
663 (MDR/MG^{hi}: *Ex vivo*, n = 16, IL-15/IL-2, n = 15; MDR/MG^{lo}: n = 5). **e**, Significantly enriched gene
664 signatures from MSigDB in differential gene expression profile of MDR/MG^{hi} CD8⁺ TILs versus
665 MDR/MG^{lo} CD8⁺ TILs from YUMM1.7-OVA tumors. **f**, GSEA of indicated signatures from the ranked
666 list of genes differentially expressed in MDR/MG^{hi} CD8⁺ TILs versus MDR/MG^{lo} CD8⁺ TILs from
667 YUMM1.7-OVA tumors. **g**, Expression of TCF1 in MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ TILs was
668 determined by flow cytometry (n = 6 per group). **h**, Total cellularity of expanded OT-I cells from
669 indicated groups in spleens collected from *Lm*-OVA-re-challenged mice (Spleen and MDR/MG^{hi}, n = 16;
670 MDR/MG^{lo}, n = 13). **i, j**, Expression of PD-1 (**i**) and LAG-3 (**j**) in expanded OT-I cells from indicated
671 groups in spleens of *Lm*-OVA-re-challenged mice was determined by flow cytometry (**i**, Spleen: n = 16,
672 MDR/MG^{hi}: n = 17, MDR/MG^{lo}: n = 14; **j**, Spleen: n = 8, MDR/MG^{hi}: n = 7, MDR/MG^{lo}: n = 10). **k**, The
673 production of IFN- γ in expanded OT-I cells from indicated groups in spleens collected from *Lm*-OVA-re-
674 challenged mice (Spleen and MDR/MG^{hi}: n = 16; MDR/MG^{lo}: n = 13). Floating boxes display the data

675 distribution from minimum to maximum with mean in the centre (**d** and **h-k**). All data were analyzed by
676 two-tailed, unpaired Student's *t*-test. Data are cumulative results from at least three independent
677 experiments. Each pair represents the comparison of TILs isolated from one tumor sample (**a**, **b** and **g**).

678

679 **Figure 4. Mitochondrial fitness in TILs orchestrates epigenetic program**

680 **a**, Heatmap with normalized chromatin accessibility exhibits cluster analysis of the 3273 differentially
681 accessible peaks between MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ TILs. **b**, Distributions of differentially
682 accessible chromatin loci specific to MDR/MG^{hi} or MDR/MG^{lo} CD8⁺ TILs. **c**, GSEA of indicated
683 signatures from the ranked list of differentially accessible peaks in MDR/MG^{hi} CD8⁺ TILs versus
684 MDR/MG^{lo} CD8⁺ TILs from YUMM1.7-OVA tumors. **d**, **e**, Bar graphs represent NCI-Nature 2016
685 pathways that are significantly enriched among genes with accessible chromatin in MDR/MG^{hi} (**d**) and
686 MDR/MG^{lo} (**e**) CD8⁺ TILs with indicated adjusted *P*-value. **f**, Significantly enriched transcription factor
687 motifs in accessible genomic loci in MDR/MG^{hi} or MDR/MG^{lo} CD8⁺ TILs. Transcription factors labeled
688 in green: involved in memory T cells formation or function; in purple: involved in ER-stress responses.
689 NES, normalized enrichment score. **g**, Representative ATAC-seq tracks at *Tcf7*, *Lef1*, and *Hif1a* loci from
690 sorted MDR/MG^{hi} or MDR/MG^{lo} CD8⁺ TILs. Differentially accessible regions are highlighted in blue.
691 Scale bar = 10 kb.

692

693 **Figure 5. TCR and PD-1 signals contribute to the accumulation of damaged mitochondria in TILs**

694 **a**, MDR/MG^{hi} (red) and MDR/MG^{lo} (blue) populations were determined in CD8⁺ TILs isolated at the
695 indicated day after tumor engraftment, followed by the quantification of the percentage of MDR/MG^{lo}
696 population. (6d: n = 11; 12d: n = 12; 18d: n = 12; data are presented as mean ± s.e.m.) **b**, **c**, MDR/MG^{lo}
697 populations in CD8⁺ OT-I and P14 TILs isolated from YUMM1.7-OVA and YUMM1.7-gp33 tumors
698 were determined by flow cytometry (**b**) and further calculated in each mouse. Each line indicates paired
699 TILs from same tumor (**c**, n = 13 per group). **d**, MDR/MG^{lo} populations in CD8⁺ OT-I and OT-3 TILs
700 isolated from YUMM1.7-OVA tumors were determined using flow cytometry, and further quantified in
701 each mouse. Each line indicates paired TILs from same tumor (n = 11 per group). **e**, Human TCR
702 clonality was examined by RNAseq on TCRβ of MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ TILs sorted from
703 human colon cancer samples (left panel, representative flow plot), followed by the calculations of
704 Simpson clonality index (right panel) (n = 4 per group). *P* values were assessed using the Wilcoxon test.
705 **f**, MDR/MG^{lo} populations in WT and PD-1 KO OT-I CD8⁺ TILs isolated from YUMM1.7-OVA tumors
706 were determined using flow cytometry, followed by the quantifications of the percentage of MDR/MG^{lo}
707 population (n = 12 per group). Data in **a**, **c**, **d**, and **f** were analyzed by two-tailed, unpaired Student's *t*-

708 test. Data are cumulative results from at least three independent experiments. Each symbol or pair
709 represents one individual (**a** and **c-f**).

710

711 **Figure 6. Coordination of TCR and metabolic stress drives mitochondrial dysfunction in CD8⁺ T**
712 **cells**

713 **a, b**, Quantifications of mitophagy events (**a**) and MDR/MG^{lo} populations (**b**) of *in vitro*-activated CD8⁺
714 OT1-Mito-QC and OT-I T cells, respectively, cultured under indicated conditions (**a**, n = 12 per group; **b**,
715 n = 9 per group). TCM: tumor cell-conditioned medium; TCR: T cell receptor stimulation. **c-e**,
716 Representative electron microscope images (**c**) and quantitative results of crista number (**d**) and length (**e**)
717 in mitochondria of sorted MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ T cells generated under TCM/TCR/Hypoxia
718 condition (red arrowhead indicate crista). Scale bar = 500 nm. (MDR/MG^{hi}: n = 64; MDR/MG^{lo}: n = 71)
719 **f**, Total cellularity of expanded OT-I cells from indicated groups in spleens collected from *Lm*-OVA-re-
720 challenged mice (n = 8 per group). **g,h**, Expression levels of PD-1 and LAG-3 (**g**), and the production of
721 IFN- γ /TNF (**h**) in expanded OT-I cells from indicated groups in spleens collected from *Lm*-OVA-re-
722 challenged mice (n = 8 per group). **i**, Quantitative results of MDR/MG^{lo} populations of *in vitro*-activated
723 CD8⁺ T cells treated with indicated compounds. (OA, oligomycin A) (n = 9 per group). **j**, Representative
724 flow plots of MDR and MG stainings in *in vitro*-activated CD8⁺ T cells cultured under
725 TCM/TCR/Hypoxia condition supplemented with or without 10mM glucose (left) and the quantification
726 of MDR/MG^{lo} populations in these conditions (right) (n = 9 per group). Floating boxes display the data
727 distribution from minimum to maximum with mean in the centre (**f-h**). All data are mean \pm s.d. and were
728 analyzed by two-tailed, unpaired Student's *t*-test. Data are cumulative results from at least three
729 independent experiments (**a, b, i** and **j**). Each symbol represents one individual (**f-h**).

730

731 **Figure 7. Accumulation of depolarized mitochondria reinforces phenotypic and epigenetic**
732 **exhaustion programs**

733 **a**, Total cellularity of expanded OT-I cells from indicated groups in spleens collected from *Lm*-OVA-re-
734 challenged mice (MDR/MG^{hi}: n = 14, MDR/MG^{lo}: n = 15). **b-d**, The expression level of surface
735 exhaustion markers, PD-1 (**b**) and LAG-3 (**c**), and the production of IFN- γ /TNF (**d**) in expanded OT-I
736 cells from indicated groups in spleens collected from *Lm*-OVA-re-challenged mice (**b, c**, MDR/MG^{hi}: n =
737 14, MDR/MG^{lo}: n = 15; **d**, n = 10 per group). **e**, GSEA of differentially accessible peaks in MDR/MG^{hi}
738 and MDR/MG^{lo} CD8⁺ T cells generated *in vitro* from the Log2FC ranked list of all the accessible peaks in
739 MDR/MG^{hi} CD8⁺ TILs versus MDR/MG^{lo} CD8⁺ TILs from YUMM1.7-OVA tumors. **f**, Significantly
740 enriched transcription factor motifs in peaks opening in MDR/MG^{hi} or MDR/MG^{lo} CD8⁺ T cells
741 generated from oligomycin and Mdivi-1 *in vitro* treatment. Transcription factors labeled in green:

742 involved in memory T cells formation or function; in purple: involved in ER-stress responses. Floating
743 boxes display the data distribution from minimum to maximum with mean in the centre (**a-d**). All data
744 were analyzed by two-tailed, unpaired Student's *t*-test. Each symbol represents one individual (**a-d**).

745

746 **Figure 8. NR sustains mitochondrial fitness and anti-tumor responses in CD8⁺ T cells**

747 **a**, Representative flow plots of MDR and MG stainings in *in vitro*-activated CD8⁺ T cells cultured under
748 control condition or TCM/TCR/Hypoxia condition supplemented with or without 400μM NR (left) and
749 the quantification of MDR/MG^{lo} populations in these conditions (right). TCM: tumor cell-conditioned
750 medium; TCR: T cell receptor stimulation (n = 9 per group). **b**, Mitochondrial ROS in *in vitro*-activated
751 CD8⁺ T cells cultured under control condition or TCM/TCR/Hypoxia condition supplemented with or
752 without 400μM NR was measured by MitoSOX staining (n = 3 per group). **c**, The quantification of
753 MDR/MG^{lo} populations in control and Drp-1-deficient CD8⁺ T cells cultured under control condition or
754 TCR/TCM/Hypoxia condition supplemented with or without 400 μM NR (Ctrl gRNA: n = 6 per group;
755 Drp1 gRNA: n = 9 per group). **d**, Tumor growth of YUMM1.7-OVA melanoma-engrafted mice received
756 intratumoral injection with PBS or 400 μM NR in alginate (PBS-alginate: n = 8; NR-alginate: n = 7). **e-g**,
757 *In vitro*-activated OT-I CD8⁺ T cells were transferred into Yumm1.7-OVA melanoma-engrafted mice
758 eight days post engraftment, followed by two injections of PBS- and NR-alginate into tumors on different
759 flanks on day 8 and 11. CD8⁺ TILs were isolated and analyzed on day 12. **e**, MDR/MG^{lo} populations in
760 CD8⁺ OT-I TILs isolated from PBS-treated and NR-treated YUMM1.7-OVA tumors were
761 determined by flow cytometry and further calculated in each mouse. Each line indicates paired
762 TILs from same mouse (n = 14 per group). **f**, The fold change of mitochondrial ROS between
763 activated OT-I CD8⁺ TILs isolated from PBS-treated and NR-treated YUMM1.7-OVA tumors (n =
764 19 per group). **g**, The fold change of TNF⁺, IFN-γ⁺ and TNF⁺IFN-γ⁺ cell populations in CD8⁺ TILs
765 isolated from PBS-treated and NR-treated YUMM1.7-OVA tumors (n = 15 per group). **h**, Tumor
766 growth of YUMM1.7 melanoma-engrafted mice fed with indicated diet plus injection with PBS (Ctrl) or
767 anti-PD-1 antibody (αPD-1). Red dotted lines indicate the tumor volume of 800 mm³. **i**, Tumor growth of
768 YUMM1.7 melanoma-engrafted mice fed with indicated diet and injected with either PBS or anti-CD8α
769 antibody. Red dotted lines indicate the tumor volume of 800 mm³. Data are mean ± s.d. and were
770 analyzed by two-tailed, unpaired Student's *t*-test (**a-d**), whereas data were analyzed by two-tailed and
771 paired Student's *t*-test in **e-g**. Data are cumulative results from at least three independent experiments.
772 Each pair represents the comparison of TILs isolated from tumors with indicated treatments from one
773 tumor-bearing mouse (**e-g**).

774

775

776

777 **Methods**

778 **Mice**

779 C57BL/6J, *Rag1*^{-/-} (B6.129S7-Rag1tm1Mom/J), CD4-Cre (B6.Cg-Tg(Cd4-cre)1Cwi/BfluJ) and B6 Cas9
780 (B6J.129(Cg)-Gt(ROSA)26Sortm1.1(CAG-cas9-EGFP)Fezh/J) mice were purchased from Jackson
781 Laboratory. *Pdcd1*^{-/-} (PD-1 KO) mice were purchased from RIKEN. *Braf*<sup>CA;Tyr:CreER;*Pten*^{lox4-5}
782 (*Braf*/*Pten*) mice were previously described³². Mito-QC mice³⁷ were provided by I.G. Ganley, and
783 *Parkin*^{n/n} mice⁵¹ were provided by T.M. Dawson. Mito-QC mice were crossed with OT-I mice to obtain
784 OT-I Mito-QC mice for adoptive cell transfer experiment. *Park2*^{cko} mice were generated by crossing
785 *Parkin*^{n/n} mice with P14 CD4-cre mice. All mice were housed in the animal facility of the University of
786 Lausanne.</sup>

787

788 **Tumor engraftment, treatments of tumor-bearing mice and re-challenge experiment**

789 For tumor induction, 3-week-old *Braf*/*Pten* male mice were topically treated with 1 μ l 4-
790 hydroxytamoxifen (8 mg μ l⁻¹ in ethanol) on the skin surface. For tumor engraftment, tumor cell lines were
791 injected (Yumm1.7: 5×10^4 ; Yumm1.7-OVA/gp33: 1×10^6 cells; MC38: 2.5×10^5 cells) subcutaneously
792 into B6 or *Rag1*^{-/-} mice, followed by the analysis on day 18. For the NR diet experiment, mice were fed
793 with control chow diet or NR diet (400 mg kg⁻¹) starting on day 3 after tumor engraftment. The anti-PD-1
794 antibody (200 μ g per injection, intraperitoneally, every 3 days, BioXcell, clone 29F.1A12) was injected
795 intraperitoneally from day 7 post tumor engraftment, whereas the anti-CTLA4 (100 μ g per injection,
796 intraperitoneally, every 3 days, BioXcell, clone 9D9) was injected intraperitoneally from day 9 in MC38
797 tumor model. For the CD8-depletion experiment, mice were treated with anti-CD8 antibody (300 μ g per
798 injection, clone 2.43) every 3 days from day 3 post tumor engraftment. For the *Park2*^{cko} experiment, *in*
799 *vitro*-activated *Park2*^{cko} CD8⁺ T cells were adoptively transferred into Yumm1.7-gp33 melanoma-bearing
800 mice on day 10 post tumor engraftment. For the CRISPR/Cas9-mediated Drp1-depletion experiment, *in*
801 *vitro*-activated P14 Cas9 CD8⁺ T cells were transduced with gRNAs, followed by adoptive transfer into
802 Yumm1.7-gp33 melanoma-bearing mice on day 10 post-tumor engraftment. For NR intratumoral
803 treatment, aqueous solution of NR (5 mg ml⁻¹, 41 μ l, DI water) was mixed with an alginate solution (10
804 mg ml⁻¹, 2 ml, PBS), followed by the intratumoral injection to form hydrogel *in situ* within the tumor^{52,53},
805⁵⁴. For *in vivo* re-challenge experiment, sorted MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ T cells from indicated
806 conditions were transferred into naïve recipient mice, followed by the *Listeria monocytogenes* expressing
807 OVA peptide (*Lm*-OVA) administration (5000 CFU per mouse), and analyzed the transferred cells 8 days

808 later. All experiments were conducted according to Swiss federal regulations and approved by the
809 veterinary authority of Canton Vaud.

810

811 **Cell lines and *in vitro* culture**

812 The YUMM1.7 melanoma cell line was provided by M. Bosenberg as described previously^{55, 56}. The
813 YUMM1.7-OVA and YUMM1.7-gp33 cell lines were established by stably transduced parental cell lines
814 with lentivirus harboring the expression cassettes of OVA or gp33 peptides and were maintained in high-
815 glucose-supplemented Dulbecco's modified Eagle's medium (DMEM, Life Technologies) with 10% fetal
816 bovine serum (Gibco), 100 U ml⁻¹ penicillin-streptomycin (Thermo Fisher Scientific) and puromycin
817 (InvivoGen). For antigen-specific CD8⁺ T cell activation, OT-I or P14 splenocytes were treated with 1 µg
818 ml⁻¹ OVA257-264 or gp33 peptides in the presence of 10 ng ml⁻¹ IL-2 for 3 days, then cultured with IL-2
819 alone for another 3 days before adoptive transfer or *in vitro* assays. For human CD8⁺ T cells, blood was
820 drawn from healthy donors according to the guidelines of ethic regulation under approved protocol at
821 University of Lausanne (protocol P_173) with written informed consent. PBMCs were isolated by Ficoll
822 gradient. CD8⁺ T cells were then isolated from PBMCs using negative selection MojoSort kit
823 (BioLegend). Isolated CD8⁺ T cells were resuspended with medium containing 10 ng ml⁻¹ human IL-2
824 (Peprotech) and then activated with Dynabeads Human T-Activator CD3/CD28 (Gibco). Throughout
825 expansion, the cell concentration was maintained between 0.5 –1.0 × 10⁶ cells per ml. Cells were further
826 used for following experiments between day 15 to day 17 post-activation.

827

828 **Tumor digestion, cell isolation and FACS analysis**

829 Tumors were minced in RPMI with 2% FBS, DNaseI (1 µg ml⁻¹, Sigma-Aldrich) and collagenase (0.5 mg
830 ml⁻¹, Sigma-Aldrich), followed by digesting at 37°C for 45 min. The digested samples were then filtered
831 through a 70-µm cell strainer, enriched by density gradient centrifugation (800g, 30 min) at 25°C with
832 40% and 80% percoll (GE Healthcare). FACS analyses were performed using LSRII (BD Biosciences)
833 with BD FACSDiva software (version 8.0.1). Data were analyzed using FlowJo. For MitoTracker
834 staining, cells were incubated with 10 nM MitoTracker Deep Red (Thermo Fisher Scientific) and 100 nM
835 MitoTracker Green (Thermo Fisher Scientific) in RPMI with 2% FBS for 15 min at 37°C for
836 mitochondrial membrane potential and mass, respectively. For cytokine examination, cells were
837 stimulated with either OVA or gp33 peptides in the presence of brefeldin A (5 ng ml⁻¹) for 5 h and then
838 stained by the intracellular staining procedure as described³. The following antibodies were used: anti-
839 CD3ε (ebioscience, 1:300), anti-CD4 (ebioscience, 1:100), anti-CD8a (ebioscience, 1:100), anti-CD44
840 (ebioscience, 1:300), anti-CD45.1 (BioLegend, 1:50), anti-CD45.2 (BioLegend, 1:100), anti-CD90.1

841 (ebioscience, 1:1000), anti-PD-1 (BioLegend, 1:200), anti-T-bet (ebioscience, 1:200), anti-TCF1 (Cell
842 signaling, 1:100), anti-IFN- γ (BioLegend, 1:1000), anti-TNF (BioLegend, 1:200), anti-LAG3
843 (BioLegend, 1:200), anti-hCD3 (BioLegend, 1:100), anti-hCD8 (BioLegend, 1:100), anti-hCD45RA
844 (BioLegend, 1:100)

845

846 **TCR clonality in human patient samples**

847 Human samples were collected according to the guidelines of ethic regulation under approved protocols at
848 University Hospital Basel (EK128/13) and Lausanne University Hospital (protocol 87/06). Human
849 PBMCs were collected according to the approval protocol at University of Lausanne (A150519/2)
850 Written informed consent was obtained from all participants. MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ TILs
851 were analyzed from tumor infiltrated lymph nodes (TILNs) from melanoma patients and human colon
852 cancer samples (**Extended Data Table 1**). Subsequently, sorted MDR/MG^{hi} and MDR/MG^{lo} CD8⁺ TILs
853 from human colon cancer were further resuspended with lysis buffer, followed by the RNAseq analysis
854 for TCR b-chain. A clonality score was determined by the Simpson index.

855

856 **Electron microscopy, tomography and 3D structural analysis of mitochondrial morphology**

857 For Electron microscopy analysis, sorted cells were fixed in glutaraldehyde solution (EMS,) 2.5% for 1 h
858 at 25°C, and directly postfixed with osmium tetroxide 1% (EMS)/1.5% of potassium ferrocyanide
859 (Sigma) for 1 h at 25°C, followed by several washes and dehydration in acetone (Sigma), and embedded
860 in Epon (Sigma). Ultrathin sections of 50nm were prepared on a Leica Ultracut (Leica Mikrosysteme
861 GmbH), followed by poststained with 4% uranyl acetate (Sigma) and Reynolds lead citrate (Sigma).
862 Micrographs were taken with a transmission electron microscope Philips CM100 (Thermo Fisher
863 Scientific) at an acceleration voltage of 80kV with a TVIPS TemCam-F416 digital camera (TVIPS
864 GmbHImage) analysis and quantification were carried out using ImageJ software. The number of
865 mitochondrion per cell was quantified. For assessing mitochondrial cristae, each dot represents the
866 crista number or total length in one mitochondrion from one high-magnitude EM image of a live
867 cell. For electron tomography, a hydrophilic surface was obtained by glow discharge (25 mA for 10 sec)
868 on the slot grids (2 × 0.5 mm oval slots) with carbon films. The fiducial markers (10 μ l of diluted 10 nm
869 gold nanoparticles with 1% BSA coating) were absorbed (10 min), blotted and air-dried on the carbon
870 film. The serial sections (200nm in thickness) were cut and the ribbon of sections was collected by a
871 homemade perfect loop, followed by staining with Reynold's lead citrate for 10 min. The stained and
872 dried grids were subjected to glow discharge again and the second layer of fiducial gold was applied to
873 the sections. The grids were loaded into the double tilt holder (Model 2040 Dual-Axis Tomography

874 Holder, Fischione) and imaged with FEI Tecnai TEM operating at 200 kV. The micrographs were
875 recorded with a Gatan UltraScan 1000 CCD at 0.87 nm/pixel (9,600×) and the tilt series from – 58° to +
876 58° with 2° increments were acquired using the Legion automatic and remote control software. The serial
877 tomograms with double tilt were reconstructed, combined, and joined in eTomo, while the 3D volume of
878 the selected area was segmented and visualized in Amira⁵⁷.

879

880 **Measurement of mitochondrial membrane potential and mass by FACS**

881 T cells were treated with or without 10 μM Oligomycin A (Sigma-Aldrich) for 2.5 h, and then stained
882 with 10 nM MitoTracker Deep Red (Thermo Fisher Scientific) and 100 nM MitoTracker Green (Thermo
883 Fisher Scientific) for 15 min at 37°C for mitochondrial membrane potential and mass, respectively. FACS
884 analyses were performed using LSRII (BD Biosciences). Data were analyzed using FlowJo.

885

886 **Determination of mitochondrial DNA copy number**

887 Mitochondrial DNA copy number of CD8⁺ T cells isolated from indicated tissues was determined as
888 mentioned previously⁵⁸. Total DNA was extracted using Genomic-tip 20/G (QIAGEN), followed by
889 quantitative real-time RT-PCR on a LightCycler 480 Instrument II machine (Roche Life Science) using
890 KAPA SYBR FAST qPCR Kit Master Mix (KAPA Biosystems).

891

892 **Florescence confocal microscopy**

893 Cells were collected by the BD InfluxTM cell sorter and allowed to adhere on glass bottom dishes coated
894 with poly-D-lysine. Cells were kept in a humidified incubation chamber at 37°C with 5% CO₂ during live
895 images collection by using a Leica TCS SP5, confocal spectral microscopy fitted with an HCX PL APO
896 63×/1.40-0.60 Oil objective. Images of mitochondria were processed and presented as using premier 3D
897 volume rendering modes tool in Imaris (Bitplane).

898

899 **Retrovirus production and transduction**

900 For CRISPR/Cas9-mediated Drp-1-depletion experiment, Drp-1 guide RNAs (Drp1-1 gRNA,
901 GTGACCACACCAGTTCCTCT; Drp1-2 gRNA, CCTTCCCATCAATACATCCA; Drp1-3 gRNA,
902 TATTTGCAGCAGTGACGGCG) were cloned into our homemade pSUPER-pU6-Thy1.1 plasmid by
903 Bbs1. For the autophagy reporter experiment, pMSCV-mCherry-EGFP-LC3B-Thy1.1 is a gift from R.
904 Ahmed as described previously⁵⁹. Retrovirus was produced by transfecting Phoenix cells with the
905 indicated plasmids with pCL-Eco using TurboFect (Thermo Fisher Scientific). For CD8⁺ T cell retrovirus
906 transduction, activated CD8⁺ T cells were cultured with medium containing virus and 10 ng ml⁻¹ IL-2 in

907 the retronectin (Takara Bio Europe)-coated plates. The following experiments were performed 5 days
908 after transduction.

909

910 **RNA-seq data processing and computational analysis**

911 mRNA-seq profiling using the Smart-seq2 protocol was performed as described previously⁶⁰. Smart-seq2
912 reads were trimmed using *Trimmomatic* (v.0.32)⁶¹ and mapped to the mouse reference genome (mm10)
913 using STAR (v.2.5.2b)⁶². *summarizeOverlaps* from the GenomicAlignments package (v.1.16.0) in
914 R/Bioconductor (v.3.5.1) was used to quantify gene expression by counting primary alignments to exons.
915 Genes were defined using Ensembl annotation of mm10/GRCm38 (genome-build GRCm38.p6).
916 Differential expression analysis was performed using DESeq2 (v.1.22.2)⁶³.

917

918 **ATAC-seq data processing and computational analysis**

919 T cells from indicated conditions were collected and performed chromatin accessibility mapping by
920 ATAC-seq as described previously⁶⁴. Raw reads were trimmed using *Trimmomatic* (v.0.32)⁶¹ and aligned
921 to the mouse reference genome (mm10) using Bowtie2 (v.2.2.4)⁶⁵. Duplicate reads were removed using
922 sambamba (v.0.5.5)⁶⁶ and only primary alignments with mapping quality greater than 30 were retained.
923 Genome browser tracks were generated using BEDTools (v.2.26.0)⁶⁷ and the UCSC Genome
924 Browser's *bedGraphToBigWig* tool. ATAC-seq peaks were called using MACS2 (v.2.1.1.20160309)⁶⁸ on
925 each individual sample. Peaks overlapping with blacklisted regions
926 (<http://mitra.stanford.edu/kundaje/akundaje/release/blacklists/mm10-mouse/>) were discarded. Peaks from
927 all samples were merged into a consensus peak list using BEDTools *merge*. The chromatin accessibility
928 of each consensus peak in each sample was quantified using BEDTools *coverageBed*. Differential
929 accessibility was calculated using *DESeq2* (v.1.22.2)⁶³. Differentially accessible regions between
930 populations were defined using adjusted P-value ≤ 0.05 and $|\log_2(\text{fold-change})| \geq 0.5$ for *in vivo*
931 experiments, P-value ≤ 0.05 and $|\log_2(\text{fold-change})| \geq 0.5$ for *in vitro* experiments. The distribution of
932 differentially accessible regions was calculated using PAVIS⁶⁹. For Figure 4a, ATAC values were
933 normalized using *vst* from *DESeq2*, followed by row-median normalization. The QC table for ATCA-seq
934 of *in vivo* (**Extended Table 4**) and *in vitro* TILs (**Extended Table 6**) is available in supplementary
935 information. The differentially accessible chromatin loci of *in vivo* (**Extended Table 5**) and *in vitro* TILs
936 (**Extended Table 7**) can be found in supplementary information.

937

938 **Gene set enrichment analysis**

939 Enrichment of manually curated gene sets was calculated by GSEA (v.3.0)⁷⁰ using the pre-ranked analysis
940 option. For Figure 3e-f, mouse gene IDs were mapped to human gene names using the Ensembl/Biomart

941 database using *biomaRt* (v.2.38.0). *DEseq2* \log_2 (fold-change) expression values were used to rank the
942 genes. For Figure 4c, peaks were assigned to the closest transcription start sites using the BEDTools
943 *closestBed*, subsequently mouse gene symbols were mapped to human gene symbols using *biomaRt*. The
944 *DESeq2* \log_2 (fold-change) accessibility values were used to rank the genes. The \log_2 (fold-change) with
945 the highest absolute value was selected if more than one peak was assigned to a gene. For Figure 7f, the
946 consensus list of *in vivo* peaks ranked according to their differential accessibility contrasting two
947 populations (\log_2 (fold-change) values) was compared to sets of differentially accessible peaks defined *in*
948 *vitro*. The *in vitro* peaks were assigned to the closest *in vivo* peaks using the BEDTools *closestBed*.

949

950 **Whole-genome bisulfite sequencing (WGBS)**

951 T cells from indicated conditions were collected for the WGBS as described previously⁷¹, with minor
952 adaptations. Bisulfite conversion was performed using the EZ DNA Methylation-Direct Kit (Zymo
953 Research, D5020) with the modification of eluting the DNA in only 9 μ l of elution buffer. Bisulfite
954 treatment was performed directly on lysed cells by placing the cells in digestion buffer and performing
955 proteinase K digestion at 50°C for 20min. In both cases, custom-designed methylated and unmethylated
956 oligonucleotides were added at a concentration of 0.1% to serve as spike-in controls for monitoring
957 bisulfite conversion efficiency. Libraries for next-generation sequencing were prepared using the
958 TruSeq® DNA Methylation Kit (Illumina, EGMK91396) with the following critical steps: bisulfite-
959 converted genomic DNA was transcribed using tagged random hexamer primers, excess random hexamer
960 primers were digested by the addition of Exonuclease I, terminal tagging was performed to extend the
961 synthesized DNA strand on its 3' side using elongation blocked and tagged random hexamers, and
962 Illumina-compatible sequencing adapters were introduced through enrichment PCR using primers
963 corresponding to the tagged sequences flanking the random hexamers. For subsequent library
964 amplification, the number of PCR cycles was 14 cycles, adjusted according to cell number. The final
965 library was purified twice using Agencourt AMPure XP beads (Beckman Coulter, A63880). Quality
966 control for the final library was performed by measuring the DNA concentration with the QuBit dsDNA
967 HS assay (Life Technologies, Q32851) on QuBit 2.0 Fluorometer (Life Technologies, Q32866) and by
968 determining library fragment sizes with the Bioanalyzer High Sensitivity DNA Kit (Agilent, 5067-4626).

969

970 **WGBS data processing and normalization**

971 Bisulfite alignment of the WGBS reads to the mm10/GRCm38 assembly of the mouse reference genome
972 and methylation calling was performed using *gemBS* (v.3.3.0)⁷². The methylation beta-values were
973 calculated using *RnBeads*⁷³. Sites exhibiting differential DNA methylation between populations were
974 identified using *limma* as implemented in *RnBeads*. Hypermethylated and hypomethylated regions

975 between MDR/MG^{hi} and MDR/MG^{lo} populations were defined using adjusted P-value ≤ 0.05 and
976 $|\log_2(\text{quotient of mean DNA methylation levels})| \geq 0.5$. The distribution of differentially methylated
977 regions was calculated using PAVIS⁶⁹. The QC table (**Extended Table 2**) and the differentially
978 methylated regions (**Extended Table 3**) for WGBS-seq of *in vivo* TILs is available in supplementary
979 information.

980

981 **Identifying TF binding motifs**

982 To identify TF-binding motifs enriched in the sets of accessible (or methylated) regions, we used *i-*
983 *cisTarget* (online v.5.0, input bed files, genome mm9, 20003 PWMs)⁷⁴. The UCSC *liftover* tool was used
984 to convert analyzed regions from mm10 to mm9. Predicted target regions from the same motif cluster
985 were merged. TFs expressed in our RNA data and annotated for binding enriched motifs specifically in
986 MDR/MG^{hi} or MDR/MG^{lo} were assigned.

987

988 **Pathway enrichment analysis**

989 Pathway analysis was performed with *Enrichr*⁷⁵ where genes assigned to sets of differentially accessible
990 or methylated regions were compared to genesets from NCI-Nature 2016 Pathway database.

991

992 **Examination of mitochondrial fitness with *in vitro* treatments**

993 For TCM/TCR/Hypoxia experiment, *in vitro*-activated CD8⁺ T cells were cultured with YUMM1.7
994 melanoma conditional medium in the presence of Dynabeads Mouse T-Activator CD3/CD28 (Gibco)
995 under hypoxia condition (1.0% O₂) w/ or w/o 10 mM glucose. For mitochondrial uncouplers treatments,
996 *in vitro*-activated CD8⁺ T cells were cultured in medium either with 10 μ M oligomycin/1 μ M antimycin
997 A (Sigma-Aldrich) for 4 h or 10 μ M oligomycin/200 μ M Mdivi-1 for 6 h. For improvement of
998 mitochondrial fitness, *in vitro*-activated CD8⁺ T cells were cultured under TCM/TCR/Hypoxia condition
999 with 400 μ M NR or 50 μ M MitoTempo (Sigma-Aldrich).

1000

1001 **RNA extraction, RT-PCR and qPCR**

1002 *In vitro*-activated CD8⁺ T cells upon indicated treatments were collected. RNAs were then extracted using
1003 TRIzol reagent (Life Technologies). Complementary DNA was converted from mRNA using M-MLV
1004 Reverse Transcriptase (Promega). Indicated mRNA expression was performed in triplicate by quantitative
1005 real-time RT-PCR on a LightCycler 480 Instrument II machine (Roche Life Science) using KAPA SYBR
1006 FAST qPCR Kit Master Mix (KAPA Biosystems). Relative expression was normalized by the expression
1007 of *Actb* in each sample.

1008

1009 **Single cell RNA-seq data analysis for hypoxia-related gene signature**

1010 Two processed scRNA-seq datasets for melanoma^{50, 76} were obtained from Gene Expression Omnibus
1011 (GEO; <https://www.ncbi.nlm.nih.gov/gds>) under accession numbers GSE72056 and GSE115978. The
1012 deconvolution method⁷⁷ implemented in was applied to normalize the read counts among cells. The read
1013 count for each gene was computed by multiplying the TPM value and gene length (for gene with multiple
1014 transcripts, the length of the longest transcript was used). Normalized gene counts were finally
1015 transformed back to TPM by dividing the gene lengths. The gene expression levels were quantified as the
1016 $\log_2(\text{TPM} + 1)$ for the following analysis. For analysis of the four states of CD8⁺ T cells, CD8⁺ T cells
1017 were classified as non-exhausted (*PDCDI*⁻, *PRDMI*⁺, *KLRG*⁺) and exhausted (*PDCDI*⁺) cells. Then,
1018 among exhausted population, we subsequently defined the *TCF7*⁺*HAVCR2*⁻ as the progenitor exhausted
1019 cells. The other exhausted cells with *TCF7*-low and *HAVCR2*-high were further ranked from low to high
1020 on basis of the average expression level of *HAVCR2*, *LAG3* and *CTLA4*. The cells ranked between 35%-
1021 65% were defined as the partially exhausted cells, while the cells ranked above 70% were defined as the
1022 fully exhausted cells. The evaluation of the hypoxia status with the gene set (from
1023 <https://reactome.org/content/detail/R-HSA-1234174>) was further conducted among four states of CD8⁺
1024 cells. The Mann-Whitney test were applied to assess significant differences between fully exhausted cells
1025 and other cell populations.

1026

1027 **Statistical analysis**

1028 Data points represent biological replicates and are shown as mean \pm s.e.m. or mean \pm s.d. as mentioned in
1029 the figure legends. Statistical significance was determined as indicated in the figure legends. Wilcoxon
1030 matched-pairs signed rank test was applied to determine statistical differences of TCR clonality between
1031 MDR/MG^{hi} and MDR/MG^{lo} population isolated from human colon cancer. Other data were analyzed
1032 using two-tailed, unpaired/paired, Student's *t*-test as mentioned in the figure legends.

1033

1034 **Reporting Summary.** Detailed information on experimental design is available in the Life Sciences
1035 Reporting Summary linked to this article.

1036

1037 **Data availability**

1038 The Smart-seq2, ATAC-seq and WGBS data are available in the Gene Expression Omnibus database
1039 under accession code (ATAC-seq: GSE144582; WGBS: GSE144583; RNA-seq: GSE156506). The data
1040 analysis code is available at https://github.com/himrichova/CD8_TIL_exhaustion. Processed data are,
1041 furthermore, publicly available in the UCSC Genome Browser using the following link: [http://genome-](http://genome-euro.ucsc.edu/s/himrichova/CD8_TIL_exhaustion_mm10)
1042 [euro.ucsc.edu/s/himrichova/CD8_TIL_exhaustion_mm10](http://genome-euro.ucsc.edu/s/himrichova/CD8_TIL_exhaustion_mm10). All the information and data are summarized

1043 and available at <https://www.medical-epigenomics.org/papers/Yu2020/#home>. Other relevant data are
1044 available from the corresponding author upon request.

1045

1046

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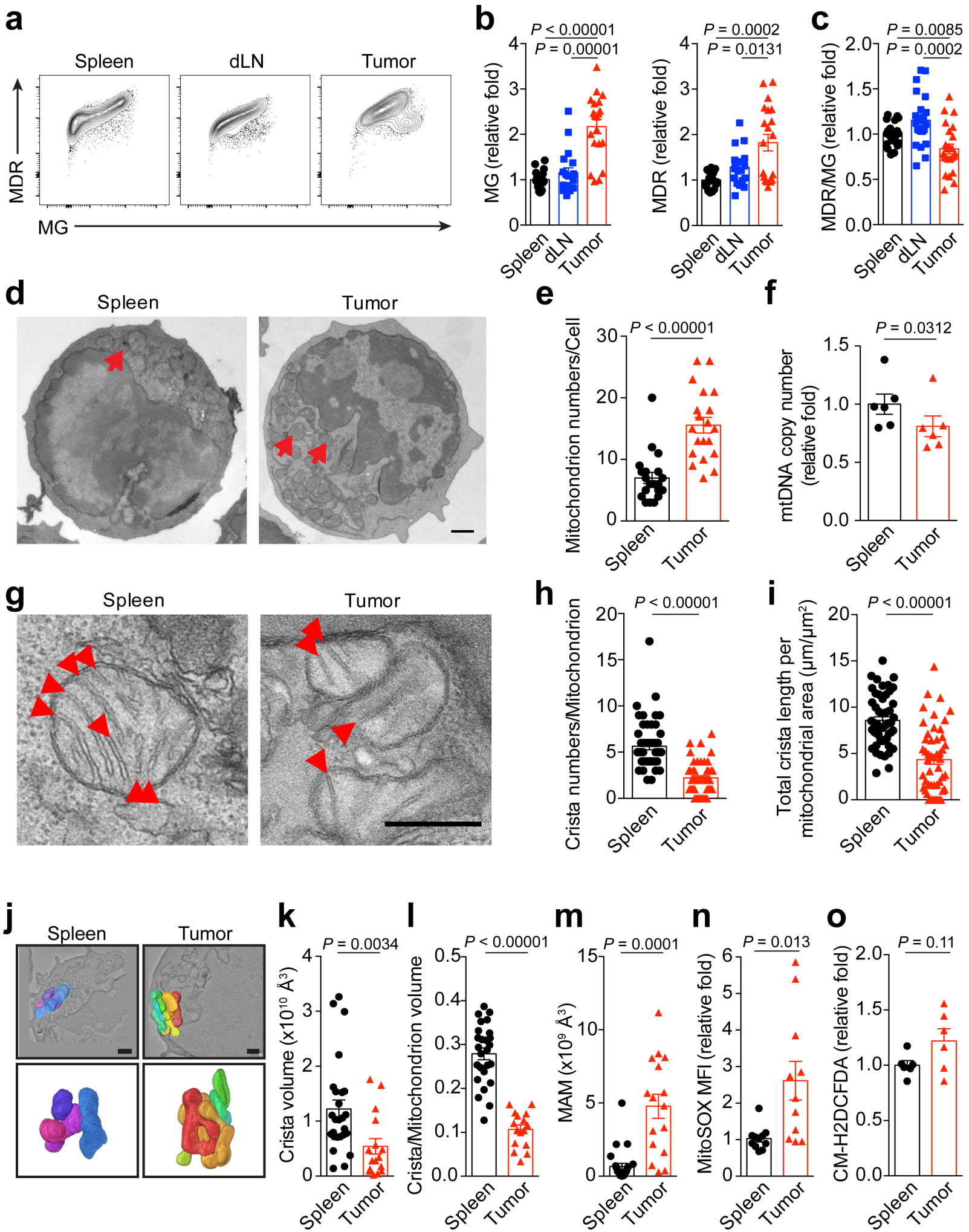


Figure 1

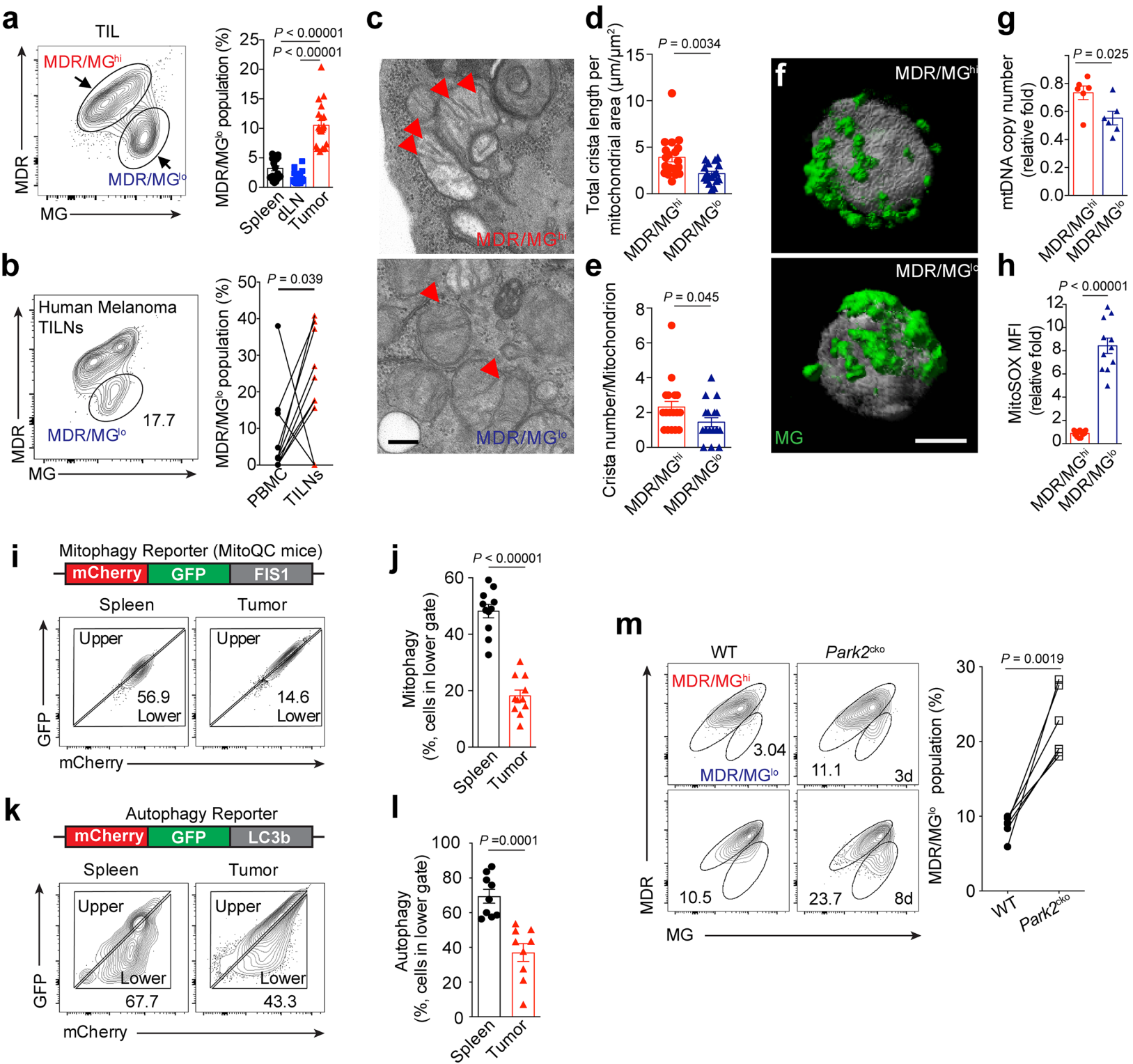


Figure 2

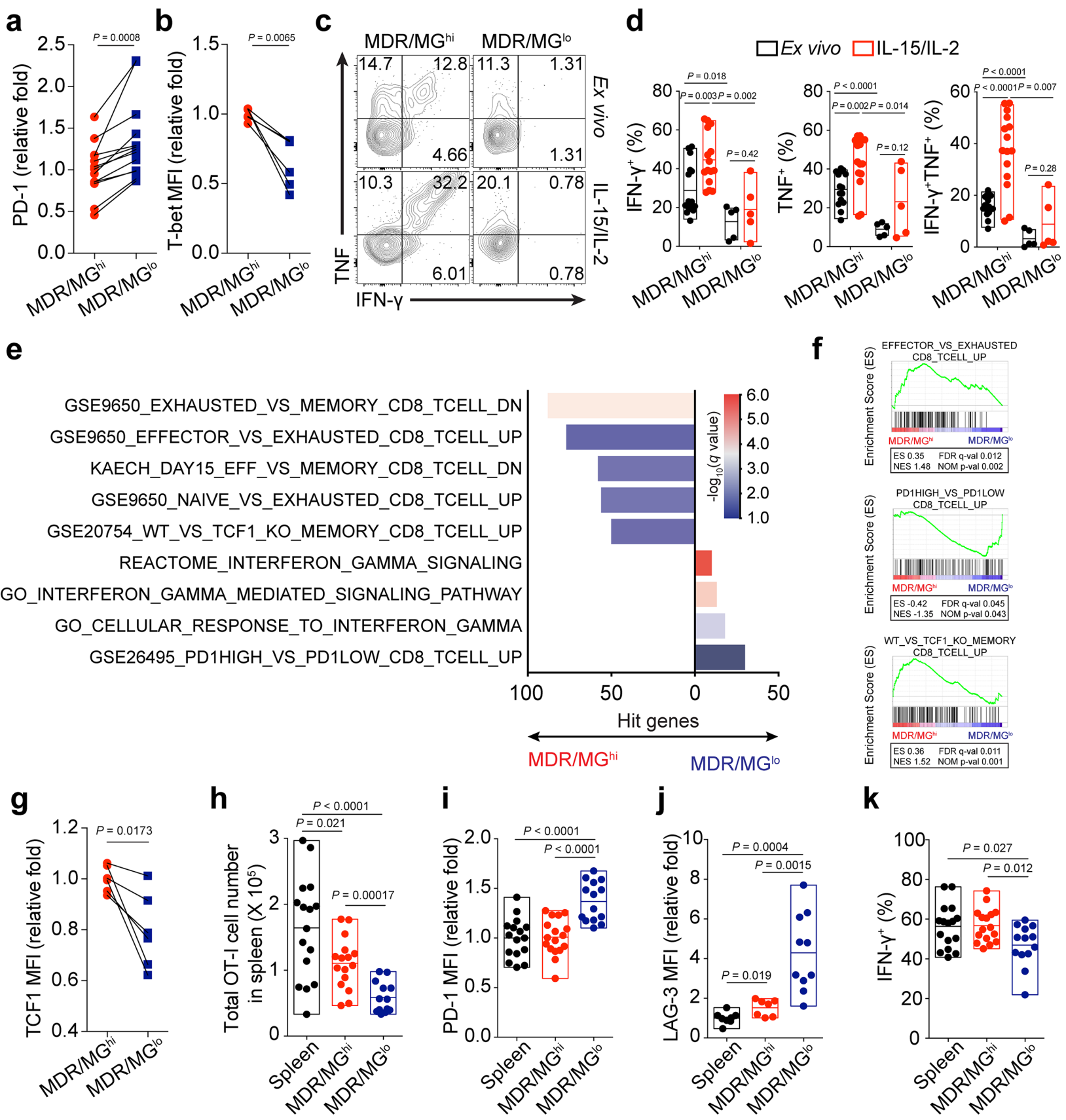


Figure 3

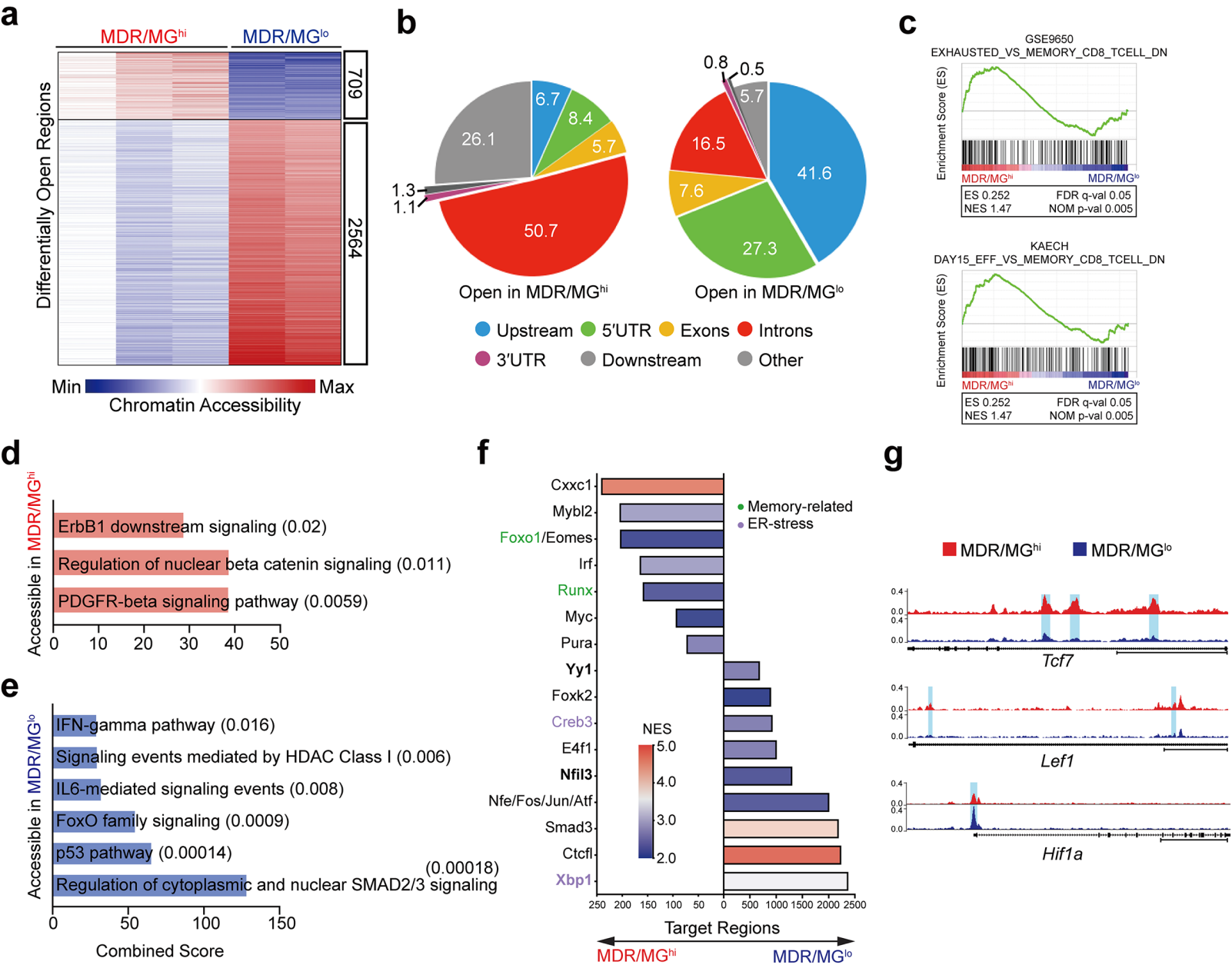


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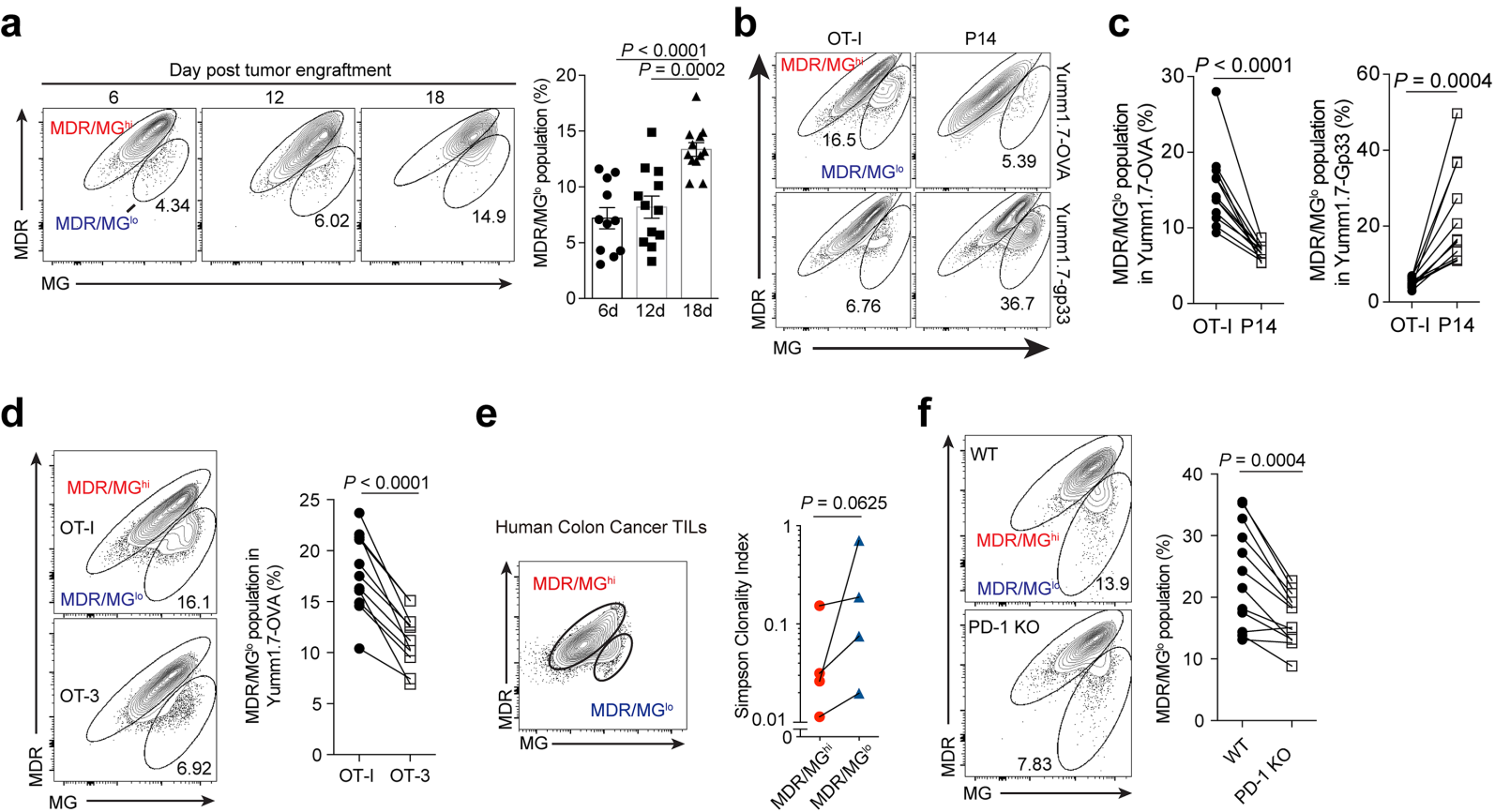


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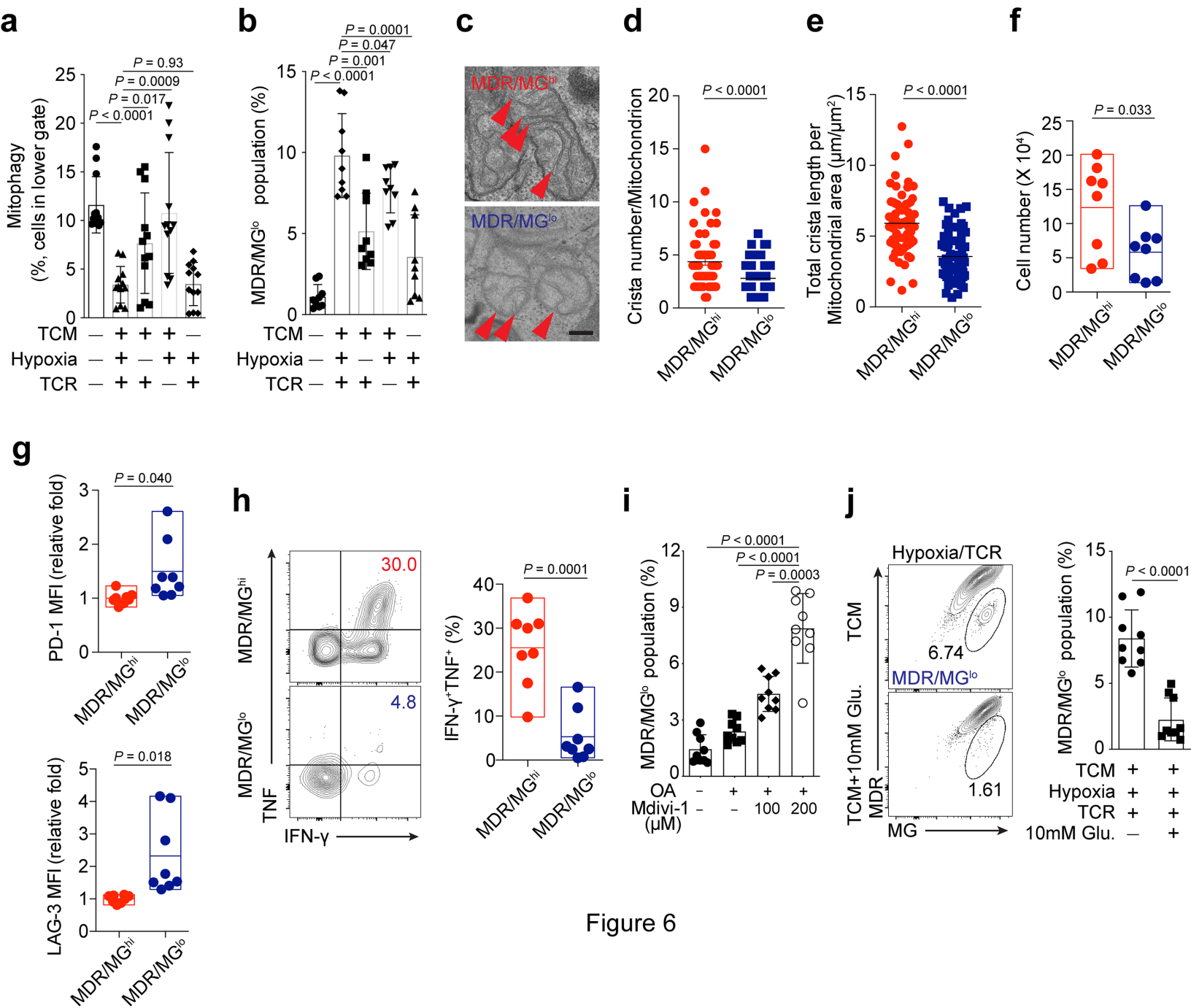


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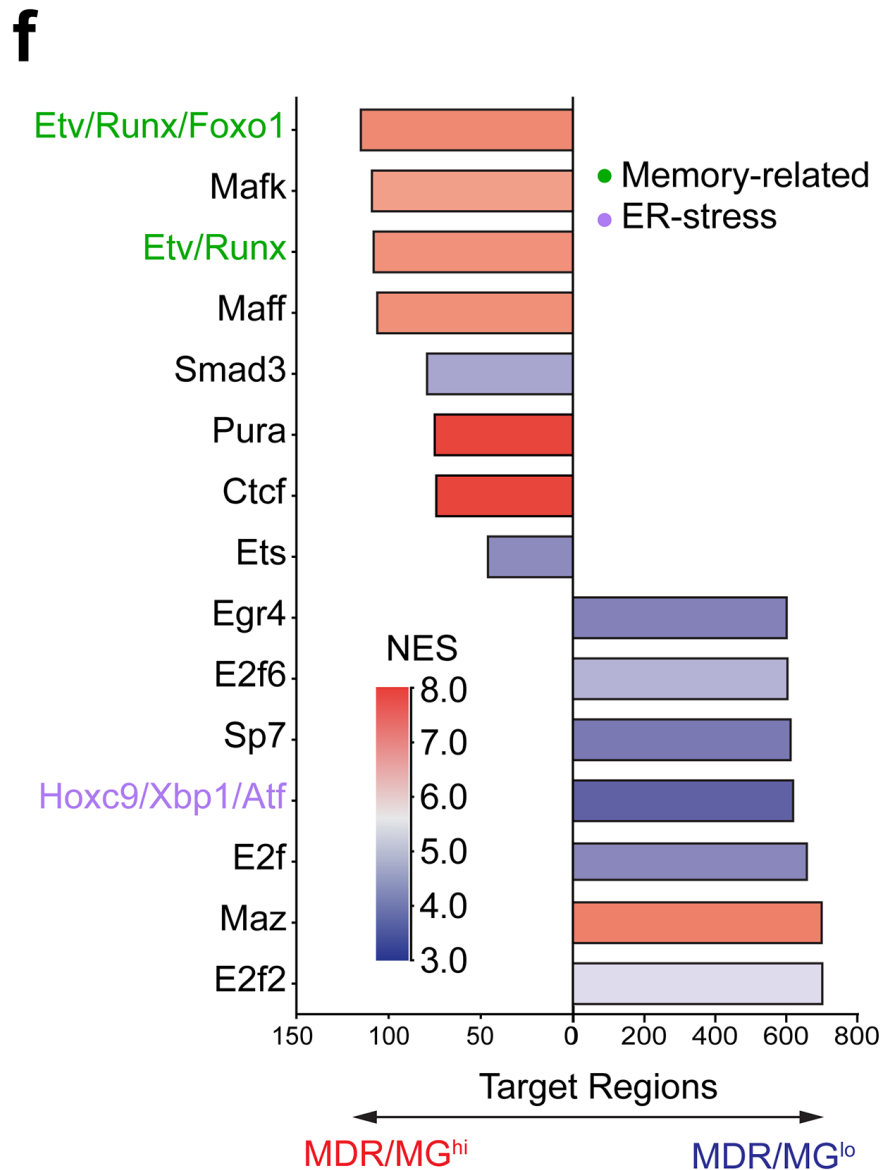
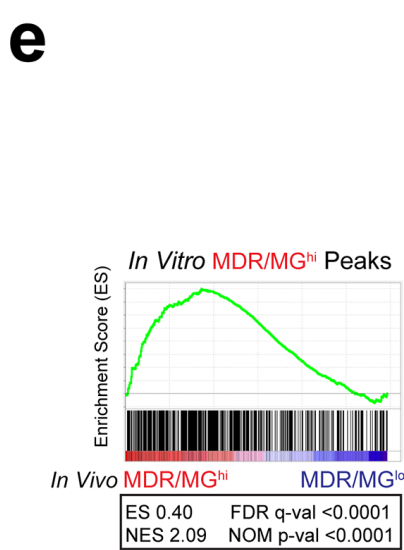
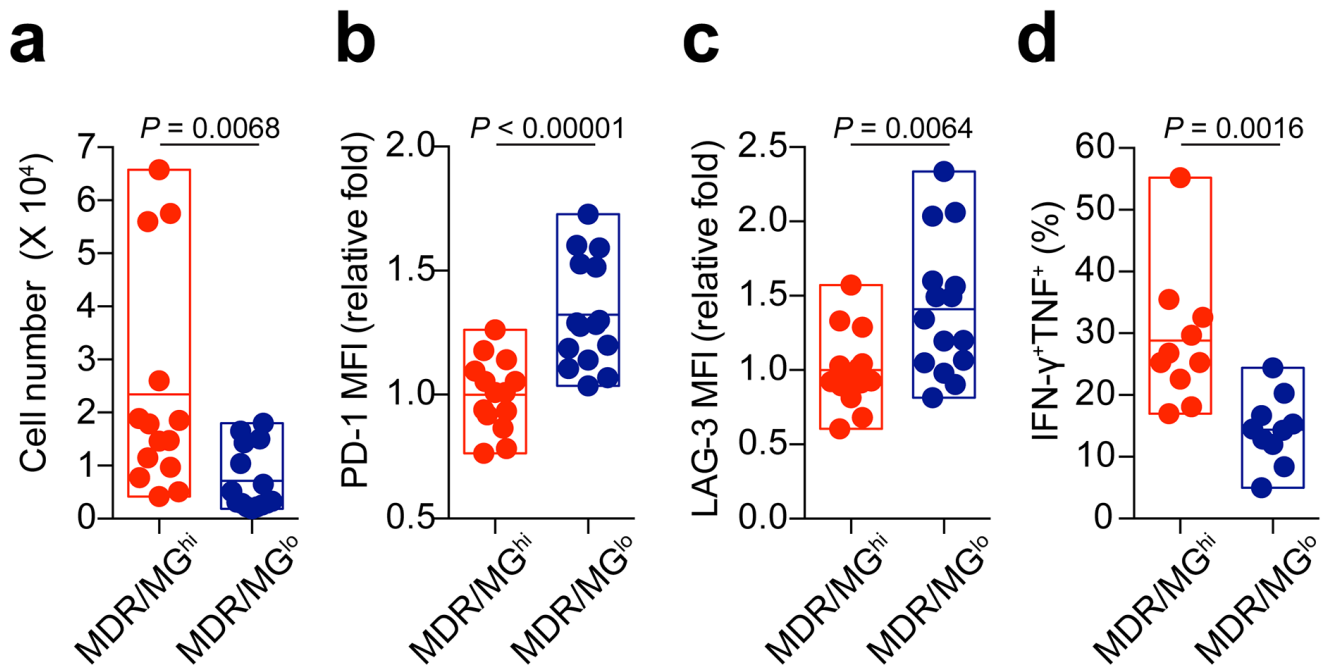


Figure 7

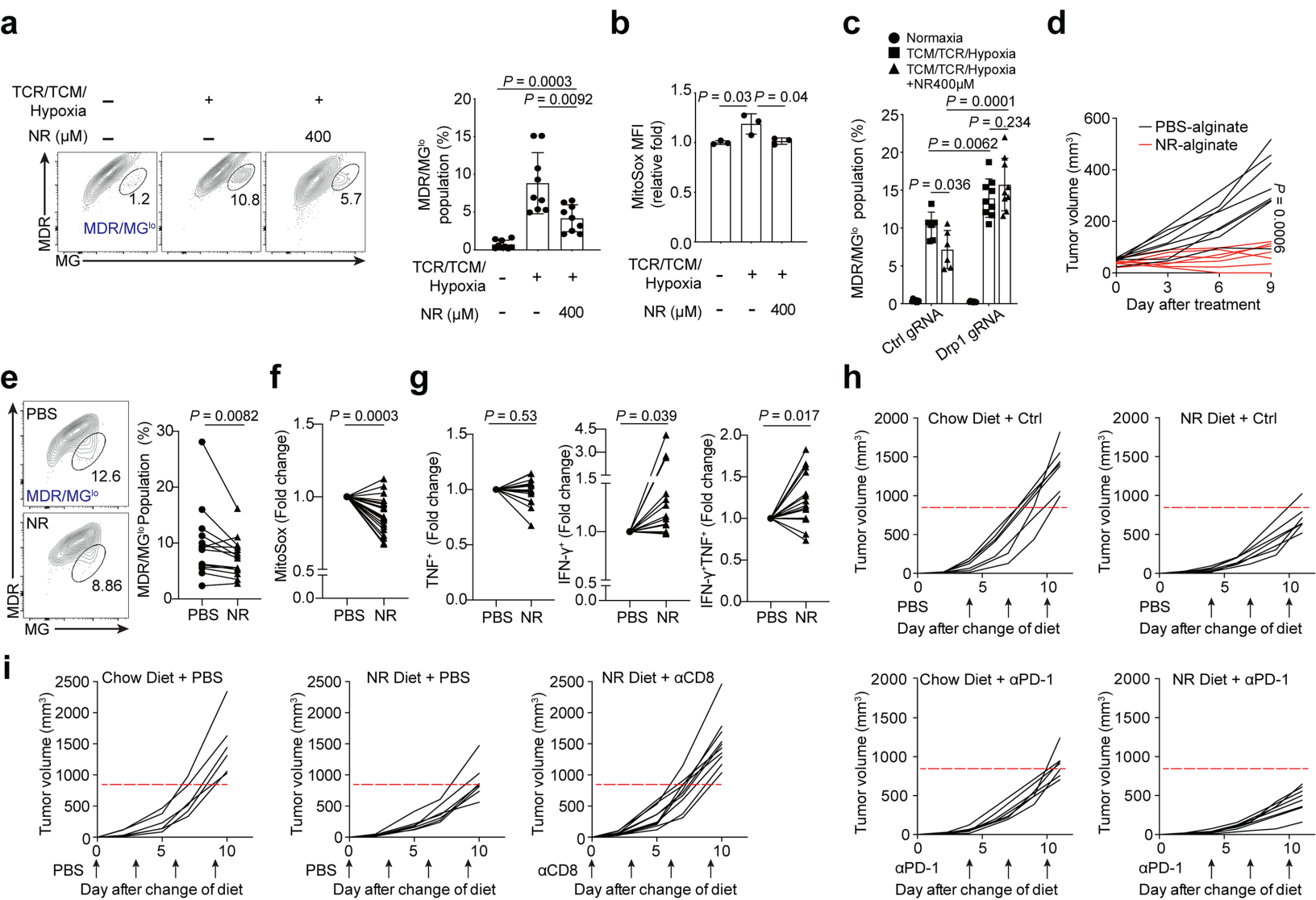
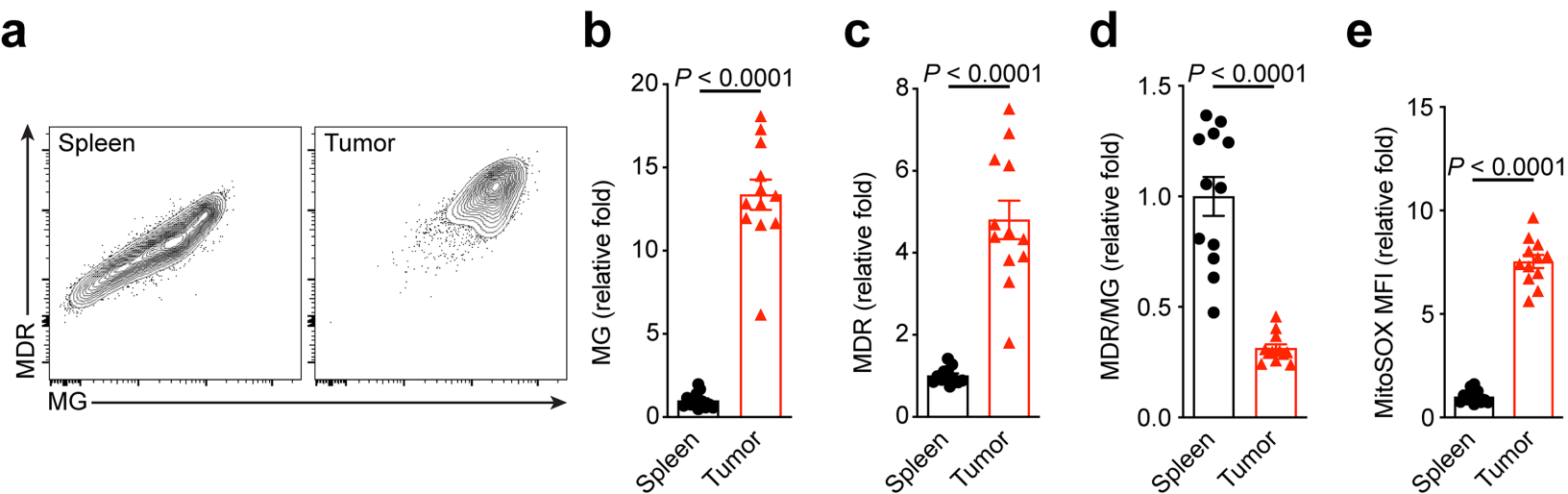
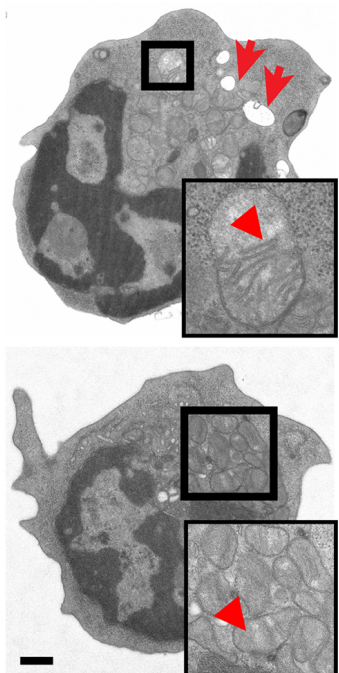
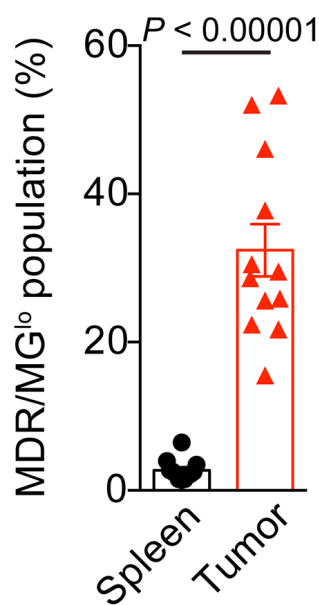
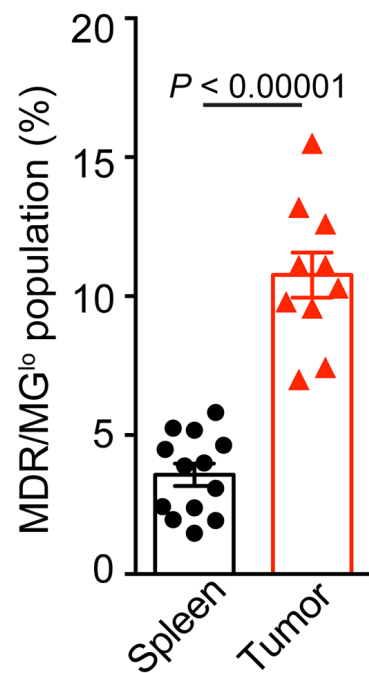
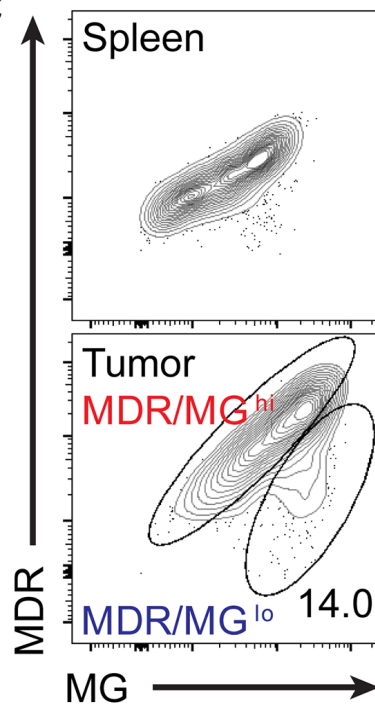
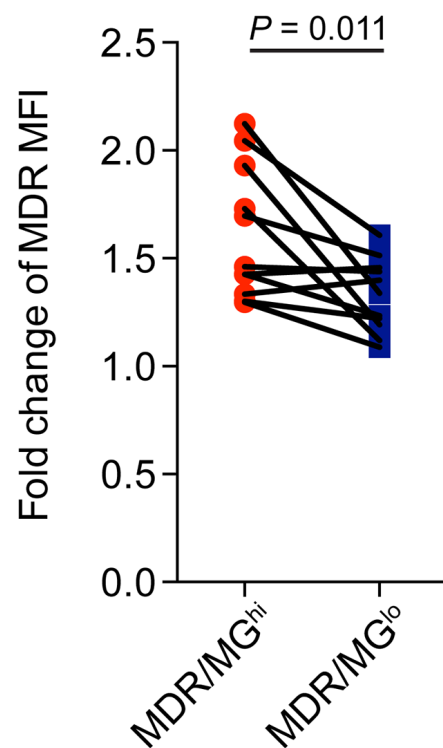
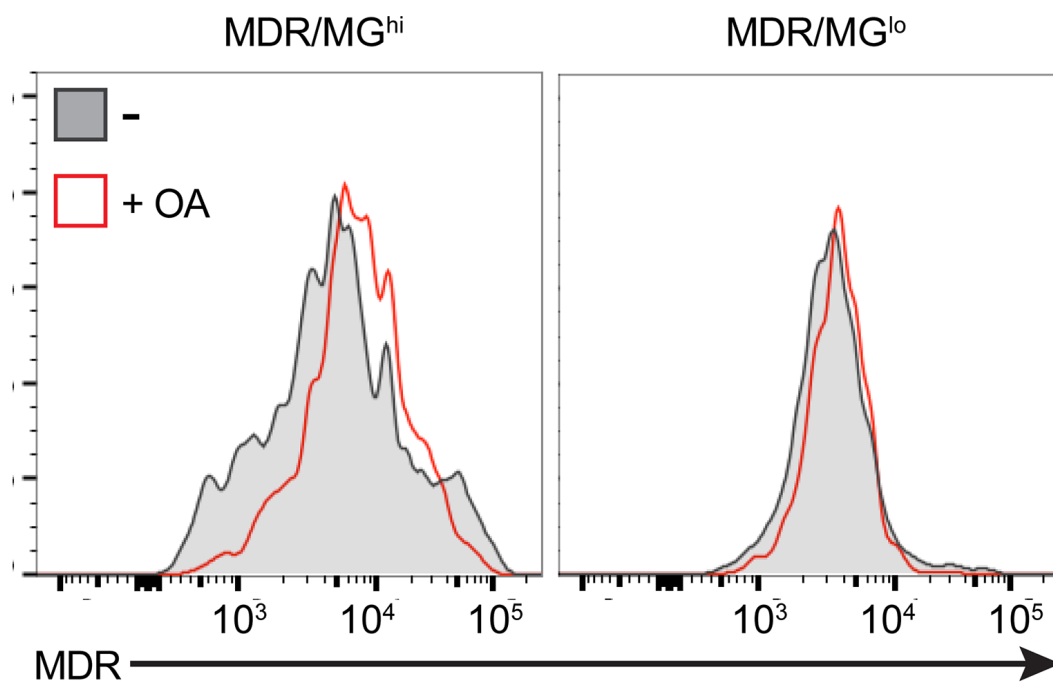


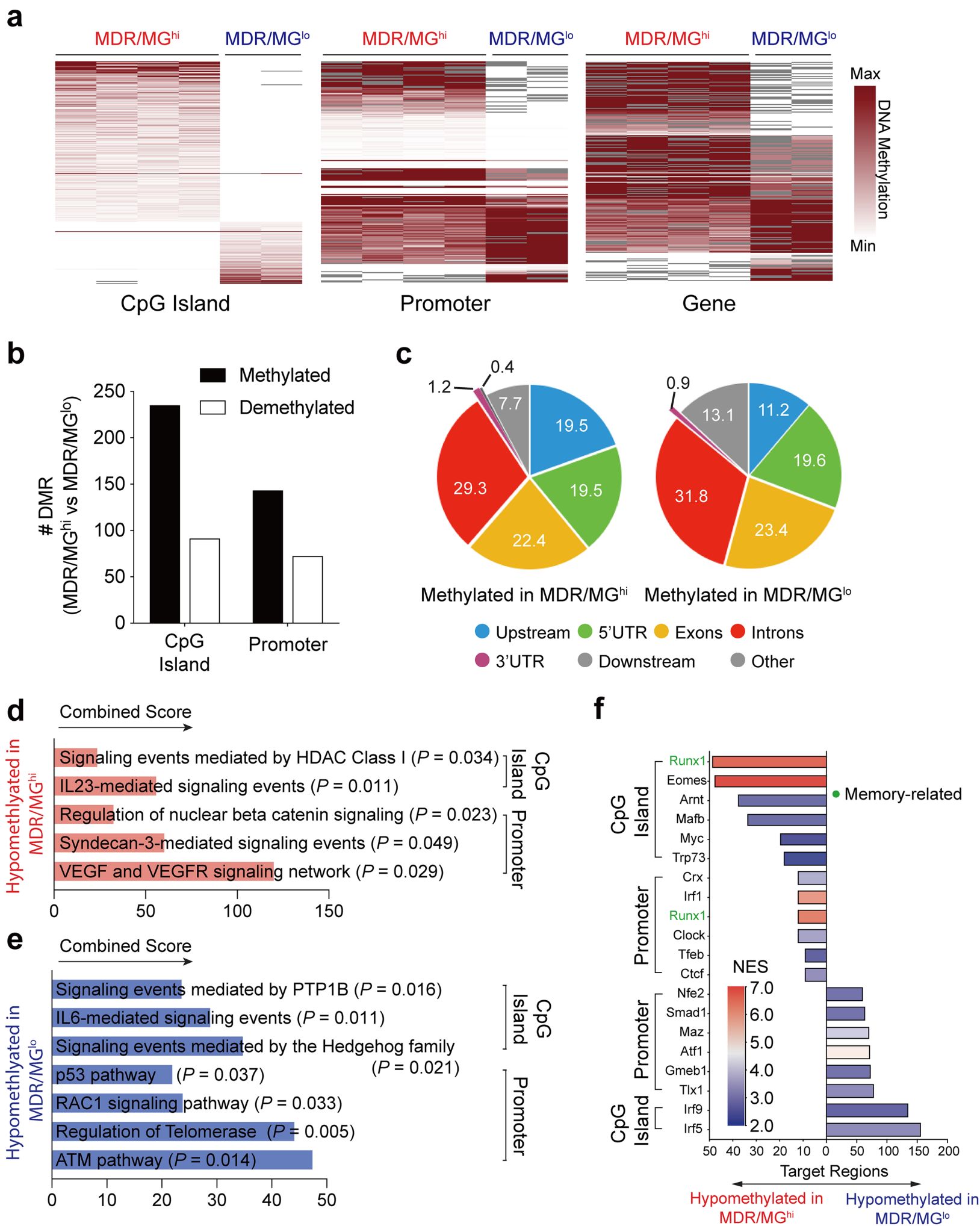
Figure 8



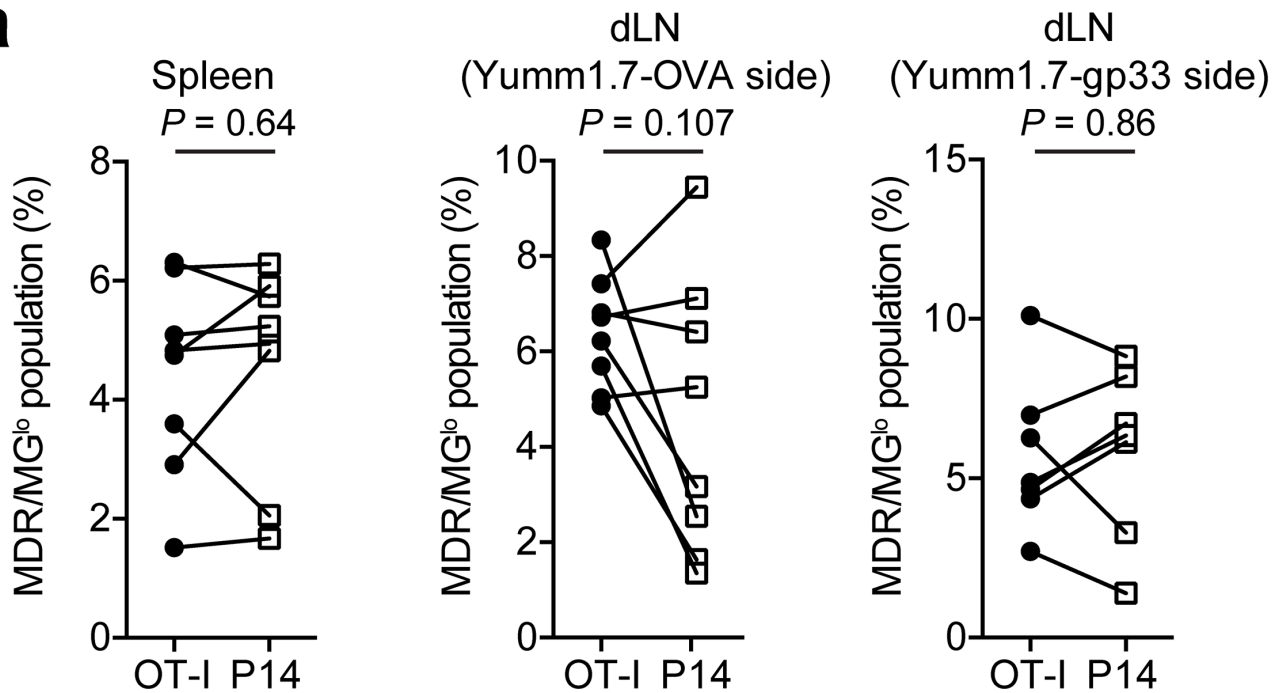
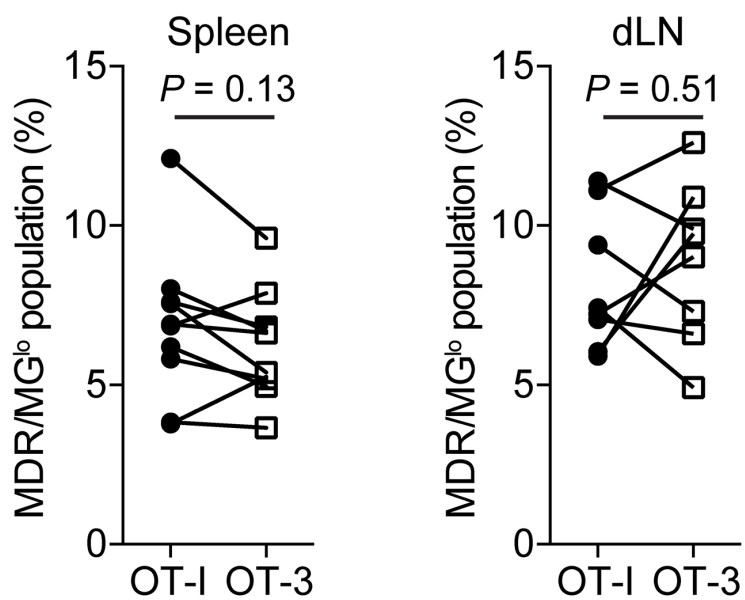
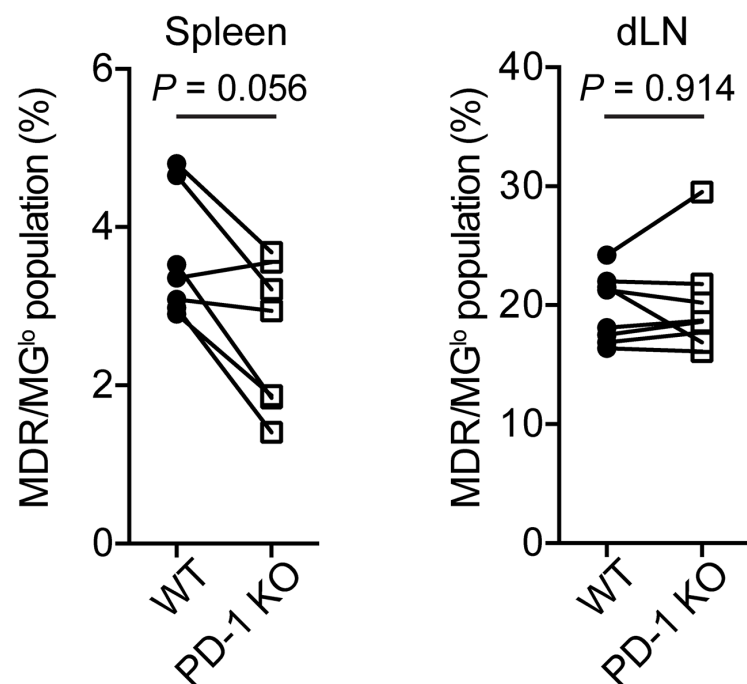
Extended Data Figure 1

a**b****c****d**

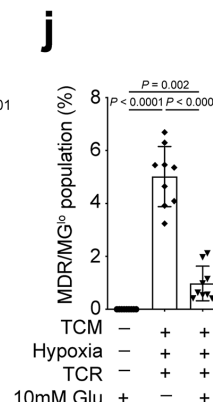
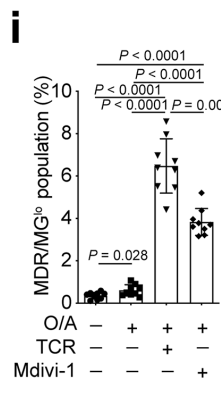
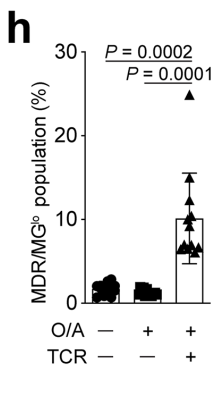
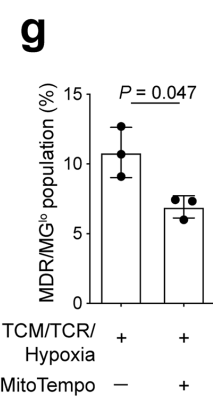
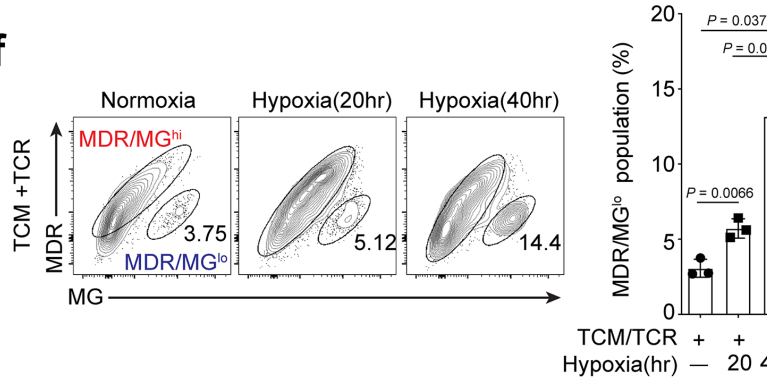
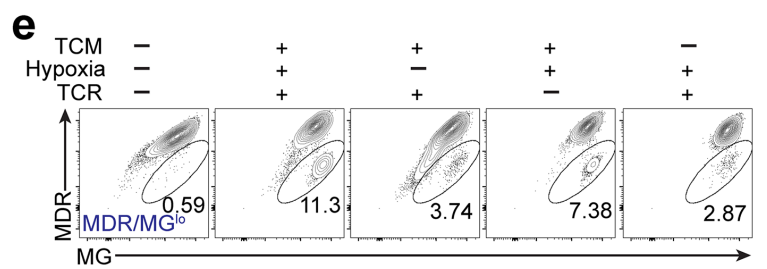
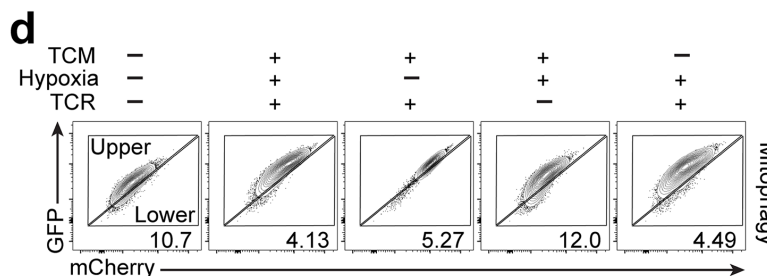
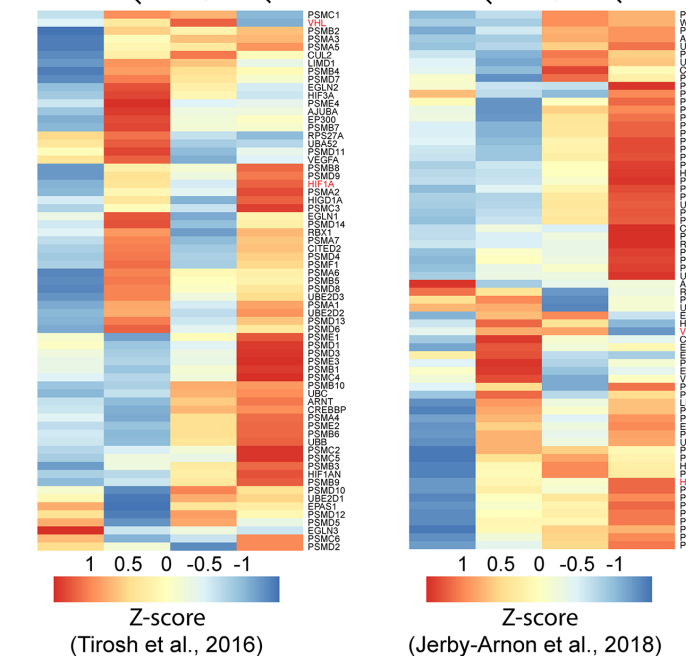
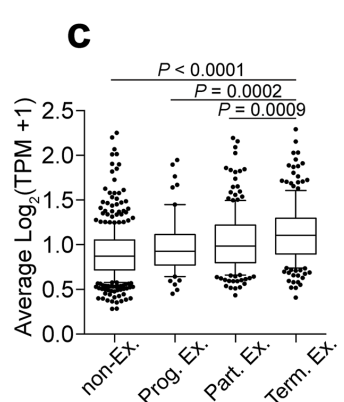
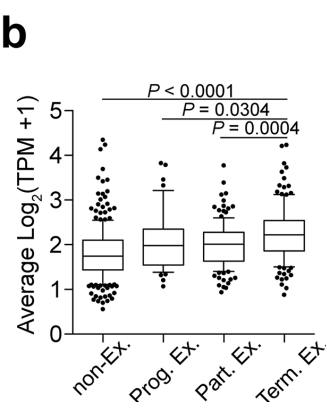
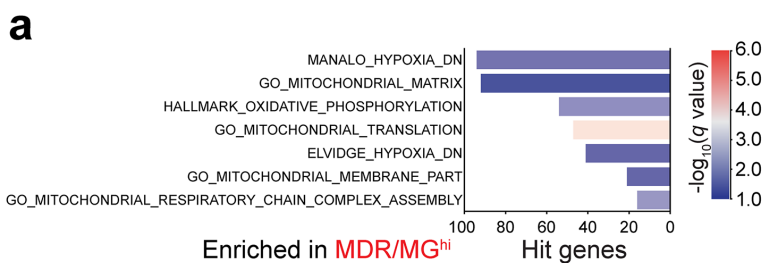
Extended Data Figure 2



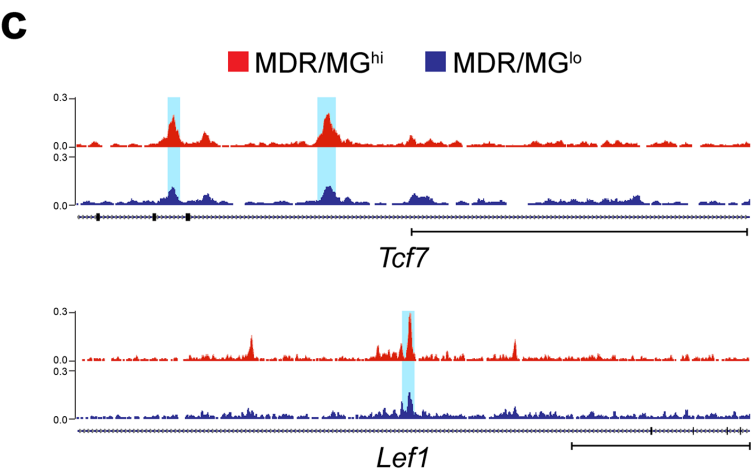
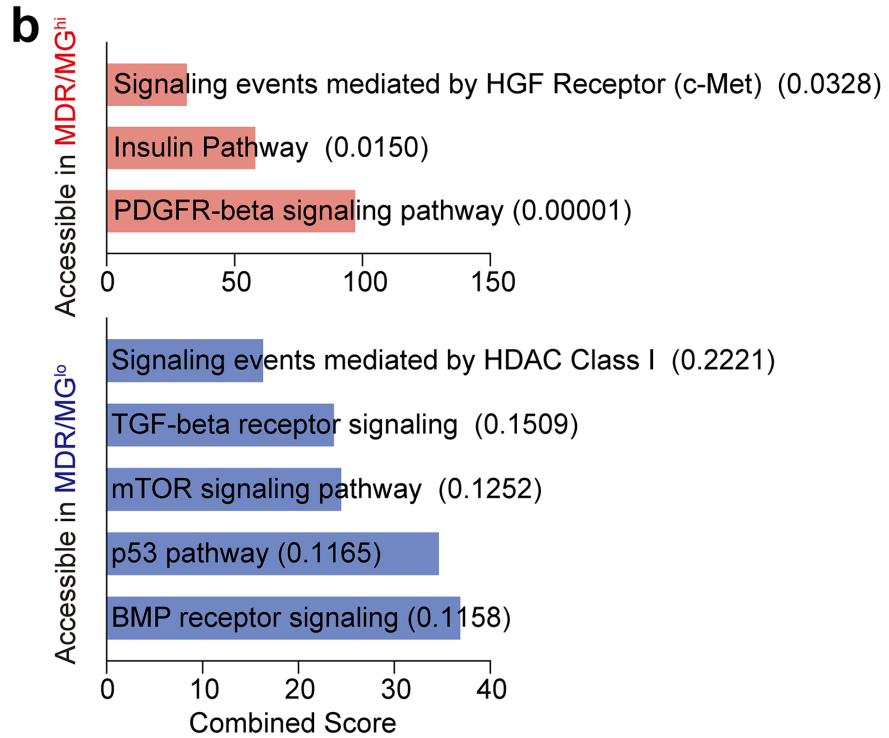
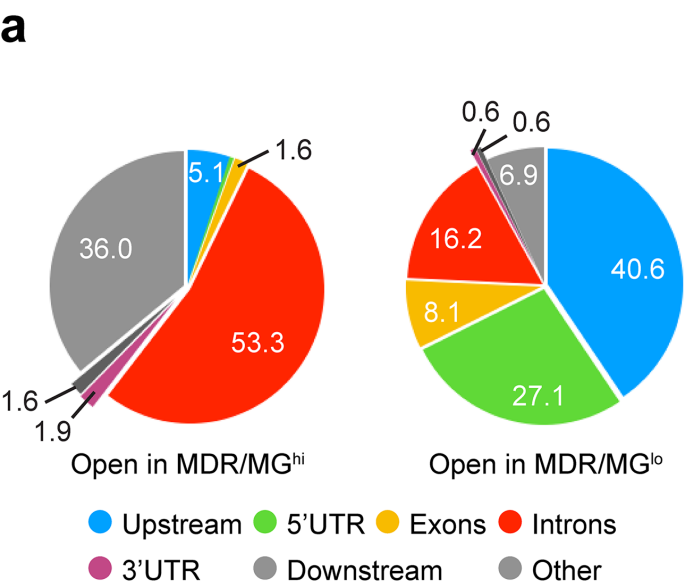
Extended Data Figure 3

a**b****c**

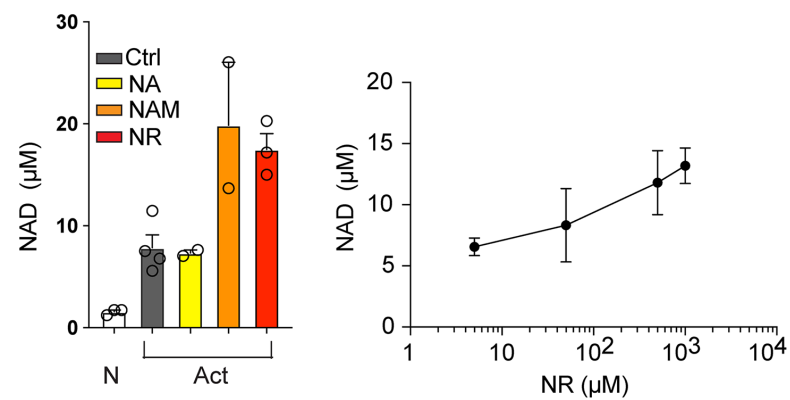
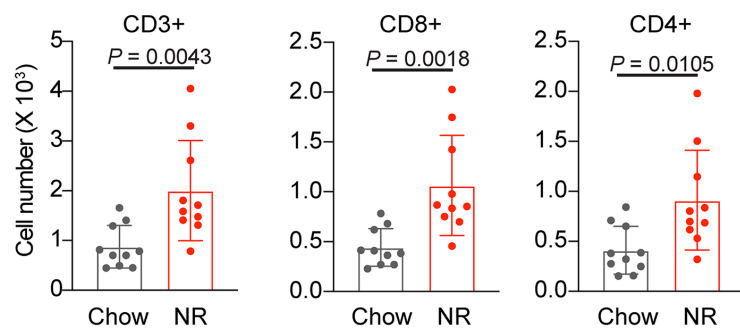
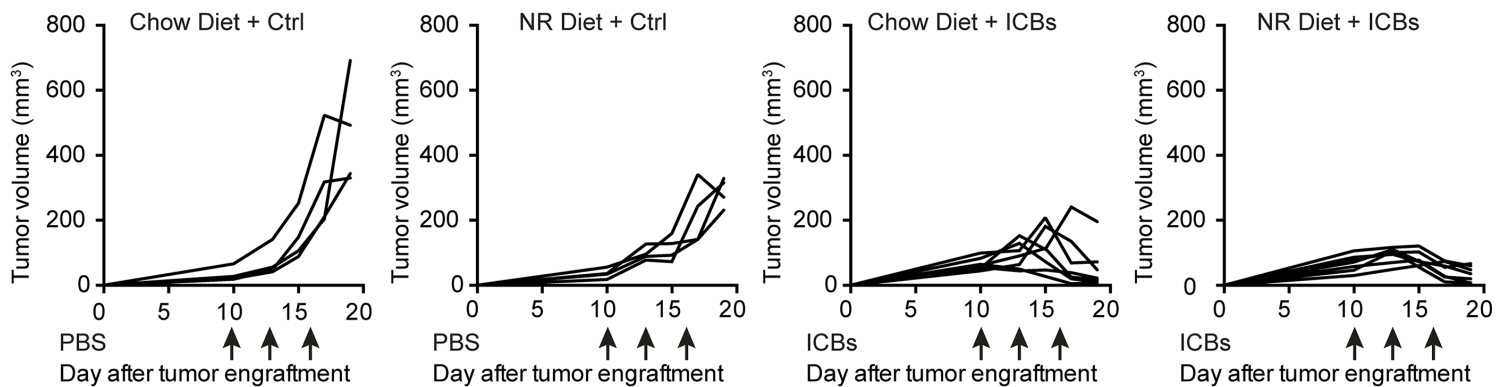
Extended Data Figure 4



Extended Data Figure 5



Extended Data Figure 6

a**b****c**

Extended Data Figure 7