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## **Metabolic signaling directs the reciprocal lineage decisions of**  αβ **and** γδ **T cells**

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## **Abstract**

The interaction between extrinsic factors and intrinsic signal strength governs thymocyte development, but the mechanisms linking them remain elusive. We report that mTORC1 couples microenvironmental cues with metabolic programs to orchestrate the reciprocal development of two fundamentally distinct T cell lineages, the αβ and  $\gamma$ δ T cells. Developing thymocytes dynamically engage metabolic programs including glycolysis and oxidative phosphorylation, as well as mTORC1 signaling. Loss of RAPTOR-mediated mTORC1 activity impairs the development of  $\alpha\beta$  T cells but surprisingly promotes  $\gamma\delta$  T cell generation, associated with disrupted metabolic remodeling of oxidative and glycolytic metabolism. Mechanistically, we identify mTORC1-dependent control of reactive oxygen species (ROS) production as a key metabolic signal in mediating  $\alpha\beta$  and  $\gamma\delta$  T cell development, and perturbation of redox homeostasis impinges upon thymocyte fate decisions and mTORC1-associated phenotypes. Furthermore, single-cell RNA sequencing and genetic dissection reveal that mTORC1 links developmental signals from T cell receptors and NOTCH to coordinate metabolic activity and signal strength. Our results establish mTORC1-driven metabolic signaling as a decisive factor for

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K.Y. designed and performed experiments, and wrote the manuscript; D.B.B. designed and performed experiments, and contributed to writing of the manuscript; X.C., C.R., J.E., and W.C. performed single-cell RNA sequencing experiments and analysis; G.N. and Y.D. performed microarray analysis; P.D., W.A., X.J.G. and P.G.T. performed analysis of γδ T cell subsets; A.K. contributed to molecular experiments; H.C. designed experiments, wrote the manuscript, and provided overall direction.

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The authors declare no competing financial interests.

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Microarray data are available at GEO under accession number GSE86495.

reciprocal αβ and γδ T cell development, and provide insight into metabolic control of cell signaling and fate decisions.

## **One Sentence Summary:**

Development of  $\alpha\beta$  and  $\gamma\delta$  T cells requires coupling of environmental signals with metabolic and redox regulation by mTORC1.

## **INTRODUCTION**

The thymus supports and guides the generation of a diverse repertoire of T cells from precursors migrating from the bone marrow (1). These thymocytes undergo a series of wellcharacterized developmental processes and differentiate into two fundamentally distinct T cell lineages, the  $\alpha\beta$  and the  $\gamma\delta$  T cells, which serve critical immune functions (fig. S1A) (2, 3). The divergence of  $\alpha\beta$  and γδ T cells occurs during thymocyte development around a stage known as double-negative (DN) 3, a crucial checkpoint in which the common progenitors undergo rearrangement of the T cell receptor (TCR) β, TCR $γ$ , and TCRδ chains through integration of diverse thymic environmental signals (2, 3). For αβ T cell commitment, the expression of a functional pre-TCR after a productive rearrangement of the TCRβ chain, together with NOTCH and other signals, induces a proliferative response accompanied by differentiation into double-positive (DP) cells (4). In contrast, NOTCH signaling plays a less important role in  $\gamma \delta$  T cell development (5, 6). Discrete models, such as the instructive and stochastic models, have been proposed to describe the contribution of TCR-mediated signals to T cell lineage choices (3). More recent studies point to a key role of signal strength, in particular the ERK, EGR1, and ID3 signaling axis (ERK/EGR1/ID3), in determining lineage choices of thymic progenitors (7–10). However, the mechanisms linking extracellular stimuli to intrinsic signal strength remain elusive.

Emerging studies reveal metabolic reprogramming as a fundamental requirement for T cell function and adaptive immune responses (11, 12). For thymocyte development, evidence to date is mainly focused on the trophic effects of NOTCH and IL-7 on cell survival and growth (13, 14), but it remains unknown whether a specific metabolic signal is linked to lineage decisions and how metabolic programs interplay with immune signals. The mechanistic target of rapamycin (mTOR) is a central sensor that integrates immune signals and metabolic cues in orchestrating T cell function and fate (15). Emerging studies also highlight the involvement of mTOR signaling in thymocyte development and T-cell acute lymphoblastic leukemia (T-ALL) progression (16–18). However, whether mTOR signaling is implicated in  $\alpha\beta$  and  $\gamma\delta$  T cell lineage choices remains unknown.

Capitalizing on genetic deletion of RAPTOR, here we report that RAPTOR-dependent mTORC1 is a central regulator of T cell development and lineage choices by coordinating environmental cues and cellular metabolic programs. We find that developing thymocytes engage dynamic regulation of metabolic and mTORC1 activation. Loss of RAPTOR impairs αβ T cell development and reciprocally promotes γδ T cell development. mTORC1 signaling and the transcription factor c-MYC (MYC) constitute a feed-forward loop that orchestrates thymocyte lineage choices. RAPTOR deficiency disrupts the balance of

oxidative and glycolytic metabolism, and results in excessive production of ROS that contributes to thymocyte lineage choices. Combining single-cell RNA sequencing (scRNA-Seq) and transcriptome analysis and experimental validation, we revealed the key roles of mTORC1 in coordinating anabolic metabolism and signal strength. Our results establish metabolic control of signal strength and lineage choices as a fundamental mechanism in thymocyte development.

## **RESULTS**

## **Metabolic and mTORC1 activities are dynamically regulated in T cell development**

To understand metabolic regulation and requirements in developing thymocytes, we measured oxygen consumption rate (OCR) and extracellular acidification rate (ECAR), which respectively denote oxidative phosphorylation (OXPHOS) and glycolytic activities, in developing thymocytes. Specifically, we analyzed DN3 (the first stage with full T cell commitment (2)), DN4, and immature single-positive cells (ISP; the intermediate transitional stage between DN and DP stages), relative to quiescent DP thymocytes (fig. S1A). DN3 and ISP cells had the highest OCR at the basal level (Fig. 1A), whereas DN3 cells displayed an even greater spare respiratory capacity (SRC), a measure of how effectively the electron transport chain can respond to energy demand, than ISP cells (Fig. 1B). During the transition from DN3 to ISP cells, ECAR was progressively upregulated (Fig. 1C), indicating prominent upregulation of glycolysis in this process; this observation was confirmed by direct measurement of glycolytic activity (Fig. 1D). In contrast, DP cells markedly downregulated ECAR and glycolytic activity (Fig. 1, C and D). The dynamic regulation of OCR and ECAR in thymocyte subsets translated into a higher OCR/ECAR ratio in DN3 and DP cells (Fig. 1E), indicating the preferential use of oxidative metabolism over glycolysis by these cells.

Metabolic activity is contingent upon nutrient uptake and mTOR activation, a crucial regulator of anabolic metabolism (15). Compared with DN3 and DP cells, DN4 and ISP cells showed higher expression of CD98 and CD71, the respective amino acid and iron transporters (fig. S1, B and C), and increased cell size (fig. S1D). Accordingly, DN4 and ISP cells had higher phosphorylation of S6, indicative of greater mTORC1 activity (Fig. 1F). Collectively, these results indicate the dynamic regulation of metabolic and mTORC1 activities in thymocyte development.

## **RAPTOR deficiency impairs DN to DP transition in** αβ **T cell development**

To define the function of mTORC1 signaling in thymocyte development, we generated Rptor<sup>fl/fl</sup>Cd2-Cre (Rptor<sup>-/-</sup>) mice with the Cd2-Cre transgene (19) to initiate deletion of RAPTOR, an obligatory component of mTORC1, in early DN cells. Complete deletion of RAPTOR was observed in DN3 cells (fig. S2, A and B). RAPTOR deficiency resulted in greatly reduced thymocyte cellularity (Fig. 1G), including an approximately 10-fold reduction of DP cells as well as a considerable loss of CD4SP and CD8SP cells (Fig. 1H and fig. S2C). Consequently, T cell numbers in the spleen were significantly decreased (fig. S2D). RAPTOR deletion, however, caused a proportional increase of the DN compartment (Fig. 1H and fig. S2C), suggesting a possible blockade at the DN to DP transition.

Hence, we performed detailed analysis of thymocyte subsets during the DN to DP transition. Although the frequency of  $Rptor^{-/-}$  DN3 cells was reduced, their absolute number was elevated and this was in association with accumulation of total DN cells (Fig. 2A). In support of a role for RAPTOR in the DN to DP transition,  $Rptot^{-1}$  thymus contained significantly elevated frequency and cellularity of DN4 (Fig. 2A) and ISP cells (Fig. 2B). Next, we generated mixed bone marrow (BM) chimeras consisting of  $CD45.1^+$  ('spike') and CD45.2<sup>+</sup> WT or *Rptor<sup>-/-</sup>* cells, and found that *Rptor<sup>-/-</sup>* but not WT or CD45.1<sup>+</sup> cells showed increased DN and ISP cells, but reduced DP cells (Fig. 2, **C** and **D**). Finally, to directly assess the DN to DP transition, we co-cultured DN3 cells with OP9 stromal cells expressing the NOTCH ligand Delta-like 1 (OP9-DL1 cells), which represents a well-established in vitro system that models thymocyte development (5). In this system,  $Rptot^{-/-}$  DN3 cells showed impaired capacity to progress into DP cells (Fig. 2E). Similarly,  $Rptor^{-/-}$  ISP cells had defective development into DP cells (fig. S3A), consistent with the accumulation of ISP cells in vivo (Fig. 2B). Collectively, these results indicate that RAPTOR mediates the transition from DN to DP cells in a cell-autonomous manner.

To explore the mechanistic basis, we examined the underlying cellular processes. Cell apoptosis, as indicated by staining of the active form of caspase-3, was not altered in any of the *Rptor*<sup>-/-</sup> subsets analyzed (fig. S3B). BrdU incorporation assay showed that RAPTOR deletion impaired proliferation of ISP cells, but not that of DN3 or DN4 cells (fig. S3C). The proliferative expansion in DN4 and ISP cells is known to be preceded by a period of quiescence at the DN3 stage (2). In fact, DN3 thymocytes are a mixture of two populations: small TCRβ-unrearranged DN3-E (DN3a) cells and large TCRβ-rearranged DN3-L (DN3b) cells that are beginning the progression toward DP cells (20, 21), which is associated with upregulated CD27 expression (fig. S3D). Compared with DN3a cells, DN3b cells had increased mTORC1 activity (fig. S3E). Further, RAPTOR deficiency impaired upregulation of cell size and expression of CD71 and CD98 as early as in DN3b cells, and these defects were exacerbated in DN4 and, more strikingly, in ISP cells (fig. S3F). However, induction of intracellular TCRβ (icTCRβ) proceeded largely normal in DN3b cells (fig. S3G). Despite the small reduction in icTCRβ expression in  $Rptor^{-/-}$  ISP cells (fig. S3G), transgenic expression of pre-rearranged OTII (MHC Class II-restricted) TCRαβ chains failed to rescue thymocyte developmental defects (Fig. 2F). These results indicate that RAPTOR deficiency does not affect thymocyte survival or pre-TCR induction, but prevents subsequent upregulation of cell size and nutrient receptors, ultimately leading to defective proliferation and differentiation of DN into DP cells.

Given that ISP cells represent a critical stage in the transition from DN to DP cells and are dysregulated in the absence of RAPTOR, we compared the transcriptional profiles of ISP cells from WT and  $Rptor^{-/-}$  mice. Gene set enrichment analysis (GSEA) (22) revealed that many downregulated gene sets in  $Rptor^{-/-}$  cells were related to metabolic programs, including cholesterol biosynthesis and the respiratory electron transport chain (fig. S4A), and real-time PCR analysis of lipogenic genes verified these hits (fig. S4B). Ingenuity Pathway Analysis (IPA) predicted the inhibition of MYC and SREBP factors (fig. S4C), which serve as crucial activators of anabolic metabolism (11, 12), in the absence of RAPTOR. Altogether, consistent with defective cell proliferation, growth, and nutrient

transporter expression (fig. S3),  $Rptor^{-/-}$  ISP cells show impaired gene expression programs mediating lipogenic and other anabolic metabolism.

### **Loss of RAPTOR enhances** γδ **T cell development**

Aside from the  $\alpha\beta$  T cell lineage, the  $\gamma\delta$  T cells are the other fundamentally distinct T cell lineage derived from the common thymocyte progenitors such as DN3 cells (2, 3). Surprisingly,  $Rptor^{-/-}$  mice had significantly increased frequency and cellularity of TCR $\gamma\delta^+$ T cells (Fig. 3A), resulting in a profoundly enhanced ratio of  $TCR\gamma\delta^+$  to  $TCR\beta^+T$  cells (fig. S5A). Rptor<sup>-/-</sup>  $\gamma$ δ T cells had efficient deletion of *Rptor* (fig. S5B), and this was associated with reduced cell size and lower CD71 and CD98 expression (fig. S5C).  $Rptor^{-/-} \gamma \delta$  T cells had slightly reduced Ki67 expression (fig. S5D), but largely normal caspase-3 activity (fig. S5E), indicating that the increase in the  $\gamma \delta$  T cell compartment was unlikely due to altered proliferation or apoptosis. The alteration in  $\gamma \delta$  T cell development was also observed in the previously mentioned mixed BM chimeras, in which  $CD45.2^+$  *Rptor*<sup>-/-</sup> donor cells had much higher frequency of γδ T cells than WT cells (Fig. 3, **B** and **C**), indicating that RAPTOR loss promotes γδ T cell development in a cell-autonomous manner (i.e. not secondary to the loss of DP thymocytes given that normal thymic cellularity is provided by the CD45.1<sup>+</sup> spike cells). This conclusion was further verified in the OP9-DL1 co-culture system, in which  $Rptor^{-/-}$  DN3a cells showed increased generation of  $\gamma \delta$  T cells than their WT counterparts (fig. S5, F to H), even in the presence of  $CD45.1^+$  spike cells (fig. S5I). Of note, CD73 has been recently identified as an important marker to define γδ T cell commitment (23).  $Rptor^{-/-}$  mice had a greatly elevated percentage and cellularity of the CD73<sup>+</sup> population in thymic  $\gamma \delta$  T cells (Fig. 3, **D** and **E**). Additionally, the expression level of CD73 was increased in RAPTOR-deficient  $\gamma \delta$  T cells from both the thymus and spleen (Fig. 3F) as well as in those generated in vitro in the OP9-DL1 system (fig. S5, F and I), further supporting the role of RAPTOR in constraining  $\gamma \delta$  T cell development. To assess the involvement of RAPTOR in the TCR repertoire of  $\gamma \delta$  T cells, we examined the usage of diverse TCR $\gamma$  chains in  $\gamma \delta$  T cells from the thymus (24, 25), and found that the composition of various V $\gamma$  chains was comparable between WT and  $Rptor^{-/-} \gamma \delta$  T cells (fig. S5J). In line with this finding, RAPTOR-deficient  $\gamma \delta$  T cells had largely normal proportions of V $\gamma$ 1.1<sup>+</sup> and  $V\gamma2^+$  subsets in the thymus (fig. S5, K and L). Taken together, our results indicate that RAPTOR deficiency promotes  $\gamma \delta$  T cell commitment without affecting the usage of TCR $\gamma$ chains.

As an important regulator of mTORC1 signaling, the small G protein RHEB integrates different upstream signals from growth factor stimulation (15). However, *Rheb*<sup>fl/fl</sup>Cd2-Cre  $(Rheb^{-/-})$  mice had largely normal cellularity and frequencies of thymocyte subsets, including  $\gamma \delta$  T cells (fig. S6, A and B). On the other hand, even though RICTOR/mTORC2 is required for αβ T cell development (26, 27), loss of RICTOR (*Rictor*<sup>fl/fl</sup>Cd2-Cre or Rictor<sup>-/–</sup> mice) did not impact the frequency or cellularity of  $\gamma \delta$  T cells (fig. S6C). Deletion of RICTOR in the  $Rptor^{-/-}$  background further reduced the cellularity of total thymocytes, including  $\gamma \delta$  T cells (fig. S6C), but it had no substantial rescue effects on the frequency of γδ T cells (fig. S6C) or CD73 expression (fig. S6D). Collectively, RAPTOR-mTORC1 exerts a unique and cell-autonomous role in constraining γδ T cell development.

## **The reciprocal interplay between mTORC1 and MYC shapes thymocyte development**

Given the link of mTORC1 to cell growth and anabolic metabolism in thymocyte development (fig. S3 and S4), we next explored the functional importance of selective metabolic programs in T cell development by targeting key transcriptional regulators. RAPTOR deficiency is predicted to downregulate SREBP1 and SREBP2 activities (fig. S4C), both of which are dependent upon the scaffold protein SCAP that is crucial for lipogenic metabolism and proliferation of T cells in the periphery (28). Deletion of SCAP (Scap<sup>fl/fl</sup>Cd2-Cre or Scap<sup>-/–</sup> mice) had no substantial effects on thymocyte populations (fig. S7A), with normal frequencies of DN subsets (fig. S7B), ISP cells (fig. S7C), and γδ T cells observed (fig. S7D). Another metabolic regulator frequently associated with mTORC1 activity is the key glycolytic regulator HIF1α (29). HIF1α mediates metabolic reprogramming of  $T_H$ 17 cells (30) and effector CD8 T cells (31). While HIF1 $\alpha$  expression is induced in developing thymocytes, deletion of HIF1 $\alpha$  (*Hif1a*<sup>fl/f1</sup>*Cd2*-Cre or *Hif1a*<sup>-/-</sup> mice) had no substantial impact on the frequencies of thymocyte subsets (fig. S7E) including  $\gamma \delta$  T cells (fig. S7F). These results indicate a dispensable role for SCAP-mediated lipogenesis and HIF1α function in thymocyte development.

The metabolic regulator MYC was among the top hits of the potential upstream regulators in RAPTOR-deficient cells (fig. S4C). Although MYC is required for thymocyte development, its functions and mechanisms in  $\alpha\beta$  and  $\gamma\delta$  T cell fate decisions remain uncertain (4, 32– 34). We found that deletion of MYC ( $Myc$ <sup>fl/fl</sup>Cd2-Cre or  $Myc^{-/-}$  mice) greatly reduced cellularity of total thymocytes, and this was associated with reduced frequency of DP cells and increased frequency of DN cells (fig. S8A). Within the DN compartment,  $Myc^{-/-}$  mice had increased frequency and number of DN3 cells (fig. S8, B and C). However, WT and  $Myc^{-/-}$  DN3b cells had comparable induction of icTCR $\beta$  expression (fig. S8D), suggesting a largely normal β-selection. In contrast,  $Myc^{-/-}$  mice had an elevated frequency of  $\gamma \delta$  T cells (Fig. 4, **A** and **B**) and ratio of  $TCR\gamma\delta^+$  to  $TCR\beta^+$  cells (Fig. 4B). Despite undisturbed cellularity of  $\gamma \delta$  T cells in  $Myc^{-/-}$  mice due to the drastic loss of total thymocytes (fig. S8E),  $Myc^{-/-}$   $\gamma$  T cells had increased frequency and cellularity of the CD73<sup>+</sup> population (Fig. 4C) as well as higher levels of CD73 expression (Fig. 4D), supporting a role for MYC in restricting γδ T cell development.

We next investigated the interaction between RAPTOR and MYC in thymocyte development. First, we crossed  $Rptor^{-/-}$  mice with GFP-MYC knockin mice (35) to track the dynamic regulation of MYC by means of GFP expression. WT DN3b cells upregulated expression of MYC, which was then downregulated in the DN4 stage (Fig. 4E). While  $Rptor^{-/-}$  DN3a cells had normal GFPMYC expression,  $Rptor^{-/-}$  DN3b cells had a modest reduction of GFP-MYC expression (Fig. 4E). This reduction was more pronounced in  $Rptor^{-/-}$  DN4 cells (Fig. 4E), indicating that MYC acts downstream of RAPTOR. We next determined whether a reciprocal interaction exists; that is, whether MYC acts upstream of mTORC1 also. Indeed,  $Myc^{-/-}$  DN3b and DN4 cells had markedly reduced phosphorylation of S6 and 4E-BP1 (Fig. 4, **F** and **G**). Therefore, mTORC1 and MYC constitute a reciprocal interaction loop in thymocyte development.

## **RAPTOR modulates ROS production in fate decisions of DN3 cells**

Given the dynamic metabolic regulation that occurs during T cell development (Fig. 1), we hypothesized that RAPTOR mediates metabolic reprogramming in DN3 cells, hence shaping their fate decisions. Compared with the WT counterparts,  $Rptor^{-/-}$  cells had intact basal OCR (Fig. 5A) and expression of representative electron transport chain components (fig. S9A), albeit with a partial impairment in SRC (Fig. 5A). In contrast,  $Rptor^{-/-}$  DN3 cells had reduced ECAR and glycolytic activity (Fig. 5B and fig. S9B). The increased ratio of OCR to ECAR in  $Rptor^{-/-}$  DN3 cells (Fig. 5C) suggests disrupted control of bioenergetics and an increased reliance on oxidative metabolism to compensate for impaired glycolysis. Consistent with this idea,  $Rptor^{-/-}$  DN3 cells, but not other subsets, had significantly increased ROS levels compared with WT counterparts (Fig. 5D and fig. S9C). The increased ROS induction was also observed in  $Rptor^{-/-} \gamma \delta$  T cells (Fig. 5E). Other parameters associated with mitochondrial fitness, including mitochondrial mass and mitochondrial membrane potential, were comparable between WT and  $Rptor^{-/-}$  cells (fig. S9, D and E). These results indicate that RAPTOR deficiency impairs metabolic remodeling and enhances ROS production in DN3 cells.

We next assessed whether directly modulating ROS production and metabolic activity affects fate choices of DN3 cells. First, we co-cultured DN3a cells with OP9-DL1 cells in the presence of galactose (Gal) and galactose oxidase (GAO), known promoters of ROS production (36). Gal/GAO significantly elevated the generation of  $\gamma$ δ T cells (fig. S10A), concomitant with impaired generation of  $\alpha\beta$  T cells (fig. S10A). Second, we used dichloroacetate (DCA), an inhibitor of the mitochondrial enzyme pyruvate dehydrogenase kinase (PDK), to activate pyruvate dehydrogenase (PDH) and hence shift glycolysis to fuel OXPHOS in the mitochondria (37). DCA treatment promoted the generation of  $\gamma \delta$  T cells at the expense of  $\alpha\beta$  T cells (fig. S10B), associated with increased ROS production (fig. S10C). To exclude the potential effects of the pharmacological agents on OP9-DL1 cells, we next used a stromal cell-free system for in vitro thymocyte differentiation (38). Gal/GAO and DCA markedly promoted generation of  $\gamma \delta$  T cells along with reduction of  $\alpha \beta$  T cells (fig. S10D), indicating that ROS signaling targets thymocytes but not stromal cells in altering fate choices. Moreover, addition of the ROS scavenger N-acetyl-L-cysteine (NAC) or glutathione (GSH) significantly diminished and promoted the generation of  $\gamma \delta$  (Fig. 5F) and  $\alpha\beta$  T cells (Fig. 5G), respectively, without substantially altering total cellularity of the culture (fig. S10E). Using the stromal cell-free system, we also observed the blocking effects of NAC and GSH on the generation of  $\gamma \delta$  T cells and their CD73 expression levels (fig. S10, F and G). We next hypothesized that neutralizing ROS production could partially rescue the altered fate choices of  $Rptor^{-/-}$  DN3a cells. In support of this, NAC treatment significantly, though not completely, suppressed the generation of  $\gamma \delta$  T cells derived from  $Rptor^{-/-}$  DN3a cells (Fig. 5H), while reciprocally restoring the defective  $\alpha\beta$  T cell development and the altered ratio of γδ to αβ T cells (Fig. 5H). Moreover, the impaired transition of  $Rptor^{-/-}$ DN3 cells to DN4 cells (indicated by the ratio of DN3 (CD25<sup>+</sup>CD44<sup>-</sup>) to DN4 (CD25<sup>-</sup> CD44– ) cells) was restored by NAC treatment (Fig. 5I). Of note, NAC treatment had no substantial effects on the reduced cellularity of  $Rptot^{-/-}$  cells (Fig. 5J) or their survival (fig. S10H), indicating that ROS regulates lineage choices of DN3 cells independent of cell expansion. These results collectively indicate that mTORC1-dependent metabolic

remodeling in DN3 cells regulates the production of ROS as a metabolic signal in dictating lineage choices.

#### **RAPTOR coordinates intrathymic signals in DN cells**

Multiple immune and developmental cues, including TCR, NOTCH, and IL-7 signaling, mediate lineage choices of DN3 cells (2, 3). We next sought to determine their individual contributions to mTORC1 activation and function. DN3 cells from Rag1-deficient mice, which lack TCR rearrangement and thus TCR signaling, had markedly reduced phosphorylation of S6 (fig. S11A). Also, Rag1-deficient DN3a cells cultured with OP9-DL1 cells were impaired to upregulate phosphorylation of S6 and 4E-BP1 (fig. S11B) compared to their WT counterparts, indicating that TCR signaling is required for mTORC1 activation. NOTCH is a pivotal factor in thymocyte development (3), however, the underlying mechanisms of NOTCH signaling in  $\alpha\beta$  and  $\gamma\delta$  T cell development remain to be fully understood (5, 6, 39, 40). Compared with OP9 cells (lacking NOTCH ligands), OP9-DL1 cells induced greater phosphorylation of S6 and 4E-BP1 (fig. S11C) in DN3a cells, in a process independent of cell survival (fig. S11D). Moreover, rapamycin-mediated inhibition of mTORC1 activity enhanced γδ T cell development and reciprocally inhibited αβ T cell development (fig. S11E). Although IL-7 signaling has been recently shown to induce trophic effects in developing thymocytes (14), addition of IL-7 did not affect mTORC1 activity in DN3 cells (fig. S11F). Our results indicate mTORC1 integrates TCR and NOTCH signals to mediate fate choices of DN3 cells.

To understand RAPTOR-dependent signaling pathways underlying T cell lineage choices, we compared transcriptional profiles of pre-selection DN3a cells from WT and  $Rptor^{-/-}$ mice. GSEA revealed that NF-κB signaling, which has been implicated in thymocyte development by mediating pre-TCR, NOTCH, and cytokine signaling (41–43), was aberrantly upregulated in RAPTOR-deficient DN3a cells (fig. S12A). Moreover,  $Rptor^{-/-}$ cells showed a significant enrichment of NOTCH signaling (fig. S12A), which can activate NF-κB (43) as well as the ERK-MAPK signaling cascade (44). Additionally, we compared transcriptional profiles of WT and  $Rptor^{-/-} \gamma \delta$  T cells, and GSEA also revealed significant enrichment of NF-κB signaling in the absence of RAPTOR (fig. S12B). In support of this finding,  $Rptor^{-/-} \gamma \delta$  T cells had elevated phosphorylation of p65 at steady state and upon anti-TCRγδ stimulation (fig. S12C). Altogether, these results indicate that RAPTOR deficiency alters signal transduction in thymocyte development.

#### **scRNA-Seq reveals RAPTOR-dependent signaling circuits in thymocyte lineage choices**

Recent advances in scRNA-Seq have enabled an unbiased characterization of immune cell subpopulations during developmental processes and immune responses (45). We performed scRNA-Seq (46) to further investigate RAPTOR-dependent signaling pathways and functional modules underlying thymocyte lineage decisions. We analyzed 21,332 late-stage DN thymocytes (DN3-DN4; Lin–CD4–CD8–CD44– ), including 7,345 WT and 13,987  $Rptor^{-/-}$  cells, that passed quality control thresholds (Fig. 6A), and partitioned the cells into eight clusters in tSNE ('t-distributed stochastic neighbor embedding') plot through unsupervised clustering (Fig. 6B). To define the nature of these clusters, we calculated gene signature scores for DN3a cells based on the genes selectively expressed in DN3a cells in

the public datasets (47), and then overlaid expression of the DN3a gene signature attributed to each cell onto the tSNE visualization. Clusters 1, 5, and 8 showed much greater expression of the DN3a signature than the remaining clusters (Fig. 6, **C** and **D**). High levels of Il2ra and Ptcra, which encode CD25 and pre-TCRa respectively and are known to be abundantly expressed in DN3a cells compared with more mature thymocytes (47), were also found in clusters 1, 5, and 8 (fig. S12D). These results support the classification of clusters 1, 5 and 8 as DN3a cells, whereas the remaining clusters likely represent post-selection thymocytes. Of note, Il2ra and Ptcra are target genes of NOTCH signaling, which is highly active in DN3a cells but downregulated after β-selection (47). Among these 3 DN3a clusters, cluster 5 showed increased expression of Il2ra, Ptcra, and additional NOTCH targets, including Notch1, Notch3, Dtx1, and Dtx3l (47) (fig. S12D) and, moreover, enhanced NOTCH signaling activity (fig. S12E). Interestingly, the majority of cells in cluster 5 were RAPTOR-deficient (Fig. 6E), while cluster 1 was dominated by WT cells, thereby verifying that deletion of RAPTOR rewires NOTCH signaling in DN3a cells. We next focused on transcriptional events in post-selection clusters. We found that the signature genes associated with pre-TCR signaling (i.e. genes induced in DN3b vs DN3a cells (47)) were highly enriched in cluster 4 (Fig. 6F and fig. S12F), which was predominantly comprised of RAPTOR-deficient cells, and, to a much lesser degree, in cluster 2, which was dominated by WT cells (Fig. 6E). In addition, the ERK signaling module was also higher in cluster 4 than in cluster 2 (Fig. 6F and fig. S12F), indicating the upregulation of TCR signaling in the absence of RAPTOR. In contrast, compared to cluster 2, cluster 4 showed lower signature scores of mTORC1 signaling, MYC targets, and glycolysis (Fig. 6G and fig. S12G), as well as expression of selective anabolic genes, including *Ldha, Tpi1, Slc7a5*, and Shmt2 (fig. S12H). Therefore, scRNA-Seq analysis suggests that RAPTOR coordinates TCR signaling and metabolic reprogramming in thymocyte development.

In further support of the enhanced  $\gamma \delta$  T cell development in RAPTOR-deficient mice, we found that the gene signature associated with  $\gamma \delta$  T cells (48) was upregulated in cluster 4, compared to cluster 2 (Fig. 6, **H** and **I**). To reconstruct the acquisition of  $\gamma \delta$  T cell fate over time, we analyzed our scRNA-Seq data using Monocle 2 (49), which provides pseudotemporal ordering of cells relative to developmental progression ('pseudotime'). This allowed us to derive a relative developmental trajectory that revealed pronounced differences in the pseudotime assignment of the 8 clusters (Fig. 6J and fig. S13, A). Specifically, we found that cells with early pseudotime assignment were mainly restricted to clusters 1, 5 and 8 (fig. S13A, blue arrow), consistent with the identification of these clusters as DN3a cells. This is further supported by the direct projection of the DN3a signature onto the pseudotime trajectory (fig. S13B), thereby corroborating our pseudotime analysis. In contrast, cells with late psedudotime were mostly enriched in cluster 4 and, to a lesser extent, in cluster 2 (fig. S13A, red arrows). Of note, the  $\gamma\delta$  T cell gene signature was highly enriched in cluster 4 (fig. S13C), which was primarily comprised of  $Rptor^{-/-}$  cells (fig. S13D). Altogether, these results support the enhanced gene expression and developmental progression along the  $\gamma \delta$  T cell lineage of RAPTOR-deficient T cells.

## **RAPTOR tunes the strength of the ERK/EGR1/ID3 signaling pathway**

The lineage decision of developing thymocytes is governed by various intrinsic factors, with TCR signal strength being particularly important (2, 3). The  $\gamma\delta$  T cell lineage choice is characterized by strong signal strength, especially in regards to the ERK/EGR1/ID3 signaling axis, as opposed to  $\alpha\beta$  T cell development (7, 8). Our scRNA-Seq results suggest that RAPTOR coordinates metabolic reprogramming and signal strength in DN3 cells. Indeed,  $Rptor^{-/-}$  DN3 cells had higher phosphorylation of ERK and expression of EGR1 and ID3 (Fig. 7, **A** to **C**) than did their WT counterparts. Ablation of ERK2 in a Rptor-deficient background did not substantially affect the reduction of DP thymocytes (Fig. 7D). However, it blocked the increased CD73<sup>+</sup>  $\gamma$ δ T cell population (Fig. 7E) and the elevated expression of CD73 (Fig. 7F), as compared to  $Rptor^{-/-}$  mice. These results indicate that the increased signal strength due to RAPTOR deficiency contributes to  $\gamma\delta$  T cell development. In line with the intersection between RAPTOR/mTORC1 and MYC,  $Myc$ <sup>-/-</sup> DN3 cells displayed increased levels of ERK phosphorylation and ID3 expression (fig. S14, A and B). Interestingly, both MYC-deficient DN3a and DN3b cells had higher levels of ROS (fig. S14C), associated with increased expression of CD5 (fig. S14D). Furthermore, DCA, which altered the development of  $\alpha\beta$  and  $\gamma\delta$  T cells (fig. S10B), increased the expression of ID3 in DN3 cells co-cultured with OP9-DL1 cells (fig. S14E). The expression of CD73, which is induced by TCR-ERK signaling to promote  $\gamma \delta$  T cell commitment (9), was markedly enhanced by treatment with DCA (fig. S14F) or Gal/GAO (fig. S14G). Collectively, these results indicate that the interplay between mTORC1, MYC, and ROS metabolism shapes the activity of the ERK/EGR1/ID3 signaling axis and, therefore, the strength of TCR signals in dictating lineage choices of DN3 cells (fig. S15).

## **DISCUSSION**

Despite the emerging interest in immunometabolism, our understanding of whether and how metabolic intermediates or pathways modulate immunity through signaling mechanisms remains limited. Here we report that mTORC1-mediated integration of metabolic and signaling activities dictates the lineage choices of  $\alpha\beta$  and  $\gamma\delta$  T cells, and identify mTORC1dependent control of ROS production as a key metabolic signal in this process. Such developmental function of mTORC1 signaling depends upon its interplay with MYC in a feed-forward loop, but not other metabolic regulators such as HIF1α and SCAP. Our findings indicate that regulation of metabolic rewiring and redox homeostasis by mTORC1 occurs in the lineage-specifying stage, DN3 cells, which likely reflects the cell contextspecific nature of this control mechanism. These results point to metabolic processes constituting a fundamental mechanism that connects extrinsic signals with transcriptional events and fate decisions.

Recent extensive studies have advanced our understanding of metabolic reprogramming of T cell-mediated immune responses (11, 12). However, little is known about the metabolic programs in thymocyte development, although NOTCH and IL-7 have been shown to exert trophic effects in this process (13, 14). Here we found that DN3 cells predominately use OXPHOS over glycolysis, whereas ISP cells have high activities of both OXPHOS and glycolysis. In contrast, DP cells markedly downregulate these metabolic activities. The use

of distinct metabolic programs by developing thymocytes likely fulfills the bioenergenetic and signaling requirements of the underlying developmental processes. Of note, these dynamic metabolic programs are associated with differential regulation of mTORC1 activity. Loss of RAPTOR and mTORC1 activity disrupts anabolic metabolism that supports population expansion, but also results in dysregulated ROS production. Furthermore, perturbation of redox homeostasis impinges upon thymocyte fate decisions and mTORC1 associated phenotypes. Specifically, enhancing or attenuating ROS production has a direct impact on αβ and  $\gamma$ δ T cell development, and antioxidant treatment rescues, albeit incompletely, the differentiation defect of mTORC1-deficient thymocytes. These results reveal a selective role for redox regulation in mediating cell fate decisions downstream of the multifunctional kinase mTORC1, and establish metabolic signaling as a decisive factor for fate decisions of αβ and γδ T cells in thymocyte development.

Our scRNA-Seq analysis further highlights the interplay between TCR signaling and metabolic activity. Among DN3a cells, clusters dominated by  $Rptor^{-/-}$  cells upregulate NOTCH signaling, while in post-selection cells, they upregulate TCR and ERK signaling but show dampened anabolic metabolism. Such unbiased analysis also shows the upregulation of  $\gamma\delta$  T cell gene signature in the  $Rptot^{-/-}$ -dominant cluster, which is further supported by the late pseudotime assignment. We have also attempted to directly assess  $\gamma \delta T$  cell commitment using in vitro single-cell progenitor assay, but the proliferative defect in  $Rptot^{-/-}$  cells prevents such analysis. Nonetheless, blocking excessive ERK signaling substantially rectifies the increased generation of committed  $\gamma \delta$  T cells and expression of CD73 in  $Rptor^{-/-}$  cells, supporting our model that increased signal strength due to RAPTOR deficiency promotes γδ T cell development.

A feature of the adaptive immune system is the intertwining cycles of quiescence and activation that accompany developmental and functional progression of T lymphocytes through their lifespan. Thymic colonization of largely nondividing progenitor cells is followed by two waves of proliferation separated by a brief period of quiescence at the DN3 stage required for  $TCR\beta$  chain rearrangement (2). T cells return to quiescence at the DP stage, which allows for their TCRα chain rearrangement. This quiescent status is maintained by mature thymocytes and peripheral naïve T cells until encounter with cognate antigen. Our data suggest that RAPTOR-dependent mTORC1 activation and metabolic reprogramming drive the exit of DN3 cells from quiescence, as  $Rptor<sup>-/-</sup>T$  cells cannot upregulate cell size or trophic receptors. Moreover, RAPTOR-deficient thymocytes are less efficient in population expansion, but this defect is observed mainly in ISP cells. Given the intricate link between cell proliferation and differentiation (4), such proliferative defect likely contributes to the developmental blockade and accumulation of ISP cells. For DN3 and DN4 cells in  $Rptor^{-/-}$ mice, although their proliferation is largely normal, they already exhibit defective expression of trophic receptors and signaling events. These results indicate that the impaired cycling of  $Rptor^{-/-}$  ISP cells is likely a consequence, not the cause, of loss of RAPTOR-dependent metabolic reprogramming and quiescence exit. The dispensable role of SCAP, an important regulator of cell proliferation (28), in thymocyte development further supports this notion.

In summary, our study reveals that dynamic regulation of metabolic programs and mTORC1 activity is required for thymocyte development. In the peripheral immune compartment,

mTOR signaling exerts discrete effects on the fate decisions of effector and memory  $CD8^+$  T cells (50), and effector and regulatory  $CD4+T$  cells (51). Interestingly, metabolic remodeling used by lineage-committed mature T cells to drive cell fates and immune functions following antigen stimulation is also adopted by developing T cells to determine lineage commitment itself in response to developmental signals and microenvironmental cues. We provide further evidence that mTORC1 signaling intersects with MYC function and ROS regulation, and coordinates TCR and NOTCH signaling and anabolic metabolism in dictating thymocyte fates. Collectively, our study establishes mTORC1 signaling as a developmental checkpoint that links intrathymic environmental signals and metabolic programs to drive thymocyte development. Future work is warranted to further dissect cell context-dependent regulation and physiologic effects of metabolic and redox controls in immune system development and activation.

## **Materials and Methods**

#### **Study design**

Genetically engineered mouse strains were used to assess the role of RAPTOR and metabolic pathways in regulating the fate decisions of T cell lineages in the thymus. Mice 6– 10 weeks old were used unless otherwise noted. The development of thymocytes was analyzed by various methods, including flow cytometry analysis, cell sorting, microarray, glucose uptake, Seahorse (for glycolysis and oxidative phosphorylation), glycolytic flux, immunoblot, real-time PCR, sequencing of TCRγ chains, and scRNA-Seq. Details are described in Supplementary Materials and Methods. The sample size and experimental replicates are indicated in the figure legends. Group sizes were determined based on published literatures with similar experiments.

#### **Mice**

C57BL/6, CD45.1<sup>+</sup>, Scap<sup>flox</sup>, Erk2<sup>flox</sup>, Cd2-Cre, and Rag1<sup>-/-</sup> mice were purchased from the Jackson Laboratory. *Rptor*<sup>flox</sup>, *Rheb*<sup>flox</sup>, *Hif1a*<sup>flox</sup>, *Rictor*<sup>flox</sup>, and *Myc*<sup>flox</sup> mice have been described previously (30, 52–55). Littermates (Cre<sup>-</sup> flox/flox and Cre<sup>+</sup> non-floxed mice) were used as WT controls. Mice at 6–10 weeks old were used unless otherwise noted. All mice were kept in specific pathogen-free conditions in Animal Resource Center at St. Jude Children's Research Hospital (SJCRH). Animal protocols were approved by Institutional Animal Care and Use Committee of SJCRH.

## **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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## **Fig. 1. Dynamic regulation of cell metabolism and mTORC1 activity and the requirement of RAPTOR in thymocyte development.**

(**A** and **B**) OCR in thymocyte subsets under basal condition (A) or in response to the indicated mitochondrial inhibitors (Oligo, Oligomycin; FCCP, carbonyl cyanide ptrifluoromethoxyphenylhydrazone; and Rot, Rotenone) (B). SRC, spare respiratory capacity (SRC of DN3 cells is shown). (**C** and **D**) Measurement of ECAR (C) and glycolytic activity (D) in freshly isolated thymocyte subsets. (**E**) Ratio of OCR to ECAR in thymocyte subsets. (**F**) Relative phosphorylation of S6 (mean fluorescence intensity (MFI) in DN3 cells is set to 1) in thymocyte subsets. (G) Total thymocyte cellularity of WT and  $Rptor^{-/-}$  mice. Each symbol represents an individual mouse ( $n = 8$  each group). (**H**) Flow cytometry of thymocyte subsets in WT and  $Rptor^{-/-}$  mice (left). Right, cellularity of the indicated thymocyte subsets (DN, CD4<sup>-</sup>CD8<sup>-</sup>; DP, CD4<sup>+</sup>CD8<sup>+</sup>; CD8SP, CD4<sup>-</sup>CD8<sup>+</sup>TCR $\beta$ <sup>+</sup>; and CD4SP, CD4<sup>+</sup>CD8<sup>-</sup>TCR $\beta$ <sup>+</sup>). Each symbol represents an individual mouse (WT,  $n = 7$ ; Rptor<sup>-/-</sup>,  $n = 6$ ). Data are mean  $\pm$  s.e.m. ns, not significant; \*P< 0.05, \*\*P< 0.001, and **\*\*\***P < 0.0001. One-way analysis of variance (ANOVA) with Tukey test (A to E), or twotailed unpaired  $t$ -test  $(G, H)$ . Data are combination of three independent experiments  $(A \text{ to } I)$ E), or representative of at least ten independent experiments (F to H). Numbers indicate percentage of cells in gates.

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#### **Fig. 2. RAPTOR deficiency impairs the DN to DP transition in** αβ **T cell development.**

(**A**) Flow cytometry of DN1–4 subsets (gated on lineage-negative DN thymocytes) in WT and Rptor<sup>-/-</sup> mice (left). Frequencies (middle) and cellularity (right) of DN subsets. Each symbol represents an individual mouse (WT,  $n = 6$ ; Rptor<sup>-/-</sup>,  $n = 5$ ). (B) Left, gating strategy for ISP cells (CD4<sup>-</sup> CD8<sup>+</sup>TCRβ<sup>-</sup>). Right, flow cytometry (upper panels) and frequency and cellularity (lower panels) of ISP cells in WT and  $Rptor^{-/-}$  mice. Each symbol represents an individual mouse (WT,  $n = 9$ ; Rptor<sup>-/-</sup>,  $n = 8$ ). (C and D) Sublethally irradiated Rag1<sup>-/-</sup> mice were reconstituted with a 1:1 mixture of CD45.1+ BM and either CD45.2+ WT or  $Rptor^{-/-}$  BM cells to generate mixed bone marrow chimeras. Flow cytometry of thymocyte subsets (C, upper panels) or ISP cells (D, upper panels) in CD45.2<sup>+</sup> WT and  $Rptor^{-/-}$  donorderived cells, or in CD45.1<sup>+</sup> spike-derived cells (C and D, lower panels). (**E**) Expression of CD4 and CD8 on WT and  $Rptor^{-/-}$  DN3 cells co-cultured with OP9-DL1 cells for 3 or 8 days. (F) Flow cytometry of thymocyte subsets in WT OTII and *Rptor*<sup> $\sim$ </sup> OTII mice (*n* = 4 each group) (left). Right, cellularity of total thymocytes. Data are mean  $\pm$  s.e.m. ns, not significant;  $*P < 0.0005$ , and  $*P < 0.0001$ . One-way ANOVA with Tukey test (A), twotailed Mann-Whitney test  $(B, frequency)$ , or two-tailed unpaired  $t$ -test  $(B, cellularity)$ . Data are representative of at least three independent experiments (A to F). Numbers indicate percentage of cells in quadrants or gates.



#### **Fig. 3. Loss of RAPTOR promotes** γδ **T cell development.**

(A) Flow cytometry (left) of  $TCR\gamma\delta^+$  cells in WT and  $Rptor^{-/-}$  thymocytes. Frequency (middle) and cellularity (right) of  $TCR\gamma\delta^+$  cells. Each symbol represents an individual mouse (WT,  $n = 6$ ; Rptor<sup>-/-</sup>,  $n = 5$ ). (B) Flow cytometry of TCR $\gamma \delta^+$  cells derived from WT and  $Rptor^{-/-}$  donor (CD45.2<sup>+</sup>, left) or spike (CD45.1<sup>+</sup>, right) cells in the reconstituted BM chimeras as described in Figure 2C. Flow cytometry of TCR $\gamma\delta^+$  cells in WT and  $Rptor^{-/-}$ donor-derived thymocytes in the reconstituted mixed BM chimeras. (**C**) Distribution of DP (left) and  $\gamma \delta$  T cells (right) between CD45.1<sup>+</sup> and CD45.2<sup>+</sup>-derived cells in the mixed bone marrow chimeras generated as described in Figure 2C, after normalization against nondeleting DN1 thymocytes. (**D**) Expression of CD73 and CD24 on CD4<sup>-</sup>CD8<sup>-</sup>TCRγδ<sup>+</sup> thymocytes from WT and  $Rptor^{-/-}$  mice. (E) Frequency (left) and cellularity (right) of CD73<sup>+</sup> TCR $\gamma\delta^+$  cells in D. Each symbol represents an individual mouse (*n* = 4 each group). (F) Expression of CD73 on TCR $\gamma\delta^+$  cells in the thymus and spleen of WT and  $Rptor^{-/-}$ 

mice, with MFI plotted above graphs. Data are mean  $\pm$  s.e.m.  $*P < 0.05$ ,  $*P < 0.005$ , and \*\*\*P < 0.0005. Two-tailed Mann-Whitney test (A and E for frequency analyses), one-tailed unpaired  $t$ -test (C), or two-tailed unpaired  $t$ -test (A and E for cellularity). Data are representative of at least three independent experiments (A to F). Numbers indicate percentage of cells in quadrants or gates.



**Fig. 4. Interplay between mTORC1 and MYC in developing thymocytes.**

(A) Flow cytometry of TCR $\beta$ <sup>+</sup> and TCR $\gamma \delta$ <sup>+</sup> cells in WT and  $Myc^{-/-}$  thymocytes. (B) Frequency of TCR $\gamma\delta^+$  cells (left) and the ratio of TCR $\gamma\delta^+$  to TCRβ<sup>+</sup> cells (right) in WT and  $Myc^{-/-}$  thymocytes. Each symbol represents an individual mouse ( $n = 4$  each group). (**C**) Expression of CD73 and CD24 on CD4– CD8–TCRγδ+ thymocytes from WT and  $Myc^{-/-}$  mice (left). Frequency (middle) and cellularity (right) of CD73<sup>+</sup> TCR $\gamma\delta^+$  cells. Each symbol represents an individual mouse (WT,  $n = 5$ ;  $Myc^{-/-}$ ,  $n = 4$ ). (**D**) Expression of CD73 on TCR $\gamma\delta^+$  cells in the thymus and spleen of WT and  $Myc^{-/-}$  mice, with MFI plotted above graphs. (E) Expression of GFP-MYC in thymocyte subsets of WT and  $Rptor^{-/-}$  mice, with MFI plotted above graphs. (**F** and **G**) Plots of p-S6 (F) and p-4E-BP1 (G) in thymocyte subsets of WT and  $Myc^{-/-}$  mice, with MFI plotted above graphs. Data are mean  $\pm$  s.e.m.  $^*P$  $< 0.05$ ,  $* p < 0.005$ , and  $* p < 0.0005$ . Two-tailed Mann-Whitney test (B and C for frequency analyses), or two-tailed unpaired t-test (B for ratio analyses, and C for cellularity). Data are representative of at least three independent experiments (A to E), or two (F, G) independent experiments. Numbers indicate percentage of cells in quadrants or gates.

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## **Fig. 5. RAPTOR controls metabolic balance between glycolysis and OXPHOS, and production of ROS in fate determination of DN3 cells.**

(A) OCR in WT and  $Rptor^{-/-}$  DN3 cells under basal conditions or in response to the indicated mitochondrial inhibitors (SRC of WT and  $Rptor^{-/-}$  cells is shown). (**B**) Measurement of ECAR in WT and *Rptor*<sup>-/-</sup> DN3 cells. (C) Ratio of OCR to ECAR in WT and *Rptor*<sup>-/-</sup> DN3 cells. (**D** and **E**) Analysis of ROS production in DN3 cells (D) and TCR $\gamma \delta^+$  cells (E) from WT and *Rptor<sup>-/-</sup>* mice. (**F** and **G**) WT DN3a cells were co-cultured with OP9-DL1 cells in the absence or presence of NAC or GSH for 3 days, followed by analysis of CD4 and  $TCR\gamma\delta$  expression (F) and CD4 and CD8 expression (G). Right, numbers of TCR $\gamma \delta^+$  (F) and CD4<sup>+</sup>CD8<sup>+</sup> DP cells (G) in the culture ( $n = 3$  each group). (**H**) WT and  $Rptor^{-/-}$  DN3a cells were co-cultured with OP9-DL1 cells in the absence or presence of NAC for 5 days, followed by analysis of CD4 and TCRγδ expression (left). Right, fold change of the ratio of  $TCR\gamma\delta^+$  to  $CD4^+$  cells (WT without NAC treatment is set to 1), and frequencies of TCR $\gamma \delta^+$  and CD4<sup>+</sup> cells (*n* = 3 each group). (**I**) WT and *Rptor*<sup>-/-</sup> DN3a cells were co-cultured with OP9-DL1 cells in the absence or presence of NAC for 5 days, followed by analysis of CD44 and CD25 expression (left). Right, fold change of the

ratio of CD25<sup>+</sup>CD44<sup>-</sup> (DN3) to CD25<sup>-</sup>CD44<sup>-</sup> (DN4) populations of WT and  $Rptor^{-/-}$  cells without or with NAC treatment (WT without NAC treatment is set to 1). (**J**) Cellularity of total cells in H. Data are mean ± s.e.m. ns, not significant; **\***P < 0.05, **\*\***P < 0.01, and **\*\*\***<sup>P</sup> < 0.0001. One-way ANOVA with Turkey test (A, F to J). Data are the combination of three independent experiments (A to C), or representative of at least three (D to J) independent experiments. Numbers indicate percentage of cells in quadrants or gates.

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#### **Fig. 6. scRNA-Seq reveals that RAPTOR coordinates immune signaling and anabolic metabolism in thymocyte fate decisions.**

(**A**) Single-cell RNA sequencing of WT and RAPTOR-deficient DN cells, followed by a tSNE visualization of the 21,332 single cells analyzed. (**B**) tSNE visualization of eight clusters partitioned by unsupervised clustering. (**C**) tSNE visualization of DN3a gene signature expressed by individual cells. (**D**) Association of different gene signatures with the eight single-cell clusters, with the relative over-representation of gene signatures for a specific cluster determined using one-tailed Mann-Whitney test. Clusters 1, 5, and 8 contained DN3a cells, while the remaining clusters contained post-selection thymocytes. (**E**) Frequencies of WT and  $Rptot^{-/-}$  cells in the different clusters. Clusters significantly enriched for presence of WT or *Rptor<sup>-/-</sup>* cells were marked. (F) Violin plots of signatures of pre-TCR and ERK signaling among the eight clusters. A violin plot combines the box plot and the local density estimation into a single display. The black bars and thin lines within the violin plots indicate the interquartile range  $(1<sup>st</sup>$  quantile –  $3<sup>rd</sup>$  quantile) and the entire range of the data (up to 1.5 fold of interquartile range from  $1<sup>st</sup>/3<sup>rd</sup>$  quantile), respectively, and the white dots in the center indicate the median values. **(G)** Violin plots of signatures of mTORC1 signaling, MYC targets, and glycolysis. (**H** and **I**) tSNE (H) and violin (I) plots of

γδ T cell gene signature. (**J**) Pseudotime densities for the 8 clusters. Data are mean ± s.e.m. \*P < 0.05, and \*\*\*P < 0.0001. One-tailed Mann-Whitney test (D), Logistic regression (E), two-tailed Mann-Whitney test (F, G, I). Data are one experiment (WT,  $n = 2$ ; Rptor  $\tau$ ,  $n = 3$ ; A to J).

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**Fig. 7. RAPTOR tunes the strength of the ERK/EGR1/ID3 signaling axis in fate choices.**

(A) Immunoblot analysis of p-ERK, EGR1, ID3 and β-ACTIN in WT and  $Rptor^{-/-}$  DN3 cells. (**B** and **C**) Plots of p-ERK (B) and expression of ID3 (C) in WT and  $Rptor^{-/-}$  DN3 cells, with MFI plotted in graphs. (**D**) Cellularity of CD4+CD8+ DP cells from the indicated mice. Each symbol represents an individual mouse (WT,  $n = 4$ ; Rptor<sup>-/-</sup>,  $n = 3$ ; Erk $2^{-/2}$ ,  $n =$ 4; Rptor<sup>-/-</sup>Erk2<sup>-/-</sup>, n = 4). (**E**) Flow cytometry of CD73 and CD24 expression on TCR $\gamma \delta^+$ thymocytes in the indicated mice (left). Right, frequency and cellularity of CD73<sup>+</sup> TCR $\gamma\delta^+$ cells. Each symbol represents an individual mouse (WT,  $n = 4$ ; Rptor<sup>-/-</sup>,  $n = 3$ ; Erk $2^{-/}$ -,  $n =$ 4; Rptor<sup>-/-</sup>Erk2<sup>-/-</sup>, n = 4). (**F**) Expression of CD73 on TCR $\gamma\delta^+$  cells in E shown as the fold change (MFI on WT cells is set to 1). Data are mean  $\pm$  s.e.m.  $*P < 0.05$ , and  $**P < 0.0001$ . One-way ANOVA with Turkey test (D to F). Data are representative of at least three independent experiments (A to F).