



# High CD8 T-Cell Receptor Clonality and Altered CDR3 Properties Are Associated With Elevated Isolevuglandins in Adipose Tissue During Diet-Induced Obesity

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**Adipose tissue (AT) CD4<sup>+</sup> and CD8<sup>+</sup> T cells contribute to obesity-associated insulin resistance. Prior studies identified conserved T-cell receptor (TCR) chain families in obese AT, but the presence and clonal expansion of specific TCR sequences in obesity has not been assessed. We characterized AT and liver CD8<sup>+</sup> and CD4<sup>+</sup> TCR repertoires of mice fed a low-fat diet (LFD) and high-fat diet (HFD) using deep sequencing of the TCR $\beta$  chain to quantify clonal expansion, gene usage, and CDR3 sequence. In AT CD8<sup>+</sup> T cells, HFD reduced TCR diversity, increased the prevalence of public TCR clonotypes, and selected for TCR CDR3 regions enriched in positively charged and less polarized amino acids. Although TCR repertoire alone could distinguish between LFD- and HFD-fed mice, these properties of the CDR3 region of AT CD8<sup>+</sup> T cells from HFD-fed mice led us to examine the role of negatively charged and nonpolar isolevuglandin (isoLG) adduct-containing antigen-presenting cells within AT. IsoLG-adducted protein species were significantly higher in AT macrophages of HFD-fed mice; isoLGs were elevated in M2-polarized macrophages, promoting CD8<sup>+</sup> T-cell activation. Our findings demonstrate that clonal TCR expansion that favors positively charged CDR3s accompanies HFD-induced obesity, which may be an antigen-driven response to isoLG accumulation in macrophages.**

The stromal vascular fraction (SVF) of adipose tissue (AT) contains immune cells that contribute to the paracrine

signaling milieu that modulates local inflammation and adipocyte function (1). This has been posited to be the primary mechanism by which inflamed AT induces insulin resistance (IR) because inflammatory cytokines are known to interfere with insulin signaling. AT macrophages (ATMs) are believed to serve as the primary cell type responsible for inflammation-induced IR, with AT T cells serving as modulators of ATM activation. However, additional evidence suggests that adaptive immune responses, mediated by both B cells (2,3) and T cells (4–7), also contribute directly to adverse changes in adipocyte metabolic fitness in obesity.

Regulatory T cells (Tregs) are reduced in obese AT compared with lean AT (6), are protective against AT inflammation and IR, and possess a distinctive gene repertoire (6). Experimental models using adoptive transfer of CD4<sup>+</sup> T cells into lymphocyte-free Rag1<sup>-/-</sup> mice reversed weight gain and IR, and depletion of CD8<sup>+</sup> T cells in AT reduced ATM density and improved insulin sensitivity. These findings suggest that immunotherapy could represent a novel approach to treatment of metabolic disease (4,8). Although the etiology of T-cell expansion is unclear at present, *in vitro* studies have found that obese fat independently activates CD8<sup>+</sup> T cells and induces proliferation, whereas lean fat has little effect (4).

Spectratyping analyses of AT CD8<sup>+</sup> T cells in the setting of obesity also have described a narrowed repertoire of T-cell receptor (TCR) V $\alpha$  and V $\beta$  chain families compared

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with cells in lean tissue, suggesting that these CD8<sup>+</sup> T cells may undergo oligoclonal expansion in AT (4,9). An important limitation of spectratyping is that it cannot detect individual TCRs, does not provide complementarity-determining region 3 (CDR3) sequences, and only describes deviations from the normally Gaussian distribution of amino acid or nucleotide length. Spectratyping also was used to demonstrate that proinflammatory CD4<sup>+</sup> T helper 1 (T<sub>H</sub>1) cells with a biased TCR V $\alpha$  repertoire expand in AT, but CD4<sup>+</sup> T<sub>H</sub>17 cells do not (7). Furthermore, progressive reductions in CD4<sup>+</sup>FoxP3<sup>+</sup> anti-inflammatory T cells with increasing obesity were detected (7). Although spectratyping in these studies has allowed the authors to suspect clonal expansion, it did not allow them to quantify TCR repertoire diversity, detect specific clones, examine CDR3 sequences and properties, or examine clonal overlap. Similarly, although analysis of CDR3 $\alpha$  sequences from 98 single AT Tregs showed that AT Tregs have a unique V gene repertoire (6), the diversity observed and its relation to the native repertoire were less clear because the transgenic mice in this study only carried a single V $\alpha$  gene, were designed to produce a distinctly narrowed TCR repertoire, and had a lower-than-normal thymic output (10).

Because prior studies demonstrated that obese mice have increased AT T-cell density and a shift toward a proinflammatory phenotype, we hypothesized that high-fat feeding would induce an increase in AT CD4<sup>+</sup> and CD8<sup>+</sup> T cells in conjunction with the clonal expansion of specific TCR clonotypes. We performed high-throughput TCR DNA sequencing of the AT and livers of mice fed either a high-fat diet (HFD) or a low-fat diet (LFD). The TCR repertoires of mice fed an HFD are markedly enriched for public clonotypes in the CD8 and CD4 TCR repertoires of the AT. This overlap in TCRs between HFD samples distinguished between lean and obese mice, suggesting selection both for more public clonotypes and for autoreactive T cells. We find that the CD8<sup>+</sup> TCR repertoire of mice fed an HFD is more clonal and characterized by more charged and less polar CDR3s. These HFD-induced features of the T-cell response led us to examine possible sources of neoantigens within AT, specifically the immunogenic and well-characterized isolevuglandin (isoLG) protein adducts, which are the sole lipid neoantigen species that induces a T-cell response in hypertension (11). We detected an increase in immunogenic isoLGs, a family of negatively charged protein adducts generated from reactive  $\gamma$ -ketoaldehydes, in CD206-expressing macrophages isolated from AT of HFD-fed mice. Moreover, isoLGs were elevated in M2-polarized macrophages *in vitro*, and cocultures of these macrophages with T cells promoted CD8<sup>+</sup> T-cell activation. These observations demonstrate that dietary modifications affect the adaptive immune response in AT in a systemic fashion and provide novel insights into potential mechanisms by which HFD and obesity may lead to pathogenic T-cell responses directed toward modified self-peptides.

## RESEARCH DESIGN AND METHODS

### Mice and Diets

Male C57BL/6J mice were purchased from The Jackson Laboratory. Studies were divided into three cohorts. The first cohort was used for AT T-cell studies and TCR repertoire analysis, the second was used for isoLGs, and the third was used for measuring isoLGs in ATM subsets and coculture studies. At 8 weeks of age, mice were placed on a 10% LFD for 9 weeks. Subsequently, mice were randomized into either the LFD or the HFD group. Both diets were purchased from Research Diets (HFD: D12492, LFD: D12450B; New Brunswick, NJ). Mice were fed *ad libitum* and given free access to water. All animal procedures were performed with approval from the institutional animal care and use committee of Vanderbilt University.

### Glucose Tolerance Testing

Mice were fasted for 5 h, and basal blood glucose levels were measured (0 min) before intraperitoneal administration of 1.5 g dextrose/kg lean body mass. Blood glucose was assessed at 15, 30, 45, 60, 90, and 150 min after injection.

### AT SVF Isolation, Liver Nonparenchymal Cell Isolation, and FACS Analysis

#### AT SVF Isolation

The SVF was isolated from epididymal fat pads through collagenase digestion and differential centrifugation as previously described (12).

#### Liver Nonparenchymal Cell Isolation

Liver was excised and minced in 1 mg/mL collagenase in PBS. Minced liver was incubated on a shaker at 37°C for 30 min. The cell suspension was filtered and spun at 800g for 10 min at 4°C. The cell pellet was suspended in 33% Percoll. The Percoll gradient was centrifuged at 800g for 30 min at room temperature. Red blood cells were lysed using ammonium-chloride-potassium lysing buffer. Cells were centrifuged at 800g for 5 min at 4°C. The cells were suspended in FACS buffer and stained for flow cytometry. The following primary fluorophore-conjugated antibodies, along with isotype controls, were used to characterize AT and liver T-cell populations: PerCP-Cy5.5-conjugated anti-mouse CD45, antigen-presenting cell (APC)-conjugated anti-mouse TCR $\beta$ , Alexa Fluor 700-conjugated anti-mouse CD4, and V500-conjugated anti-mouse CD8a (all from eBioscience). DAPI was added immediately before analysis to enable discrimination between live and dead cells.

#### FACS Analysis

FACS was performed on a BD FACSAria III flow cytometer (BD Biosciences) at the Vanderbilt Medical Center Flow Cytometry Core shared resource, and data were analyzed using FlowJo software (Tree Star). The gating strategy is shown in Supplementary Fig. 1.

#### TCR Sequencing

Genomic DNA from sorted CD4<sup>+</sup> and CD8<sup>+</sup> T cells was isolated using the QIAamp DNA Blood Mini Kit (QIAGEN).

DNA from AT CD4<sup>+</sup> and CD8<sup>+</sup> T cells and liver CD8<sup>+</sup> T cells was used for bulk TCR $\beta$  CDR3 region amplification and sequencing using the ImmunoSEQ assay (Adaptive Biotechnologies, Seattle, WA). In this method, bias-controlled V and J gene primers are used to amplify rearranged V(D)J segments for sequencing (13).

### IsoLG Adduct Quantification

ATMs were analyzed by flow cytometry using the following antibodies: PerCP-Cy5.5-conjugated anti-mouse CD64, PE-Cy7-conjugated anti-mouse CD86, Alexa Fluor 700-conjugated anti-mouse CD11c, PE-conjugated anti-mouse CD206, APC-conjugated anti-mouse F4/80, and PECF594-conjugated anti-mouse CD45 (Becton Dickinson). We used intracellular staining with the single-chain antibody D-11 to detect isoLG protein adducts. The D-11 single-chain variable fragment antibody was labeled with Alexa Fluor 488 using the APEX Alexa Fluor 488 Antibody Labeling Kit (Invitrogen). Cells labeled with surface antibodies were fixed and permeabilized for intracellular detection of isoLGs using the FIX & PERM Cell Fixation and Permeabilization Kit (Invitrogen). Dead cells were excluded from analysis using a LIVE/DEAD Fixable Dead Cell Stain Kit (Invitrogen). For each experiment, we gated on single live cells and used fluorescence minus one controls for each fluorophore to establish the gates. Data were analyzed using FlowJo software. The gating strategy is shown in Supplementary Fig. 2A.

### Bone Marrow-Derived Macrophage Polarization and T-Cell Coculture

Bone marrow-derived macrophages (BMDMs) isolated from C57BL/6J mice were obtained as described by Trouplin et al. (14). On day 6, fully differentiated BMDMs were split and loaded into 24-well plates at a density of 700,000 cells per well in L929-conditioned media. Cells were allowed to adhere overnight and then polarized as follows: For M1 polarization, BMDMs were stimulated for 24 h with interferon- $\gamma$  (100 ng/mL; R&D Systems) and lipopolysaccharide (10 ng/mL; Sigma). For M2 polarization, BMDMs were treated for 96 h with interleukin 4 (10 ng/mL; R&D Systems) and interleukin 13 (10 ng/mL; R&D Systems). For metabolic polarization (metabolically activated macrophages [MMes]), BMDMs were treated for 24 h with 30 mmol/L glucose, 10 nmol/L insulin, and 0.4 mmol/L palmitic acid as described by Hill et al. (15). For *tert*-butyl hydroperoxide (TBHP) treatment, BMDMs were treated with 1 mmol/L TBHP for 30 min, after which the TBHP media were replaced with fresh media. T cells were isolated from spleens of LFD- and HFD-fed mice using APC magnetic beads (Miltenyi) to isolate TCR $\beta$ -APC-labeled cells. Polarized BMDMs were cocultured with isolated pan-T cells from LFD- and HFD-fed mice at a ratio of 1:2. BMDMs and T cells were collected.

Immunostaining for flow cytometry was performed using the following antibodies: for macrophage panel, PE-conjugated anti-mouse CD45, APC-conjugated anti-mouse F4/80, and intracellular staining with the single-

chain antibody D-11 to detect isoLG protein adducts, and for activated T-cell panel, PerCP-Cy5.5-conjugated anti-mouse CD45, fluorescein isothiocyanate-conjugated anti-mouse CD4, PECF594-conjugated anti-mouse CD69, and PE-Cy7-conjugated anti-mouse CD8 (BD Biosciences) and DAPI. The gating strategy for BMDMs is shown in Supplementary Fig. 3 and for activated T cells in Supplementary Fig. 4.

### Computation

#### Data Import and Preprocessing

All TCR sequences, including nonproductive sequences, from immunoSEQ were processed and imported using VDJTools as previously described (16). Amino acid sequences were analyzed because the amino acid sequence of a TCR determines its structural properties.

#### Repertoire Similarity

VDJTools was used to calculate a pairwise distance matrix between samples using the geometric mean overlap  $F_{ij} = \sqrt{f_{ij}f_{ji}}$ , such that  $f_{ij} = \sum_{k=1}^N \phi_{ik}$  sums to the frequencies of TCRs shared between two samples present in the first as the distance metric. This matrix was used to perform complete linkage hierarchical clustering through the *hclust* function in base R version 3.4.0 software. Permutation testing confirmed significant factors in clustering. Each sample was downsampled in a density-dependent fashion to 10,000 clonal sequences to confirm significant factors in clustering and significant structure. Mice with <1,000 clonotypes detected in any sample were excluded from analysis.

#### Repertoire Overlap

The VDJTools *JoinSamples* routine was used to detect clonotypes overlapping between samples with shared amino acid sequences.

#### Clonal Homeostasis

The frequency of each clonotype within each sample was calculated using VDJTools. The clonal space, defined by the sum of frequencies, occupied by the top 1–3, 4–10, 11–20, 21–50, 51–100, and bottom 101–*n* clonotypes was calculated per sample as described previously (17). These clonal bins were log-transformed and tested for differences in the ratio of their geometric means between LFD and HFD. The CD4 and CD8 clonal bins were then condensed per mouse and used as input for hierarchical clustering. Average linkage was used as the clustering method, and absolute correlation was used as the distance metric. For visualization, the geometric means for each set of samples was calculated per clonal bin and normalized to range from 0 to 1.

#### *t*-Distributed Stochastic Neighbor Embedding

Clonal homeostatic proportions were fed into the *t*-distributed stochastic neighbor embedding (*t*-SNE) algorithm with principal component analysis (PCA) before projection. Perplexity was set at 2,  $\theta$  at  $10^{-5}$ , and learning rate at 1, and perplexity was exaggerated for the first

50 iterations to restrain the *t*-SNE algorithm in a size-dependent fashion. Five thousand iterations were allowed. Calculations were performed using the Rtsne package (18).

### PCA

Homeostatic proportions were centered and scaled before projection. Calculations were performed using the *prcomp* function in base R.

### P Value-Validated Clustering

Clonal homeostatic proportions were clustered using complete linkage for clustering and absolute correlation for distance. Calculations were performed using the *pvclust* package of R (19).

### Multidimensional Scaling

The pairwise distance matrix using geometric mean overlap was used as input for nonmetric multidimensional scaling using *VDJTools* (16) and the *isoMDS* function from the Modern Applied Statistics With S-PLUS package (20).

### Repertoire Publicity Analysis

Public clonotypes were defined as those shared among at least three mice to account for sampling depth. All public clonotypes were retrieved using *VDJTools* (16), and the frequency within each mouse was converted to a binary value representing present (1) or absent (0). For each public clonotype, each dietary group was then assigned a binary value representing whether it was greater than (1), less than (0), or equally prevalent to (0) the other dietary group. These values were then used to construct a 2 × 2 contingency table representing the proportion of public TCRs for each dietary group, in similar fashion to analysis of concentration and association (21,22).

### Sequence Logo Plots

Seq2Logo was used to generate three types of sequence logo plots. The median TCRβ length was calculated, and these sequences were used to generate logo plots using Shannon entropy (the probability of an amino acid appearing), the Kullback-Leibler divergence (probability with enrichment and depletion), and the probability-weighted Kullback-Leibler divergence (probability of each amino acid multiplied by its weight). Where indicated, Hobohm first algorithm (nearest-neighbor selection clustering) was used to bin TCRs with similar sequences, using a threshold of 20% to account for the diversity and divergence of the TCRβ chain. A weighted prior correction of 200 pseudocounts on the basis of the BLOSUM62 matrix was used to correct for amino acids detected at very low levels as previously described (23). Where appropriate, each mouse's TCR repertoire also was down-sampled in density-dependent fashion to 10,000 clonal sequences to draw comparisons between samples and to cross-validate the multidimensional structure and similarity of data.

### Statistics

Significance was set a priori at  $P < 0.05$ .

### Weight and Clonality

Repeated-measures ANOVA with Bonferroni multiple comparisons testing was used to assess changes between diet groups using GraphPad Prism version 6.05 software (GraphPad Software, La Jolla, CA) and R version 3.4.0 (RStudio version 1.0.143).

### Glucose Tolerance Testing

Two-way ANOVA with post hoc Bonferroni-Šidák multiple comparisons testing was used to assess differences between dietary groups at each time point.

### Clonal Homeostasis

The Mann-Whitney *U* test was used to assess differences in the geometric mean ratios of clonal homeostasis bins using GraphPad Prism software.

### Factor Analysis in Clustering

Significant factors in hierarchical clustering were assessed using permutation testing in *VDJTools* for repertoire similarity.

### Cluster Analysis in Clonal Homeostasis

Cluster significance for clonal homeostatic signatures was assessed using multistep-multiscale bootstrap resampling in the *pvclust* package of R (19).

### CDR3 Amino Acid and Nucleotide Profiling

CDR3 properties were calculated per sample and per dietary group using *VDJTools* (16). The Mann-Whitney *U* and Wilcoxon signed rank tests were used to assess differences in CDR3 properties using GraphPad Prism and R software. *P* values were corrected using the Benjamini-Hochberg false discovery rate correction.

### Repertoire Publicity

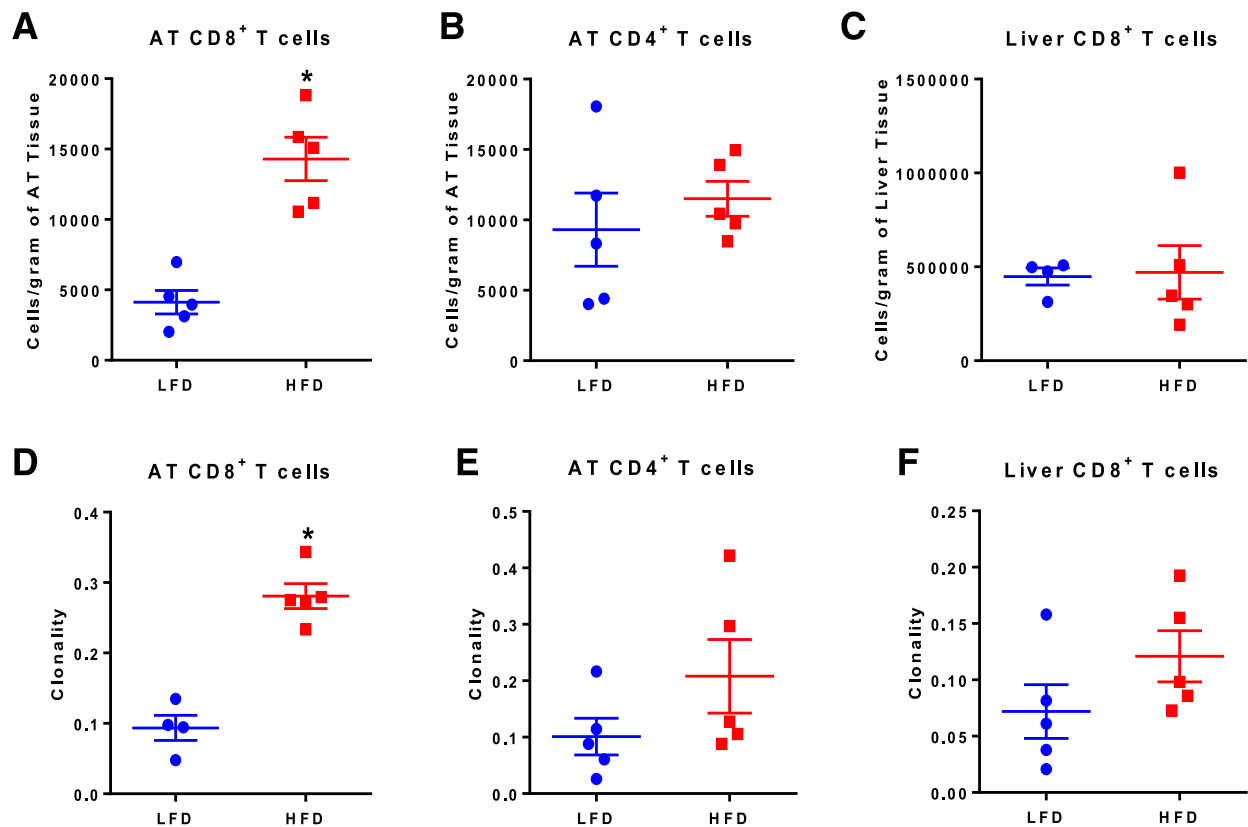
We tested the 2 × 2 contingency table computed as described above using Pearson  $\chi^2$  test. The *P* value for this test was calculated using Monte Carlo simulation with 1,000 bootstraps in R. *P* values were adjusted using the Bonferroni correction to control the familywise error rate.

## RESULTS

### High-Fat Feeding Reduces CD8<sup>+</sup> T-Cell Diversity in AT

An HFD increased body weight (Supplementary Fig. 5A), AT mass (Supplementary Fig. 5B), and liver mass (Supplementary Fig. 5C). Although fasting blood glucose was similar among diet groups (Supplementary Fig. 5D), plasma insulin was significantly higher in the HFD-fed mice (Supplementary Fig. 5E), and HFD-fed mice had impaired glucose tolerance (Supplementary Fig. 5F). We next compared the T-cell density (cells/gram tissue) in AT and liver. Similar to previous studies (4), the density of AT CD8<sup>+</sup> T cells was elevated by threefold in HFD-fed mice compared with LFD-fed controls (Fig. 1A). In contrast, AT CD4<sup>+</sup> T-cell and liver CD8<sup>+</sup> T-cell populations were not significantly different between groups (Fig. 1B and C).

TCRβ chain amplification and deep sequencing of AT CD8<sup>+</sup> and CD4<sup>+</sup> T cells as well as liver CD8<sup>+</sup> T cells yielded



**Figure 1**—HFD leads to increased T-cell number and clonality. *A* and *B*: AT CD8<sup>+</sup> number was increased in HFD mice (two-tailed *t* test) (*A*), whereas CD4<sup>+</sup> T cells were not significantly increased (*B*). *C*: There was no difference in the number of liver CD8<sup>+</sup> T cells. *D*: The TCR repertoires of AT CD8<sup>+</sup> T cells of HFD-fed mice are significantly more clonal than those of LFD-fed mice ( $P < 0.05$ , two-tailed Student *t* test). *E*: AT CD4<sup>+</sup> clonality did not differ between HFD and LFD ( $P = 0.18$ , two-tailed Student *t* test). *F*: Liver CD8<sup>+</sup> T cells of HFD-fed mice are not significantly clonal compared with LFD-fed mice ( $P = 0.18$ , two-tailed Student *t* test). Data points represent the clonality of each mouse as calculated using normalized Shannon entropy. Data are mean  $\pm$  SEM ( $n = 4$ –5 mice/group). \* $P \leq 0.05$ .

three repertoires of V(D)J gene TCR sequences per mouse. These TCR sequences were used to calculate overall repertoire clonality as measured by Shannon entropy using the immunoSEQ Analyzer. AT CD8<sup>+</sup> T cells from HFD-fed mice had a higher clonality score, indicating less diversity, compared with LFD-fed mice (Fig. 1*D*). Although there was somewhat increased clonality in AT CD4<sup>+</sup> T cells (Fig. 1*E*) and liver CD8<sup>+</sup> T cells (Fig. 1*F*), this difference was not significant; because we did not detect differences in the liver CD4<sup>+</sup> populations, we did not sequence these T cells.

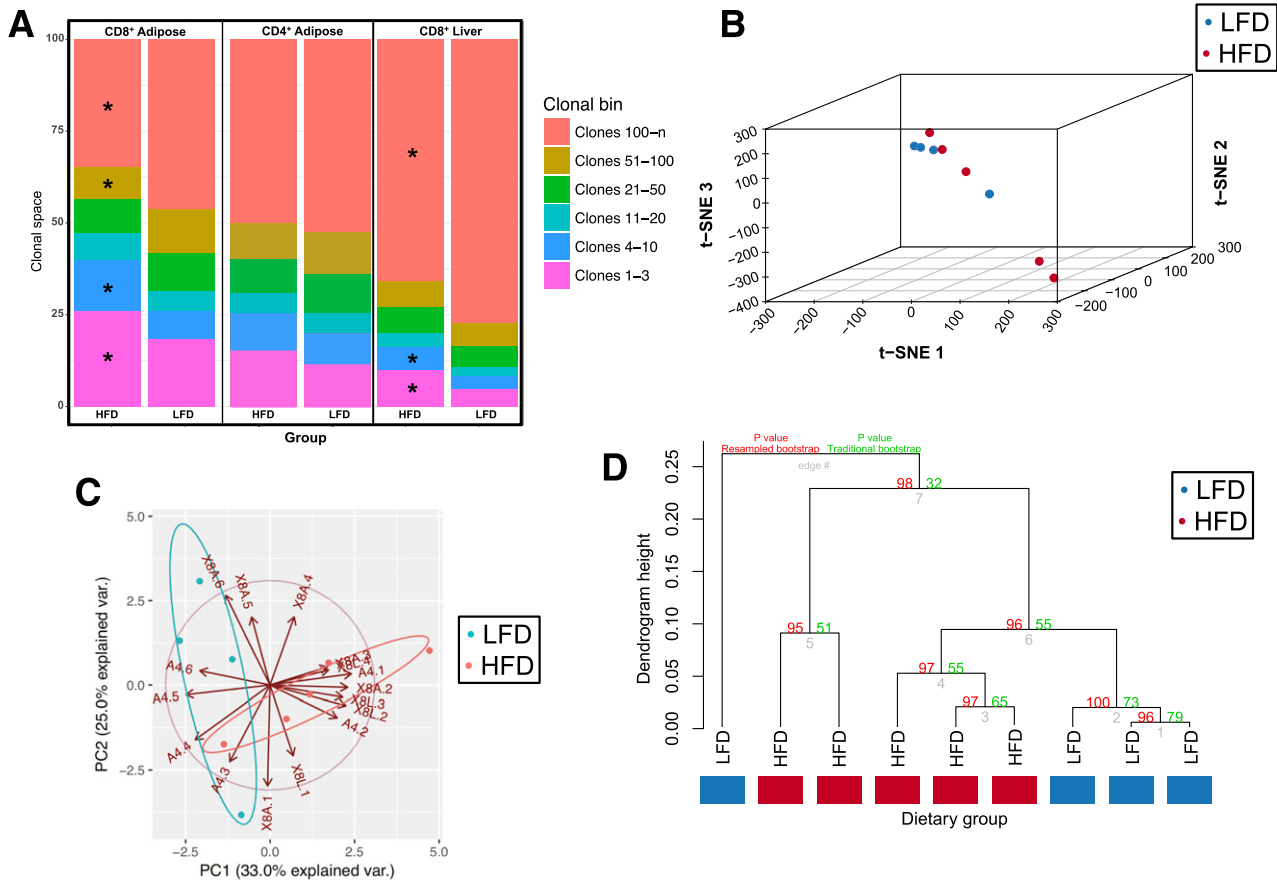
#### T-Cell Clonal Distributions Differ Between Mice Fed an HFD or LFD

Our observation of the marked clonality in the CD8<sup>+</sup> T cells from AT of HFD-fed mice led us to ask whether diet-induced obesity (DIO) affected the relative contributions of the major and minor clonotypes within a given TCR repertoire. We first examined this clonal homeostatic space within each mouse using the Mann-Whitney *U* test after downsampling to account for sampling depth. The top clonotypes of mice fed an HFD occupied significantly higher proportions of clonal space ( $P < 0.001$ ) (Fig. 2*A*), whereas the bottom clonotypes occupied significantly less clonal space ( $P < 0.001$ ) in CD8<sup>+</sup> T cells from AT and liver. The

proportions of these TCRs from the AT and liver also distinguish between lean and obese mice on the basis of *t*-SNE (Fig. 2*B*), PCA (Fig. 2*C*), and hierarchical clustering ( $P < 0.05$ ) (Fig. 2*D*). These multidimensional analyses demonstrate that HFD distorts the size of the largest and smallest clonotypes of the repertoire, an observation that traditional measures of clonality, such as Shannon entropy, do not capture.

#### Shared Clonotypes and Gene Usage Distinguish Between TCR Repertoires From Mice Fed LFD or HFD

Hierarchical clustering on repertoire similarity of TCR clonotypes sharing the same amino acid sequence successfully distinguished between both AT CD8<sup>+</sup> TCR ( $P < 0.05$ ) and AT CD4<sup>+</sup> TCR repertoires of LFD- and HFD-fed mice ( $P < 0.001$ ) (Fig. 3*A*). The impact of dietary group on repertoire similarity held true when pooling TCR repertoires from AT and liver and from both CD8<sup>+</sup> and CD4<sup>+</sup> T cells ( $P = 0.01$ ) (Fig. 3*B*). Expansion of both major and minor clonotypes led to synchronous changes in CD8<sup>+</sup> T cells between AT and liver repertoires within each mouse (Fig. 3*C* and Supplementary Table 1) in a diet-dependent fashion ( $P < 0.05$ ). Each mouse's AT and liver repertoires were most similar to each other, demonstrating the reproducibility of repertoire changes that are tissue specific.

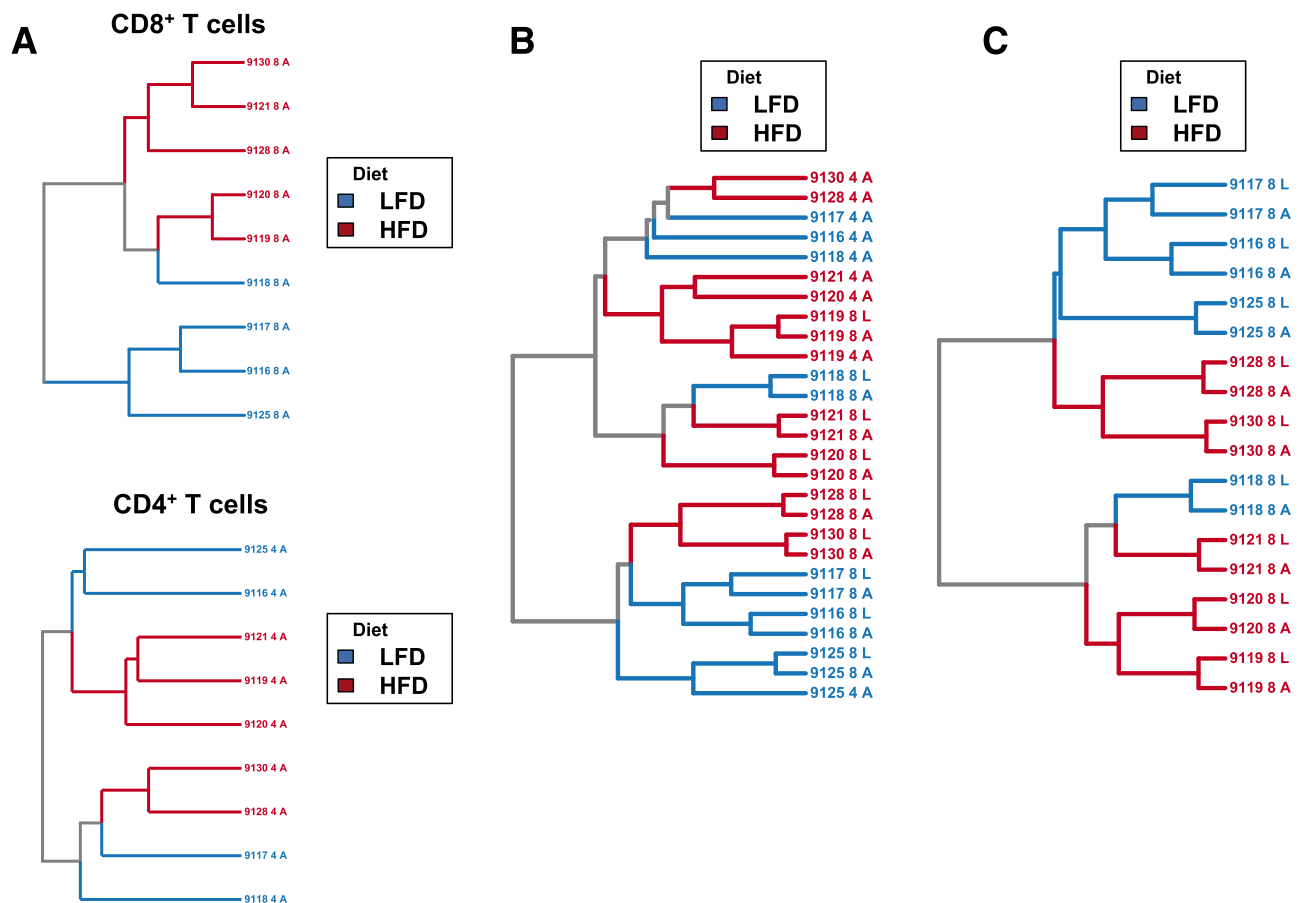


**Figure 2**—Clonal homeostatic space differs between dietary groups and is a distinctive signature in multidimensional space. **A**: The space within the repertoire occupied by the clonotypes within each clonal bin was calculated for each mouse. The geometric mean for each of these proportions was calculated for each diet group, and the clonal homeostatic proportions occupied were tested using the two-tailed Mann-Whitney *U* test. The clonal proportions distinguish between dietary conditions using modern machine learning methods measuring several multidimensional distances. **B**: Two dimensional *t*-SNE projection of clonal homeostatic proportions from the AT reveals that lean and obese mice differ in clonal homeostasis as measured in a two-dimensional projection. PCA with centering and scaling was performed before *t*-SNE, and 15 dimensions were retained for embedding with the *t*-SNE algorithm. **C**: PCA projection of clonal homeostatic proportions reveals that the repertoire space occupied by both highly and lowly abundant clonotypes distinguishes between lean and obese mice. **D**: Hierarchical clustering using average linkage and absolute correlation reveals that clonal homeostatic proportions distinguish between lean and obese mice. Values shown at each node demonstrate the confidence that a cluster truly exists as measured using multiscale bootstrap resampling and traditional bootstrapping. Multiscale bootstrap resampling validates that these characteristic differences are not expected to distinguish between lean and obese mice by chance alone. \**P* ≤ 0.05. PC, principal component; var., variance.

Our observation of the dissimilarity of the TCR repertoires between dietary groups led us to examine whether V $\beta$  gene usage differed in AT between LFD- and HFD-fed mice. The AT CD8<sup>+</sup> T-cell repertoires of each dietary group demonstrated differential usage of several V $\beta$  genes (Fig. 4A). Neither LFD nor HFD affected J $\beta$  gene usage in the AT (Fig. 4B). Similar to other groups, we observed differential V $\beta$  gene usage between CD4<sup>+</sup> and CD8<sup>+</sup> T cells (24,25), which also distinguished between CD4<sup>+</sup> and CD8<sup>+</sup> TCR repertoires (Supplementary Fig. 6). CD4<sup>+</sup> TCRs expressed a decrease in charge and increase in polarity compared with CD8<sup>+</sup> TCRs (*P* < 0.05) (Supplementary Fig. 7A). They also had characteristically shorter N-D gene-N regions (*P* < 0.05) (Supplementary Fig. 7B).

### HFD Increases the Prevalence of Public T-Cell Clonotypes

The observation that diet strongly influences TCR repertoire similarity led us to ask whether HFD-fed mice were more likely to share clonotypes than LFD-fed mice. To test this hypothesis, we used a specialized Monte Carlo-validated  $\chi^2$  test (Supplementary Fig. 8). This test proved to be robust to both *P* value permutation and probability proportionate to size downsampling in addition to extremely conservative *P* value correction. HFD mice were more likely to have public clonotypes shared among at least three mice in their CD8<sup>+</sup> (*P* < 0.001) and CD4<sup>+</sup> AT T-cell repertoires (*P* = 0.01). This difference was not observed in the liver CD8<sup>+</sup> TCR repertoire.



**Figure 3**—Dietary group is predictive of repertoire similarity and synchronously alters the TCR repertoire in AT. Geometric mean overlap was used to calculate pairwise distance matrices on the basis of shared clonotypes with identical CDR3 amino acid sequences. Labels on each dendrogram correspond to a specific mouse, tissue type, and cell type (4 or 8). **A:** AT CD8<sup>+</sup> (upper) and CD4<sup>+</sup> repertoires (lower) share more TCRs within diet groups than between diet groups ( $P < 0.0001$  for CD8<sup>+</sup> and CD4<sup>+</sup>, permutation of pairwise distance matrix). This suggests that sets of shared TCRs are enriched and depleted in a diet-dependent fashion. **B:** Diet significantly affects repertoire similarity across multiple cell types and within multiple tissues ( $P = 0.01$ , permutation of pairwise distance matrix). TCRs shared between mice within multiple tissue and T-cell types distinguish between lean and obese mice. Diet-dependent repertoire similarity is observed in liver in addition to AT. **C:** CD8<sup>+</sup> T-cell repertoires from liver and AT reflect simultaneous clonal expansion and sharing within each mouse and show that diet significantly affects repertoire similarity within the CD8<sup>+</sup> compartment ( $P < 0.05$ , permutation of pairwise distance matrix). A, AT; L, liver.

Regardless of dietary condition and tissue type, we identified 15,419 TCRs shared between any two samples, 9,034 TCRs shared between any two CD8<sup>+</sup> liver samples, 1,126 TCRs shared between any two CD4<sup>+</sup> AT samples, and 826 TCRs shared between any two CD8<sup>+</sup> AT samples (Supplementary Data). We also detected previously reported clonotypes that have been associated with obesity and IR in mouse models in both LFD- and HFD-fed mice (Table 1).

#### HFD Alters Physicochemical Properties of the TCR Repertoire

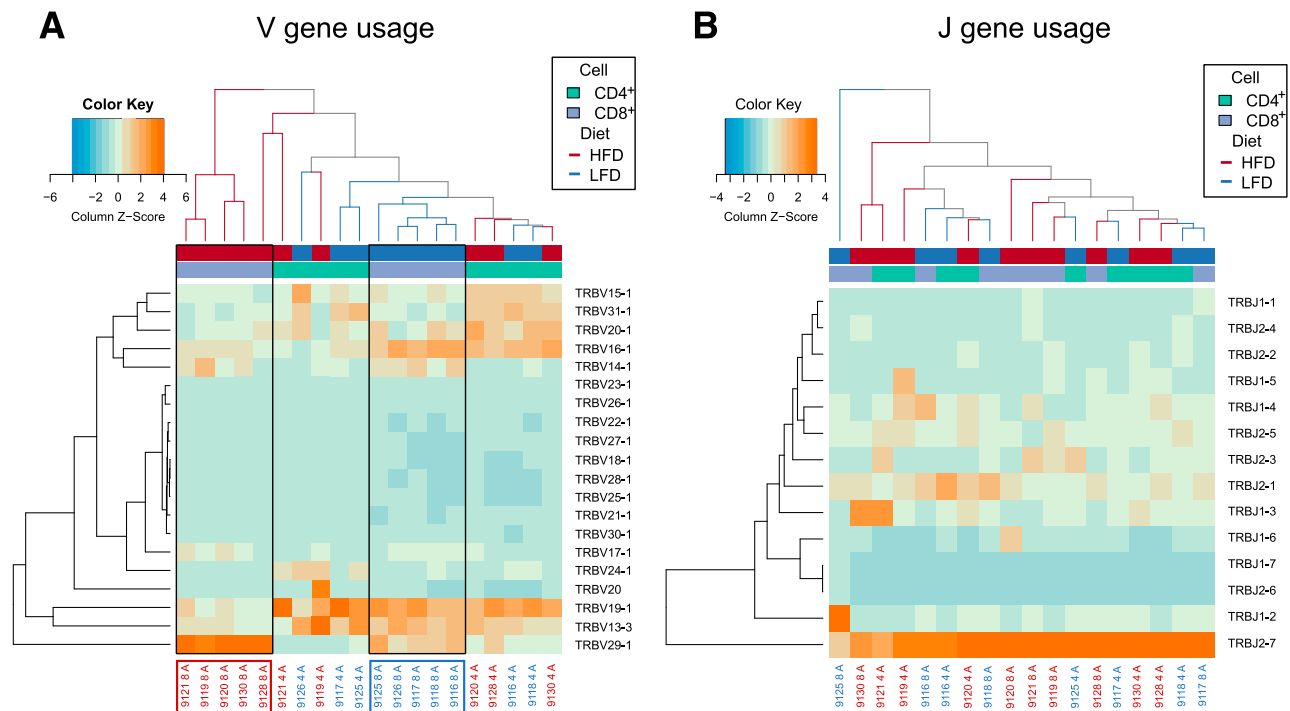
In addition to being more clonal, the TCR repertoire of mice fed an HFD demonstrated marked physicochemical differences from mice fed an LFD. To assess these differences, we systematically compared the CDR3 of every TCR detected in LFD- and HFD-fed mice and CD4<sup>+</sup> to CD8<sup>+</sup> TCRs. Obesity resulted in an elevation in charge ( $P = 0.01$ ) (Fig. 5A) and a decrease in polarity in CD8<sup>+</sup> TCRs from AT ( $P < 0.05$ ) (Fig. 5B). These repertoire-level changes do not appear to originate from germline selection and instead

derive from the junctional regions of the CDR3, where TCR diversity is generated at the nucleotide level (Fig. 5C and D).

To examine more closely the differences in charge and polarity, we used sequence entropy measurements to detect enriched and depleted amino acids in the CDR3s of CD8<sup>+</sup>. Weighted Shannon entropy (Fig. 6A) and Kullback-Leibler divergence (Fig. 6B) demonstrated that these changes are due to an enrichment of arginine and depletion of negatively charged amino acids, with other positively charged amino acids selected for at positions 8, 9, and 11. Unweighted Shannon entropy (Fig. 6C) and Kullback-Leibler divergence (Fig. 6D), where each TCR is given equal weight, revealed that both lysine and histidine contribute strongly to the increase in charge observed.

#### HFD Leads to isoLG Accumulation in ATMs

The physicochemical alterations in the CD8<sup>+</sup> TCR repertoires of HFD-fed mice led us to consider how the CDR3 of the TCR $\beta$  chain could interact with the local biochemical environment of AT. Because we observed an increased charge



**Figure 4**—CD8<sup>+</sup> TCR repertoires within AT are genetically distinct by dietary group. Z-score-normalized heat maps were built using VDJTools. Labels underneath the heat maps correspond to individual mice, and rows correspond to a given V $\beta$  (TRBV) gene. The heat map is colored on the basis of Z-score and how many SDs from the mean a given sample is in its expression of a given V $\beta$  gene family. **A:** Obesity leads AT CD8<sup>+</sup> T cells to use distinct sets of V gene segments. These changes do not appear to distinguish between CD4<sup>+</sup> T cells of lean and obese mice, although CD4<sup>+</sup> T cells appear to use different sets of V $\beta$  genes than CD8<sup>+</sup> T cells regardless of dietary condition. **B:** Obesity does not affect the J segments used within the CD8<sup>+</sup> TCR repertoires of mice to the same extent that V segments do. This is unsurprising because there are fewer J $\beta$  (TRBJ) genes than V $\beta$  genes and because the J $\beta$  region frequently accounts for less nucleotide diversity than the V $\beta$  region.

and decreased polarity, we chose to examine the isoLG content of APCs within AT because these highly reactive  $\gamma$ -ketoaldehydes carry both negatively charged phospholipid content and nonpolar lipid content (Fig. 7A). IsoLGs have been shown to rapidly adduct to lysines on self-proteins, forming isoLG protein adducts that are processed and presented as neoantigens, and induce an autoimmune-like state in hypertension (11). We isolated total leukocytes from AT and performed flow cytometry to identify isoLG protein adducts in ATMs (Fig. 7A). As previously reported by other research groups (32,33), HFD increased total ATM density and ATM subsets CD11c<sup>+</sup> (M1-like ATMs), CD206<sup>+</sup> (M2-like ATMs), and double-positive populations (Supplementary Fig. 2B and C). After HFD, ATMs showed increased isoLG-adduct formation (Fig. 7B) and expression of the costimulatory molecule B7 ligand CD86 (Fig. 7C). Regardless of ATM polarization state, HFD led to significant elevations of isoLGs in the number of cells per gram of AT of CD11c<sup>+</sup>, CD206<sup>+</sup>, and CD11c<sup>+</sup>CD206<sup>+</sup> ATMs compared with LFD (Fig. 7D–F). However, HFD only increased the percentage of isoLG<sup>+</sup> cells in CD206<sup>+</sup> ATMs (Fig. 7E).

Because HFD led to elevations in isoLGs in ATMs, we sought to determine whether isoLGs in macrophages induce T-cell activation. As a control and to verify that isoLG-containing macrophages activate T cells, we treated BMDMs with 1 mmol/L TBHP, which induces oxidative stress. Treatment with TBHP led to elevations in isoLGs in

BMDMs (Fig. 8A and B) and as previously reported (11). With use of an in vitro coculture system, we polarized BMDMs to M1, M2, and obesogenic MMs to represent the various subsets present in AT during HFD. Of note, isoLG levels were elevated only in M2-polarized macrophages compared with M0 ( $P < 0.05$ ), were lower in M1 macrophages ( $P < 0.001$ ), and were not different in MMs compared with M0 (Fig. 8A and B). TBHP-treated and polarized BMDMs were subsequently cultured with pan-T cells isolated from spleens of LFD- and HFD-fed mice. As expected, coculture with TBHP-treated macrophages led to elevations of total CD8<sup>+</sup> T cells (Fig. 8C) and more specifically in activated cells as indicated by expression of the early activation marker CD69 (Fig. 8D). Furthermore, only the isoLG-containing M2 macrophages promoted an increase in CD8<sup>+</sup> T cells and their activation (Fig. 8C and D), and this was only when cocultured with CD8<sup>+</sup> T cells from the obese HFD-fed mice. Together, these findings demonstrate that ATMs express isoLGs under obese conditions and that isoLG-containing M2 macrophages are capable of driving CD8<sup>+</sup> T-cell activation in vitro.

## DISCUSSION

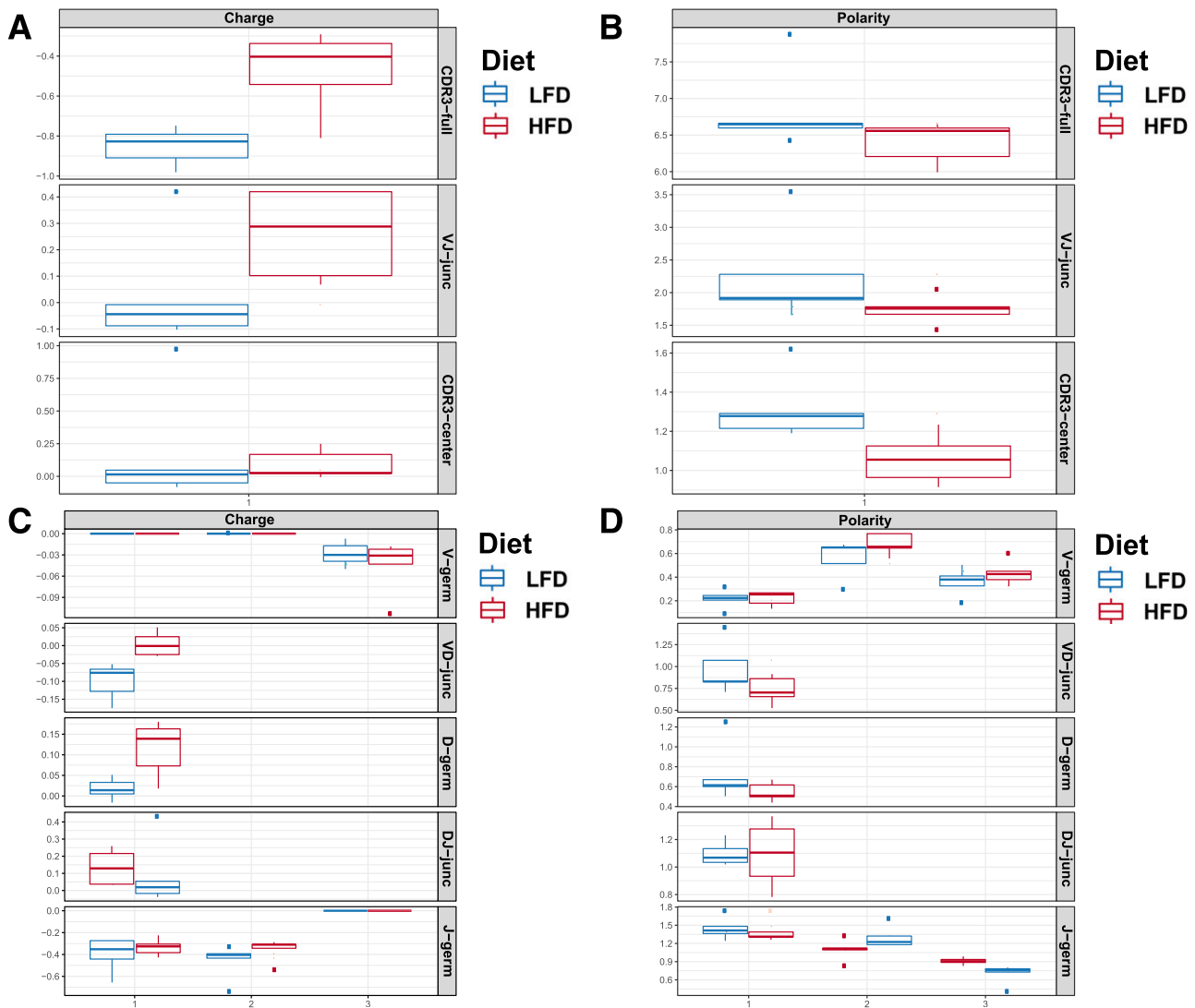
We demonstrate that HFD-fed mice have a higher AT CD8<sup>+</sup> T-cell density and TCR clonality. CD8<sup>+</sup> cells from AT of HFD-fed mice also have a distinctive TCR repertoire that differs in both charge and polarity within the CDR3 region



**Table 1—Detection of previously reported T-cell clonotypes associated with pathogenesis in mouse models of obesity and diabetes**

CDR3 AA	Reference	HFD Liver CD8	HFD Adipose CD8	HFD Adipose CD4	LFD Liver CD8	LFD Adipose CD8	LFD Adipose CD4	Annotation	P value
CASSLGGNTLYF	26	4	1	1	3	0	0	Expanded in pancreas	NS
CASSDAGQYEQYF	26	1	0	0	2	0	0	Expanded in pancreas	NS
CASSDSAETLYF	26	3	3	0	1	0	0	Expanded in pancreas	*
CASGDEGYEQYF	26	1	0	1	0	0	0	Expanded in pancreas	NS
CASGDAREQYF	26	2	1	0	3	0	0	Expanded in pancreas and B-cell scaffolds	NS
CASGSSYEQYF	26	2	0	1	2	0	0	Expanded in $\beta$ -cell scaffolds	NS
CASSDAGTNERLFF	26	1	0	1	0	0	0	Expanded in $\beta$ -cell scaffolds	NS
CASGSSYEQYF	26	2	0	1	2	0	0	Expanded in $\beta$ -cell scaffolds	NS
CASSLGTGDEQYF	27	2	1	1	1	0	1	Diabetogenic clone BDC 4.12	NS
CASSGTGGQNTLYF	28	0	0	0	3	0	0	Diabetogenic clone A115.A3, $\beta$ -cell autoreactive	*
CASSGTGGQNTLY	28	0	0	0	3	0	0	Diabetogenic clone A15.F5, $\beta$ -cell autoreactive	*
CASSLGGYEQYF	29	3	1	3	5	1	2	Proinsulin reactive	NS
CASSRDNTEVF	29	3	0	1	2	0	0	Insulin reactive	NS
CASSLTGNTGQLY	29	2	0	4	1	0	0	Insulin reactive	*
CASSPDNVEQY	29	1	1	1	2	0	0	Insulin reactive	NS
CASSRHQDTQYF	30	1	0	0	2	0	0	Specificity not known	NS
CASSLGGYEQY	31	3	1	2	5	1	2	Reactive against insulin	NS

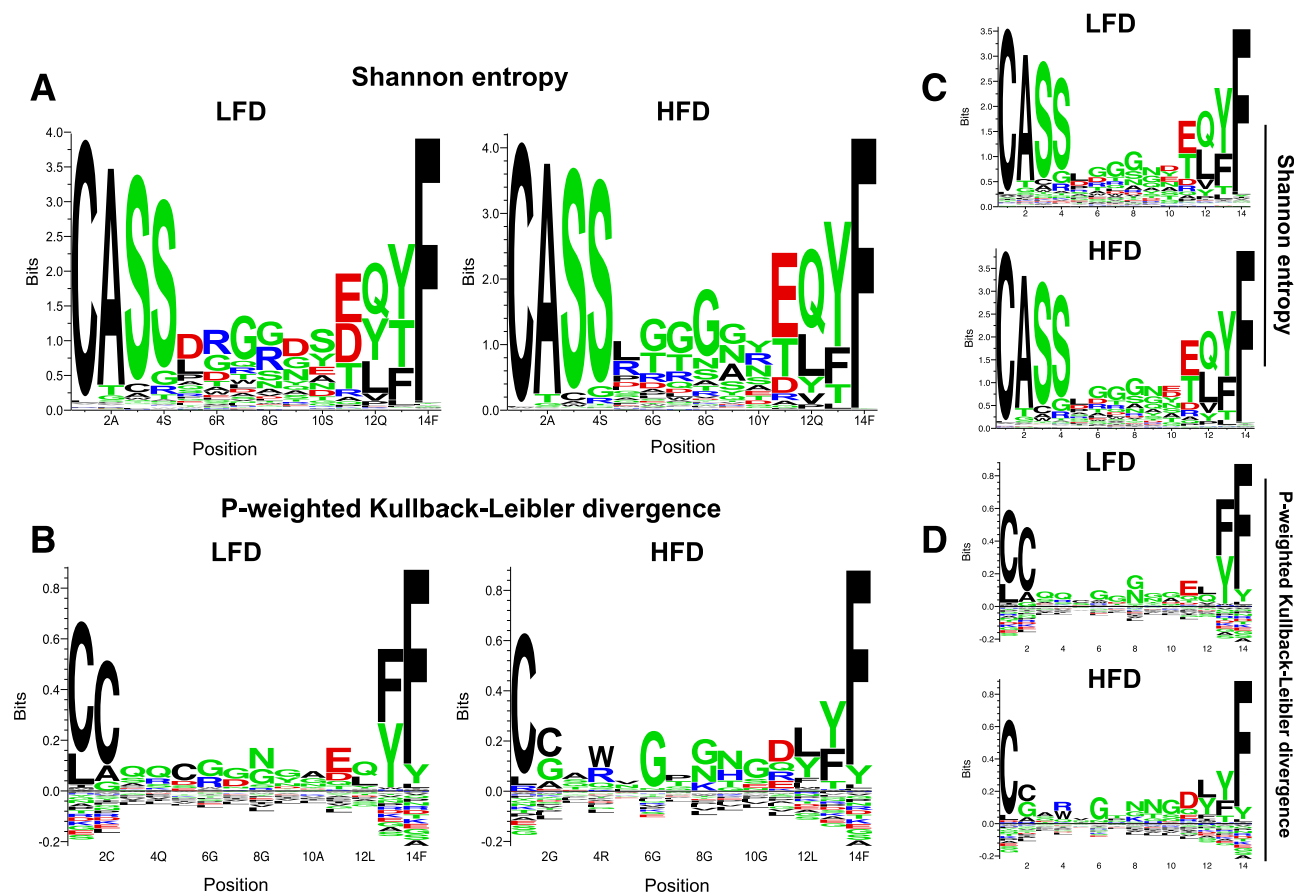
\*  $P \leq 0.05$ .



**Figure 5**—CD8<sup>+</sup> TCR repertoires of mice fed an HFD differ in physicochemical properties compared with those of mice fed an LFD. **A:** AT CD8<sup>+</sup> T-cell repertoires of obese mice are significantly higher in charge ( $P = 0.01$ , Student  $t$  test). This elevation in charge is due to amino acids encoded in the junctional regions of the TCR, where diversity is generated. **B:** The CD8<sup>+</sup> T-cell repertoire within AT also is markedly lower in polarity in obese mice ( $P < 0.01$ , Student  $t$  test). Unlike the changes observed in charge, the difference in polarity appears to arise from germline selection. **C:** Elevations in charge arise from the junctional regions of the TCR, where TCR diversity is generated at the nucleotide level. Repertoires were assessed using three scanning bins to account for variance along each region and to identify signal arising from each genetic region of the TCR. **D:** The increased polarity of AT CD8<sup>+</sup> TCR repertoires from obese mice appears to be more closely related to changes selected at the germline level, unlike changes in charge. germ, germline; junc, junction.

compared with LFD-fed mice. These changes are not observed within the CD4<sup>+</sup> TCR repertoire, which uses different V-segment genes than CD8<sup>+</sup> T cells, regardless of diet (Fig. 4A). The repertoires of mice fed an HFD are also more public than of mice fed an LFD, which has been reported previously in autoimmune pathologies but uncommonly in antipathogen responses (reviewed in Madi et al. [34]). Furthermore, we provide evidence that these repertoire properties may emerge in part as a response to an increase in immunogenic isoLG adducts present in the ATMs of mice fed an HFD. We have directly identified and quantitated specific clonally expanded TCRs within the CD8<sup>+</sup> and CD4<sup>+</sup> T-cell populations that appear to arise in

response to DIO. We also demonstrate that the AT TCR repertoire alone can distinguish between LFD- and HFD-fed mice. To that end, we note that HFD induces repertoire-level changes previously described in studies of autoimmunity and enriches for amino acid sequences biased toward a positive charge. In fact, Glanville et al. (35) recently described a strong inverse correlation between CDR3 charge and epitope charge in TCRs of both humans and mice. Finally, we document elevated numbers of isoLG-positive macrophages in the AT of HFD-fed mice and that M2 macrophages containing isoLG-adducted protein enhance T-cell survival and activation. These data suggest a coordinated mechanism of inflammation within

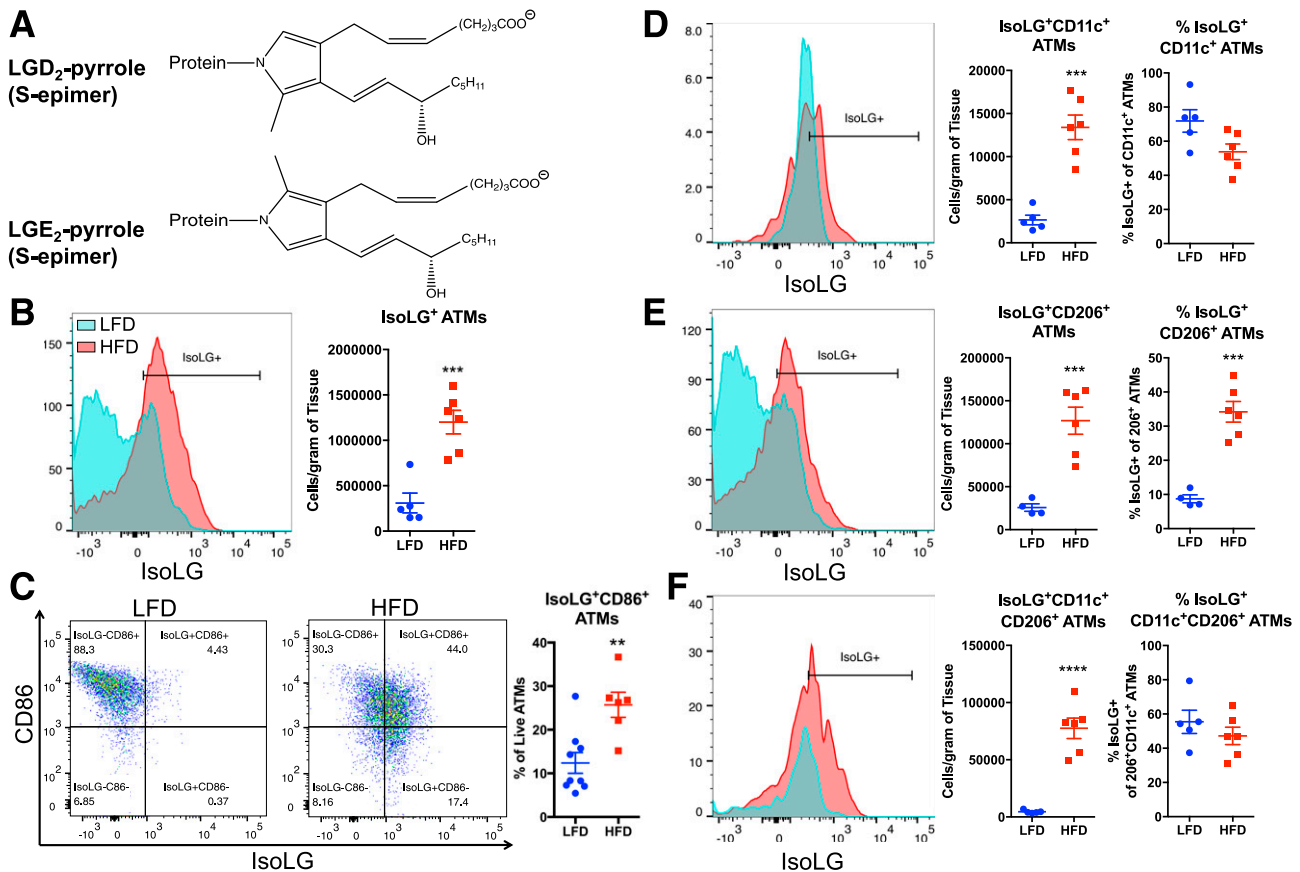


**Figure 6**—Weighted and unweighted measures of entropy demonstrate selection for positively charged amino acids within the CDR3 of HFD TCR repertoires. The median CDR3 length was 14 amino acids, which we analyzed using several sequence entropy methods. **A:** Shannon entropy reveals enrichment of arginine and depletion of negatively charged amino acids in the CD8<sup>+</sup> repertoires of HFD-fed mice. **B:** P-weighted Kullback-Leibler divergence with Hobohm1 clustering reveals that other positively charged amino acids are enriched within HFD CD8<sup>+</sup> TCR repertoires from AT and that negatively charged amino acids are correspondingly depleted. **C and D:** Unweighted analyses using Shannon entropy (**C**) and P-weighted Kullback-Leibler divergence (**D**) show that these amino acid enrichments are due to clonotypes present at higher frequencies, although there is still enrichment for arginine, lysine, and histidine, all of which carry a positive charge at physiological pH. This indicates that obesity-induced changes in charge and polarity at the repertoire level are driven not only by highly expanded clonotypes but also by clonotypes that are present at lower frequencies.

AT wherein T cells infiltrate tissue in response to neoantigen presented on ATMs.

To date, other studies have described the infiltration of a possibly clonally expanded T-cell population within AT (4,7,10,36). In mice, Yang et al. (9) observed shifts in the clonality of both the AT CD4<sup>+</sup> and CD8<sup>+</sup> TCR repertoires in obese versus lean mice using PCR-based spectratyping, where clonal expansion was detected as a deviation from the normally Gaussian frequency distribution of CDR3 length. Although spectratyping has been advantageous in the detection of unusual T-cell clones in lymphoma, it does not provide the specificity or direct measurement of clonal expansion and cannot distinguish between expanded clones with different amino acid sequences and similar V and J gene usage. Consequently, spectratyping also cannot detect clones with identical amino acid sequences and different V and J gene usage, as we observed in the CD8<sup>+</sup> and CD4<sup>+</sup> TCR repertoires of mice fed both an LFD and an HFD

(Supplementary Data). In contrast, deep sequencing of the TCR repertoire makes it possible to distinguish between the TCR repertoires of LFD- or HFD-fed mice (Fig. 3) and to assess intricate biochemical details of the TCR at the repertoire level (Figs. 4–6). Similar observations have been made with regard to HFD-induced T-cell infiltration in pancreatic islets (30,37–39,40), skeletal muscle (41), and liver (42). We observed similar levels of macrophage and CD8<sup>+</sup> T-cell infiltration as reported in prior studies and further identified several highly oligoclonal CD8<sup>+</sup> T-cell populations induced by HFD. As previously reported by Nishimura et al. (4), we observed no difference in CD4<sup>+</sup> T-cell infiltration into AT and extend this observation to include no significant difference in CD4<sup>+</sup> T-cell clonality ( $P = 0.18$ ). Although we do not observe enrichment of V $\beta$  gene families 7 and 10b as in Nishimura et al., we do observe slight enrichment of V $\beta$  families 17, 18, 21, 22, 25, 27, 28, and 29 (Fig. 4A). We observe a pronounced increase in the



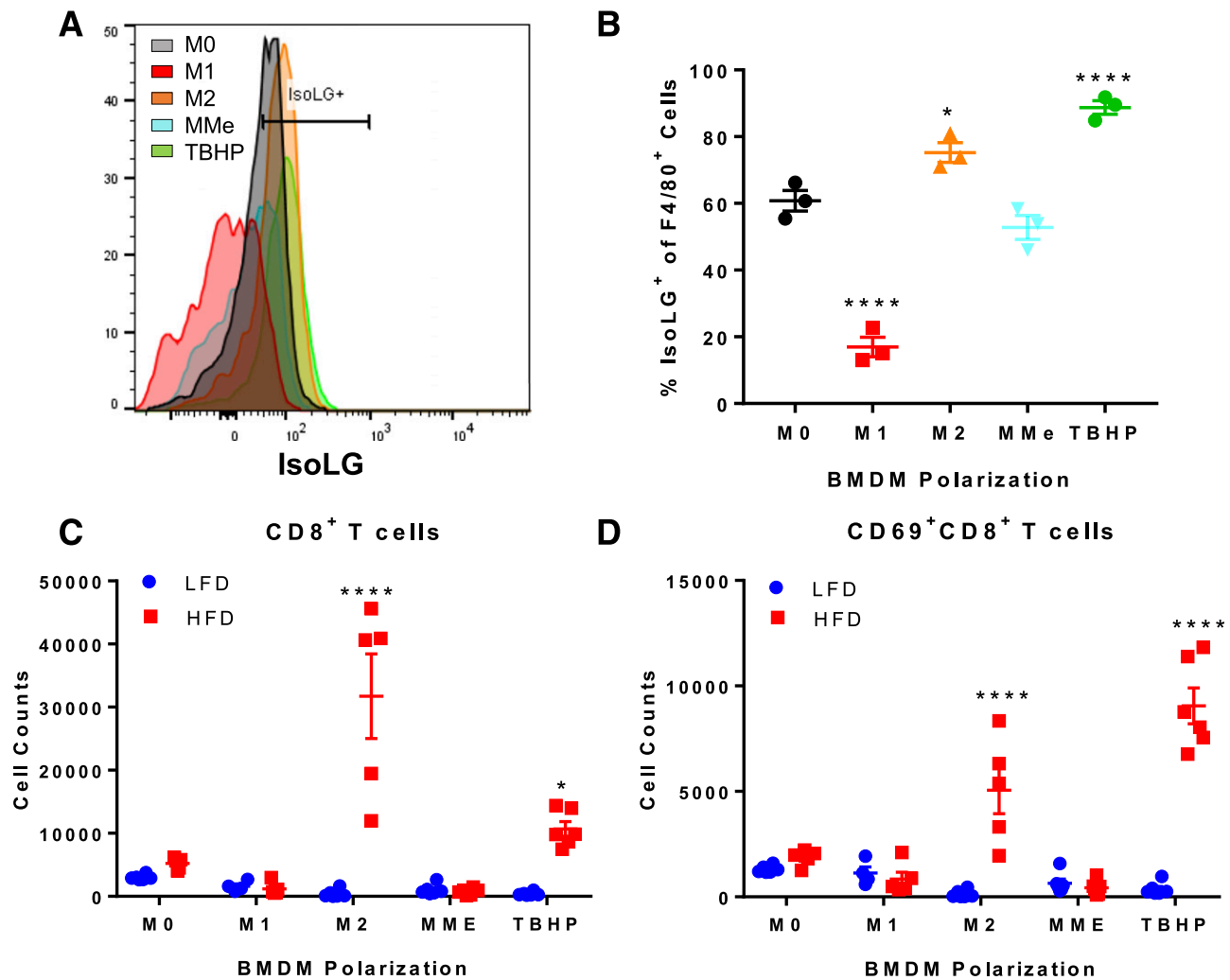
**Figure 7**—HFD induces formation of immunogenic isoLGs and expression of B7 ligand CD86 in ATMs. Total leukocytes were isolated from AT of mice fed an LFD or HFD, and isoLG content was quantified using previously described gating schema. **A**: Structure of the major isoLG protein adducts. The major intermediates are a pair of pyrrole epimers whose covalently bonded nitrogen originates from lysine residues on proteins. Phospholipids attached to isoLGs derive from polyunsaturated acids, arachidonic acids, and phospholipids thereof. **B**: Representative flow cytometry plot and average data showing intracellular staining for isoLG protein adducts in ATMs using the single-chain antibody D-11 single-chain variable fragment. **C**: Representative FACS plots and average data showing surface expression of CD86 and isoLGs in ATMs (proportion of ATMs staining CD86<sup>+</sup> IsoLG<sup>+</sup>). **D–F**: Representative flow cytometry plots and average data showing the number of IsoLG<sup>+</sup> cells per gram of tissue and percentage of IsoLG<sup>+</sup> cells per ATM subsets CD11c<sup>+</sup> (**D**), CD206<sup>+</sup> (**E**), and CD11c<sup>+</sup>CD206<sup>+</sup> (**F**) of HFD-fed mice. Data are mean  $\pm$  SEM ( $n = 5–10$  mice/group). \*\* $P < 0.01$ , \*\*\* $P < 0.001$ , \*\*\*\* $P < 0.0001$ .

clonality of CD8<sup>+</sup> T cells in AT of HFD-fed mice and note that future studies should specifically examine the extent to which this is induced by diet alone or entirely depends on obesity. Future dietary studies also would benefit from analysis of age because at least one study indicated that AT mass and CD8<sup>+</sup> T cells—but not CD4<sup>+</sup> T cells—are elevated independent of diet in aging male and female mice (43).

Highly clonal T-cell populations have been described in a broad array of pathologies (44). Our group has demonstrated recently that the TCR repertoire is more clonal in the AT of obese and overweight adults with HIV infection receiving long-term therapy than in the blood and that the V-J gene family pairings appear to differ between tissue compartments (36), suggesting that similar repertoire contraction also occurs in the AT of humans. Adverse effects of similarly clonal populations have been described in both obesity and diabetes. Highly clonal T-cell populations recognizing an HLA-DR4-restricted epitope of insulin

have been documented in patients with type 1 diabetes (45). Obesity in both mice and humans leads to markedly lower naive T-cell pools and highly clonal T-cell populations, further restricting the availability of diverse TCRs (46). A recent report by Pham et al. (2) indicated that HFD also limits the diversity of the B-cell repertoire, which corresponds with IR. The presence of a clonally expanded T-cell population within tissue can be explained by several immunological processes. One possible scenario is that a T-cell population may infiltrate in response to an antigen within the tissue, as documented in the AT of humans and macaques during chronic simian immunodeficiency viral and HIV infection (47). Another is the presence of multiple T-cell populations sharing the same TCR but with drastically different functional roles and properties (48). Alternatively, dominant clones from the blood could enter the tissue in an antigen-blind fashion.

Our findings raise the question of where and how antigen is presented to drive TCR clonal expansion. Several



**Figure 8**—M2 polarization increases IsoLGs levels and promotes activation of CD8<sup>+</sup> T cells. BMDMs were polarized to M0, M1, M2, or MMe or treated with TBHP. After polarization, BMDMs were cocultured with isolated T cells from the spleen of mice fed an LFD or HFD for 3 days. IsoLG content was quantified in polarized BMDMs by flow cytometry. *A* and *B*: Flow analysis (*A*) and quantification (*B*) of IsoLG<sup>+</sup> F4/80<sup>+</sup> cells (one-way ANOVA). Data are mean  $\pm$  SEM ( $n = 3$  wells/group). T cells were collected from cocultures, and flow analysis was performed to quantify CD8<sup>+</sup> T cells (*C*) and CD8<sup>+</sup>CD69<sup>+</sup> T cells (*D*) (two-way ANOVA). Data are mean  $\pm$  SEM ( $n = 5$  mice/LFD or HFD group) and mean  $\pm$  SEM ( $n = 5$  wells/group). \* $P \leq 0.05$ , \*\*\*\* $P \leq 0.0001$ .

published reports have indicated that antigen presentation to CD4<sup>+</sup> T cells occurs directly in AT. Multiple MHC-II-expressing APC populations in AT can present to CD4<sup>+</sup> T cells, including B cells (3), dendritic cells (49), macrophages (50), and even adipocytes (51). Mice with global deficiency of MHC-II demonstrate protection from AT inflammation and systemic IR when placed on an HFD (50). A portion of the reduced inflammation in AT was due to attenuation of CD11c<sup>+</sup> macrophages and CD4<sup>+</sup> T-cell accumulation (50). Adipokines also can activate these APCs directly, including leptin, adiponectin, and retinol-binding protein 4 (51–53). Thus, AT has all the prerequisite components to activate CD4<sup>+</sup> T cells. However, our studies show clonality in the CD8<sup>+</sup> T-cell population, begging the question of their activation signals. MHC-I is expressed on all cell types and could allow for presentation of neoantigens or modified proteins. The current data suggest

an enrichment of arginine and positively charged amino acids in the TCRs of CD8<sup>+</sup> T cells that are clonally expanded in HFD-fed mice. This positive charge led us to consider that protein modifications leading to a negative charge might serve as neoantigens in AT. Indeed, the data suggest that ATMs display increased levels of isoLG adducts (Fig. 7). Similar alterations in charge and amino acid content have been reported in the context of renal disease (11,54). Insulin-reactive TCRs have been reported to be enriched for arginine and for nonpolar amino acids at position 7 (55), which we also observed. We identified TCRs previously associated with obesity and IR in mice (Table 1), two of which were significantly enriched in HFD TCR repertoires. One clonotype that was highly prevalent in AT is known to be insulin reactive, and another is known to be enriched in the pancreas of diabetic mice. In contrast, two previously reported diabetogenic clonotypes were

detected at elevated levels in LFD-fed mice alone (Table 1), which demonstrates that changes to the TCR repertoire extend to multiple tissues in the context of obesity and IR and that insulin reactivity alone may not explain clonal expansion within AT. Although we did not observe significant changes in the TCR repertoire of CD4<sup>+</sup> T cells of the AT, future studies also could examine the TCR repertoire of CD4<sup>+</sup> T cells within the liver, where fat also accumulates during DIO.

The current findings suggest that isoLGs may act as neoantigens responsible for AT TCR clonal expansion. Generation of these reactive lipid aldehydes primarily depends on oxidative stress, and reactive lipid aldehydes are detected at elevated levels in other autoimmune processes, including multiple sclerosis, glaucoma, allergic inflammation, and cancer (reviewed in Salomon and Bi [56]). Previous studies examined the role of various lipid adducts on the immunogenicity of APCs and found that only proteins adducted to isoLGs induced APC immunogenicity (11). A number of reports demonstrated that oxidative stress levels are elevated in AT of obese mice and humans (57,58). In pulmonary injury, impaired NADPH oxidase reduces production of isoLG-adducted proteins, whereas impairment of the Nrf2-antioxidant response element signaling pathway increases isoLG-modified protein levels (59). Furthermore, inhibition of NADPH oxidase reduces obesity-induced AT reactive oxygen species production, inflammation, and IR (57,58). Thus, obesity-induced oxidative stress in ATMs may account for the elevation in isoLGs.

Although our results suggest that M2-like ATMs induce or enhance clonal expansion of AT-infiltrating T cells through the presentation of immunogenic isoLG-adducted peptides, the extent to which ATM-generated isoLGs induce clonal expansion in T cells remains to be explored. We also note that T cells derived from splenocytes in the liver may not precisely reflect those found in AT and that a culture model able to effectively enrich such lymphocytes from the AT would be a valuable contribution to the field. The current results also suggest several new directions for further investigation. The antigen specificity of clonally expanded T cells within AT remains to be determined, and single-cell TCR sequencing can connect surface phenotype information from flow cytometry with transcriptomics and paired TCR $\alpha/\beta$  sequences (60). Although we did not identify any clonotypes that were universally shared at high (>1%) frequencies between or within diet groups, we did observe several TCRs that were shared within the top 100 clonotypes of each dietary group (Table 1 and McDonnell [62]), particularly with respect to HFD-fed mice. This suggests that the antigens or neoantigens presented in obesity may not be the same from mouse to mouse. These TCRs may be specific for one or more antigens, although we have previously shown that T<sub>H</sub>1 CD4<sup>+</sup> cells, CD8<sup>+</sup> T cells, and memory cells accumulate in the AT of weight-cycled mice, suggesting secondary immune responses with repeat exposure to HFD (61), and our *in vitro* experiments suggest that isoLG-containing

macrophages augment T-cell activation and survival in tissue-resident immune populations that are expanded in obesity (Fig. 8).

In summary, we have demonstrated that T cells infiltrating AT of obese mice are clonally expanded, that the TCR repertoires of lean and obese mice are distinct in their sequences and biochemical properties, that immunogenic isoLGs are elevated in ATMs of obese mice, and that T cells of obese mice accumulate and activate in response to isoLG-containing M2 macrophages. Our observations also suggest that therapy targeting the CD8<sup>+</sup> T-cell population and antigens thereof could potentially abrogate inflammation and other consequences of adaptive immune activation in obesity.

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**Author Contributions.** W.J.M. performed the software analysis. W.J.M., J.R.K., S.A.M., M.A.P., A.K., M.K.A., M.A.C., A.H.H., and A.J.K. contributed to the writing, review, and editing of the manuscript. W.J.M., J.R.K., S.A.M., M.A.P., A.H.H., and A.J.K. contributed to the study concept and methodology. W.J.M., J.R.K., A.K., M.K.A., M.A.C., A.H.H., and A.J.K. validated the data. W.J.M., J.R.K., A.H.H., and A.J.K. curated the data and drafted the manuscript. W.J.M., J.R.K., and A.J.K. performed the formal analysis. W.J.M., M.A.P., A.K., M.K.A., M.A.C., and A.J.K. performed the investigation. W.J.M. and A.J.K. contributed to the visualization. J.R.K., S.A.M., and A.H.H. provided resources. J.R.K., S.A.M., A.H.H., and A.J.K. supervised the project, provided project administration, and acquired funding. W.J.M. and A.J.K. are the guarantors of this work and, as such, had full access to all the data in the study and take responsibility for the integrity of the data and the accuracy of the data analysis.

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**Data Availability.** The data that support the findings of this study are available from A.J.K. upon request.

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