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## Dietary restriction of isoleucine increases healthspan and lifespan of genetically heterogeneous mice

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### Declaration of Interests

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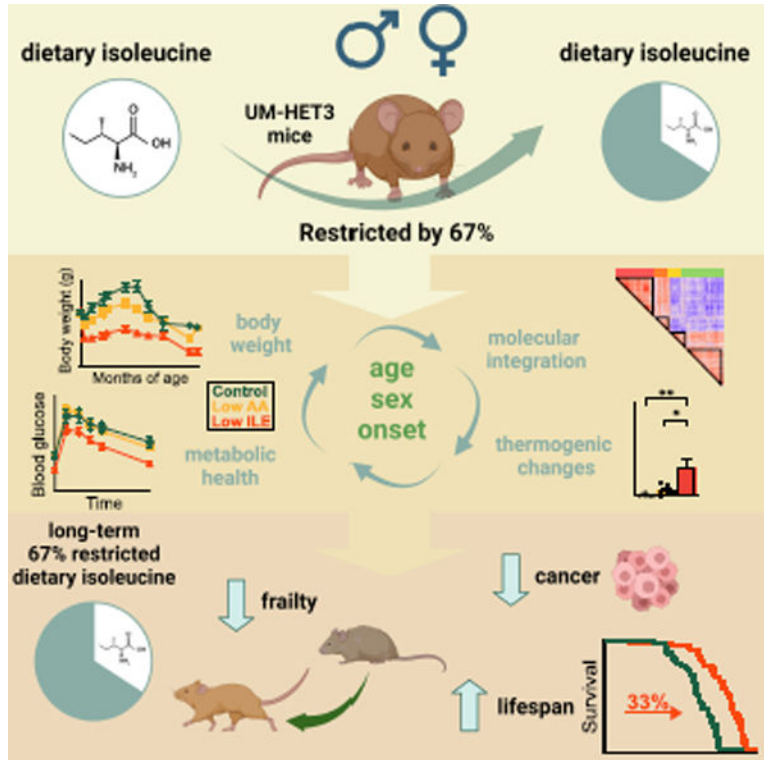
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## Summary

Low protein diets promote health and longevity in diverse species. Restriction of the branched-chain amino acids (BCAAs) leucine, isoleucine and valine recapitulates many of these benefits in young C57BL/6J mice. Restriction of dietary isoleucine (IleR) is sufficient to promote metabolic health and is required for many benefits of a low protein diet in C57BL/6J males. Here, we test the hypothesis that IleR will promote healthy aging in adult, genetically heterogenous UM-HET3 mice. We find that IleR improves metabolic health in young and old HET3 mice, promoting leanness and glycemic control in both sexes, and reprograms hepatic metabolism in a sex-specific manner. IleR reduces frailty and extends the lifespan of male and female mice, but to a greater degree in males. Our results demonstrate that IleR increases healthspan and longevity in genetically diverse mice and suggests that IleR, or pharmaceuticals that mimic this effect, may have potential as a geroprotective intervention.

## Graphical Abstract



## eTOC

Green et al. find that dietary isoleucine is a key regulator of metabolic health and lifespan in genetically heterogeneous mice. Restriction of isoleucine improves metabolic health, reduces frailty, and increases the lifespan of both male and female mice, with greater benefits for males.

## Keywords

isoleucine; lifespan; frailty; mice; branched-chain amino acids

## Introduction

Dietary interventions such as calorie restriction (CR) extend the lifespan and healthspan of diverse species, including rodents and non-human primates<sup>1-5</sup>. As adhering to an abstemious CR diet can be difficult, there is great interest in developing interventions that mimic the benefits of a CR diet without reduced calorie intake. Dietary composition has a strong influence on longevity and health, and the role of dietary protein has been the subject of significant investigation.

Beneficial effects of high protein diets for metabolic health have been found by several studies, and these diets are often recommended to the elderly to fight frailty and sarcopenia<sup>6,7</sup>. In contrast, retrospective and prospective clinical trials have found that lower protein consumption is associated with a decreased risk of age-related diseases and mortality<sup>8-11</sup>, and a recent twin study found that higher protein diets are paradoxically

associated with sarcopenia<sup>12</sup>. Two short-term clinical trials have found that protein restriction (PR) improves multiple markers of metabolic health, reducing adiposity and improving insulin sensitivity<sup>13,14</sup>. In rodents, PR improves metabolic health, and the consumption of low protein (LP) diets promotes longevity<sup>15–21</sup>.

While the mechanisms that mediate the beneficial effects of CR and PR are unknown, both interventions lower consumption of dietary essential amino acids (EAAs). Restriction of the nine EAAs is required for the benefits of CR<sup>22</sup>, suggesting that one or more of these EAAs regulates lifespan. While significant attention has focused on methionine<sup>23–25</sup>, we have shown that the branched-chain amino acids (BCAAs) leucine, isoleucine, and valine are of unique metabolic importance. Restriction of all three BCAAs by 67% improves metabolic health in C57BL/6J males and females, and in males extends lifespan by over 30%, indistinguishable from the effect of restricting all 20 common dietary AAs by the same amount<sup>19</sup>.

While the BCAAs are usually considered as a group, each BCAA has distinct molecular and metabolic effects; this may be due to differential sensing of the BCAAs, for instance by the mammalian target of rapamycin (mTOR) protein kinase, or due to the distinct intermediate and final products of each BCAA. For example, a valine-specific catabolite regulates trans-endothelial fatty acid transport and glucose uptake<sup>26,27</sup>. We recently showed that the beneficial metabolic effects of protein or BCAA restriction are principally mediated by restriction of isoleucine (IleR). IleR promotes glucose tolerance, reduces adiposity, and is necessary for the metabolic benefits of PR<sup>28</sup>. In humans, dietary isoleucine levels are associated with body mass index, while blood levels of isoleucine correlate with increased mortality<sup>28,29</sup>.

Here, we investigated the hypothesis that IleR would extend the healthspan and lifespan of genetically heterogenous UM-HET3 (HET3) mice, which are extensively used in aging studies<sup>30–33</sup> as they better reflect the genetically diverse human population than any single inbred strain. Using HET3 mice also increases the likelihood that any findings will be generalizable and robust, and not related to a strain-specific genetic defect or cause of death. We find that short-term IleR improves metabolic health in young HET3 mice of both sexes, reducing weight, adiposity, and improving glucose homeostasis. Lifelong IleR started in 6-month-old adult HET3 mice promotes lifelong leanness and glycemic control, and reprograms hepatic metabolism in a way distinct from a diet in which all dietary AAs are restricted. Finally, IleR reduces frailty in both sexes, extends median and maximum lifespan in male mice, and extends median lifespan more modestly in females. In conclusion, our results demonstrate that reducing dietary levels of isoleucine promotes healthy aging in mice, is more robust than PR in its ability to promote healthy aging, and may be a uniquely potent method to promote healthy aging without requiring reduced calorie consumption.

## Results

### IleR improves metabolic health in young HET3 mice

In an initial study, we placed male and female 9-week-old HET3 mice (HET3 mice are the F2 progeny of (BALB/cJ × C57BL/6J) mothers and (C3H/HeJ × DBA/2J) fathers, and

have segregating alleles from all four parental strains) on one of three AA-defined diets<sup>28</sup>. Briefly, our Control diet contains all twenty common AAs; the diet composition reflects that of a natural chow in which 21% of calories are derived from protein. We also utilized diets in which all AAs (Low AA) or isoleucine (Low Ile) was reduced by 67%. All three diets are isocaloric, with identical levels of fat; in the Low AA diet, carbohydrates were used to replace calories from AAs, while in the Low Ile diet, non-EAAs were increased to keep the calories derived from AAs constant (Fig. 1A, Table S1).

Both male (Fig. 1B) and female (Fig. 1C) mice on Control and Low AA diets gained weight; however Low Ile-fed mice of both sexes initially lost a significant amount of weight (~12% in males and ~9% in females), which female mice gradually regained. The change in weight was sex and diet-dependent; Low Ile-fed males and females, as well as Low AA-fed males, gained significantly less weight than their Control-fed counterparts (Figs. 1D–E).

Body composition was determined at the beginning and end of the experiment. A Low Ile diet had significant effects on both fat and lean mass, with the effect on lean mass being sex-dependent (Figs. 1F–I). Low Ile-fed males lost both fat and lean mass, while Low AA-fed males accreted a similar amount of fat mass as Control-fed males but lost lean mass (Fig. 1F, H). Low Ile-fed females accreted significantly less fat and lean mass than Control-fed females (Fig. 1G, I). Overall, a Low Ile diet reduced adiposity in both sexes, while a Low AA diet did not reduce adiposity in either sex (Figs. 1J–K and S1A–B).

We expected that a Low Ile and a Low AA diet would improve glycemic control, and we performed glucose tolerance tests (GTTs) after 3 (Figs. S1C–D) and 10 weeks on diet (Figs. 1L–M). The effects were dependent on both diet and sex, with Low Ile-fed males showing significant improvements at both times, while Low Ile-fed females showed improved glucose tolerance only after ten weeks. This was independent of improvements in insulin sensitivity, as measured through an insulin tolerance test (ITT) after either 4 or 11 weeks on diet (Figs. S1E–H), although Low AA-fed females had improved insulin sensitivity at 4 weeks relative to Low Ile-fed mice. Performing an alanine tolerance test (ATT), we found that a Low Ile diet appeared to improve suppression of hepatic gluconeogenesis in both sexes (Figs. S1I–L). Overall, we found that a Low Ile diet was able to reduce weight gain and improve glycemic control in young HET3 mice and was more effective at promoting metabolic health than reducing all AAs.

### **IleR increases food intake and energy expenditure in young HET3 mice**

Despite the effects of a Low Ile diet on body weight and composition, Low-Ile and Low AA-fed males and females ate significantly more calories each day than Control-fed mice (Figs. 2A–B). As a result, both sexes of Low Ile-fed mice consumed significantly more AAs than Control-fed mice (Figs. S2A–B), while consuming significantly less isoleucine (Figs. 2C–D). Notably, Low AA-fed mice of both sexes consumed a similar amount of isoleucine as the Low Ile-fed mice.

As Low Ile-fed mice weighed less despite significantly increased calorie intake, we investigated other components of energy balance using metabolic chambers. Male mice fed a Low Ile diet had drastically increased energy expenditure as assessed via indirect

calorimetry; the effect was particularly prominent during the “active” dark phase, when Low AA fed mice also had significantly upregulated energy expenditure (Figs. 2E–G). Low Ile and Low AA-fed females displayed a similar pattern of increased energy expenditure, particularly during the dark phase (Figs. 2H–J). The average respiratory exchange ratio (RER) was not affected by IleR (Figs. S2C–F); however, there was an effect on timing, with Low Ile-fed mice, particularly females, shifting from low RER to high RER several hours later than Control or Low AA-fed mice (Figs. S2G–H). These alterations in RER and energy expenditure were not associated with altered activity (Figs. S2I–N). In summary, the lower weight of Low Ile and Low AA-fed mice is not due to decreased food intake; consumption of these diets is instead associated with increased food consumption and energy expenditure.

### **IleR improves metabolic health in older HET3 mice**

To determine if IleR could promote healthy aging, 6-month-old male and female HET3 mice raised on chow were placed on either Control, Low AA, or Low Ile diets; at 24 months of age, a pre-selected group of animals was euthanized and tissues collected, while the remaining mice continued aging (Fig. 3A). Tracking weight, we found that Low Ile-fed mice (Figs. 3B–E) weighed significantly less than Control AA and Low AA-fed mice. Much of the difference in Low Ile-fed males was due to a rapid loss of fat mass (~50%) during the first month (Figs. 3F–G), while much of the difference in females was due to fat gain by Control-fed females (Figs. 3H–I). Differences in lean mass contributed less, with Low Ile-fed males dropping ~10% of their lean mass during the first month which was maintained until late life, and Low Ile-fed females accreting less lean mass than Control-fed females (Figs. 3J–M). All groups of males lost adiposity between 6 and 24 months of age, and while there was no significant difference between groups at these ages, over their life Low Ile-fed males had lower adiposity than Control-fed males, as did Low Ile and Low AA-fed females relative to Control-fed females (Figs. 3N–O, S3A–B).

We performed glucose and insulin tolerance tests up to 24 months of age. At 22 months of age (after 16 months on the indicated diets), we found that a Low Ile diet, but not a Low AA diet improved glucose tolerance in both sexes (Figs. 3P–Q). Overall, Low AA and Low Ile diets improved glucose tolerance earlier in life, and this effect persisted in Low Ile-fed mice as they aged (Figs. 3R–S). Low AA-fed males had improved insulin sensitivity relative to Control-fed mice at 22 months of age (Fig. 3T) and trended towards improved insulin sensitivity at earlier timepoints (Fig. S3C); Low Ile-fed males also trended towards improved insulin sensitivity at 22 months of age. In contrast, Low AA-fed females showed improved insulin sensitivity only at 17 months of age, despite a later improvement in glucose tolerance (Figs. 3U, S3D). Overall, IleR powerfully promotes leanness and glycemic control in aging HET3 mice of both sexes, with significantly greater impact than a Low AA diet.

### **IleR increases food intake and energy expenditure in older HET3 mice**

Low AA and Low Ile-fed males and females initially consumed significantly more calories, but significantly less isoleucine, than Control-fed mice; as the mice aged, Low Ile and Low AA-fed mice always ate at least as many calories as Control-fed mice (Figs. 4A–F). Due to the prominent differences in weight and body composition, we used metabolic chambers to investigate how energy balance was impacted by Low AA and Low Ile diets at 9, 14,

and 24 months of age (Figs. 4G–L, S3E–T, and S4A–JJ). At all timepoints, Low Ile-fed mice of both sexes had significantly increased energy expenditure relative to Control-fed mice during both the light and dark phases; we also observed increased energy expenditure in Low AA-fed males and females at all ages (Figs. 4G–L, S3O–P, S4A–D and S4S–V). This was not accompanied by significant changes in either respiratory exchange ratio (RER) or activity, although in females at all ages we observed a right-shift in the RER curve of Low Ile-fed mice suggesting an alteration in temporal fuel utilization patterns (Figs. S3E–N, S4G–R, S4Y–JJ). While energy expenditure, RER and activity remained fairly constant over time, 14-month-old females had increased RER on Low AA and Low Ile diets (Fig. S3Q–T).

We have previously observed that in C57BL/6J males, a Low Ile diet increases circulating levels of FGF21 and induces hepatic *Fgf21*, promoting the expression of *Ucp1* and other thermogenic, lipogenic, and lipolytic genes in inguinal white adipose tissue (iWAT)<sup>28</sup>. Consistent with iWAT beiging and the increased energy expenditure we observed, we found that expression of *Ucp1* and *Elov3* was increased in the iWAT of Low AA and Low Ile-fed males, we did, however, observe a significant increase in the expression of *Cidea* in Low Ile-fed males (Figs. 4M–O). In females, expression of iWAT *Ucp1* was not affected by diet, and although *Elov3* levels were increased, it did not reach statistical significance; however, *Cidea* was significantly upregulated by IleR (Figs. 4P–R). In summary, at all timepoints Low AA and Low Ile-fed mice of both sexes ate at least as many calories as Control-fed mice, yet weighed less and had reduced fat mass, likely due in part to increased energy expenditure associated with increased *Cidea* expression in iWAT.

### Changes in metabolic health relative to isoleucine intake vary with sex and age

We used multivariate analysis to identify age and sex-dependent responses to reduced dietary isoleucine. We correlated the isoleucine intake of each individual mouse on all three diets with 26 phenotypic measurements obtained from each animal for each age and sex, and plotted these in a clustered heatmap (Fig. 5A). For the most part, old and young males and females had similar phenotypic responses to reduced isoleucine intake. In general, isoleucine intake correlates negatively with energy expenditure and RER, and positively with lean and fat mass, body weight, and glucose area under the curve (poor glycemic control). The strength of the changes varies with age, with old male mice having weaker correlations of isoleucine intake with the measured parameters than young males, and vice versa for females (Table S2).

In young and old males, differences between groups are particularly driven by changes in energy expenditure and changes in weight and adiposity, which contributed the most (and oppositely) to the differences in phenotypic variation as shown by principle component analysis (PCA), with isoleucine intake correlating closely with weight, and oppositely with energy expenditure normalized to body weight (Figs. 5B & D). In females, energy expenditure normalized to body weight likewise strongly contributed to differences in phenotypic variation (Figs. 5C & E). Surprisingly, there was a strong contribution and correlation of energy expenditure and hepatic *Fgf21* only in aged females (Fig. 5E). When looking across diet and ages groups, energy expenditure appears to contribute to the separation of all groups of Low Ile-fed mice (Figs. 5B–E and S5C–F).

The increased energy expenditure of mice on a PR or IleR diet may be mediated by induction of FGF21<sup>17,18,28,34</sup>. Circulating FGF21 (Figs. 5F–G & L–M) and hepatic *Fgf21* expression (Figs. 5H–I & N–O) did not have a consistent trend across groups. While there was a trend towards increased blood levels of FGF21 and greater hepatic *Fgf21* expression in young males, this was not the case in females or in old mice of either sex, nor in the iWAT of old mice (Figs. S5A–B). In contrast, fasting blood glucose was consistently lower in Low Ile-fed mice of both age groups and in aged females (Figs. 5J–K & P–Q).

Using PCA of the variables from Fig. 5A for young, old, male and female mice, we investigated variation across diet groups (Figs. S5C–F). Due to the heterogeneous nature of our study species, there was overlap for all groups, especially as mice age. Interestingly, across all groups, the Low Ile and Control-fed mice had the greatest separation, and Low AA-fed overlapping with both of these groups, consistent with our general observation that a Low Ile diet has greater metabolic and physiological impact than a Low AA diet. Overall, while the correlation between isoleucine consumption and individual measures of metabolic health tend to trend in the same direction regardless of age or sex, the magnitude of the relationship is highly dependent on these variables.

### IleR and reducing all dietary amino acids have distinct molecular effects

Due to the central role of the liver in maintaining metabolic homeostasis, we conducted a detailed molecular analysis of the livers of young and old mice of both sexes, consuming either the Control, Low AA, or Low Ile diet. We performed transcriptional profiling as well as metabolomic and lipidomic analysis. After analyzing the effects of diet on each of these parameters separately, we integrated these analyses with phenotypic data.

Low Ile-fed young males showed a distinct pattern of gene expression relative to Control-fed counterparts; interestingly, at this age 56% of the significantly differentially expressed (SDE) genes altered by a Low AA diet are also altered by a Low Ile diet (Fig. 6A, Table S3A–4). In contrast, when we examined the top 50 SDEs altered in a Low Ile diet in 24-month-old males, Low AA-fed males appeared more similar to Control-fed males, and there was no overlap in the SDE genes altered by Low AA and Low Ile diets (Fig. 6B). Conversely, while in young females there were relatively few SDE changes induced by either diet and little overlap in those few genes that were SDE, in old females, many more genes were SDE, and 35% of the genes SDE by a Low Ile diet were also altered by a Low AA diet (Fig. 6C–D, Table S3C).

We performed KEGG analysis to identify pathways altered by each diet (Figs. 6E, S6A and Table S3D). Interestingly, many more pathways were altered by IleR than a Low AA diet in both young and old males, and more pathways were altered by both diets in young than in old males (Table S3B, S3D). In young males, there was substantial overlap in the pathways altered by Low AA and Low Ile diets; in aged males, there was no overlap in the altered pathways (Fig. 6E). In young males a Low Ile diet downregulated multiple pathways linked to aging, including “Insulin signaling”, “Lysosome”, “Ribosome”, and “AMPK signaling”. In old Low Ile-fed males, upregulated pathways included “PPAR signaling”, “Fatty acid metabolism” and “Thermogenesis” while downregulated pathways included pathways related to immune function, including “Chemokine signaling” and “COVID-19.”



Few pathways were altered by diet in young females, while there were numerous pathways with significant overlap between the effects of the Low Ile and Low AA diet in old females (Fig. S6A). In aged females, many of the downregulated pathways on Low AA and Low Ile diets were shared, including pathways associated with the immune system, including the TNF signaling pathway, cytokine, interleukin and MAPK signaling, while upregulated pathways were associated with fatty acid metabolism, including fatty acid degradation and PPAR signaling (Fig. S6A, Table S3D).

We performed untargeted metabolomics and investigated significant changes between the livers of Control and Low AA-fed or Low Ile-fed mice across sexes and ages (Tables S4A–S4B). We did not see many significant changes, likely reflecting the genetic diversity of our studied mice and their variable metabolomic profiles (Table S3B). Relaxing the significance criteria to investigate pathway changes, we found aged Low Ile-fed males had altered carbohydrate and AA metabolism (Table S4B), including BCAA metabolism; they also showed changes in other AA pathways, including glutamine/glutamate, arginine, and histidine metabolism (Fig. S6B). In young Low AA-fed males, only 2 metabolites changed significantly, including glycine which was significantly downregulated, and we observed a similar pattern in young Low Ile-fed males (Table S4A). In females, with relaxed significance criteria, we identified changes in fatty acid metabolism pathways in old Low Ile and Low AA-fed mice and AA pathway changes in young Low AA-fed mice (Table S4C).

To investigate potential long-term diet-induced changes in AAs, we performed metabolomics in the plasma of fasted old mice. Despite the restriction of all AAs by 2/3rds in Low AA-fed mice, we observed significant increases in the blood levels of proline, lysine, arginine and isoleucine in Low AA-fed males and increased levels of isoleucine in Low AA-fed females (Fig. S6C & Table S4D). In contrast, we observed no changes in plasma AA levels in Low Ile-fed males, while in Low Ile-fed females proline, phenylalanine, methionine, leucine and valine were significantly increased (Table S4D). Hepatic levels of isoleucine did not significantly change in any group, but trended upwards in young Low AA-fed males and downwards in old Low Ile-fed mice of both sexes (Figs. S6D–E & Tables S4A, S4C).

We also performed untargeted lipidomics on livers from all groups (Tables S5A–S5B). Similar to our transcriptomics analysis, we found the greatest number of changes in young Low Ile-fed males, and the fewest in young females, with little overlap between Low AA and Low Ile-fed mice for each age and sex (Table S3B, Figs. S6F–G). In young Low AA and Low Ile-fed males, levels of the omega-9 fatty acid oleic acid, which is thought to prevent heart disease and reduce cholesterol, was upregulated (Table S5A).

Using LION, we found that except in aged females fatty acylcarnitines, which play a key role in the regulation of sugar and lipid metabolism, were enriched (Table S5C). In young Low AA and Low Ile-fed male, and Low AA-fed females, there were many changes in fatty acid and triglyceride pathways. In aged Low AA and Low Ile-fed males, there were changes involved in lipid bilayer thickness and diffusion, whereas in aged females consuming these diets, there was an effect on lipid storage and triglycerides. This suggests that these diets induce sex-specific changes in fatty acid metabolism that become more pronounced with age

(Table S5C). Looking at the top 50 most significantly altered lipids between Control and Low Ile groups, we observed that Low AA and Low Ile diets appear to have rejuvenating qualities on the lipidomic profile of aged males, which look more similar to young males than to aged Control-fed males; this was less clear in females (Figs. S6F–G).

To examine the relationship between molecular changes and whole-organism physiology and metabolism induced by a Low Ile diet, we constructed a correlation matrix for each age and sex using phenotypic data as well as hepatic transcriptomic (Tables S3A & S3C), metabolomic (Tables S4A and S4C, S5, S6, S7) and lipidomic data (Tables S5A–S5B). Statistically significant changes in gene expression, metabolite and lipid levels for each group were concatenated with phenotypic data, and Spearman's correlation was used to calculate coefficients which were then rendered by hierarchical clustering (based on 1 – correlation coefficient between all molecules) to produce 4–7 clusters for each contrast (Table S5D). We identified KEGG-enriched pathways in each cluster and related these to the corresponding cluster phenotypes. Our results are consistent with a broad reprogramming of hepatic metabolism by a Low Ile diet, and link specific molecular changes and metabolic processes in the liver with specific phenotypes.

We previously found in C57BL/6J males IleR induces FGF21 and showed that the effects of a Low Ile diet on energy expenditure and food consumption are partially blocked by deletion of *Fgf21*<sup>28</sup>. Interestingly, in young HET3 males FGF21 levels in the blood cluster with the expression of thermogenic genes in iWAT and the inner mitochondrial membrane cardiolipins, while hepatic expression of *Fgf21* clusters with energy expenditure and calorie intake (Fig. 6F, clusters 2 and 4). However, in aged males, energy expenditure and iWAT thermogenic gene expression cluster together and do not cluster with FGF21 (Fig. 6G, cluster 1). This suggests that, as we recently found for dietary protein<sup>17</sup>, FGF21 may be more important in the response to isoleucine in C57BL/6J males than in other genetic backgrounds.

Other associations in aged males related to glycemic control. In addition to containing genes associated with energy expenditure and thermogenesis, Cluster 1 contains genes associated with insulin resistance, fatty acid metabolism and PPAR signaling; this last is known to have a key role in glucose and lipid metabolism (Fig. 6G, cluster 1)<sup>35</sup>. We found that changes in genes related to insulin sensitivity and insulin secretion were associated with FGF21 levels (Fig. 6G, cluster 4), while changes in blood glucose levels and glucose tolerance were associated with isoleucine intake and ceramides (Fig. 6G, cluster 5). In aged females Cluster 3, containing genes involved in thermogenesis, was similar to Cluster 1 in old males (Figs. S6H–I).

In both young and old males we found clusters containing genes associated with the KEGG “Longevity regulating pathway (LRP)” (Fig. 6H). In young males, these genes were found in Cluster 1, and were associated with changes in weight and adiposity, as well as transcriptional changes in oxidative phosphorylation, mTOR signaling, and thermogenesis (Fig. 6F, cluster 1). In aged males, the LRP was likewise associated with changes in weight, but clustered with changes in lean mass, insulin resistance, and carbohydrate digestion and absorption (Fig. 6G, cluster 7).

We created clustered heatmaps based on LPR genes altered by diet (Fig. 6H). While some of these clusters appear to be age-dependent and diet-independent, such as Cluster 2 which is associated with mTOR signaling, genes in Cluster 1, associated with the adenylate cyclase activating pathway, retain a more youthful expression profile in Low Ile-fed males and not in Low AA-fed males. In old males, Cluster 3, which contains genes associated with insulin signaling, is less strongly downregulated in Low Ile-fed old males than in Low AA-fed old males. Finally, in cluster 4, genes associated with autophagy/mTOR signaling are downregulated by a Low AA diet and upregulated by a Low Ile diet. In females we saw little evidence of either diet inducing a more youthful expression profile (Fig. S6J).

In summary, we found that consumption of Low AA and Low Ile diets uniquely reprograms hepatic metabolism. In contrast to our initial assumption that Low AA and Low Ile diets would have similar molecular effects on the liver, we found that the effects of the diets were largely distinct. Further, age and sex were extremely important factors in the molecular response to both diets. These effects were also observed in our differential coexpression analysis, where the clustering of molecular changes and phenotypes depended on both sex and age.

### IleR increases lifespan and healthspan in HET3 mice

We utilized a recently developed mouse frailty index to examine how diet, age, and sex impact frailty<sup>36</sup>. As expected, we observed increased frailty with age in Control-fed mice of both sexes; frailty was significantly lower in Low AA and Low Ile-fed male mice at multiple time points (Fig. 7A), as well as in female mice at 22 and 24 months of age (Fig. 7B). These changes were mainly related to physical frailty in both sexes, and body condition and digestion in males (Figs. S7A–J).

We also investigated other age-associated phenotypes. Lower urinary tract dysfunction increases with age, particularly in males<sup>37</sup>, and urinary spotting was significantly increased in aged Control-fed males relative to Low AA and Low Ile-fed males (Figs. 7C–D). We performed inverted cling and rotarod assays to assess muscle strength, function, and motor coordination. At 20 and 22 months of age, Low Ile-fed males and females were able to cling for longer than Control-fed mice; a similar affect was observed in Low AA-fed females (Figs. 7E–F). In late life, concurrently with the convergence of body weights, we found no significant differences in inverted cling performance between diet groups in either sex (Figs. 7G–H). Similarly, 20 and 22 months of age Low AA and Low Ile-fed females were able to stay on the rotarod longer than their Control-fed counterparts, although this was not the case in males (Figs. 7I–J). As females aged, we no longer saw significant differences in rotarod performance between diet groups, and we saw no significant differences between diet groups in males at any time point (Figs. 7K–L). We observed no diet-induced effects on either short-term or long-term memory during novel object recognition testing in either sex (Figs. S7K–L).

Cellular senescence is a underlying mechanism of age-related pathophysiological decline<sup>38</sup>. To investigate if a Low Ile diet altered cellular senescence, we measured the expression of *p16* and *p21* as well as several senescence-associated secretory phenotype (SASP) genes in the livers of aged Low Ile-fed mice relative to Control-fed mice. In males only, *p16* trended

towards a significant reduction on a Low Ile diet and the inflammatory marker interleukin 1- $\alpha$  (*Il1a*) was downregulated, and no changes were seen in the markers measured in females (Figs. S7M–N).

In HET3 mice, cancer is the major cause of death, with >80% of mice dying of neoplastic lesions<sup>39</sup>. At necropsy Low Ile-fed males were less likely to have a tumor present at death than Control-fed males, but in females there was no significant difference between groups (Fig. 7M–N). When looking more broadly at pathologies observed at death, we found differences in the spectrum of pathologies observed. The most common pathology found at necropsy in Control-fed and Low AA-fed males were liver tumors, while Low Ile-fed males had fewer liver tumors ( $p=0.0083$ ) (Fig. 7O). In Control-fed females the most common pathology at necropsy were mammary and pulmonary tumors (Fig. 7P), and Control-fed females had a greater prevalence of mammary gland tumors relative to Low AA fed mice ( $p=0.1$ , Fig. S7O).

In agreement with the significant difference in frailty and decrease in tumors found at necropsy, we found that consumption of a Low Ile diet from 6 months of age significantly increased male lifespan, with a 33% increase in median lifespan relative to Control-fed mice (Fig. 7Q, Table S6A) and a significant increase in maximum lifespan (Wang-Allison  $p=0.0257$ , Table S6A). Surprisingly, despite inhibiting frailty a Low AA diet had no effect on male lifespan (Fig. 7Q, Table S6A). A Low Ile diet also increased median lifespan in females, albeit by a more modest 7%, but did not increase maximum lifespan; once again, there was no effect of a Low AA diet on median or maximum lifespan (Fig. 7R, Table S6A). Investigating the survival of the top 10% longest-lived animals in each group we found the top 10% of Low Ile-fed males had a 17% increase in lifespan relative to the top 10% of Control-fed males (Fig. 7S). In females, a Low AA diet increased the lifespan of the 10% longest-lived mice relative to Control-fed mice by 12% (Fig. 7T).

To determine how frailty might interact with lifespan in a diet- and sex-dependent manner, we correlated frailty measures with lifespan in male and female mice (Fig. 7U–V). In Low Ile-fed males, we observed a strong negative correlation between lifespan and frailty measures associated with body condition, including tail stiffness, fur color and tremor occurrence. By contrast, Low AA-fed males had a strong positive correlation between lifespan and alopecia, whisker loss and body weight (Fig. 7U). Females similarly showed different correlation patterns based on diet; in Control-fed females, we found that lifespan was strongly positively correlated with whisker loss, alopecia and kyphosis, while these deficits correlated negatively with lifespan in Low AA and Low Ile-fed females (Fig. 7V).

In summary, a Low Ile diet improves healthspan and reduces frailty in both male and female mice, and robustly extends median and maximum lifespan in males. In females, a Low Ile diet more modestly promotes median but not maximum lifespan. Notably, a Low AA diet reduced in all AAs including isoleucine benefits aspects of healthspan in both sexes, and slows the development of frailty equivalently to the effects of a Low Ile diet, but does not extend lifespan in either males or females.

## Discussion

Recently it has become clear that diet macronutrient composition is important for metabolic health and aging. Multiple studies have highlighted dietary protein as a key determinant of human health and suggest that a low protein diet is optimum metabolic health<sup>8,9,11,13,14,40</sup>. In animals, dietary protein is a key regulator of metabolic health as well as longevity, with mice living longer when fed a low protein diet<sup>16,41</sup>.

We have hypothesized that many of the beneficial effects of PR may result from the reduced consumption of specific AAs. We have shown that 67% restriction of the three BCAAs is sufficient to recapitulate the benefits of PR and can extend the lifespan of male mice equivalently to restriction of all twenty common AAs<sup>19</sup>. Conversely, increasing dietary BCAAs promotes hyperphagia, obesity, and shortens lifespan<sup>42</sup>. While the BCAAs are often considered as a group, it is becoming clear that the three BCAAs do not all have equivalent metabolic effects, and we have shown that isoleucine is the most potent of these in the regulation of metabolic health<sup>28</sup>. IleR is both necessary for the metabolic benefits of PR, and is sufficient to promote glucose tolerance, hepatic insulin sensitivity, and energy expenditure in mice C57BL/6J males<sup>28</sup>. Here, we tested the hypothesis that IleR would promote healthy aging in genetically heterogeneous HET3 mice, which better model the human population than inbred strains. We found that IleR has dramatic effects on weight, fat mass, glycemic control, and energy expenditure in both young and old mice of both sexes. Interestingly, these effects were distinct – and generally greater in magnitude – than the effects in mice consuming a Low AA diet in which all AAs were restricted. Furthermore, we found that in males, IleR substantially increases both median and maximum lifespan while reducing frailty; IleR had a more modest effect on the median lifespan of female HET3 mice, while surprisingly a Low AA diet did not extend lifespan in either sex.

Our most striking finding was the robust extension of median and maximum lifespan induced in HET3 male mice by IleR. The ability of IleR to extend the lifespan of this heterogeneous population beginning at 6 months of age, as well as the effect of IleR on frailty and maximum lifespan, clearly indicate that IleR is geroprotective. Unlike BCAA restriction<sup>19</sup>, IleR increases median lifespan not only in males, but also more modestly in females. This type of male-specific or male-biased effect has also been seen before in numerous studies<sup>30,43</sup>. Our correlation and PCA analyses of the relationship between isoleucine intake and metabolic phenotypes clearly show sex differences, the accrual of which over time may contribute to differences in longevity. Pharmacological or genetic disruption of the AA-sensitive mTORC1 signaling pathway consistently shows larger benefits for female than male longevity<sup>44–47</sup>. In combination with the fact that isoleucine is not a strong mTORC1 agonist, this suggests that IleR may work through largely mTORC1-independent mechanisms.

Although our results show that the frailty index for mice can be successfully employed in genetically heterogeneous mice, we were surprised to find that the Low AA diet uncoupled frailty from lifespan, particularly as a Low AA diet begun early in life extends male C57BL/6J lifespan equivalently to a Low BCAA diet<sup>19</sup>. In most of the physiological tests we carried out, regardless of age, females on a Low Ile diet had a reduced magnitude of

response relative to males. These differences may be due to inherent disparities in AA catabolism between males and females<sup>48</sup>, or due to sex hormones.

Consistent with our previous findings in C57BL/6J males<sup>28</sup>, a Low Ile diet did not decrease fasting plasma levels in HET3 mice, although as we previously observed in C57BL/6J males, hepatic levels of isoleucine did trend downwards in old Low Ile-fed HET3 mice. In Low AA-fed mice, plasma levels of isoleucine were actually higher, and trended upwards in male liver, which may help to explain the divergent effects of a Low AA and Low Ile diets on lifespan. This may reflect in part that changes in dietary AA content more directly impact levels of AAs in the portal vein than in the systemic circulation<sup>49</sup>. While the precise mechanisms by which circulating AA levels are buffered against changes in dietary Ile are not known, the limited impact of a Low Ile diet on circulating levels of Ile likely reflects in part reduced catabolism of Ile and increased autophagy to preserve this limiting AA for proteogenesis.

The molecular impact of the diets were dependent upon sex and age, with both diets impacting many more pathways in young males and aged females than in either aged males or young females. Notably, the divergent effects of Low AA and Low Ile diets on the lifespan of males was reflected at the transcriptional level, where there was little overlap in the biological pathways affected in males fed these two diets. For example, we observed upregulation of fatty acid metabolism and downregulation of immune pathways in aged Low Ile-fed males, but not in aged Low AA-fed males. In contrast, the biological pathways altered by Low AA and Low Ile-fed diets were very similar in aged females, possibly contributing to the smaller lifespan differences between Low AA-fed and Low Ile-fed females.

We consider it likely that the sex-specific molecular effects of IleR contributes to the greater benefit of IleR on healthy aging in males. We have not investigated the impact of IleR on the immune system, but the downregulation of immune pathways in Low Ile-fed HET3 males suggests that inflammation could be reduced, and reduced inflammation is thought to contribute to the beneficial effects of CR<sup>50,51</sup>. Effects on IleR on cell senescence could also result in reduced inflammation and immune activation. Future research investigating the effects of IleR on inflammation and cell senescence may shed light on the mechanisms by which IleR extends healthspan and lifespan.

While we and others have shown that PR increases lifespan, these previous studies initiated the diets earlier in life<sup>16,19,21</sup>, and we may have initiated the Low AA diet too late to extend longevity. This appears paradoxical, as the Low AA-fed mice consumed the same amount of isoleucine as the Low Ile-fed mice. It is possible that the reduction of other EAAs or NEAAs has a negative impact on healthy aging when initiated at 6 months of age. These AAs could include leucine, restriction of which we have found can negatively impact body composition<sup>13,28</sup>, and serine and glycine, which have important roles in skeletal muscle stem cell function<sup>52</sup>. The ratio between isoleucine and other dietary AAs may also be important in determining the effects of IleR on healthspan and longevity.

We were concerned about the potential impact of our interventions on sarcopenia<sup>53</sup>. Comfortingly, we found that a Low Ile diet tended to promote grip strength, and rotarod testing did not show any significant defect induced by either Low AA or Low Ile diets. While grip strength appeared to improve in middle age for Low Ile-fed mice, this is most likely due to reduced body weight. However, we did not examine muscle strength and quality in detail, and more directly assessing the effects of IleR on muscle strength, quality and fiber type will be critical to examine in the future.

IleR significantly improves metabolic health in young HET3 mice of both sexes, mirroring our previous work in Low Ile-fed C57BL/6J males<sup>28</sup>. Low AA-fed HET3 mice also showed a modest reduction in body weight, but interestingly IleR had a greater impact on glucose tolerance than the Low AA diet at most ages, suggesting that some AAs may have a detrimental effect on glycemic control when reduced. Importantly, when started in 6-month-old mice – roughly equivalent to a 30 year old adult human<sup>54</sup>, IleR and to a lesser extent a Low AA diet was able to promote leanness in both sexes. While the metabolic benefits of IleR varies by sex and age, the main trend towards improved health is consistent. All of this highlights the potential translatability of IleR to improve not only longevity, but metabolic health.

FGF21 has been strongly associated with the metabolic health benefits of PR, PR induces FGF21 in C57BL/6J mice, and deletion of *Fgf21* blocks many of the benefits of a PR in this strain<sup>17,18,21,34,55</sup>. However, we saw no statistically significant changes in either circulating FGF21 or hepatic *Fgf21* induced by either Low AA or Low Ile diets, and FGF21 levels tended not to correlate or anti-correlate with other phenotypes. These results are in accordance with our recent observation that FGF21 was induced by PR in C57BL/6J mice, but not in HET3 or DBA/2J mice<sup>17</sup>. Understanding the role of FGF21 in the benefits of IleR should be a priority for future studies.

Energy expenditure was increased by both Low Ile and Low AA diets; while we expected this to be mediated by induction of the FGF21-UCP1 axis<sup>34</sup>, we also did not see a clear upregulation of *Ucp1* by these diets. Interestingly, we did see a statistically significant increase in *Cidea*, but not *Elov3*, both regulators of thermogenesis. The role of *Cidea* in metabolic health is complex; while *Cidea* deficient mice are lean and resistant to obesity, it has been suggested that *Cidea* may regulate lipolysis and thermogenesis through *Ucp1* suppression<sup>56</sup>. In humans, reduced *CIDEA* expression is associated with high body fat and a low basal metabolic rate and is increased in adipose tissue by CR<sup>57</sup>. Future work will need to be conducted to determine if induction of *Cidea* contributes to the metabolic effects of IleR.

In conclusion, we have shown that dietary restriction of a single BCAA isoleucine, can extend both healthspan and lifespan when begun at 6 months of age – roughly equivalent to a human in their 30's<sup>33</sup>. This effect is particularly robust in males, but benefits are observed in both sexes; the fact that IleR works in a genetically heterogeneous population suggests that such an intervention may be applicable to humans. IleR improves metabolic health without inducing “binge eating” behavior as seen with CR<sup>58</sup>, and improves median lifespan in females, which is not seen with BCAA restriction<sup>19</sup>. Additional research will be

required to determine if there are potentially negative effects of IleR, and to examine how optimal levels of isoleucine for lifespan and health span vary with age and sex. In agreement with human data<sup>28,29</sup>, dietary isoleucine seems to be critically important in metabolic health and aging, and provide new evidence that protein quality – the specific AA composition of dietary protein – is as important, or even more important, than the amount of protein or calories consumed. While additional research will be required to test how isoleucine affects healthy aging in humans, our results support the concept that limiting dietary levels of isoleucine may be a key to healthy aging.

## Limitations of study

There are several limitations of the work conducted here. First, we examined only a single level of restriction, and studies of CR as well as PR suggest that different strains and sexes may respond optimally to different levels of restriction. Different levels of IleR may more optimally function to reduce frailty and increase lifespan in females, and examining the graded response to isoleucine may provide new insights into both biological mechanisms as well as translatability.

Other dietary components may also affect longevity. The diets used here are based on the AA profile of whey; however, studies conducted with either whey or casein have found broadly similar effects<sup>13,16,18,28,59,60</sup>. To keep diets isocaloric, the reduction of dietary AAs in the Low AA diet was balanced by additional carbohydrates, and the reduction of isoleucine from the Low Ile diet was balanced with NEAAs. The protein to carbohydrate ratio, the type of dietary carbohydrate consumed, the precise degree of restriction, and diet-induced changes to the microbiome could all play a role in the responses we observe here<sup>16,41,61–63</sup>.

Our molecular analysis was largely limited to the liver; while this is the first organ to be exposed to nutrients following their absorption in the intestine, catabolism of isoleucine occurs in many tissues<sup>64</sup>. We have not yet identified the specific cellular or organismal sensor of isoleucine responsible for the beneficial effects of IleR, and this is a critical area for future research. Notably, we did not observe significant reductions of circulating levels of Ile in IleR mice in this study or in a previous study utilizing young C57BL/6J male mice. We hypothesize that this reflects a dietary adaptation that acts to maintain AA homeostasis by reducing utilization and catabolism of Ile in order to preserve limited Ile for the translation of protein; understanding how this is mediated may provide important insight into understanding the beneficial effects of IleR. The effect of IleR on immune function has not been investigated, and as the mice here were in a specific pathogen-free facility, effects of IleR on immune function may not have revealed themselves.

Surprisingly, PR does not confer the same beneficial effects as reducing isoleucine alone. It is possible that this is due to reduced levels of beneficial AAs; we and others have found that reducing dietary levels of leucine, serine, or glycine may have detrimental effects<sup>13,65</sup>. In the context of a human diet, this may limit the translation of our findings, as the simplest way to lower dietary isoleucine at the present time is to reduce total protein intake. Finally, while short-term IleR in humans is likely feasible based on recent studies<sup>66,67</sup>, long-term



IleR will likely require novel approaches or the development of pharmaceutical methods to reduce isoleucine uptake or sensing, or the identification of compounds that can mimic the benefits of IleR.

## STAR METHODS

### RESOURCE AVAILABILITY

**Lead contact**—Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Dudley W. Lamming (dlamming@medicine.wisc.edu).

**Materials availability**—This study did not generate new unique reagents.

### Data and code availability

- The accession number for the hepatic RNAseq gene expression data reported in this paper can be obtained from Gene Expression Omnibus (GEO) (GEO: GSE241904).
- This paper does not report original code.
- All data required to remake graphs is available in the excel Data S1 file (published at <http://data.mendeley.com/preview/dk74jscsww>), and where stated is provided in Supplementary Tables.
- List of primers used provided in Table S7 and in Key Resources.
- Any additional information required to reanalyze the data reported in this paper is available from the lead contact upon request.

## EXPERIMENTAL MODEL AND SUBJECT DETAILS

**Mouse information**—All procedures were performed in conformance with institutional guidelines and were approved by the Institutional Animal Care and Use Committee of the William S. Middleton Memorial Veterans Hospital (Madison, WI, USA). HET3 mice are the F2 progeny of (BALB/cJ x C57BL/6J) mothers and (C3H/HeJ x DBA/2J) fathers; female BALB/cJ (#000651), male C57BL/6J (#000664), female C3H/HeJ (#000659) and male DBA/2J (#000671) were obtained from The Jackson Laboratory and bred to produce heterogeneous HET3 mice. Breeders and their litters prior to weaning were fed 19% protein chow (2019 Teklad Global 19% Protein Extruded Rodent Diet, Table S1). At weaning, mice were switched to Teklad Global 2020x. Approximately one week prior to the start of experiments, mice were switched to a chow diet (Purina 5001) and housed 2–3 per cage. All mice were maintained at a temperature of approximately 22°C, and health checks were completed on all mice daily. The short-term study was started when the mice were 9 weeks of age, and the lifespan study when they were 6 months old (numbers in Table S6B).

At the start of both experiments, mice were randomized to receive either the 22% (Control, TD.140711) or 7% (Low AA, TD.140712) amino acid diet, or 22% amino acid diet with isoleucine reduced by 2/3rds (Low Ile, TD.160734); all diets were obtained from

Envigo. Within the diet series, calories from amino acids were replaced by calories from carbohydrates, while calories from fat were held fixed at 20%, making the diets isocaloric (3.6 Kcal/g). For the Low Ile diet, amino acid levels were made up with non-essential amino acids, making the diet isonitrogenous with the Control diet. Full diet descriptions are provided in Table S1. The randomization of mice was performed at the cage level to ensure that all groups had approximately the same initial starting weight and body composition. Mice were housed in a SPF mouse facility in static microisolator cages, except when temporarily housed in a Columbus Instruments Oxymax/CLAMS metabolic chamber system. Mice were housed under a 12:12 h light/dark cycle with free access to food and water, except where noted in the procedures below.

## METHOD DETAILS

**In vivo Procedures**—Glucose, insulin, and alanine tolerance tests were performed by fasting the mice overnight for 16 hours and then injecting glucose ( $1 \text{ g kg}^{-1}$ ), insulin ( $0.75 \text{ U kg}^{-1}$ ) or alanine ( $2 \text{ g kg}^{-1}$ ) intraperitoneally (i.p.)<sup>68,69</sup>. Glucose measurements were taken using a Bayer Contour blood glucose meter (Bayer, Leverkusen, Germany) and test strips. Mouse body composition was determined using an EchoMRI Body Composition Analyzer (EchoMRI, Houston, TX, USA). For assay of multiple metabolic parameters [O<sub>2</sub>, CO<sub>2</sub>, food consumption, respiratory exchange ratio (RER), energy expenditure] and activity tracking, mice were acclimated to housing in a Oxymax/CLAMS metabolic chamber system (Columbus Instruments) for ~24 h and data from a continuous 24 h period was then recorded and analyzed. Food consumption in home cages was measured by moving mice to clean cages, filling the hopper with a measured quantity of fresh diet in the morning and measuring the remainder in the morning 3–6 days later. The amount was adjusted for the number of mice per cage, the number of days that passed and the relative weights of the mice (i.e., heavier mice were credited with a larger relative portion of the food intake). Mice were euthanized by cervical dislocation after an overnight (16h) fast and tissues for molecular analysis were flash-frozen in liquid nitrogen or fixed and prepared as described below.

**Lifespan study**—Mice were randomized into diet groups and enrolled in the survival study at 6 months of age; deaths prior to randomization and enrollment were not recorded. Mice were euthanized for humane reasons if moribund, if the mice developed other specified problems (e.g. excessive tumor burden), or upon the recommendation of the facility veterinarian. No mice in these studies contracted dermatitis requiring treatment or removal. Mice found dead were noted at each daily inspection and saved in a refrigerator for gross necropsy, during which the abdominal and thoracic cavities were examined for the presence of solid tumors, metastases, splenomegaly, and infection; on the basis of this inspection the presence or absence of observable cancer was recorded. For each necropsied mouse, a “cause of death” was assigned based on the clearest visually detected indication from necropsy and histological analyses. A subset of mice were removed from the study for cross-sectional analysis; these mice were pre-selected on enrollment in the lifespan study and euthanized at 24 months of age. Only mice used for the cross-sectional analysis were used for GTTs and ITTs. Frailty data and chamber data were collected from all mice. Mice were censored as of the date of death if removed for cross-sectional analysis or if death

was likely due to experimenter error. The lifespans of all mice, including censored mice, is provided in Table S6C.

**Frailty assessment**—Frailty was assessed longitudinally in a subset of mice using a list of 28 frailty measures based on the procedures outlined by<sup>36</sup>. This frailty index reflects an accumulation of deficits associated with aging, akin to Rockwood's frailty index in humans<sup>70</sup>. The items scored are scored 0 (no deficit), 0.5 (mild deficit) or 1 (severe deficit) and included alopecia, loss of fur color, dermatitis, loss of whiskers, coat condition, tumors, distended abdomen, kyphosis, tail stiffening, gait disorders, tremor, body condition score, vestibular disturbance, cataracts, corneal opacity, eye discharge/swelling, microphthalmia, vision loss, menace reflex, nasal discharge, malocclusions, rectal prolapse, vaginal/uterine/penile prolapse, diarrhea, breathing rate/depth, mouse grimace score, and piloerection. Scores for all items are added together, and then divided by the total number of items scored.

**Inverted cling and rotarod assays**—For inverted cling tests, mice were placed on a wire frame which was carefully inverted until mice were hanging upside down, a timer was started, and the time until the mouse fell was recorded. The average time of two rounds of testing conducted at least 30 minutes apart was calculated. For rotarod testing, mice were trained at a constant speed of 4rpm the day before testing. On the day of testing, mice were put on the rotarod for two rounds, at least 30 minutes apart, and the average time spent on the rotarod and max speed were recorded. For testing, the rotarod started at a speed of 4rpm with an acceleration of 0.5rpm/sec up to a max of 40rpm.

**Void Spot Assay**—Void spot assays were performed as described previously<sup>71</sup>. Briefly, mice were individually placed in standard mouse cages with thick chromatography paper (Ahlstrom, Kaukauna, WI). During the 4 hour study period, mice were restricted from water. Chromatography papers were imaged with a BioRad ChemiDoc Imaging System (BioRad, Hercules, CA) using an ethidium bromide filter set and 0.5 second exposure of ultraviolet light. Images were imported into ImageJ and total void spots analyzed with VoidWhizzard<sup>72</sup>.

**Assays and Kits**—Blood for circulating FGF21 analysis was obtained following an overnight fast. Blood FGF21 levels were assayed by a mouse/rat FGF-21 quantikine ELISA kit (MF2100) from R&D Systems (Minneapolis, MN, USA).

**Quantitative PCR**—Liver was extracted with Trizol (Sigma, St Louis, MO, USA). Then, 1 µg of RNA was used to generate cDNA (Superscript III; Invitrogen, Carlsbad, CA, USA). Oligo dT primers and primers for real-time PCR were obtained from Integrated DNA Technologies (IDT, Coralville, IA, USA). Reactions were run on a StepOne Plus machine (Applied Biosystems, Foster City, CA, USA) with Sybr Green PCR Master Mix (Thermo Fisher Scientific, Waltham, MA). Actin was used to normalize the results from gene-specific reactions. Primer sequences can be found in Table S7 and in Key Resources.

**Transcriptomic Analysis**—RNA was extracted from liver as previously described<sup>73</sup>. The concentration and purity of RNA was determined using a NanoDrop 2000c spectrophotometer (Thermo Fisher Scientific, Waltham, MA) and RNA was diluted to 100–400 ng/µl for sequencing. The RNA was then submitted to the University of Wisconsin-

Madison Biotechnology Center Gene Expression Center & DNA Sequencing Facility, and RNA quality was assayed using an Agilent RNA NanoChip. RNA libraries were prepared using the TruSeq Stranded Total RNA Sample Preparation protocol (Illumina, San Diego, CA) with 250ng of mRNA, and cleanup was done using RNA Clean beads (lot #17225200). Reads were aligned to the mouse (*Mus musculus*) with genome-build GRCm38.p5 of accession NCBI:GCA\_000001635.7 and expected counts were generated with ensembl gene IDs<sup>74</sup>.

Analysis of significantly differentially expressed genes (DEGs) was completed in R version 3.4.3<sup>75</sup> using *edgeR*<sup>76</sup> and *limma*<sup>77</sup>. Gene names were converted to gene symbol and Entrez ID formats using the *mygene* package. Male and female mice were analyzed separately, and clear outliers were removed following PCA analysis of the raw data. Genes with too many missing values were removed, if genes were present in less than one diet/age group they were removed. To reduce the impact of external factors not of biological interest that may affect expression, data was normalized to ensure the expression distributions of each sample are within a similar range. We normalized using the trimmed mean of M-values (TMM), which scales to library size. Heteroscedasticity was accounted for using the voom function, DEGs were identified using an empirical Bayes moderated linear model, and log coefficients and Benjamini-Hochberg (BH) adjusted p-values were generated for each comparison of interest<sup>78</sup>. DEGs were used to identify enriched pathways, both Gene Ontology (for Biological Processes) and KEGG enriched pathways were determined for each contrast, enriched significantly differentially expressed genes (FDR cutoff=0.1, FDR cutoff=0.2 old male mice with higher variability). All genes, log<sub>2</sub> fold-changes and corresponding unadjusted and Benjamini-Hochberg adjusted p-values can be found in Tables S3A and S3C.

**Metabolomic Analysis**—Untargeted metabolomics was performed as previously described<sup>79</sup>. Samples were kept at -20°C throughout the extractions in an Iso-Therm System (VWR #20901-646). Fifteen milligrams of liver were homogenized in 200 µL of a 3:3:2 solution of acetonitrile:isopropanol:water (MeCN:IPA:H<sub>2</sub>O) in ceramic bead tubes (1.4 mm, Qiagen #13113-50) using a TissueLyzer II (Qiagen #85300). An additional 800 µL of the extraction solvent was added and samples were centrifuged for 2 min at 14,000xg at RT. Lysate equivalent to 2 mg of tissue was transferred to a new 1.5 mL tube and 100 µL of extraction solvent containing 5 µg succinate-d4 (Sigma-Aldrich #293075) and 1 µg myristate-d27 (CDN Isotopes #D-1711) internal standards was added to each sample to a final volume of 500 µL. 250 µL of extract was transferred to a new tube and dried down in a SpeedVac Plus SC110A, then resuspended in 420 µL 1:1 MeCN:H<sub>2</sub>O. Samples were centrifuged as before and 400 µL was transferred to a glass autosampler vial with insert and dried down using a SpeedVac. To the dried extract, 10 µL of 20 mg/mL methoxyamine hydrochloride (MP Biomedicals #155405) in pyridine (Millipore PX2012-7) was added and vials were capped, then incubated at 37°C for 1.5h with light flicking every 30 min to mix. 91 µL of MSTFA (Thermo Fisher Scientific #TS-48915) was added to vials and incubation at 37°C with constant shaking for an additional 30 min was done to derivatize samples. Finally, samples were transferred to a GC-MS vial and immediately queued for injection.

Analysis of trimethylsilylated metabolites was performed using an Agilent 5977A Series GC-MS. A Phenomenex ZB-5MSi column (30 m, 0.25 I.D., 0.25  $\mu\text{m}$ ; #7HG-G018-11) with 5 m column guard was used for chromatographic separation. Splitless, 1  $\mu\text{L}$  sample injections were performed with injector port at 250°C with a 60 s purge at 8.2 psi. Helium was used as carrier gas and kept at 1 mL/min during the GC profile which was as follows: oven at 60°C for 1 min followed by an increase of 10°C/min to 325°C, which was held for 10 min. The MS transfer line was kept at 290°C with a solvent delay of 5.70 min. Ion source was kept at 230°C, quadrupole at 150°C and the acquisition range was from 50–750  $m/z$  collecting 3 spectra/sec. Two quality control samples of pooled liver extracts were run at the beginning and end of each day to monitor for changes in chromatography and to equilibrate the system. A FAME mix was run externally for RI calibration. Collected data was processed in the NIST AMDIS Program using the Fiehn metabolomics library<sup>80</sup> for compound identification and peak integration before being exported to R for normalization to the succinate-d4 internal standard to control for extraction variability. Final data was reported as ion count per 2 mg liver. Data was normalized and analyzed using the *metabolomics* package in R. Log<sub>2</sub> fold-changes and associated p-values for young and old, male and female mice on Low AA or Low Ile diets relative to Control fed mice can be found in Tables S4A and S4C.

For serum metabolomics, 150  $\mu\text{L}$  of methanol was added to 5  $\mu\text{L}$  of serum sample and incubated on ice for 10 min, followed by vortexing and centrifugation at 16,000  $\times g$  for 10 min at 4°C. The supernatant (3  $\mu\text{L}$ ) was loaded to LC-MS. Samples were analyzed using a quadrupole-orbitrap mass spectrometer (Q Exactive Plus, Thermo Fisher Scientific, San Jose, CA) operating in negative or positive ion modes, coupled to hydrophilic interaction chromatography via electrospray ionization and used to scan from  $m/z$  70 to 1000 at 1 Hz and 140,000 resolution. LC separation was on a XBridge BEH Amide column (2.1 mm  $\times$  150 mm, 2.5 mm particle size, 130Å<sup>o</sup> pore size) using a gradient of solvent A (20mM ammonium acetate, 20mM ammonium hydroxide in 95:5 water: acetonitrile, pH 9.45) and solvent B (acetonitrile). Flow rate was 150 ml/min. The LC gradient was: 0 min, 85% B; 2 min, 85% B; 3 min, 80% B; 5 min, 80% B; 6 min, 75% B; 7 min, 75% B; 8 min, 70% B; 9 min, 70% B; 10 min, 50% B; 12 min, 50% B; 13 min, 25% B; 16 min, 25% B; 18 min, 0% B; 23 min, 0% B; 24 min, 85% B; 30 min, 85% B. Autosampler temperature was 4°C. Data was analyzed using the *metabolomics* package in R. Log<sub>2</sub> fold-changes and associated p-values for 24 month old male and female mice on Low AA or Low Ile diets relative to Control fed mice can be found in Tables S4D.

**Lipidomic Analysis**—All solutions were pre-chilled on ice. Tissue was transferred to labeled bead-mill tubes (1.4 mm, MoBio Cat# 13113-50) and extracted in a solution of 250  $\mu\text{L}$  PBS, 225  $\mu\text{L}$  MeOH containing internal standards (Avanti SPLASH LipidoMix (Lot#12) at 10  $\mu\text{L}$  per sample) and 750  $\mu\text{L}$  MTBE (methyl tert-butyl ether). The sample was homogenized in two, 30s cycles using the TissueLyzer followed by incubation on ice for 5 minutes. Samples were centrifuged at 16,000g for 10 minutes at 4 °C, and 500  $\mu\text{L}$  of the lipid-containing upper phase was collected in a new tube. Samples were evaporated to dryness using a Savant SpeedVac Plus SC110A (ThermoFischer) at room temperature.

Dried lipids were reconstituted in 150  $\mu$ L IPA and transferred to an LC-MS vial with insert (Agilent 5182–0554 and 5183–2086) for analysis. A processed blank sample was included with each extraction batch and went through the same procedure except without tissue or internal standard added. Five pooled quality control (QC) samples were prepared by taking equal volumes ( $\sim$ 10  $\mu$ L) from each sample after final resuspension and aliquoting in vials. These were run throughout the LC-MS queue to ensure reproducibility throughout the run. The extraction protocol was based on<sup>81</sup>.

The Agilent 6546 Accurate Mass Q-TOF dual ESI mass spectrometer equipped with an Agilent HiP 1290 Sampler and Agilent 1290 Infinity II LC system was used for analysis. Samples were run in positive and negative ionization as separate experiments. Samples were injected at either 1  $\mu$ L (positive mode) or 5  $\mu$ L (negative) at a 50x (positive) or 5x (negative) dilution. Samples were separated on an Agilent Poroshell C18 2.1  $\times$  50 mm column maintained at 50°C connected at a sample flow of 0.500 ml/min. Mobile phase A consisted of ACN:H<sub>2</sub>O (60:40 v/v) in 10 mM ammonium formate and 0.1% formic acid, and mobile phase B consists of IPA:ACN:H<sub>2</sub>O (90:9:1 v/v) in 10 mM ammonium formate and 0.1% formic acid. The chromatography gradient for both positive and negative modes started at 15% mobile phase B then increases to 30% B over 2.4 min, then to 48% B from 2.4 – 3.0 min, then to 82% B from 3 – 13.2 min, and finally to 99% B from 13.2 – 13.8 min where it was held until 15.4 min and then returned to the initial conditions and equilibrated for 4 min.

For positive ionization, the source gas temperature is set to 250 °C, with a gas flow of 12 L/min and a nebulizer pressure of 35 psig. VCap voltage was 4000 V, fragmentor at 145 V, skimmer at 45 V and Octopole RF peak at 750 V. For negative mode, the source gas temperature was set to 350 °C, with a drying gas flow of 12 L/min and a nebulizer pressure of 25 psig. VCap voltage is set at 4000 V, fragmentor at 200 V, skimmer at 45 V and Octopole RF peak at 750 V. Reference masses in positive mode (m/z 121.0509 and 922.0098) are infused with nebulizer pressure at 2 psig, and negative mode reference masses (m/z 1033.988, 966.0007, and 112.9856) were infused with a nebulizer pressure at 5 psig. Samples were analyzed in a randomized order acquiring with a scan range m/z 100 – 1500. Tandem mass spectrometry was conducted using the same LC gradient at collision energy of 25 V using a pooled sample to create the lipid library.

QC samples and blanks were injected throughout the sample queue to ensure the reliability of acquired lipidomics data. Results from LC-MS experiments were collected using Agilent Mass Hunter (MH) Workstation and analyzed using the software packages MH Qual, MH Quant, Lipid Annotator and Profinder (Agilent Technologies, Inc.) to prepare the data set. In-house R scripts were used for data cleanup and curation (see accompanying code for details). Data was normalized and analyzed using the *metabolomics* package in R. Data was normalized and analyzed using the *metabolomics* package in R. Log<sub>2</sub> fold-changes and associated p-values for 24-month-old male mice on Low AA or Low Ile diets relative to Control fed mice can be found in Tables S5A and S5B.

**Integrative Analysis**—Four data types (metabolomics, transcriptomics, lipidomics, phenotypic outcomes) were obtained from experiments with three factors (sex, age (young,

old) and diet (Low AA, Low Ile or Control)) from 92 mice (eight old female mice fed Control diet, seven old female mice fed LowAA diet, eight old female mice fed Low Ile diet, seven old male mice fed Control diet, eight old male mice fed Low AA diet, eight old male mice fed Low Ile diet, eight young female mice fed Control diet, eight young female mice fed Low AA diet, eight young female mice fed Low Ile diet, eight young male mice fed Control diet, seven young male mice fed Low AA diet, and seven young male mice fed Low Ile diet). For each of the four contrasts we investigated, young/old male/female Control vs Low Ile, there were different numbers of correlations depending on the number of significant data points.

To identify molecules of interest in each of the -omics datasets, significantly differentially expressed molecules between Control, and Low Ile Groups using an estimated marginal means from a linear model. The Benjamini-Hochberg method was applied to control false discovery rate, selecting those with adjusted p-value < 0.05 (adjusted p-value < 0.2 for metabolites)<sup>78</sup>. Metabolomics, transcriptomics, and lipidomics data were preprocessed, log<sub>2</sub> transformed, z-scale normalized across molecules and samples for each data type individually. Phenotypic outcome data were similarly z-scale normalized just across phenotypes.

To integrate the data, all four data types were concatenated for each comparison. Correlations were performed between using Spearman's rank (Young Control x Low Ile Male:  $2560 \times 2560 = 6553600$ ; Old Control x Low Ile Male:  $98 \times 98 = 9604$ ; Young Control x Low Ile Female:  $42 \times 42 = 1764$ ; Old Control x Low Ile Female:  $1198 \times 1198 = 1435204$ ). Complete hierarchical clustering was used to reorder molecules based on 1 – Spearman correlation between all molecules. The number of clusters were determined by silhouette scores<sup>82</sup>. However, the silhouette curve was atypical, so the number of clusters were determined based on the 4–7 clusters observed in the heatmap and the consistency of pathways and phenotypes within clusters; heatmaps and correlation plots were generated for all comparisons.

All analyses were performed in R (v. 4.1.0) using using emmeans<sup>83</sup> (v. 1.8.4), ComplexHeatmap<sup>84</sup> (v. 2.8.0), cluster<sup>85</sup> (v. 2.1.2). For each cluster, the over representation of KEGG pathways from genes were determined using kegga and the gene ontology terms were determined using goana from limma<sup>77</sup> (v. 3.48.3).

## QUANTIFICATION AND STATISTICAL ANALYSIS

**Statistical Analyses**—Most statistical analyses were conducted using Prism, version 9 (GraphPad Software Inc., San Diego, CA, USA) and R (version 4.1.0). Tests involving multiple factors used one-way ANOVA with Diet as the categorical variable followed by a Tukey–Kramer or Dunnett's *post hoc* test for multiple comparisons as appropriate. Data distribution was assumed to be normal but was not formally tested. Energy expenditure data did not meet criteria for ANCOVA with body weight as a covariate. Transcriptomics, metabolomics and lipidomics data were analyzed using R (version 3.4.2). All correlations where depicted were produced using Pearson's correlations and PCA plots were produced by imputing missing data and scaling the data using the R package “missMDA” using the PCA analysis and plots were generated using the R package “factoextra”<sup>86,87</sup>. Lifespan

comparisons were calculated by log-rank test. Maximum lifespan calculations were made by generating a cutoff of the top 10% longest lived animals in each sex, coupled with Boschloo's Test (Wang-Allison) for significance testing between groups<sup>88</sup>. Exact test used and exact n values are provided in each figure legend.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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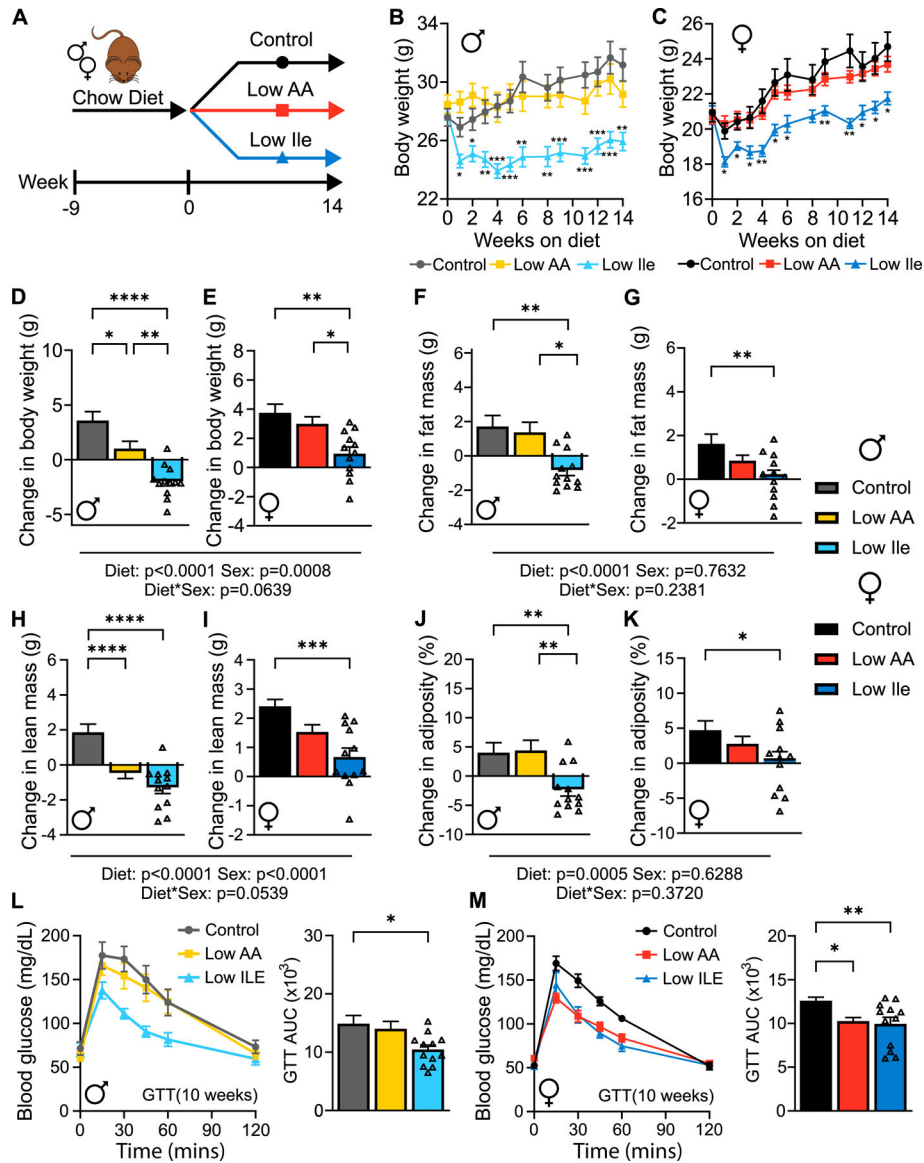
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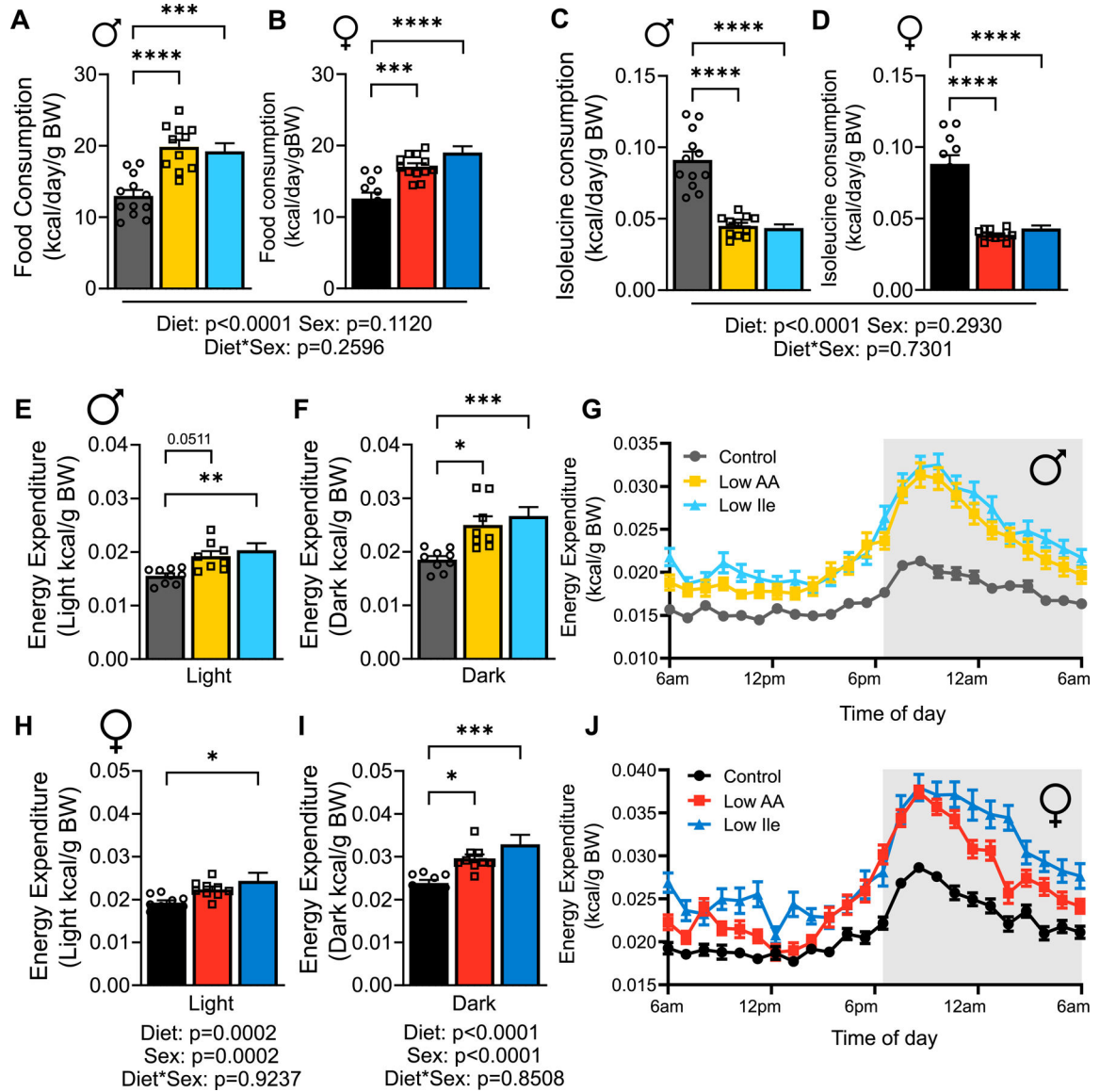
**Highlights**

- Isoleucine restriction (IleR) improves metabolic health in both sexes.
- IleR reprograms hepatic metabolism in a sex- and age-dependent manner.
- IleR reduces frailty and increases lifespan, with stronger effects on male lifespan.
- Amino acid restriction begun at 6 months extends healthspan but not lifespan.



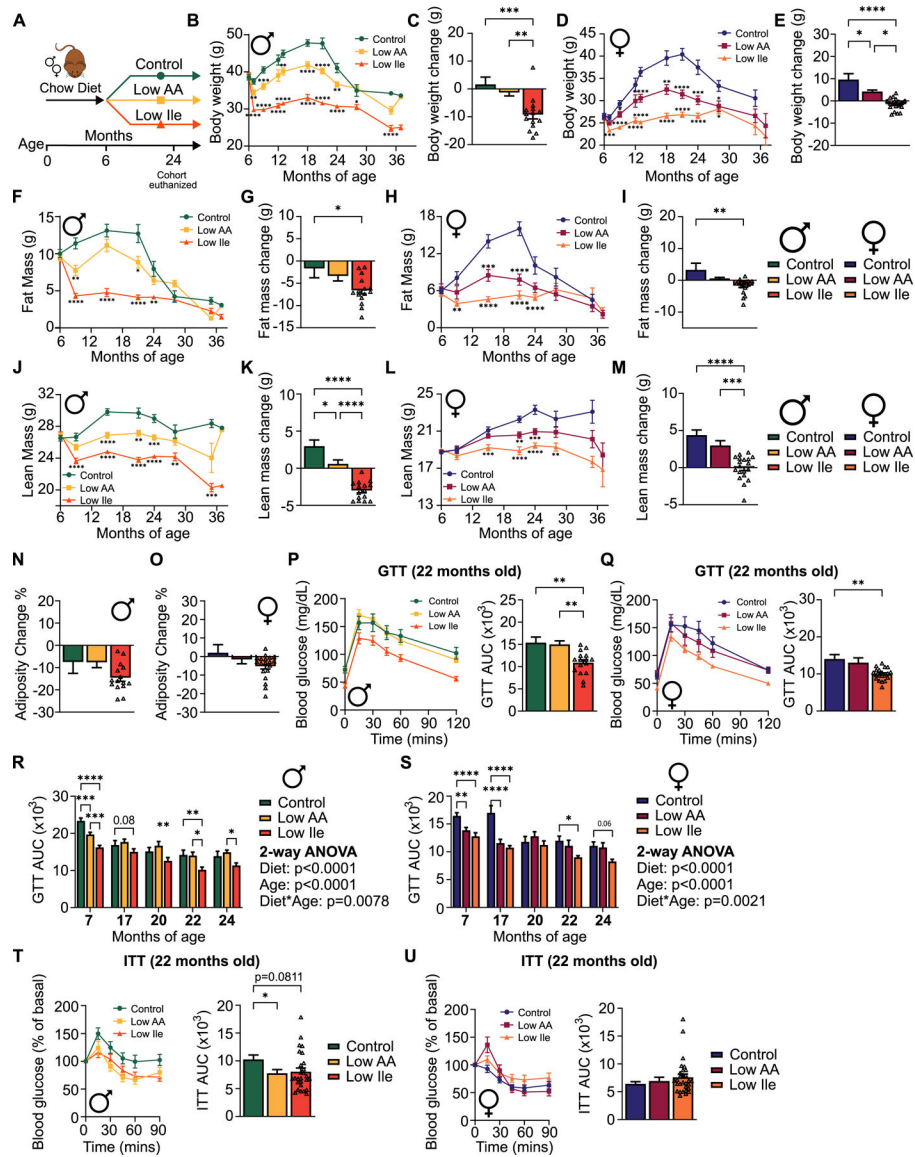
**Figure 1: IleR reduces body weight and improves glycemic control in young HET3 mice.** (A) Experimental scheme. (B-C) Male (B) and female (C) mouse weight. (D-K) Change in weight (D-E), fat mass (F-G), lean mass (H-I) and adiposity (J-K) over 14 weeks. (L-M) Glucose tolerance of male (L) and female (M) mice after 10 weeks on the indicated diets. (B-M)  $n=11-12$  mice/group. (B-C) Tukey test following residual maximum-likelihood (REML) analysis model with Geisser-Greenhouse correction. (D-K) Tukey test following 2-way ANOVA. (L, M) Tukey test following ANOVA. (B-M)  $*P<0.05$ ,  $**P<0.01$ ,  $***P<0.001$  and  $****P<0.0001$ . P-values for the overall effect of Sex, Diet and the interaction represent the significant p-values from the two-way ANOVA. Data represented as mean  $\pm$  SEM. See also Figure S1.





**Figure 2: IleR alters energy balance in young HET3 mice.**

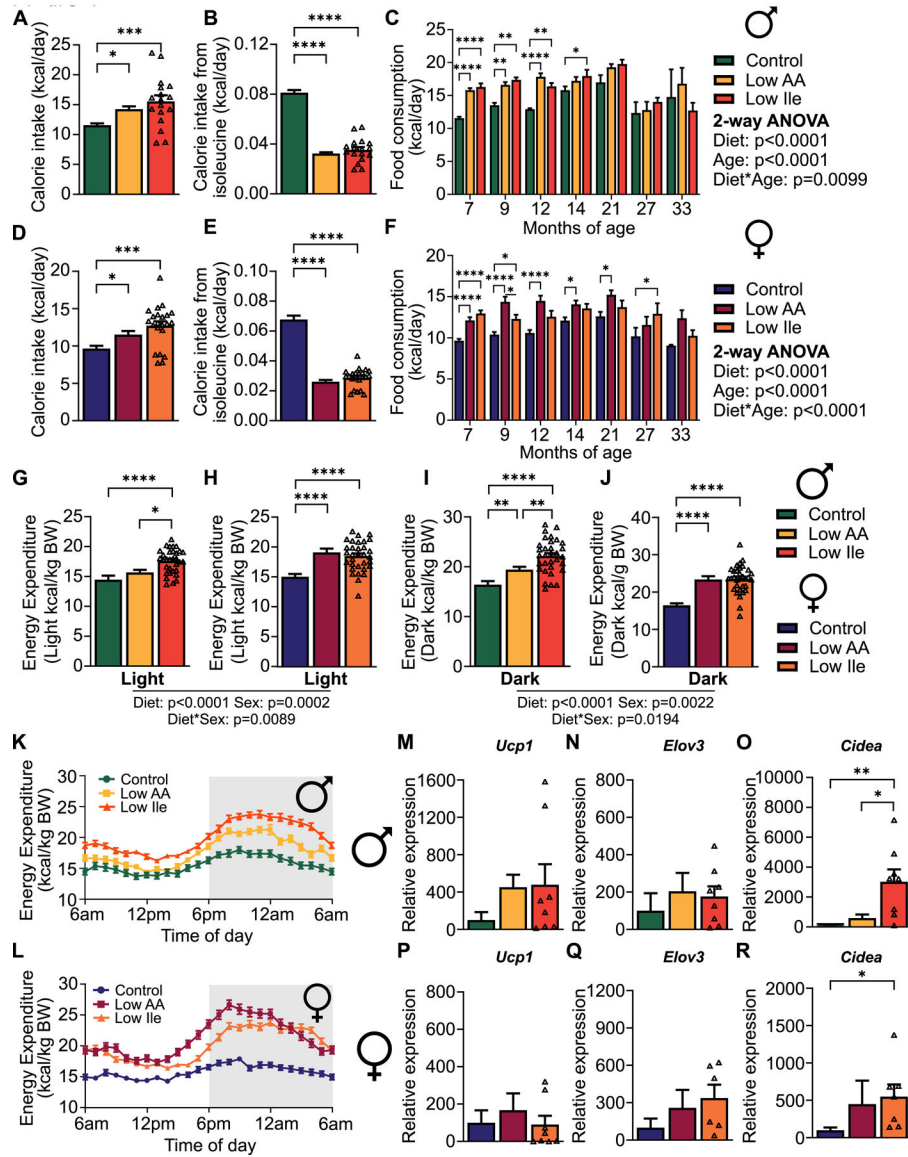
(A-B) Daily food consumption was measured in home cages after 3 weeks on diet in males (A) and females (B). (C-D) Calculated daily isoleucine intake for males (C) and females (D). (A-D)  $n = 11-12$  mice/group. (E-J) Energy expenditure measure in males (E-G) and females (H-J);  $n = 8-10$  mice/group. (A-F, H-I) Tukey test following 2-way ANOVA,  $*P < 0.05$ ,  $**P < 0.01$ ,  $***P < 0.001$  and  $****P < 0.0001$ . P-values for the overall effect of Diet, Sex and the interaction represent the significant p-values from the two-way ANOVA. Data represented as mean  $\pm$  SEM. See also Figure S2.

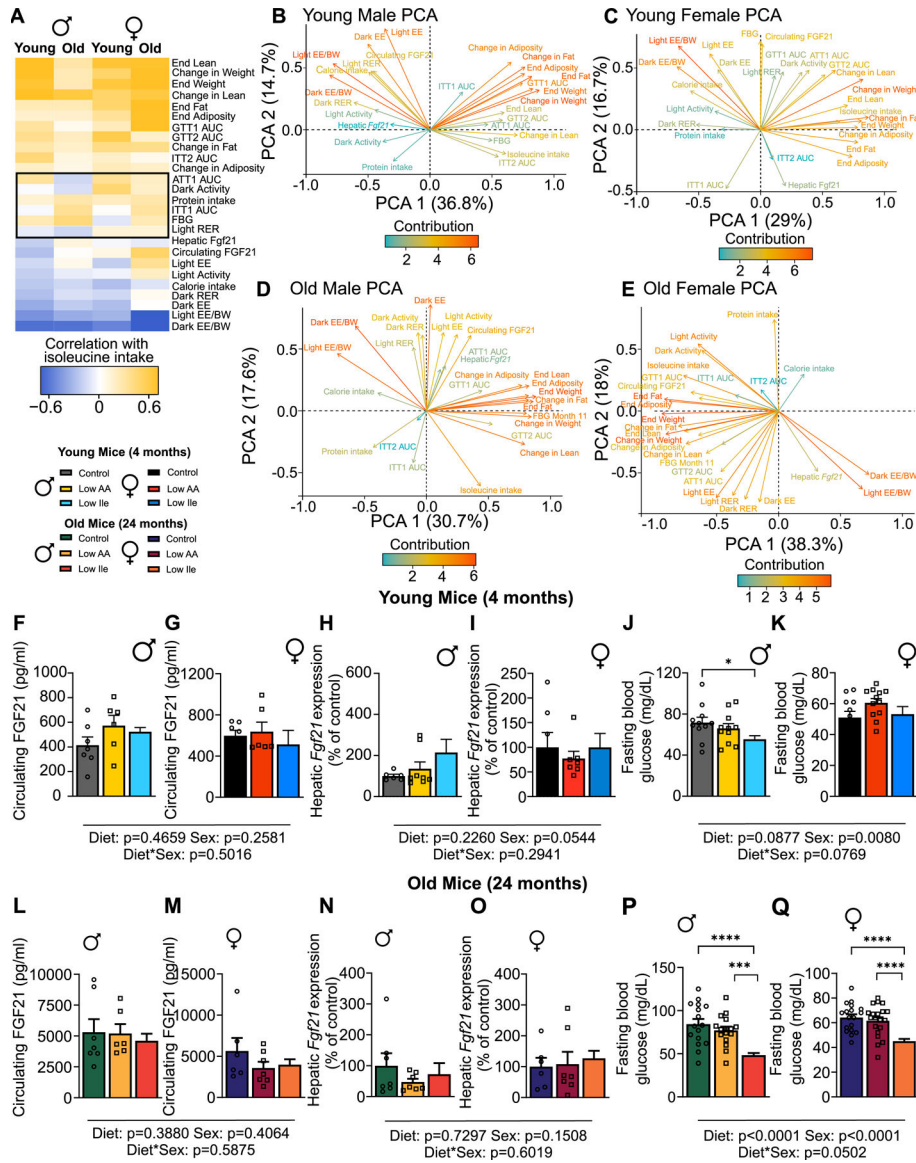


**Figure 3: IleR reduces body weight and improves glycemic control in HET3 mice when started in mid-life.**

(A) Experimental scheme. At 24 months of age, a pre-selected cohort of mice in each group was euthanized for molecular analysis. (B-E) Male (B-C) and female (D-E) body weight and change from 6–24 months of age. (B, D) n varies by month; maximum 47–53 mice/group. (C) n=9–15 mice/group. (E) n=11–19 mice/group. (F-O) Body composition over the course of the lifespan and change from 6–24 months of age. (F, H, J, L) n varies by month; maximum 47–53 mice/group. (G, K, N) n=9–15 mice/group. (I, M, O) n=11–19 mice/group. (P-Q) Glucose tolerance after 16 months (22 months of age) on the indicated diets in male (P) and female (Q) mice; n=14–16 mice/group for males, 15–20 mice/group for females. (R-S) GTT area-under-the-curve (AUC) for male (R) and female (S) mice over the course of the experiment. Initial n=30–33/group in males, n=30–32 mice/group in females. (T-U) Insulin tolerance after 16 months on diet (22 months of age) on the indicated diets in male (T) and female (U) mice; n=19–27 mice/group for males, 19–29

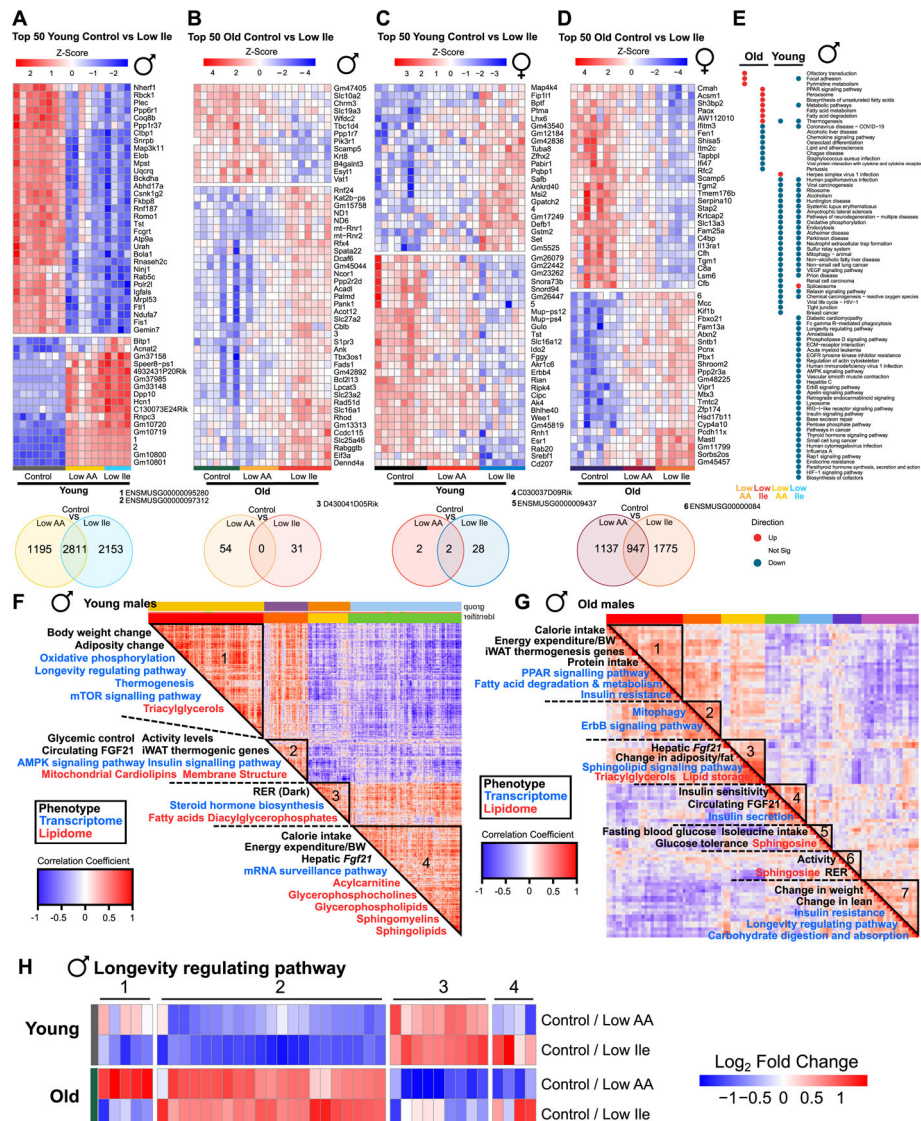
mice/group for females. (B, D, F, H, J, L) Mixed-effects model with Geisser-Greenhouse correction followed by Dunnett's multiple comparison correction test, (C, E, G, I, K, M-Q, T,U) Tukey test following ANOVA. (R, S) Tukey test following 2-way ANOVA. (B-U) \* $P < 0.05$ , \*\* $P < 0.01$ , \*\*\* $P < 0.001$  and \*\*\*\* $P < 0.0001$ . P-values for the overall effect of Diet, Age and the interaction represent the significant p-values from the two-way ANOVA. Data represented as mean  $\pm$  SEM. See also Figure S3.



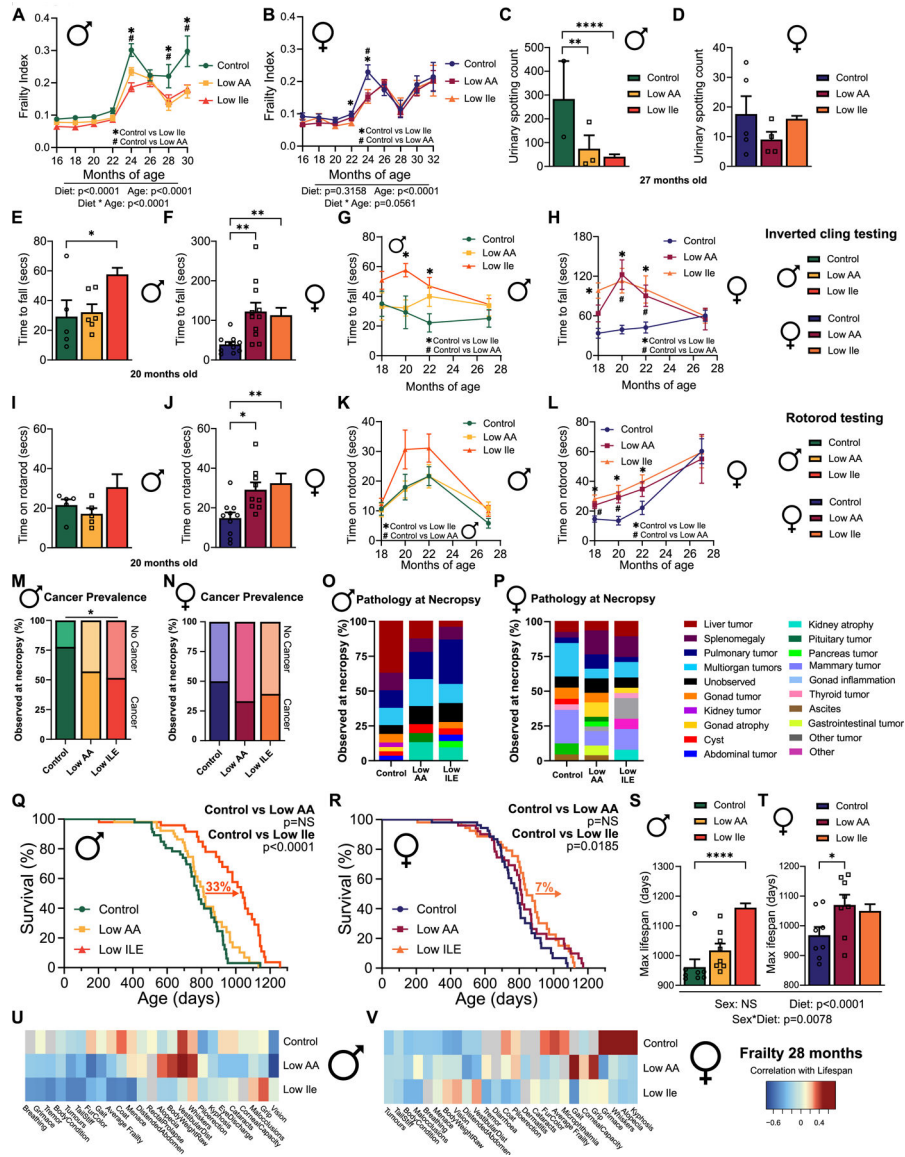


**Figure 5: Correlation analysis identifies diet and age dependent and independent physiological and metabolic responses to a Low Ile diet.**

(A) Phenotypic measurements correlated with consumption of isoleucine (kcal) in each mouse (Pearson's correlation) and clustered (hierarchical clustering). Phenotypic measurements that do not cluster as well appear in the middle of the correlation plot surrounded by a black box. (B-D) Phenotypic measurements from PCA of young and old mice of both sexes were visualized; positively correlated variables point to the same side of the plot, negatively correlated variables point to opposite sides of the plot. Length and color of arrows indicate contribution to the principal components. Young  $n=11-12$  mice/group, old  $n=17-22$  mice/group. (F-Q) Selected phenotypic measurements. Circulating FGF21  $n=6-7$  mice/group, Hepatic *Fgf21*  $n=6-8$  mice/group, FBG  $n=11-21$  mice/group. Tukey test following 2-way ANOVA; \* $P<0.05$ , \*\* $P<0.01$ , \*\*\* $P<0.001$  and \*\*\*\* $P<0.0001$ . P-values for the overall effect of Sex, Diet and the interactions represent the significant p-values from the two-way ANOVA. Data represented as mean  $\pm$  SEM. See also Table S2. See also Figure S5.



**Figure 6: IleR and Low AA diets have sex- and age-dependent molecular impacts.** (A-D) Top 50 significantly differentially expressed (SDE) genes for the indicated comparisons, with hierarchical clustering across all groups in each figure. Venn Diagrams below each heatmap indicating significant gene overlap for the comparisons, unadjusted  $p < 0.05$ .  $n = 4-8$  mice/group. (E) Enriched transcriptomic pathways across all male groups (red = upregulated, blue = downregulated, grey = not significant).  $n = 6-8$  mice/group. (F-G) Spearman's rank order correlation matrix of phenotypic, transcriptomic, metabolomic and lipidomic changes across young (F) and old (G) male Control vs Low Ile mice. Mega-clusters identified by hierarchical clustering are outlined in black (Table S5D).  $N = 6-8$  mice/group. (H) Genes from KEGG "Longevity regulating pathway" significantly altered in old and young male mice on Low AA or Low Ile diets.  $n = 6-8$  mice/group. See also Tables S3A-S5D. See also Figure S6.



**Figure 7: IleR increases lifespan and improves healthspan in HET3 male mice.**

(A-B) Frailty of male (A) and female (B) mice over time. n varies by month; max n=44–49 mice/group. (C-D) Void spot assay conducted in 27-month-old male (C) and female (D) mice. n=2–14 mice/group. (E-H) Inverted cling test in 20-month-old mice and over time. (E-F) n=5–11 mice/group. (G-H) n varies by month; max n=16–22 mice/group. (I-L) Rotarod test in 20-month-old mice and over time. (I-J) n=5–10 mice/group. (K-L) n varies by month; max n=15–22 mice/group. (M-N) Tumor incidence at necropsy; n=31–38 mice/group. (O-P) Pathology observed at necropsy. n=22–32 mice/group. (Q-R) Kaplan-Meier survival curves by diet in male (Q) and female (R) mice. n=47–53 mice/group. (S-T) Average top 10% of lifespans in male (S) and female (T) mice by diet, n=8 mice/group. (U-V) Spearman's rank correlation of frailty measured at 28 months with final lifespan across male (U) and female (V) mice. n=13–25 mice/group. (A-B, G-H, K-L) Mixed-effects model (REML) for time and diet with post-hoc Tukey testing for multiple comparisons. #*P*<0.05 Control vs Low

AA, \* $P < 0.05$  Control vs Low Ile. (C-F, I-J, S-T) Tukey test following ANOVA; \* $P < 0.05$ , \*\* $P < 0.01$ , \*\*\* $P < 0.001$  and \*\*\*\* $P < 0.0001$ . (M-N) Two-sided chi-squared test, \* $P < 0.05$ . (Q-R) Log-rank test for Control vs Low AA and Control vs Low Ile. Outlier removed from (D) using ROUT outlier test. Data represented as mean  $\pm$  SEM. See also Tables S6A and S6C. See also Figure S7.

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## Key resources table

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Chemicals, peptides, and recombinant proteins		
Human insulin	Eli Lilly	NDC 0002-8215-17 (Humulin R U-100)
TRI reagent	Sigma	T9494
SYBR Green	Thermo Fisher Scientific	4309155
Superscript III Reverse Transcriptase	Thermo Fisher Scientific	18080085
Critical commercial assays		
Mouse/Rat FGF-21 Quantikine ELISA Kit	R&D Systems	Cat# MF2100
Deposited data		
Liver transcriptomics raw and analyzed	This paper	GEO: GSE241904; Tables S3A and S3C. RRID:SCR_017757.
Liver metabolomics	This paper	Tables S4A and S4C
Plasma metabolomics	This paper	Table S4D
Liver lipidomics	This paper	Table S5A and S5B
Raw data to recreate figures	This paper	<a href="http://data.mendeley.com/preview/dk74jcsww">http://data.mendeley.com/preview/dk74jcsww</a>
Experimental models: Organisms/strains		
Mouse strain: C57BL/6J (Male)	The Jackson Laboratory	Cat# JAX:000664; RRID: IMSR_JAX:000664
Mouse strain: DBA/2J (Male)	The Jackson Laboratory	Cat# JAX: 000671; RRID: IMSR_JAX:000671
Mouse strain: BALB/cJ (Female)	The Jackson Laboratory	Cat# JAX: 000651; RRID: IMSR_JAX:000651
Mouse strain: C3H/HeJ (Female)	The Jackson Laboratory	Cat# JAX: 000659; RRID: IMSR_JAX:000659
Mouse strain: UM-HET3 (Male and Female)	This paper	F2 progeny of (BALB/cJ x C57BL/6J) mothers and (C3H/HeJ x DBA/2J) fathers
Oligonucleotides		
<i>Fgf21</i> : F: CAAATCCTGGGTGTC AAAGC	[13]	N/A
<i>Fgf21</i> : R: CATGGGCTTCAGACTGGTAC	[13]	N/A
<i>Cidea</i> : F: GAATAGCCAGAGTCACCTTCG	[28]	N/A
<i>Cidea</i> : R: AGCAGATTCCTTAACACGGC	[28]	N/A
<i>Elov3</i> : F: ATGCAACCTATGACTTCGAG	[28]	N/A
<i>Elov3</i> : R: ACGATGAGCAACAGATAGACG	[28]	N/A
<i>Ucp1</i> : F: GCATTCAGAGGCAAATCAGC	[28]	N/A
<i>Ucp1</i> : R: GCCACACCTCCAGTCATTAAG	[28]	N/A
<i>P16 (Cdkn2a)</i> : F: CCCAACGCCCGAACT	[89]	N/A
<i>P16 (Cdkn2a)</i> : R: GCAGAAGAGCTGCTACGTGAA	[89]	N/A
<i>P21 (Cdkn1a)</i> : F: GTCAGGCTGGTCTGCCTCCG	[89]	N/A
<i>P21 (Cdkn1a)</i> : R: CGGTCCCGTGGACAGTGAGCAG	[89]	N/A
<i>Il1a</i> : F: TGCAGTCCATAACCCATGATC	[90]	N/A
<i>Il1a</i> : R: ACAAACCTTCTGCCTGACGAG	[90]	N/A
<i>Il1b</i> : F: TCCTGTGTGATGAAAGACGGCAC	[89]	N/A
<i>Il1b</i> : R: GTGCTGATGTACCAGTTGGGGAAC	[89]	N/A

REAGENT or RESOURCE	SOURCE	IDENTIFIER
<i>Ilf</i> : F: CTGGGAAATCGTGGAAT	[89]	N/A
<i>Ilf</i> : R: CTGGGAAATCGTGGAAT	[89]	N/A
<i>Ilf0</i> : F: ATAACTGCACCCACTTCCCA	[89]	N/A
<i>Ilf0</i> : R: GGGCATCACTTCTACCAGGT	[89]	N/A
<i>Mcp1</i> : F: GCATCCACGTGTTGGCTCA	[89]	N/A
<i>Mcp1</i> : R: CTCCAGCCTACTCATTGGATCA	[89]	N/A
<i>Actb</i> ( $\beta$ -Actin): F: GATGTATGAAGGCTTTGGTC	[89]	N/A
<i>Actb</i> ( $\beta$ -Actin): R: TGTGCACTTTTATTGGTCTC	[89]	N/A
Software and algorithms		
edgeR package	[76]	<a href="https://bioconductor.org/packages/release/bioc/html/edgeR.html">https://bioconductor.org/packages/release/bioc/html/edgeR.html</a>
GraphPad Prism	GraphPad	<a href="http://www.graphpad.com/scientific-software/prism">http://www.graphpad.com/scientific-software/prism</a>
MetaboAnalyst	[91]	<a href="https://www.metaboanalyst.ca/">https://www.metaboanalyst.ca/</a>
R (Version 3.4.2)	N/A	<a href="https://www.r-project.org/">https://www.r-project.org/</a>
MyGene package	N/A	<a href="https://www.bioconductor.org/packages/release/bioc/html/mygene.html">https://www.bioconductor.org/packages/release/bioc/html/mygene.html</a>
Factoextra package	[87]	<a href="https://cran.r-project.org/web/packages/factoextra/index.html">https://cran.r-project.org/web/packages/factoextra/index.html</a>
missMDA package	N/A	<a href="https://cran.r-project.org/web/packages/missMDA/index.html">https://cran.r-project.org/web/packages/missMDA/index.html</a>
LION/web	[92]	<a href="http://www.lipidontology.com/">http://www.lipidontology.com/</a>
Limma package	[77]	<a href="https://bioconductor.org/packages/release/bioc/html/limma.html">https://bioconductor.org/packages/release/bioc/html/limma.html</a>
Metabolomics package	N/A	<a href="https://cran.r-project.org/src/contrib/Archive/metabolomicsR/">https://cran.r-project.org/src/contrib/Archive/metabolomicsR/</a>
Lipid Annotator	[93]	<a href="https://www.agilent.com/en/solutions/omics/lipidomics/lipidomics-data-analysis">https://www.agilent.com/en/solutions/omics/lipidomics/lipidomics-data-analysis</a>
MassHunter	N/A	<a href="https://www.agilent.com/en/promotions/masshunter-mass-spec">https://www.agilent.com/en/promotions/masshunter-mass-spec</a>
Emmeans package	N/A	<a href="https://cran.rproject.org/web/packages/emmeans/index.html">https://cran.rproject.org/web/packages/emmeans/index.html</a>
ComplexHeatmap package	[84, 94]	<a href="https://bioconductor.org/packages/release/bioc/html/ComplexHeatmap.html">https://bioconductor.org/packages/release/bioc/html/ComplexHeatmap.html</a>
Cluster package	N/A	<a href="https://cran.r-project.org/web/packages/cluster/index.html">https://cran.r-project.org/web/packages/cluster/index.html</a>
Other		
Normal Chow	Purina	Cat# 5001
2019 Teklad Global 19% Protein Extruded Rodent	Teklad	2019
Teklad Global 2020x	Teklad	2020X
Mouse diets (See Table S1)	This paper	N/A