

Shared and distinct transcriptional programs underlie the hybrid nature of *i*NKT cells

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Invariant natural killer T cells (*i*NKT cells) are innate-like T lymphocytes that act as critical regulators of the immune response. To better characterize this population, we profiled gene expression in *i*NKT cells during ontogeny and in peripheral subsets as part of the Immunological Genome Project. High-resolution comparative transcriptional analyses defined developmental and subset-specific programs of gene expression by *i*NKT cells. In addition, we found that *i*NKT cells shared an extensive transcriptional program with NK cells, similar in magnitude to that shared with major histocompatibility complex (MHC)-restricted T cells. Notably, the program shared by NK cells and *i*NKT cells also operated constitutively in $\gamma\delta$ T cells and in adaptive T cells after activation. Together our findings highlight a core effector program regulated distinctly in innate and adaptive lymphocytes.

The Immunological Genome (ImmGen) Project is a consortium of immunologists and computational biologists who aim, through the use of rigorously standardized experimental and analysis pipelines, to generate a high-resolution, comprehensive definition of gene-expression and regulatory networks in the mouse immune system¹. In this context, we determined global gene-expression profiles for thymic and peripheral invariant natural killer T cell (*i*NKT cell) subsets to gain insight into the *i*NKT cell transcriptional 'landscape', its unique features and the relationships of *i*NKT cells to other cell lineages of the innate and adaptive immune systems. A subset of $\alpha\beta$ T cells, *i*NKT cells express a semi-invariant T cell antigen receptor (TCR) that recognizes lipid antigens presented by CD1d². By rapidly producing cytokines, these cells modulate both the innate and adaptive arms of the immune system, critically affecting biological processes in antimicrobial immunity, tumor rejection and inflammation³. Like major histocompatibility complex (MHC)-restricted T cells, *i*NKT cells undergo thymic differentiation with somatic recombination⁴, recognize self and foreign antigens^{2,3}, secrete cytokines characteristic of the T_H1 , T_H2 and T_H17 subsets of helper T cells⁵, and provide help to B cells⁶.

The designation 'NKT' was coined to reflect expression of the NK cell marker NK1.1 (ref. 7). Although many other receptors expressed by NK cells ('NK cell receptors' (NKR)) can also be expressed by *i*NKT cells⁸, the validity of the designation 'NKT' has been called into question⁹ because *i*NKT cells are developmentally more closely related to the T cell lineage than to the NK cell lineage and because NKRs are neither specific to *i*NKT cells nor expressed on all *i*NKT cells. Although a central role for TCR-mediated activation in *i*NKT cell biology is clear, notable parallels in the activity of NK cells and *i*NKT cells have nevertheless emerged. The homeostatic distribution and survival

requirements of *i*NKT cells are similar to those of NK cells^{10–13}. Also similar are their trafficking and activation kinetics. Both cell types constitutively express receptors for inflammatory chemokines, accumulate at sites of infection within 24–72 h and exert their effector functions without a priming requirement^{14,15}. In addition, evidence suggests that *i*NKT cells, like NK cells, can use activating NKRs to sense stress-induced ligands^{15–19}. Furthermore, *i*NKT cells also detect cellular stress via their TCRs, which are reactive to inflammation-induced alterations in CD1d-presented self lipid antigens^{20–22}. Finally, NK cells and *i*NKT cells engage in similar bidirectional interactions with antigen-presenting cells during which inflammatory cytokines derived from the antigen-presenting cells potentiate the responses of NK cells and *i*NKT cells to surface ligands, and NK cells or *i*NKT cells, in turn, promote the maturation of antigen-presenting cells^{23–28}.

In this report, we shed light on the transcriptional programs that operate over the course of *i*NKT cell development and in peripheral CD4⁺ and CD4[−] *i*NKT cell subsets. Using the ImmGen Project compendium, which allows direct comparison of gene expression in developing and mature subsets of *i*NKT cells, NK cells and T cells, we assessed the transcriptional basis for similarities between NK cells and *i*NKT cells. Our data demonstrate that transcriptional programs shared by NK cells and *i*NKT cells are more extensive than has been appreciated and are similar in breadth to those shared by *i*NKT cells and MHC-restricted T cells. Finally, we show that the transcriptional patterns of genes expressed constitutively by both NK cells and *i*NKT cells represent a core effector program that also operates in other innate lymphocytes and is induced in adaptive lymphocyte populations after activation.

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RESULTS

Developmental programs specific to iNKT cells

Like other T lymphocytes, iNKT cells mature in the thymus, where they diverge from MHC-restricted $\alpha\beta$ T cells at the CD4⁺CD8⁺ double-positive (DP) stage. During maturation, iNKT cells subsequently undergo sequential stages of differentiation characterized by differences in expression of the activation markers CD44 and NK1.1 (ref. 4; **Supplementary Fig. 1**). To characterize the developmental transcriptional programs in iNKT cells relative to those that operate in maturing adaptive $\alpha\beta$ T cells, we profiled CD44⁺NK1.1[−] (stage 1),

CD44⁺NK1.1[−] (stage 2) and CD44⁺NK1.1⁺ (stage 3) thymic iNKT cells in the context of the ImmGen Project (**Fig. 1a**). We found that 1,850, 155 and 697 genes had a change in expression of at least twofold from the DP stage to stage 1, from stage 1 to stage 2, and from stage 2 to stage 3, respectively (**Fig. 1b,c**). Transcripts modulated between thymic iNKT cell populations encoded molecules known to be involved in iNKT cell maturation⁴, as well as several factors of unknown function (**Supplementary Tables 1–6**). At the DP branch point, we identified a subset of genes modulated selectively by iNKT cells at stage 1 but not by early-stage CD4⁺ adaptive

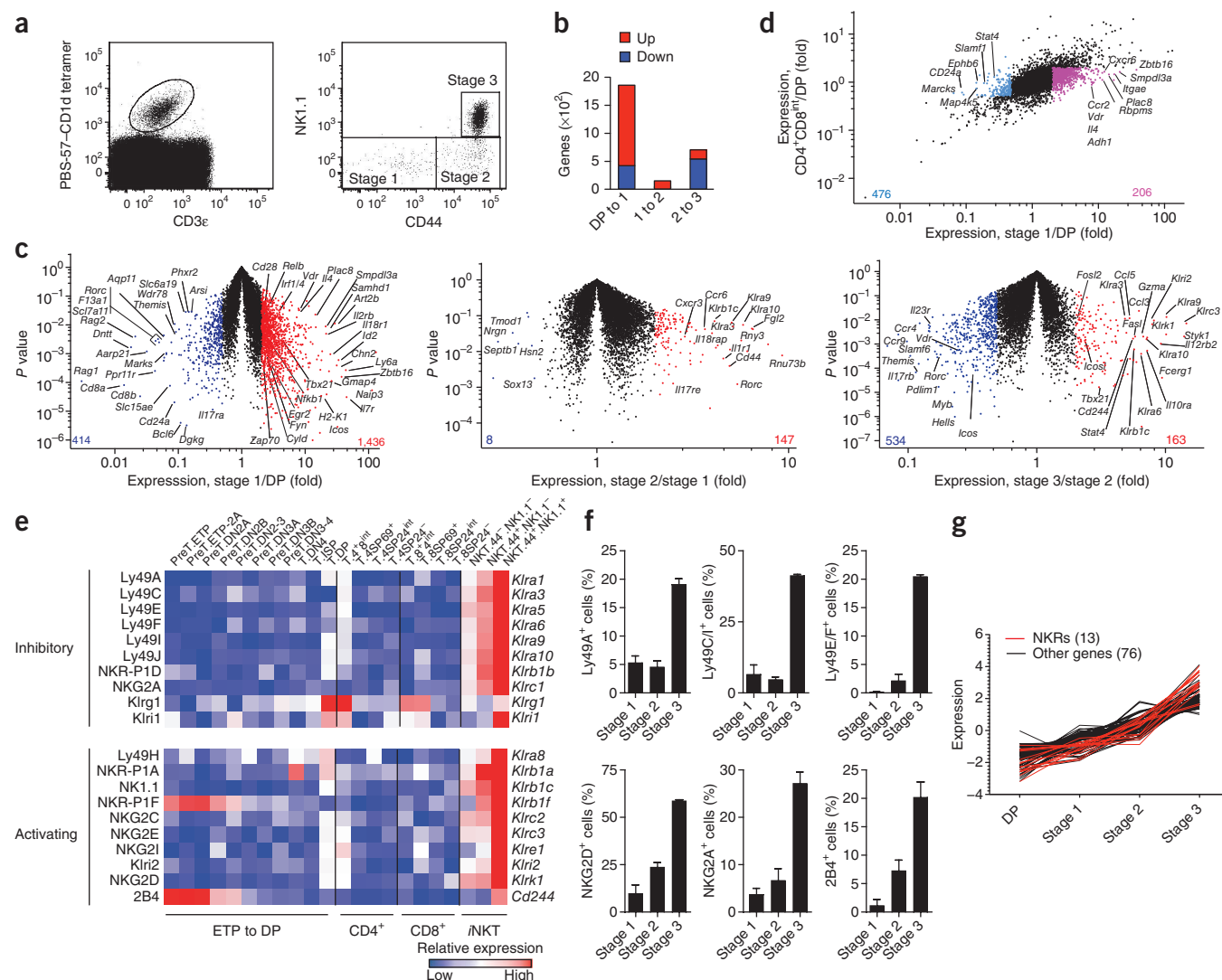


Figure 1 Upregulation of the expression of NKR by iNKT cells at the end of thymic differentiation. **(a)** Identification of thymic iNKT cells by flow cytometry. PBS-57, α -galactosylceramide analog. **(b)** Quantification of genes upregulated (Up) or downregulated (Down) during the developmental transitions of iNKT cells. **(c)** Genes with a difference in expression (upregulated, red; downregulated, blue) in iNKT cells at stage 1 versus DP thymocytes (left), in iNKT cells at stage 2 versus iNKT cells at stage 1 (middle) or in iNKT cells at stage 3 versus iNKT cells at stage 2 (right); complete lists, **Supplementary Tables 1–6**. **(d)** Genes with a difference in expression in iNKT cells at stage 1 versus DP thymocytes; colors indicate genes regulated differently in iNKT cells but not in CD4⁺CD8^{int} T cells relative to their regulation in DP thymocytes (upregulated, pink; downregulated, light blue; complete lists, **Supplementary Tables 7 and 8**). For **b–d**, only genes with expression above the detection limit in one or more subsets and a coefficient of variation of less than 0.5 in all subsets were considered. Each symbol represents a single gene. **(e)** Expression of genes encoding NKR in differentiating thymocytes (subset nomenclature (top), **Supplementary Table 16**); results were log₂-transformed, row-centered and locally color-scaled. **(f)** Surface expression of NKR, determined by flow cytometry. **(g)** Expression of a cluster of genes encoding NKR (*Klra3*, *Klra5*, *Klra6*, *Klra9*, *Klra10*, *Klrb1c*, *Klrb1f*, *Klrc2*, *Klrc3*, *Klrd1*, *Klri2* and *Klrk1*; red) and other genes (black), derived from a Euclidean distance-based K-means clustering analysis (mean correlation, 0.958); genes were prefiltered for expression and for a change in expression of over twofold between any two subsets, and the results were log₂-transformed. Data are combined from at least three independent experiments for each population, with cells pooled from three or more mice in each experiment (**a–e,g**), or are representative of at least two independent experiments (**f**; mean and s.e.m. of three mice).

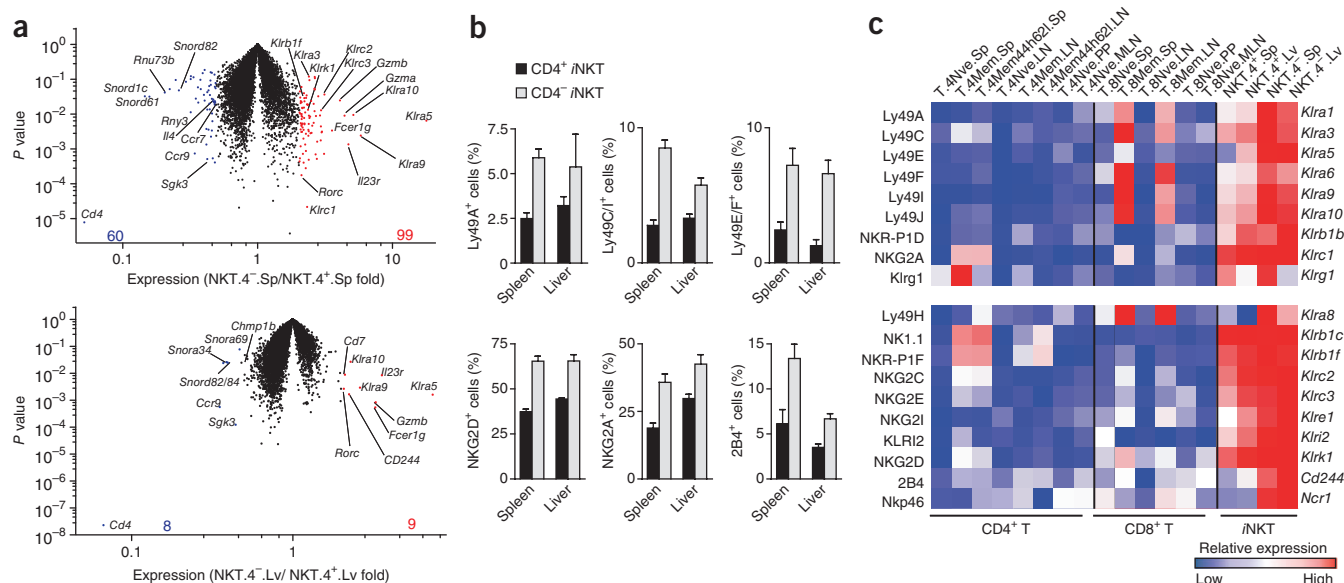


Figure 2 Expression of NKR genes in peripheral CD4⁺ and CD4⁻ iNKT cells. **(a)** Genes with a difference in expression in splenic CD4⁺ iNKT cells (NKT.4⁺.Sp) versus splenic CD4⁻ iNKT cells (NKT.4⁻.Sp; top) or in liver CD4⁺ iNKT cells (NKT.4⁺.Lv) versus liver CD4⁻ iNKT cells (NKT.4⁻.Lv; bottom); colors indicate genes upregulated (red) or downregulated (blue) in CD4⁻ cells relative to their expression in CD4⁺ cells (change in expression of over twofold); only genes with expression above the detection limit in one or more subsets and a coefficient of variation of less than 0.5 in all subsets are included. Each symbol represents a single gene. **(b)** Surface expression of NKR genes on spleen and liver CD4⁺ and CD4⁻ iNKT cells, determined by flow cytometry. **(c)** Expression of genes encoding NKR genes in peripheral MHC-restricted T cells and iNKT cell subsets (subset nomenclature (top), **Supplementary Table 16**); results were log₂-transformed and gene-row-centered, and local color scaling was used. Data are combined from at least three independent experiments for each population, with cells pooled from three or more mice in each experiment (**a,c**), or are representative of at least two independent experiments (**b**; mean and s.e.m. of three mice).

T cells (CD4⁺CD8^{int} cells; **Fig. 1d**). Although some of these genes, such as *Zbtb16* (which encodes the transcription factor PLZF) and *Vdr* (which encodes the receptor for vitamin D) encoded molecules known to have important functions in specification of the iNKT cell lineage^{29–31}, many encoded molecules not yet been linked to the development of iNKT cells (**Supplementary Tables 7 and 8**). At the final maturation stage of iNKT cells, many of the genes with

the greatest upregulation encoded molecules that belong to the killer lectin receptor family, which includes activating and inhibitory NKRs (**Fig. 1c**, bottom). By the final stage of ontogeny, iNKT cells had expression of transcripts encoding several NKRs similar in amount to that of splenic NK cells (**Supplementary Fig. 2a**). In addition, upregulation of genes encoding NKRs occurred selectively in developing iNKT cells but not in maturing MHC-restricted T cells or at any stage in early T cell development, with a few exceptions (**Fig. 1e**). Flow cytometry of thymic iNKT cells confirmed the increase in expression of surface NKRs over the course of maturation (**Fig. 1f** and **Supplementary Fig. 2b**). K-means clustering analysis determined that a large number of genes followed the same expression kinetics as that of genes encoding NKRs over the course of the DP-to-stage 3 transition (**Fig. 1g**), which suggested that progressive upregulation of the expression of NKRs may be part of a broader gene program. Together these data comprehensively characterized shared and distinct gene-expression changes that occurred in maturing iNKT cells in the broader context of $\alpha\beta$ T cell development.

Transcriptional signatures of peripheral iNKT cells

In both mice and humans, CD4⁺ and CD4⁻ iNKT cells have been reported to secrete different types of cytokines^{5,32,33}. In addition, iNKT cell subsets

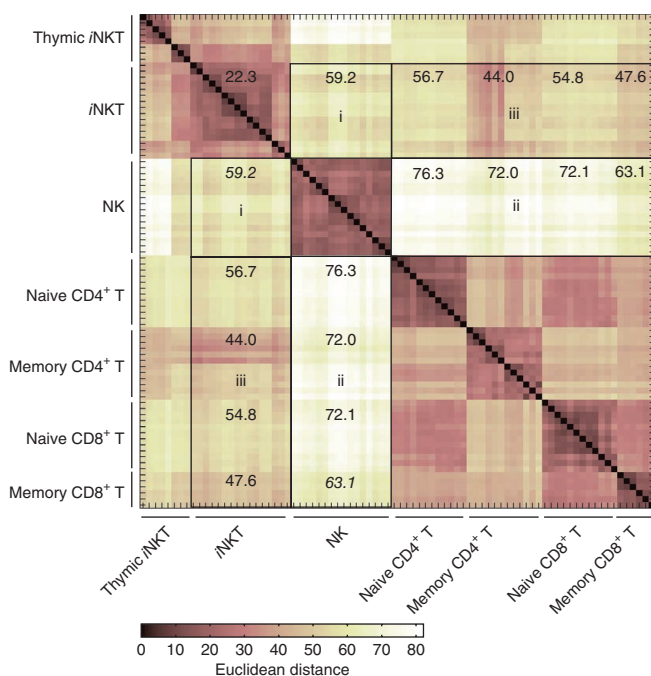


Figure 3 The global transcriptional relationship between NK and iNKT cells is similar in magnitude to the relationship between T cells and iNKT cells. Euclidean-distance matrix calculated with the 15% most variable probes; numbers in outlined areas indicate average Euclidean distance between intersecting subsets (i–iii indicate areas of interest). Only genes with mean expression values above 120 were included; results were log₂-transformed and mean-centered. Data are combined from at least three independent experiments for each population, with cells pooled from three or more mice in each experiment.

from the liver have been suggested to be functionally distinct³⁴. To characterize the transcriptional basis that may underlie subset-specific functional differences, we assessed the gene-expression profiles of CD4⁺ and CD4⁻ iNKT cells sorted from the spleen, liver and lungs of mice. Whereas 159 genes were expressed differently in CD4⁺ versus CD4⁻ iNKT cells in the spleen, and 261 genes were expressed differently in the corresponding subsets in the lung, only 17 transcripts varied in expression in CD4⁺ versus CD4⁻ hepatic iNKT subsets (Fig. 2a, Supplementary Fig. 3 and Supplementary Tables 9–14). That suggested that splenic and pulmonary iNKT cell subsets may be more functionally distinct from each other than are liver iNKT cell subsets. In all three tissues, we found that genes encoding NKR were among those most modulated, with higher expression in CD4⁻ subsets than in CD4⁺ subsets (Fig. 2a and Supplementary Fig. 3). In liver and spleen, this reflected a greater frequency of NKR⁺ cells among CD4⁻ iNKT cells than among CD4⁺ iNKT cells, as determined by flow cytometry (Fig. 2b). The expression of NKR-encoding mRNA in peripheral iNKT cells, although lower than that in thymic iNKT cells at stage 3, was maintained at higher amounts than that in most MHC-restricted $\alpha\beta$ T cell subsets (Fig. 2c and data not shown). In addition, comparison of liver iNKT cell subsets to their splenic counterparts showed that CD4⁻ populations were more transcriptionally similar to each other than were CD4⁺ iNKT cells, across tissues. A small number of genes were expressed differently in different tissues regardless of CD4 expression (Supplementary Fig. 4), which supported the idea that iNKT cells subsets may serve organ-specific functions.

Transcriptional patterns shared by NK cells and iNKT cells

Because iNKT cells share broad functional features with NK cells, we hypothesized that NKR expression by iNKT cells might reflect a much

larger transcriptional program shared by NK cells and NKT cells than is now appreciated. To assess the extent of transcriptional relatedness between iNKT cells and NK cells at a global level, and to compare the NK cell–iNKT cell relationship and the relationship of iNKT cells to T cells, we calculated Euclidean distances between subsets of steady-state NK cells, T cells and iNKT cells. We determined Euclidean distance, a measure of the similarity of the gene-expression patterns of pairwise compared subsets, using the 15% of gene probes with the greatest variability among the subsets analyzed (presented as a matrix in Fig. 3). Mature iNKT cells and NK cells showed a high degree of similarity in gene expression (Fig. 3, area i), in contrast to the greater distances between all MHC-restricted T cells and NK cells (Fig. 3, area ii). Although iNKT cells had a somewhat closer relationship to memory CD8⁺ T cells and to certain memory CD4⁺ T cells than to NK cells, we sorted memory CD4⁺ T cells through the use of markers with similar expression by iNKT cells (CD44⁺ and CD62L^{lo}) and thus they probably included a substantial proportion of iNKT cells. The average Euclidean distance between iNKT cells and NK cells was only slightly larger than the distance that separated iNKT cells from naive CD4⁺ T cells and CD8⁺ T cells (Fig. 3, area iii). Those relative relationships were maintained when we analyzed all genes and not just the 15% of genes with the greatest variability (data not shown). To determine whether the NK cell–iNKT cell relationship was dependent on the shared expression of NKR, we recalculated the distance matrix after removing NKR and related molecules from the data. The outcome of the analysis remained essentially unchanged (Supplementary Fig. 5). Thus, the transcriptional relationship between NK cells and iNKT cells was not limited to the shared expression of NKR. Together these data supported the idea of an unexpectedly substantial transcriptional

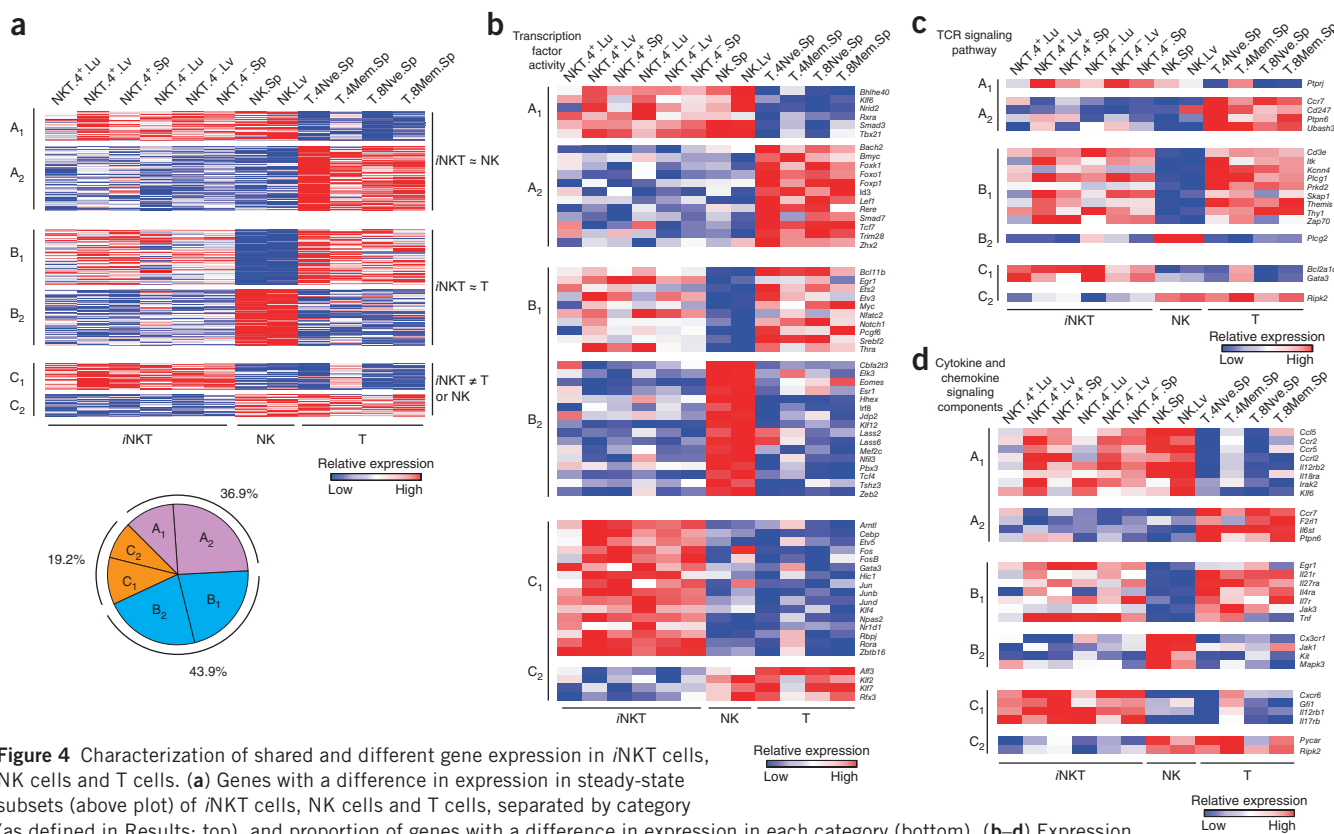


Figure 4 Characterization of shared and different gene expression in iNKT cells, NK cells and T cells. (a) Genes with a difference in expression in steady-state subsets (above plot) of iNKT cells, NK cells and T cells, separated by category (as defined in Results; top), and proportion of genes with a difference in expression in each category (bottom). (b–d) Expression of genes (categorized as in a) in relevant selected functional gene groups. In all heat maps, rows are mean-centered and normalized, and local scaling is used (subset nomenclature, Supplementary Table 16). Data are combined from at least three independent experiments for each population, with cells pooled from three or more mice in each experiment.

Table 1 Functional pathway–enrichment analysis of genes in category A₁

Biological process	Genes present	Enrichment (fold)	P value
NK cell–mediated immunity (BP00157)	<i>Klrc2, Klrc3, Ifng, Klrb1f, Klrk1, Klrb1c, Klrc1</i>	13.70	1.11×10^{-5}
Cytokine- or chemokine-mediated immunity (BP00255)	<i>Ccr2, Ccr5, Ifng, Ccr2, Xcl1, Ccl5</i>	7.31	1.33×10^{-3}
Cytokine- and chemokine-mediated signaling pathway (BP00107)	<i>Ccr2, Il12rb2, Ccr5, Ifng, Ccr2, Inpp5d, Xcl1, Ccl5</i>	4.31	2.49×10^{-3}
Cell motility (BP00287)	<i>Ccr2, Coro2a, Dok2, Ccr5, Ccr2, Anxa1, Abi2, Dock5, Diap1</i>	3.68	2.98×10^{-3}
Immunity and defense (BP00148:)	<i>F2rl2, Klrc2, Klrc3, Fgr, Cysl2r, Adora2a, Tbx21, Klrk1, Ccl5, Ccr2, Cd97, Il12rb2, Ifng, Irak2, Klf6, Il18rap, Lgals3, Gzmb, Sh2d2a, Ccr5, Ccr2, Klrb1f, Xcl1, Klrb1c, Klrc1, Sema4a</i>	2.11	3.57×10^{-4}
Signal transduction (BP00102)	<i>F2rl2, Klrc2, S100a6, Gna15, Klrc3, Fgr, Adora2a, Cysl2r, Gpr65, Klrk1, Abi2, Itgb2, Ccl5, Prkx, Il12rb2, Cd97, Ccr2, Coro2a, Zfp36l2, Plcb3, Ifng, Rhob, Fgl2, Rhoc, Fasl, Inpp5d, Ptpri, Irak2, Abr, Rxra, Anxa1, Ntng2, Smad3, Gem, Dock5, Arhgap26, Dusp5, Dok2, Dusp2, Ccr5, Rgs2, Rgs3, Ccr2, Chn2, Xcl1, Sema4a, Klrc1</i>	1.55	6.50×10^{-4}

Functional biological process–enrichment analysis of genes in category A₁; designations in parentheses (left column) indicate module identifiers (PANTHER classification system). Enrichment and P values (from a modified Fisher's exact test) were calculated with DAVID software; enrichment indicates the representation of genes in category A₁ in a given biological process relative to representation that would occur by chance.

relationship between iNKT cells and NK cells that was close in magnitude to that between iNKT cells and naive T cells.

Shared and distinct iNKT cell programs

We next sought to identify the specific genes concordantly regulated by iNKT cells, NK cells and T cells. For this purpose, we used one-way analysis of variance (ANOVA) to compare the transcriptomes of peripheral steady-state iNKT cells, NK cells and naive and memory CD4⁺ or CD8⁺ T cells. We excluded from the analysis genes with low variability over the entire ImmGen Project data set. We found that 20.2% (1,192) of the remaining genes had differences in expression in the three groups ($P < 0.05$ (Bonferroni corrected)). We further classified the modulated genes into the following six categories on the basis of common patterns in two of the three subsets: genes with similar expression in NK cells and iNKT cells that was higher (A₁) or lower (A₂) than that in T cells; genes with similar expression in iNKT cells and T cells that was higher (B₁) or lower (B₂) than that in NK cells; and genes with expression that was higher (C₁) or lower (C₂) in iNKT cells than in both T cells and NK cells (Fig. 4a). Genes encoding many transcription factors, TCR signaling components and cytokine- or chemokine-related molecules known to be expressed differently by NK cells, iNKT cells and T cells partitioned as expected in these categories (Fig. 4b–d). For example, genes encoding the transcription

factor PLZF (*Zbtb16*; Fig. 4b), the chemokine receptor CXCR6 (*Cxcr6*; Fig. 4c), and a component of the high-affinity receptor for interleukin 12 (IL-12 (*Il12rb1*); Fig. 4d), all known to be have higher expression in iNKT cells than in resting T cells or NK cells^{29,30,35,36}, partitioned into category C₁ (higher expression in iNKT cells than in NK cells or T cells). The genes encoding the transcription factor T-bet (*Tbx21*; Fig. 4b), as well as the IL-12RB2 receptor for IL-12 (*Il12rb2*; Fig. 4d), known to be upregulated in NK cells and iNKT cells³⁷, partitioned into category A₁ (higher expression in iNKT cells and NK cells than in T cells). Genes encoding TCR signaling components such as CD3ε (*Cd3e*), ITK (*Itk*), PLC-γ1 (*Plcg1*) and Zap70 (*Zap70*) segregated as anticipated into category B₁ (higher expression in iNKT cells and T cells than in NK cells; Fig. 4c,d). Functional biological process–enrichment analysis of genes in category A₁ with software from the DAVID bioinformatics database³⁸ (as described in Online Methods) demonstrated significant enrichment for genes encoding molecules with effector functions, including NK cell–mediated immunity, chemokine or cytokine responses, signal transduction, and cell motility (Table 1). The group of transcripts upregulated in iNKT cells relative to their expression in NK cells and MHC-restricted T cells (category C₁) showed enrichment for genes encoding molecules involved in distinct biological processes, including proliferation and survival, which probably reflected the uniquely activated phenotype of steady-state iNKT cells (Table 2).

We found that the number of genes with similar expression patterns in the iNKT and NK lineages (440 genes (36.91%); categories A₁ and A₂) was similar to the number of genes with similar expression patterns in iNKT cells and T cells (523 genes (43.88%); categories B₁ and B₂). In addition, about one fifth of the genes that ‘passed’ the ANOVA were regulated uniquely in iNKT cells (229 genes (19.21%); categories C₁ and C₂; Fig. 4a and Supplementary Table 15). Thus, in addition

Table 2 Functional pathway–enrichment analysis of genes in category C₁

Biological process	Genes present	Enrichment (fold)	P value
Jnk cascade (BP00116)	<i>Vav3, Dusp1, Jun, Jund, Junb, Cxcl10</i>	14.49	5.45×10^{-5}
Oncogene (BP00265)	<i>Fos, Vav3, Lmo4, Jun, Jund, Ets5, Junb</i>	10.35	5.53×10^{-5}
Inhibition of apoptosis (BP00263)	<i>Il4, Bcl2a1d, Bcl2a1c, Cebpb, Socs2, Bcl2a1b, Bcl2a1a</i>	8.11	2.13×10^{-4}
Apoptosis (BP00179)	<i>Il4, Bcl2a1d, Bcl2a1c, Cebpb, Socs2, Bcl2a1b, Bcl2a1a, Tnfrsf14, Nfkb1a, Gadd45b, Emp1</i>	3.25	1.88×10^{-3}
Oncogenesis (BP00281)	<i>Fos, Vav3, Lmo4, Jun, Lund, Fam129a, Ets5, Junb, Emp1</i>	3.13	7.59×10^{-3}
Intracellular signaling cascade (BP00111:)	<i>Il4, Cap2, Vav3, Socs2, Rab4a, Nfkb1a, junb, Cxcl10, Plk3, Dusp1, Jun, Jund, Gadd45b, Tbkbp1, Dusp6, Rab27a</i>	2.78	5.12×10^{-4}
mRNA transcription (BP00040)	<i>Dtx4, Cebpb, Lmo4, Nfkb1a, Fosb, Arntl, Zbtb16, Rora, Junb, Hic1, Fos, Npas2, Nr1d1, Gata3, Jun, Jund, Dennd4c, Thoc4, Gfi1, Rbpj, Ets5, klf4</i>	1.76	9.97×10^{-3}

Functional biological process–enrichment analysis of genes in category C₁ (presented as in Table 1). Jnk, kinase.



Thymic induction of programs shared by NK cells and *i*NKT cells

To determine at what point during thymic development the transcriptional program shared by mature *i*NKT cells and NK cells was induced, we analyzed by hierarchical clustering the expression patterns of genes in category A₁ over the course of the differentiation of MHC-restricted T cells and *i*NKT cells. Although approximately 75% of the shared genes upregulated in NK cells and *i*NKT cells were expressed in early thymic precursors, these genes were then largely shut down or downregulated by the DP thymocyte stage and were not reactivated in differentiating CD4⁺ or CD8⁺ T cells. In contrast, differentiating *i*NKT cells upregulated those same genes, so that thymic *i*NKT cells at stage 3 expressed more than 90% of the genes (**Fig. 5a**). Consistent with that observation, the distribution of genes in category A₁, calculated by comparison of the expression of each gene in developing *i*NKT cells with that in their DP progenitors, showed an increasing shift toward higher values with *i*NKT cell maturation. All three distributions were significantly different from the baseline distribution for all expressed genes, as determined by the Kolmogorov-Smirnov test (**Fig. 5b**). In contrast, the distribution calculated by comparison of naive splenic CD4⁺ or CD8⁺ T cells with DP cells showed no significant difference between the gene set of category A₁ and all expressed genes. In contrast to genes in category A₁, the genes significantly downregulated in mature NK cells and *i*NKT cells relative to their expression in T cells

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We next sought to determine if other lymphocytes with innate features might also have the transcriptional program noted above. Innate

The genes shared by NK cells and *i*NKT cells (category A_1) had relatively low expression in splenic $CD44^- \gamma\delta$ T cells, similar to that observed in resting T cells. A subset of those genes was upregulated in splenic $CD44^+ V\gamma 2^+$ and $V\gamma 2^-$ cells. Notably, we found that the expression of a large cluster of genes in category A_1 was higher in all tissue-resident IEL $\gamma\delta$ T cells than in the reference NK and *i*NKT populations (**Fig. 6a**). Distributions made by comparison of the expression of genes in category A_1 by splenic or IEL $\gamma\delta$ T cells and T cells showed significant enrichment for overexpressed genes (**Fig. 6b**). IEL $\gamma\delta$ T cells expressed an even smaller proportion of genes in category A_2 (downregulated in NK cells and *i*NKT cells relative to their expression in T cells) than did *i*NKT cells, although most of those genes were expressed in splenic $\gamma\delta$ T cells (data not shown). Although it was less prominent than for the shared NK cell–*i*NKT cell program (category A_1), a portion of the genes upregulated in *i*NKT cells but not in T cell or NK cell subsets (category C_1) also had relatively high expression in $\gamma\delta$ T cell subsets (**Supplementary Fig. 7a**). Together these data suggested that most of the gene program shared by NK cells and *i*NKT cells, as well as part of the program of genes upregulated differentially in *i*NKT cells, was also used by populations of $\gamma\delta$ T cells at steady state.

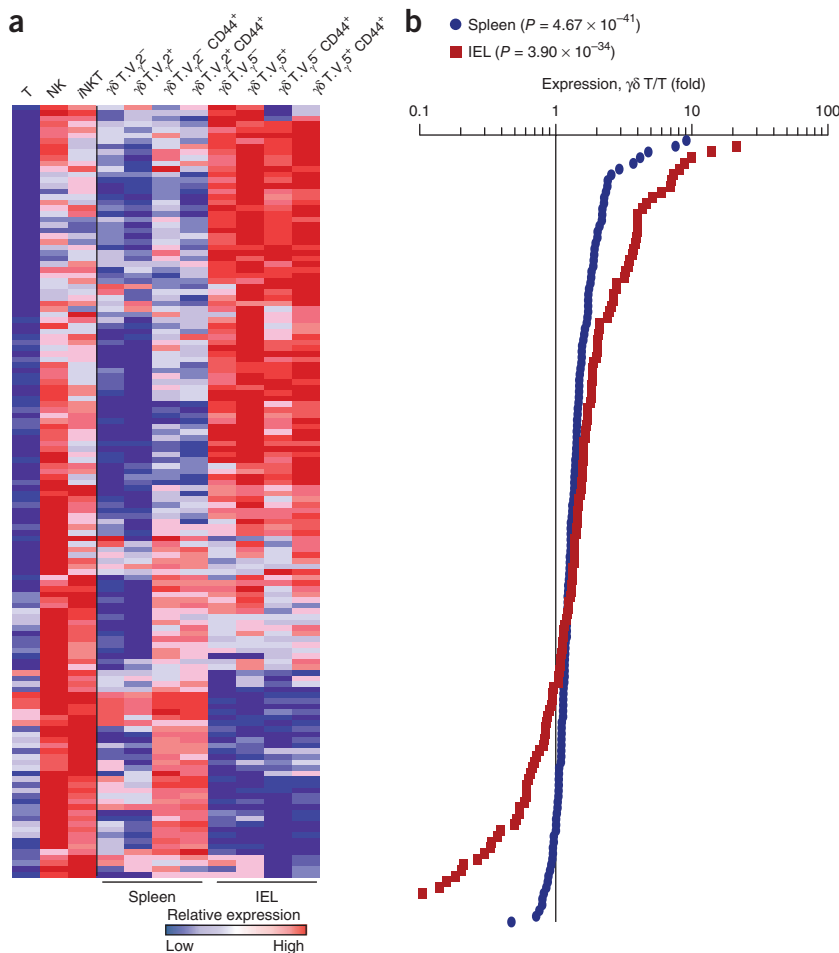


Figure 6 Activated splenic $\gamma\delta$ T cells and IEL $\gamma\delta$ T cells express genes in the program shared by NK cells and iNKT cells. **(a)** Expression of genes significantly upregulated in peripheral NK cells and iNKT cells relative to their expression in T cells (category A₁) in various splenic and IEL $\gamma\delta$ T cell subsets (top; presented as in **Fig. 4b–d**). Left three columns, averaged expression values for the subsets used to define the ANOVA categories (iNKT cells, NK cells and T cells). **(b)** Distribution of genes in category A₁ for averaged expression values for splenic and IEL $\gamma\delta$ T cell subsets compared with the averaged values for the T cell subset (presented as in **Fig. 5b**). Data are combined from at least three independent experiments for each population, with cells pooled from three or more mice in each experiment.

blood effector memory CD8⁺ T cell populations than in naive CD8⁺ T cells⁴³ (**Fig. 7c,d**). Thus, a large proportion of the genetic program shared by NK cells and iNKT cells was elicited in effector $\alpha\beta$ T cells, but only several days after their activation.

DISCUSSION

Although they express a functional TCR, iNKT cells do not fit the paradigm of adaptive T cell immunity^{3,14}. How the innate features of iNKT cells are acquired and how the transcriptional programs involved relate to those active in lymphocytes with similar functional attributes remains incompletely defined.

The transcriptional programs we found to be operating during the maturation of

iNKT cells were consistent with published reports and included genes encoding PLZF, the vitamin D receptor, T-bet, components of the transcription factor NF- κ B and GTPase Ras-mitogen-activated protein kinase (MAPK) pathways, and NKR^s^{4,37,44,45}. By comparing developing iNKT cells with differentiating MHC-restricted T cells, we have defined transcriptional programs of genes expressed specifically by iNKT cells at stage 1 shortly after the DP branch point. We have thus identified a large number of genes encoding molecules not previously known to affect the biology of iNKT cells but that probably specifically modulate the thymic maturation of iNKT cells.

Many genes reported to be involved in the development of iNKT cell were not expressed in an iNKT cell specific-manner. For example, genes encoding members of the NF- κ B and Ras-MAPK pathway, such as the p50 and RelB subunits of NF- κ B, Ras-MAPK and Egr2, were upregulated in both iNKT and non-iNKT thymocyte populations⁴ (data not shown). Other genes encoding molecules known to affect the ontogeny of iNKT cells, such as the transcription factor Bcl-11b⁴⁶ and the chromatin modifier Med1 (ref. 47), showed little or no transcriptional variation over the course of iNKT cell differentiation. The functional regulation of those and other genes not detected in our analyses may thus be controlled at post-transcriptional levels.

Mature iNKT cells share several innate functional features with NK cells, which are developmentally distant relatives. We hypothesized that NK cells and iNKT cells share a broader transcriptional program than is now appreciated. Our analyses showed that the transcriptional patterns that iNKT cells shared with NK cells made up nearly

The NK cell–iNKT cell program in CD8⁺ T cells

We next investigated the expression of genes of the shared NK cell–iNKT cell transcriptional program in CD8⁺ effector T cells, a cell population that shares functional characteristics with NK cells and iNKT cells, including the expression of certain NKR^s⁴². We examined the expression of genes in categories A₁ and A₂ in CD8⁺ T cells from the spleens of OT-I mice (which have transgenic expression of an ovalbumin (OVA)-reactive $\alpha\beta$ TCR) after infection with OVA-expressing *Listeria monocytogenes*. Only a small fraction of genes in category A₁ became upregulated in effector CD8⁺ T cells at 12, 24 and 48 h after infection (**Fig. 7a,b**). By day 6, however, genes of the NK cell–iNKT cell shared program showed considerable upregulation, with a distribution (of change in expression) significantly enriched for higher expression, and this genetic program was maintained in CD8⁺ memory T cells as late as day 100 after infection (**Fig. 7a,b**). In contrast, only a limited portion of genes in category C₁ (expressed differently by iNKT cells) followed a similar pattern in effector CD8⁺ T cell populations (**Supplementary Fig. 7b**). The genes downregulated in NK cells and iNKT cells relative to their expression in T cells (category A₂), which by definition are widely expressed in naive OT-I CD8⁺ T cells, were partially repressed after infection (**Supplementary Fig. 8**). We obtained similar results when we examined the expression of genes of the NK cell–iNKT cell shared transcriptional programs in CD8⁺ T cells from OT-I mice infected with OVA-expressing vesicular stomatitis virus (**Supplementary Fig. 9**). We also found significantly higher expression of the homologous human genes of the NK cell–iNKT cell shared program (category A₁) in human peripheral

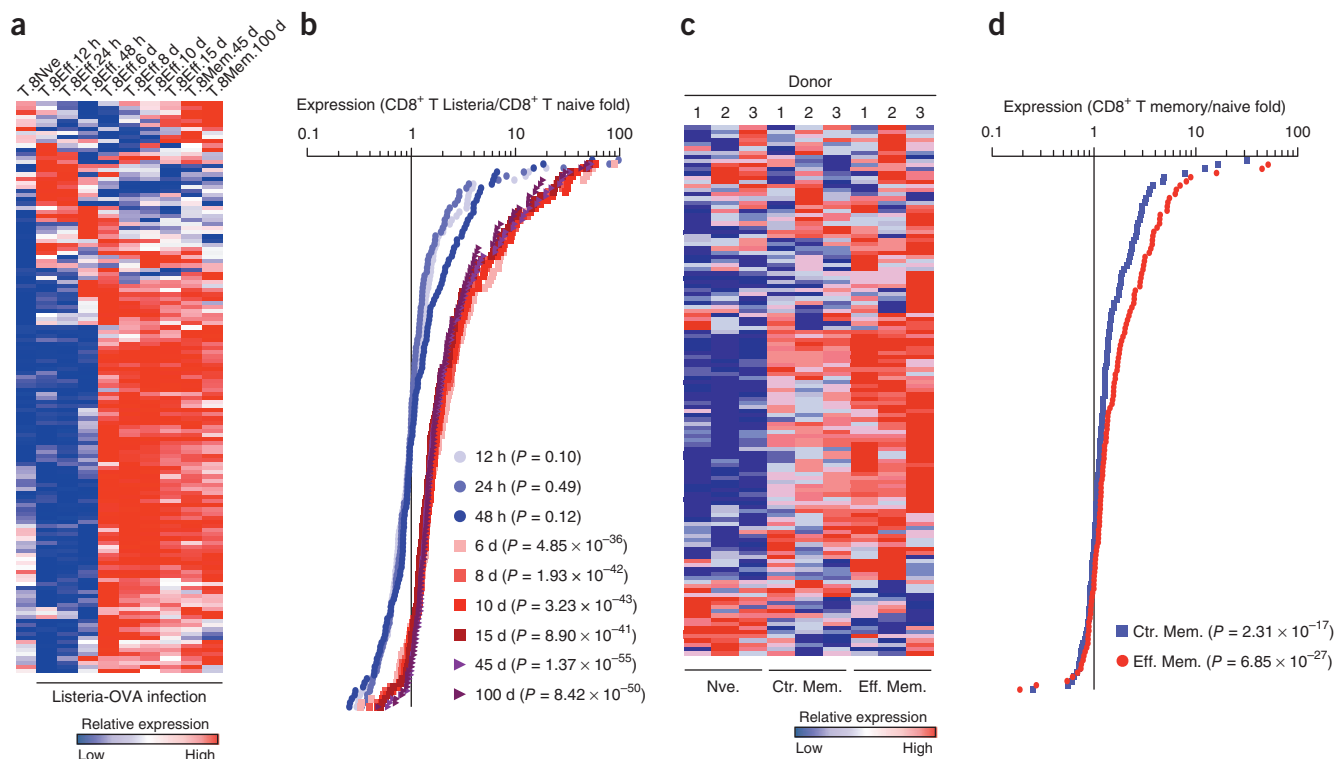


Figure 7 Programs shared by NK cells and iNKT cells are induced in activated CD8⁺ T cells. (a) Expression of genes significantly upregulated in peripheral NK cells and iNKT cells (category A₁) relative to their expression in antigen-specific CD8⁺ T cells over the course of infection with OVA-expressing *L. monocytogenes* (Listeria-OVA; presented as in Fig. 4b–d). (b) Distribution of genes in category A₁ for activated CD8⁺ T cells versus that for naive control cells (presented as in Fig. 5b). (c) Expression of the human homologs of genes in category A₁ in human peripheral blood CD8⁺ T cell subsets from various donors (1–3)⁴³ (presented as in Fig. 4b–d). (d) Distribution of the gene set of category A₁ for human memory CD8⁺ T cells versus that for the naive control cells, with human homologs of the genes in category A₁ (presented as in Fig. 5b). Data are combined from at least three independent experiments for each population, with cells pooled from three or more mice in each experiment.

as large a part of the iNKT transcriptome as those shared with MHC-restricted T cells. Furthermore, we found that the program shared by NK cells and iNKT cells was also active in steady-state $\gamma\delta$ T cells subsets similarly poised for rapid, innate-like responsiveness. The NK cell–iNKT cell program was also induced in adaptive $\alpha\beta$ T cells, but only days after antigen-specific stimulation. These data suggested that the program shared by NK cells and iNKT cells represents a core effector program operational in lymphocytes of distinct lineages, consistent with the many functional abilities that iNKT cells, NK cells and activated MHC-restricted T cells have in common.

The factors that regulate the expression of genes in this shared effector program remain to be fully defined. Nevertheless, our data have provided several clues. Acquired largely at the end of thymic iNKT cell maturation, the shared program mirrored the cells' acquisition of NKR expression, which is driven by the transcription factor T-bet both in NK cells and iNKT cells³⁷. Thus, it is likely that T-bet, whose transcript was among those significantly upregulated in both NK cells and iNKT cells relative to its expression in resting T cells, has an important role in eliciting and maintaining at least part of the shared effector lymphocyte program. T-bet-deficient iNKT cells have lower mRNA and protein expression of IFN- γ , granzyme B, Fas ligand, CCR5 and CD38, all molecules that are part of the shared program⁴⁴. IL-15, reported to act upstream of T-bet in maturing iNKT cells⁴⁵, is also probably involved in the acquisition of this program by iNKT cells. Furthermore, IL-15 and T-bet are important for the regulation of CD8⁺ effector T cell responses⁴⁸, as well as for the homeostasis of IEL $\gamma\delta$ T cells⁴⁹. Thus, IL-15 and T-bet

may have an important role in inducing the expression of genes in the shared effector program in several cell types.

We have also identified genes encoding many previously unappreciated transcriptional regulators with similar expression patterns in NK cells and iNKT cells that may help regulate the core effector program in innate lymphocytes. For example, the expression of genes encoding the transcription factor Bhlhe40, a regulator of the circadian rhythm⁵⁰ with immunomodulatory functions in CD4⁺ T cells^{51,52}, as well as Smad3, a transcription factor important for the 'tuning' of lymphocyte activation mediated by transforming growth factor- β , was upregulated in both NK cells and iNKT cells relative to their expression in resting T cells. Also, the expression of genes encoding many other factors was downregulated in NK cells and iNKT cells. Among those were *Lef1* and *Tcf7*, which encode transcription factors downstream of the Wnt signaling pathway that are important for the establishment and maintenance of T cell identity⁵³; Wnt signaling is typically repressed after the activation of T cells^{54,55}. The relatively low expression of *Tcf7* and *Lef1* in NK cells and iNKT cells during development is consistent with acquisition of the terminally differentiated effector phenotype of these cells at steady state.

Approximately 20% of the genes with significantly different expression in NK cells, iNKT cells and T cells had transcriptional patterns specific to iNKT cells. As expected, the transcription factors PLZF and GATA-3 were among the factors encoded by these genes. The group of genes 'preferentially' upregulated in iNKT cells (category C₁) showed enrichment for those encoding molecules involved in cellular activation and survival programs. For example, genes encoding several

members of the AP-1 family of transcription factors (*Jun*, *Junb*, *Jund*, *Fos*, *Fosb* and *Cebpb*), which are normally induced in cells only after activation, had relatively high expression in iNKT cells. Constitutive expression of AP-1 transcription factors by iNKT cells is consistent with their poised effector phenotype.

Together our data offer a new view of iNKT cells and their relationships with other lymphocyte lineages. Using the Immunological Genome Project database, we have identified gene-expression programs that both link to iNKT cells and differentiate iNKT cells from other lymphocytes of the innate and adaptive immune systems. Our data have identified extensive genetic modules shared with NK cells and other innate-like T cells that were also elicited several days after activation in adaptive T cells. By defining both distinct and shared transcriptional programs in iNKT cells, our data open avenues for future research and bring into clearer focus how lymphocyte populations that differ substantially in their ontogeny can ultimately serve similar effector functions through modular expression of genes in similar transcriptional programs.

METHODS

Methods and any associated references are available in the [online version of the paper](#).

Accession codes. GEO: microarray data, [GSE15907](#).

Note: Supplementary information is available in the [online version of the paper](#).

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AUTHOR CONTRIBUTIONS

N.R.C. primarily wrote the manuscript, conceived of and did experiments and analyzed the data; P.J.B. contributed substantially to the manuscript, conceived of and did experiments and analyzed the data; T.S. conceived of and did experiments and analyzed the data; G.F.W. did experiments; M.B. and J.K. assisted with experimental design and interpretation of the data; M.B.B. substantially contributed to the manuscript and supervised all experimental design, performance and data analysis; and The ImmGen Project Consortium contributed to experimental design and data collection.

COMPETING FINANCIAL INTERESTS

The authors declare no competing financial interests.

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ONLINE METHODS

Mice. Male C57BL/6 mice 6 weeks of age were obtained from Jackson Laboratories 1 week before organ collection. Mice were maintained under specific pathogen-free conditions. All studies were approved by the Animal Care and Use Committee of the Dana-Farber Cancer Institute.

Antibodies. Antibody to CD19 (anti-CD19; MB19-1), anti-B220 (RA3-6B2), anti-Ter119 (TER119), anti-CD11b (M1/70), anti-CD11c (N418), anti-Ly6G/Gr1 (A18), anti-CD8 α (53/6.7), anti-TCR β (H58-597), anti-NK1.1 (PK136), anti-CD44 (IM7), anti-CD4 (GK1.5), anti-CD45 (102), anti-CD3 ϵ (145-2C11), anti-Ly49e,f (CM4), anti-NKG2D (CX5), anti-NKG2A (16a11), anti-2B4 (ebio244F4), and anti-CD16,32 (2.4G2) were from eBioscience. Anti-Ly49a (A1) and anti-Ly49c,1 (5F6) were from BD Biosciences. CD1d tetramers loaded with PBS-57 (α -galactosylceramide analog) were provided by the tetramer facility of the US National Institutes of Health.

Cell isolation, microarray analysis and subset nomenclature. All purification of cells of the immune system was done in strict adherence to standard operating procedure guidelines of the ImmGen Project. Additional information about the thymic, NK cell, $\gamma\delta$ T cell and CD8 $^+$ T cell populations used for comparison with iNKT cells is available at the ImmGen Project website. For iNKT cells, thymocytes, splenocytes, liver and lung mononuclear cells were isolated from five to ten mice per sample. Thymocytes were disaggregated and then blocked with anti-CD16-CD32 (2.4G2; eBioscience), then were stained with fluorophore-labeled antibodies for depletion of non-iNKT cell populations and were separated with anti-fluorophore magnetic beads (Miltenyi). Spleens were disaggregated, treated with ammonium chloride-potassium bicarbonate lysis buffer (Lonza) to remove red blood cells, and then depleted of non-iNKT cells as described above. Lungs and livers were collected after perfusion with cold PBS and were mechanically homogenized. Lungs were digested for 15 min at 37 °C in 7 U/ml of Liberase III enzyme (Roche) in DMEM, then were filtered and washed. Livers were homogenized and liver mononuclear cells were isolated by Ficoll density gradient centrifugation. iNKT cell-enriched thymocytes, splenocytes, liver mononuclear cells and lung cells were stained for cell surface markers (information about the staining procedure, including gating strategy, is available at the ImmGen Project website) and were double sorted directly into TRIZOL (Invitrogen) at a purity of >99%. By staining of thymocytes from CD1d-deficient mice that lack iNKT cells, a false-positive rate of $2.7\% \pm 0.9\%$ was estimated for CD44 $^+$ NK1.1 $^+$ (Stage 1) iNKT cells, the rarest thymic subset. Contamination was negligible for other iNKT cell populations. Two to four replicates were obtained for each sample with a FACSAria, with the exception of the CD4 $^+$ iNKT subset from the lungs, for which only a single replicate passed quality control (discussed below). RNA extraction, microarray hybridization (Affymetrix MoGene 1.0 ST array) and data were processing were done at the ImmGen Project processing center. Additional details are available in **Supplementary Table 16** (subset nomenclature key), Data Generation and Quality Control pipeline documentation, or the ImmGen Project website. Human and mouse data sets not from the ImmGen Project were from data sets from the GEO (Gene Expression Omnibus) database repository of the National Center for Biotechnology Information^{43,56}. Human homologs of mouse genes were identified with the HomoloGene automated system for detecting homologs (National Center for Biotechnology Information).

Data analysis and visualization. Data from the March 2011 ImmGen Project release (802 arrays with 22,268 probe sets) were used. Probe sets associated with the same gene symbol were consolidated by selection of the probe set with the highest mean expression overall. For heat maps, data were log₂-transformed, and a relative color scale with row centering (subtraction of the mean) and normalization was used. Heat maps were produced with the HeatmapViewer module of GenePattern software (Broad Institute). Where indicated, Pearson correlation with pairwise complete linkage was

applied to rows for clustering analysis. Volcano plots were produced by with the Multiplot module of GenePattern.

For K-means clustering analysis, genes were prefiltered for a mean expression value of ≥ 120 (cutoff above which genes have a 95% chance of expression) and for a change in expression of over twofold between any two subsets analyzed. The ExpressCluster application of GenePattern (<http://www.broadinstitute.org/cancer/software/genepattern/>) was used for clustering, with $K = 10$.

For Euclidean-distance matrices, the 15% most variable genes were identified with the PopulationDistances application of GenePattern, which filters probes on the basis of a variation of ANOVA with the geometric s.d. of populations to 'weight' genes that vary in multiple populations. The selected genes were log₂-transformed, filtered for probes with a mean expression value of ≥ 120 , and centered on the mean before visualization. Genes encoding activating and inhibitory NKRs, adaptors and signaling partners (*Klra1*, *Klra2*, *Klra3*, *Klra5*, *Klra6*, *Klra8*, *Klra9*, *Klra10*, *Klra17*, *Klrb1a*, *Klrb1b*, *Klrb1c*, *Klrb1f*, *Klrc1*, *Klrc2*, *Klrc3*, *Klrd1*, *Klre1*, *Klri1*, *Klri2*, *Klrk1*, *Klrk2*, *Ncr1*, *Cd244*, *Fcer1g*, *Tyrbp* and *Hcst*) were present in the initial gene list used in the first analysis (**Fig. 3**) and were manually removed for the second analysis (**Supplementary Fig. 5**). *Klra1*, *Klra3*, *Klra5*, *Klra6*, *Klra8*, *Klra9*, *Klra10*, *Klrb1a*, *Klrb1b*, *Klrb1c*, *Klrb1f*, *Klrc1*, *Klrc2*, *Klrc3*, *Klrd1*, *Klre1*, *Klri1*, *Klri2*, *Klrk1*, *Ncr1*, *Cd244*, *Fcer1g*, *Tyrbp* (but not *Klra2*, *Klra17*, *Klrk2* or *Hcst*) were present after filtering for 15% most variable gene list and were contributed to the first, but not the second, Euclidean-distance analysis.

For ANOVA, data were log₂-transformed, low-variability genes with a s.d. of ≤ 0.5 across all ImmGen Project samples were removed and only genes with expression values of ≥ 120 in two or more arrays were considered, which left 5,900 genes. ANOVA was done with MATLAB software function 'anova1' (MathWorks) for comparison of iNKT cell, NK cell and T cell populations, and the Bonferroni correction was applied to the resulting list of P values, and 1,192 (of 5,900) genes passed the ANOVA test ($P < 0.05$). A secondary test was used to determine which of the three populations significantly differed from the other two, as indicated by the 'multcompare' function of MATLAB. On the basis of the results of this analysis, the 1,192 genes were then separated into 14 gene categories. By comparison of the average expression of each gene in NK cells, iNKT cells and T cells, these categories were then sorted into six groups of genes: genes with the most similar expression in NK cells and iNKT cells that were upregulated (A_1) or downregulated (A_2) relative to the expression in T cells; genes with the most similar expression in T cells and iNKT cells that were upregulated (B_1) or downregulated (B_2) relative to the expression in NK cells; and genes with upregulated (C_1) or downregulated (C_2) expression in iNKT cells relative to the expression in T cells or NK cells. Functional gene-set enrichment analysis was done with software from the DAVID bioinformatics database (Database for Annotation, Visualization and Integrated Discovery; Version 6.7; National Institute for Allergy and Infectious Diseases of the US National Institutes of Health)⁵⁷. Biological processes of the PANTHER database of gene products organized by biological function (Protein Analysis Through Evolutionary Relationships)³⁸ are presented in **Tables 1** and **2**. P values calculated with DAVID represent a modified Fisher's exact test. Biological processes with P values less than 0.01 are presented.

For estimation of the significance of enrichment for the distributions associated with the heat maps in **Figures 5–7**, Kolmogorov-Smirnov P values were calculated with JMP software (SAS Institute) with comparison of the selected gene set with all genes meeting the criteria for expression (> 120) in the samples tested.

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