

Tissue-Specific Sex Difference in Mouse Eye and Brain Metabolome Under Fed and Fasted States

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Received: January 9, 2023

Accepted: February 13, 2023

Published: March 9, 2023

Citation: Saravanan M, Xu R, Roby O, et al. Tissue-specific sex difference in mouse eye and brain metabolome under fed and fasted states. *Invest Ophthalmol Vis Sci.* 2023;64(3):18. <https://doi.org/10.1167/iovs.64.3.18>

PURPOSE. Visual physiology and various ocular diseases demonstrate sexual dimorphisms; however, how sex influences metabolism in different eye tissues remains undetermined. This study aims to address common and tissue-specific sex differences in metabolism in the retina, RPE, lens, and brain under fed and fasted conditions.

METHODS. After ad libitum fed or being deprived of food for 18 hours, mouse eye tissues (retina, RPE/choroid, and lens), brain, and plasma were harvested for targeted metabolomics. The data were analyzed with both partial least squares-discriminant analysis and volcano plot analysis.

RESULTS. Among 133 metabolites that cover major metabolic pathways, we found 9 to 45 metabolites that are sex different in different tissues under the fed state and 6 to 18 metabolites under the fasted state. Among these sex-different metabolites, 33 were changed in 2 or more tissues, and 64 were tissue specific. Pantothenic acid, hypotaurine, and 4-hydroxyproline were the top commonly changed metabolites. The lens and the retina had the most tissue-specific, sex-different metabolites enriched in the metabolism of amino acid, nucleotide, lipids, and tricarboxylic acid cycle. The lens and the brain had more similar sex-different metabolites than other ocular tissues. The female RPE and female brain were more sensitive to fasting with more decreased metabolites in amino acid metabolism, tricarboxylic acid cycles, and glycolysis. The plasma had the fewest sex-different metabolites, with very few overlapping changes with tissues.

CONCLUSIONS. Sex has a strong influence on eye and brain metabolism in tissue-specific and metabolic state-specific manners. Our findings may implicate the sexual dimorphisms in eye physiology and susceptibility to ocular diseases.

Keywords: sex difference, retinal metabolism, brain metabolism, lens metabolism, metabolites

Sexual dimorphisms have been reported in vertebrate eyes, including photoreceptor cell distribution, visual acuity, color perception and disease susceptibility. The males have more relative number of L- and M-cone photoreceptors, thicker macula, stronger response to blue light stimuli, and greater sensitivity for fine detail and rapidly moving stimuli.¹⁻⁵ The females have a higher density of lens epithelium and more irons in the retina and RPE.⁶⁻⁸ Men are known for the high prevalence of color blindness⁹; however, women are more susceptible to AMD, cataract, and glaucoma.¹⁰⁻¹³ Although sex differences in eye physiology and pathology are well-established, the biochemical basis for these sex differences in different eye tissues remains unknown.

The metabolome is a collection of metabolites such as carbohydrates, amino acids, nucleotides, fatty acids, and vitamins in the cell or tissue, serving as substrates, products, cofactors, or ligands for biochemical reactions, nutrient transport, and cell signaling.¹⁴ These metabolites are not only the products of metabolic gene and protein expression, but also reflect interactions with the environment

such as microbiome, diet, and exposure.¹⁵⁻¹⁷ Quantifying metabolites by metabolomics is increasingly important in eye research to identify tissue-specific metabolism in healthy ocular tissues and mechanisms or biomarkers in ocular diseases.¹⁸⁻²² Notably, the ocular tissues have a specialized metabolism, which may underlie various ocular diseases that cause blindness. Like tumors, the neural retina has the Warburg effect or aerobic glycolysis to produce large amounts of lactate from glucose. Many mutations of metabolic genes in glycolysis, tricarboxylic acid (TCA) cycle, and nucleotide metabolism only cause retinal degeneration in humans.²³⁻²⁵ The RPE, a single layer of epithelial cells, resides between the neural retina and choroid circulation. RPE metabolism is critical to the survival of the neural retina. The defects in RPE metabolism are attributed to inherited retinal degeneration and AMD, the leading cause of blindness in the elder population.^{23,26,27} The lens is a transparent tissue that relies on nutrients, especially glucose, from the aqueous humor through the blood-aqueous barrier.²⁸ Metabolic disturbance of lens metabolism can cause the loss

of transparency or cataract, a common ocular disease in the elderly.^{29,30} Sex differences in glucose, lipid, and amino acid metabolism are well-studied in adipose tissue, muscle, and liver^{31–34}; however, sex differences in eye metabolism have not been determined or appreciated.

In this study, we used a targeted metabolomics approach to quantify 133 metabolites covering major intermediates in the metabolism of glucose, amino acids, nucleotides, fatty acids, and vitamins in the neural retina, RPE, and lens from male and female mice under fed or fasted conditions. We also quantified the metabolites from the brain and plasma to identify common and tissue-specific sex differences in metabolism. We have found 97 sex-different metabolites and 64 metabolites show tissue-specific sex differences. Our findings demonstrate strong tissue-specific and sex-specific differences in eye metabolome, and these differences may implicate sex differences in eye physiology and susceptibility to diseases.

METHODS

Animals

We purchased 12-week-old C57 BL/6J mice of both sexes from the Jackson Laboratory (Bar Harbor, ME, USA; stock #:000664). The fed group had ad libitum access to food, but the food was removed for 18 hours after 4 PM in the fasted group. All mouse experiments were performed in accordance with guidelines by the National Institutes of Health and ARVO Statement for the Use of Animals in Ophthalmic and Vision Research, and the protocols were approved by the Institutional Animal Care and Use Committee of West Virginia University.

Isolation of Retina, RPE/Choroid, Lens, Brain, and Plasma

All mice were euthanized via quick cervical dislocation. Enucleated eyeballs were cleaned of the lingering fat and muscle tissue and dissected to isolate the retina, RPE/choroid, and lens as previously reported.^{21,35} Another technician quickly drew blood from the heart into microtubes with 10 μ L of 0.5 mM EDTA and centrifuged at 3000 rpm at 4°C for 15 minutes to collect the supernatant to fresh microtubes. The whole brain tissue was rapidly dissected and snap frozen in liquid nitrogen. All the harvested samples were stored at –80°C before use.

Metabolite Extraction and Preparation

Metabolites from the retina, RPE/choroid, lens, and brain were extracted with 80% cold menthol together with internal standard norvaline (1 mM) as described.^{36,37} Plasma metabolites were extracted by mixing 10 μ L of plasma with 40 μ L of cold methanol with norvaline. The mix was centrifuged and 10 μ L of supernatant was used for metabolite analysis. Protein concentrations from extraction pellets were measured for data normalization using MetaboAnalyst 5.0 (<https://www.metaboanalyst.ca/>).³⁸ All the metabolite extracts were dried before targeted metabolomics to run in the same batch.

Targeted Metabolomics

Targeted metabolomics was performed as described in detail before with liquid chromatography-mass spectrometry and gas chromatography-mass spectrometry.^{22,37} A total of 133

metabolites that cover major metabolic pathways were quantified (see detailed pathways and parameters in Supplementary Table S1). A Shimadzu LC Nexera X2 UHPLC coupled with a QTRAP 5500 liquid chromatography-mass spectrometry (AB Sciex, Hong Kong), and an Agilent 7890B/5977B gas chromatography-mass spectrometer (Agilent Technologies, Santa Clara, CA, USA) were used for metabolite analysis. The data were analyzed by MultiQuant 3.0.2 (AB Sciex) and Agilent MassHunter Quantitative Analysis Software.³⁹

Statistical Analyses

Multivariate analysis was performed with a supervised classification model partial least-squares discriminant analysis after pareto scaling using MetaboAnalyst 5.0. The comparison of specific metabolites was analyzed with Volcano plot with a *P* of less than 0.05 and fold changes of more than 1.3 or less than –1.3 (*P* > 1.3) for all figures.

RESULTS

Sex Differences in Retinal Metabolism

To study the impact of sex differences on retinal metabolites, we analyzed the abundance of metabolites from mouse retinas in both fed and fasted states. Under fed conditions, a multivariate analysis with partial least squares discriminant analysis (PLSDA) showed a clear separation between the male and female retinas (Fig. 1A), demonstrating sex differences in retinal metabolism. Volcano plots showed that 32 metabolites increased and 3 metabolites decreased in female retinas compared with male retinas (Fig. 1B, Supplementary Table S2). The female retinas had fewer long-chain fatty acids (palmitate and stearic acid) and cysteine, but more increased metabolites in the metabolism of amino acid, nucleotide, and nicotinamide adenine dinucleotide phosphate (NADP) (Figs. 1B, 1C, Supplementary Table S2). Pantothenic acid (a vitamin precursor for coenzyme A [CoA] synthesis), trigonelline (methylated nicotinic acid in NAD metabolism), amino adipic acid (an intermediate in lysine metabolism), oxidized glutathione, nicotinamide adenine dinucleotide phosphate hydrogen, cytidine diphosphate (CDP), and guanosine diphosphate (GDP) were among the top increased metabolites, indicating that the female retina has more active CoA synthesis and NAD(P) metabolism.

Retinal metabolites were further separated between sexes in the PLSDA plots in the fasted state (Fig. 1D) and sex-different metabolites were decreased to eight when compared with fed state (Fig. 1E). Similar to the fed state, pantothenic acid was increased in the fasted female retina. The long-chain acyl-carnitines (palmitoylcarnitine and stearoylcarnitine) were increased, but the short-chain acyl-carnitine (propionylcarnitine), purine nucleoside (hypoxanthine and 1-methyladenosine), hypotaurine, and riboflavin were decreased in the female retina (Figs. 1D, 1E). Compared with the fed state, 44 metabolites in the male retina and 21 in the female retina were changed in the fasted state with 11 overlapping changes between the sexes (Fig. 1G, Supplementary Fig. 1, and Supplementary Tables S3, S4). Ketone bodies are known to increase as alternative fuels during fasting. Consistently, 3-hydroxybutyrate (3-HB) was increased by 5- to 6-fold in both sexes after fasting. Pantothenic acid and acyl-carnitines were also increased in both sexes, suggesting that fatty acid oxidation is activated.

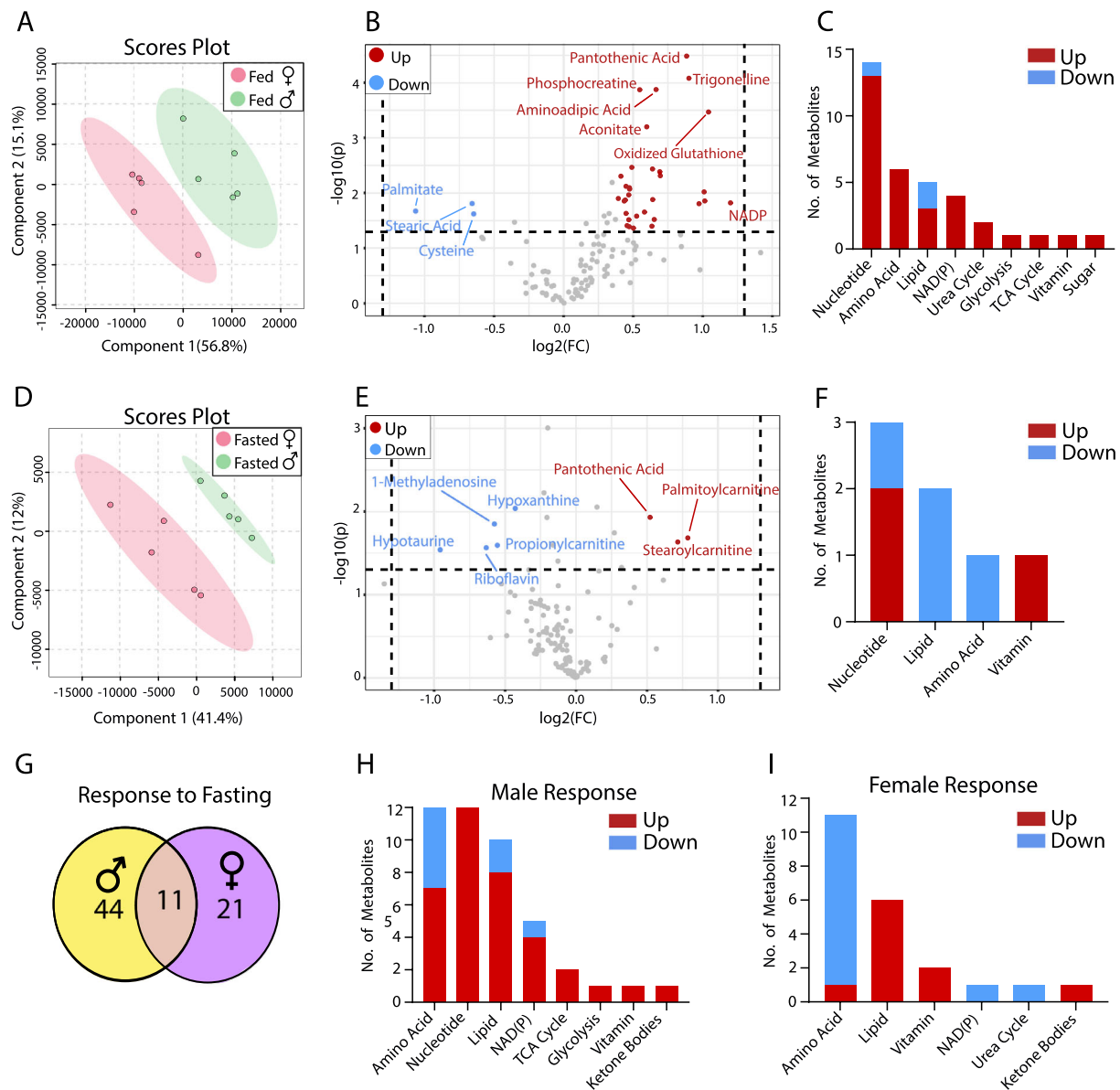


FIGURE 1. Sex differences in retinal metabolites in fed and fasted states. **(A)** PLSDA plots of mouse retinal metabolites from the fed state. **(B)** Volcano plot of retinal metabolites in the fed state ($N = 5$). **(C)** The number of changed metabolites in metabolic pathways in the fed state. **(D)** PLSDA plots of mouse retinal metabolites from the fasted state. **(E)** Volcano plot of retinal metabolites in the fasted state ($N = 5$). **(F)** The number of changed metabolites from the volcano plot in metabolic pathways in the fasted state. **(G)** The number of common and sex-specific changes in retinal metabolites in response to fasting in fasted versus fed in males or females, respectively. **(H)** The number of changed retinal metabolites in male mice in response to fasting. **(I)** The number of changed retinal metabolites in female mice in response to fasting. FC, fold change.

Serine, methionine and trigonelline were decreased in the retinas of both sexes (Figs. 1H, 1I, Supplementary Tables S3, S4). Despite these common changes, male and female retinas responded differently to fasting in nucleotide metabolism, amino acid metabolism, NAD(P) metabolism, TCA cycle and glycolysis (Figs. 1H, 1I, Supplementary Tables S3, S4).

Sex Difference in RPE/Choroid Metabolism

Similar to the neural retina, metabolites from RPE/choroid showed distinct separation between males and females in PLSDA scores plot under either fed or fasted conditions (Figs. 2A, 2D), indicating sex differences in RPE metabolism. The volcano plot showed that 19 metabolites were

significantly different between sexes under fed state, but the number of different metabolites was decreased to 9 in the fasted state (Figs. 2B, 2E, Supplementary Table S5). Pantothenic acid was the only metabolite that was increased in the female RPE/choroid in both fed and fasted states. Succinate, 4-hydroxyproline, β -alanine, and adenosine triphosphate were decreased in both fed and fasted states in the female (Figs. 2B, 2E). Under the fed state, the sex-different metabolites were mostly in the metabolism of amino acid, nucleotide, TCA cycle, lipid and pentose phosphate pathway; however, under the fasted state, there were fewer or no changes in those pathways (Figs. 2C, 2F, Supplementary Table S5). In response to fasting, male and female RPE/choroid showed the same number of changed

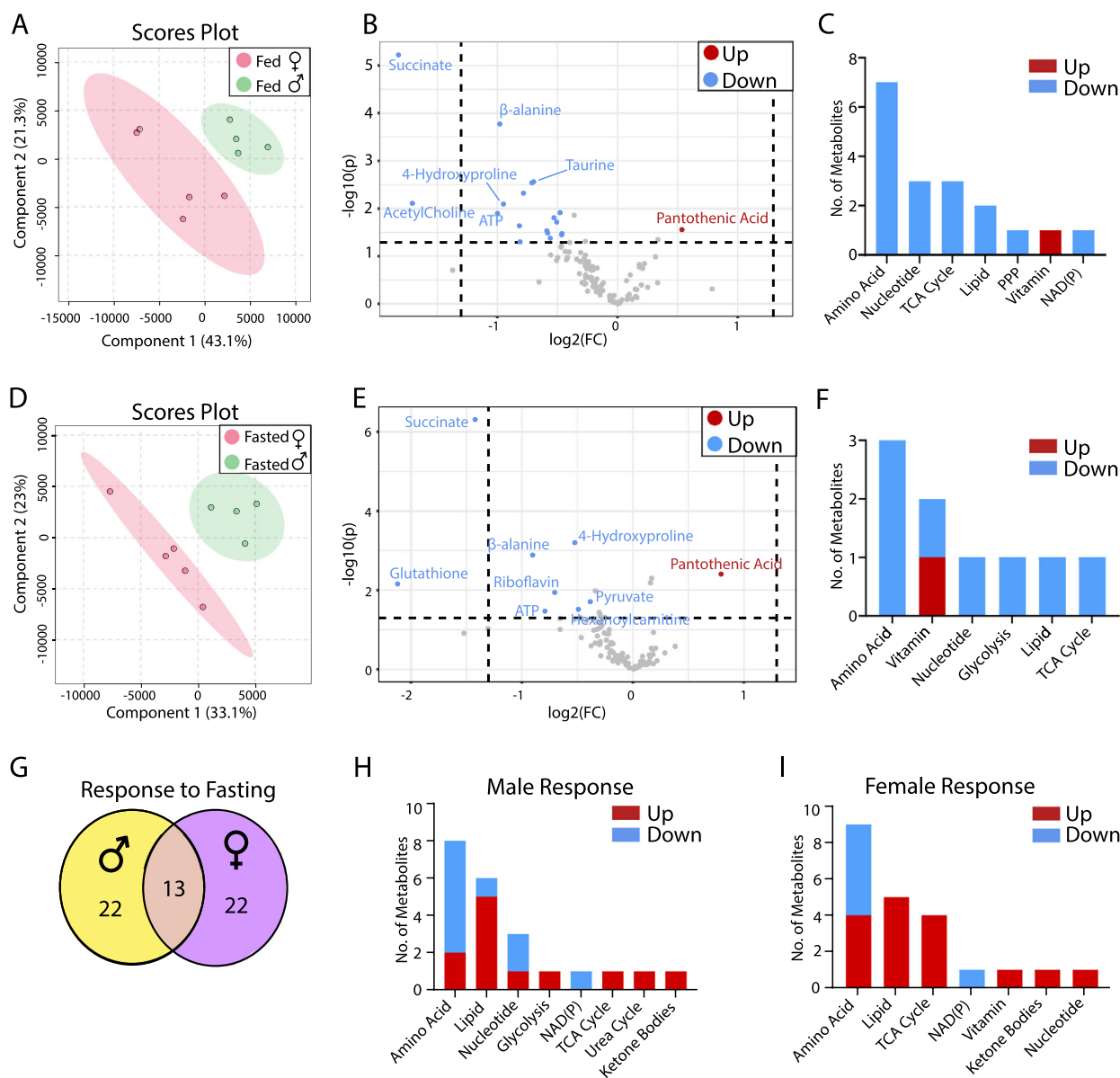


FIGURE 2. Sex difference in RPE metabolites in fed and fasted states. (A) PLSDA plots of mouse RPE metabolites from the fed state. (B) Volcano plot of RPE metabolites in the fed state. $N = 5$. (C) The number of changed metabolites in metabolic pathways in the fed state. (D) PLSDA plots of mouse retinal metabolites from the fasted state. (E) Volcano plot of retinal metabolites in the fasted state. $N = 5$. (F) The number of changed metabolites from the Volcano plot in metabolic pathways in the fasted state. (G) The number of common and sex-specific changes in RPE metabolites in response to fasting in fasted vs. fed in males or females respectively. (H) The number of changed RPE metabolites in male mice in response to fasting (I) The number of changed RPE metabolites in female mice in response to fasting. FC, fold change.

metabolites with approximately one-half of them overlapping (Fig. 2G, Supplementary Fig. S2, Supplementary Tables S6, S7). Like the retinas, ketone bodies and acylcarnitines were increased, whereas trigonelline and serine were decreased in both sexes in the fasted state (Figs. 2H, 2I, Supplementary Tables S6, S7). However, female RPE/choroid had more significant changes in TCA cycle metabolites and pantothenic acid than male RPE/choroid.

Sex Differences in Lens Metabolism

The PLSDA plot showed slight overlapping under the fed state but a clear separation of male and female

lens metabolites in the fasted state (Figs. 3A, 3D). Forty-five metabolites were different in the fed state and 28 under the fasted (Figs. 3B, 3E, Supplementary Tables S8, S9). Twenty-two metabolites were different between males and females, independent of metabolic states. The female lens had higher glucose but lower antioxidative metabolites, including cystine, glutathione, and ascorbic acid, than the male, suggesting that the female lens may be more vulnerable to oxidative stress (Figs. 3B, 3E, Supplementary Tables S8, S9). Fasting-induced changes of 20 metabolites in the male and 19 in the female, with 12 metabolites changed in both sexes (Fig. 3G, Supplementary Fig. 3, Supplementary Tables 10, 11). Like the retina and the RPE, fasting increased

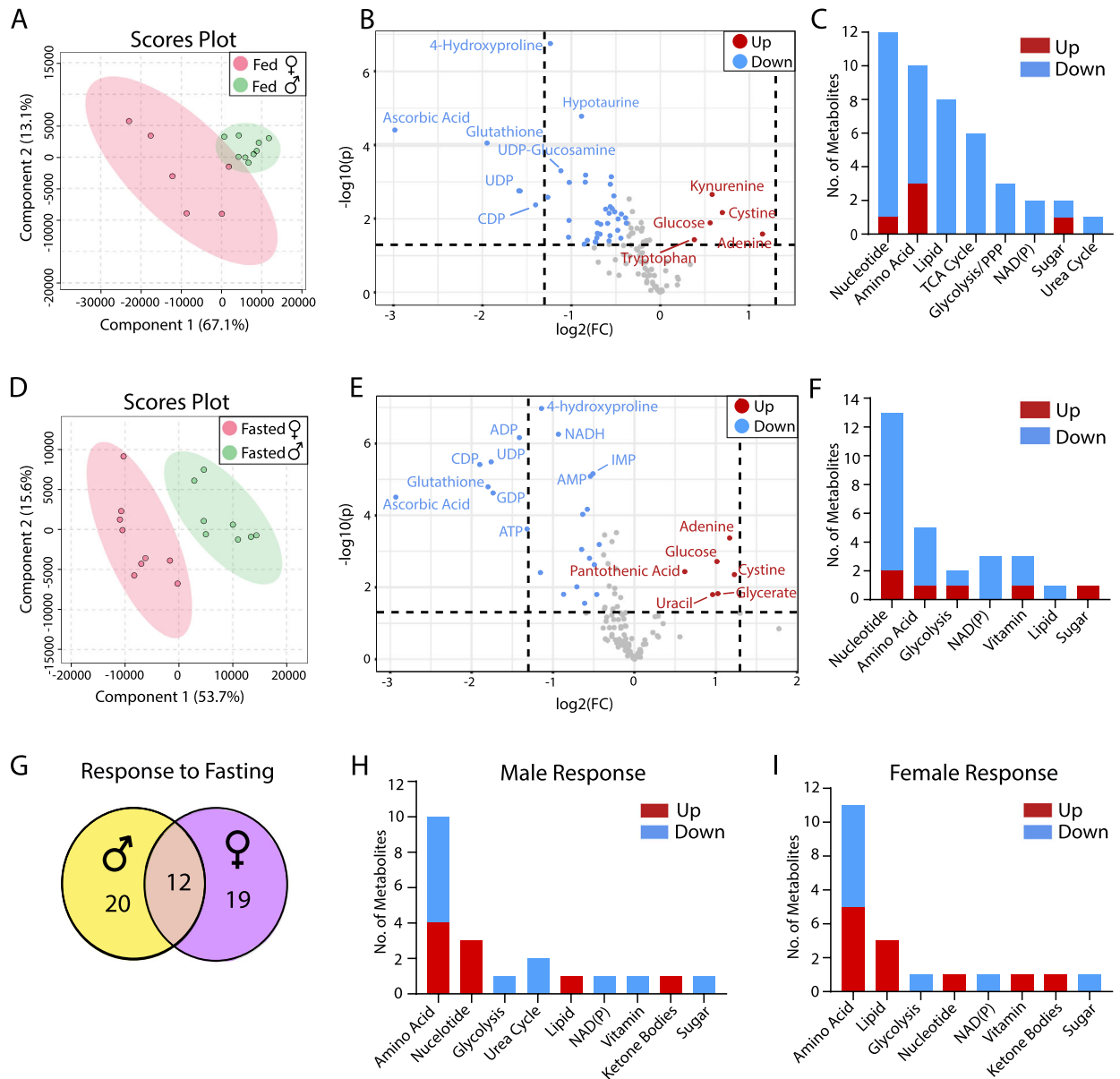


FIGURE 3. Sex differences in lens metabolites in fed and fasted states. **(A)** PLSDA plots of mouse lens metabolites from the fed state. **(B)** Volcano plot of lens metabolites in the fed state ($N > 6$). **(C)** The number of changed metabolites in metabolic pathways in the fed state. **(D)** PLSDA plots of mouse lens metabolites from the fasted state. **(E)** Volcano plot of lens metabolites in the fasted state ($N = 9$). **(F)** The number of changed metabolites from the volcano plot in metabolic pathways in the fasted state. **(G)** The number of common and sex-specific changes in lens metabolites in response to fasting in fasted versus fed in males or females, respectively. **(H)** The number of changed lens metabolites in male mice in response to fasting. **(I)** The number of changed lens metabolites in female mice in response to fasting. FC, fold change.

3-HB but decreased trigonelline and serine in the lens in both sexes. In the fasted lens, changed metabolites were primarily enriched in amino acid metabolism in both sexes. The male lens had more changes in nucleotide metabolism, while the female lens had more changes in lipid metabolism (Figs. 3H, 3I, Supplementary Tables S10, S11).

Sex Difference in Brain Metabolism

To decrease variation from different brain regions, we homogenized the whole brain to measure metabolites from the aliquot. PLSDA scores plot showed distinct separations of metabolites from male and female brains under either

fed or fasted states (Figs. 4A, 4D). Fourteen sex-different metabolites were in the fed state and 15 in the fasted state (Figs. 4B, 4E, Supplementary Tables S12, S13). Pantothenic acid was higher and hypotaurine was lower in the female brain, regardless of metabolic states. Strikingly, the sex-different metabolites were highly enriched in glucose metabolism including glycolysis and glycogen, in the fed state but not in the fasted state (Figs. 4C, 4F). The female brain was more sensitive to fasting than the male brain and had three times more changes in metabolites after fasting (Fig. 4G, Supplementary Fig. 4, Supplementary Tables S14, S15). Similar to eye tissues, 3-HB was increased and trigonelline decreased in both sexes in fasted brains.

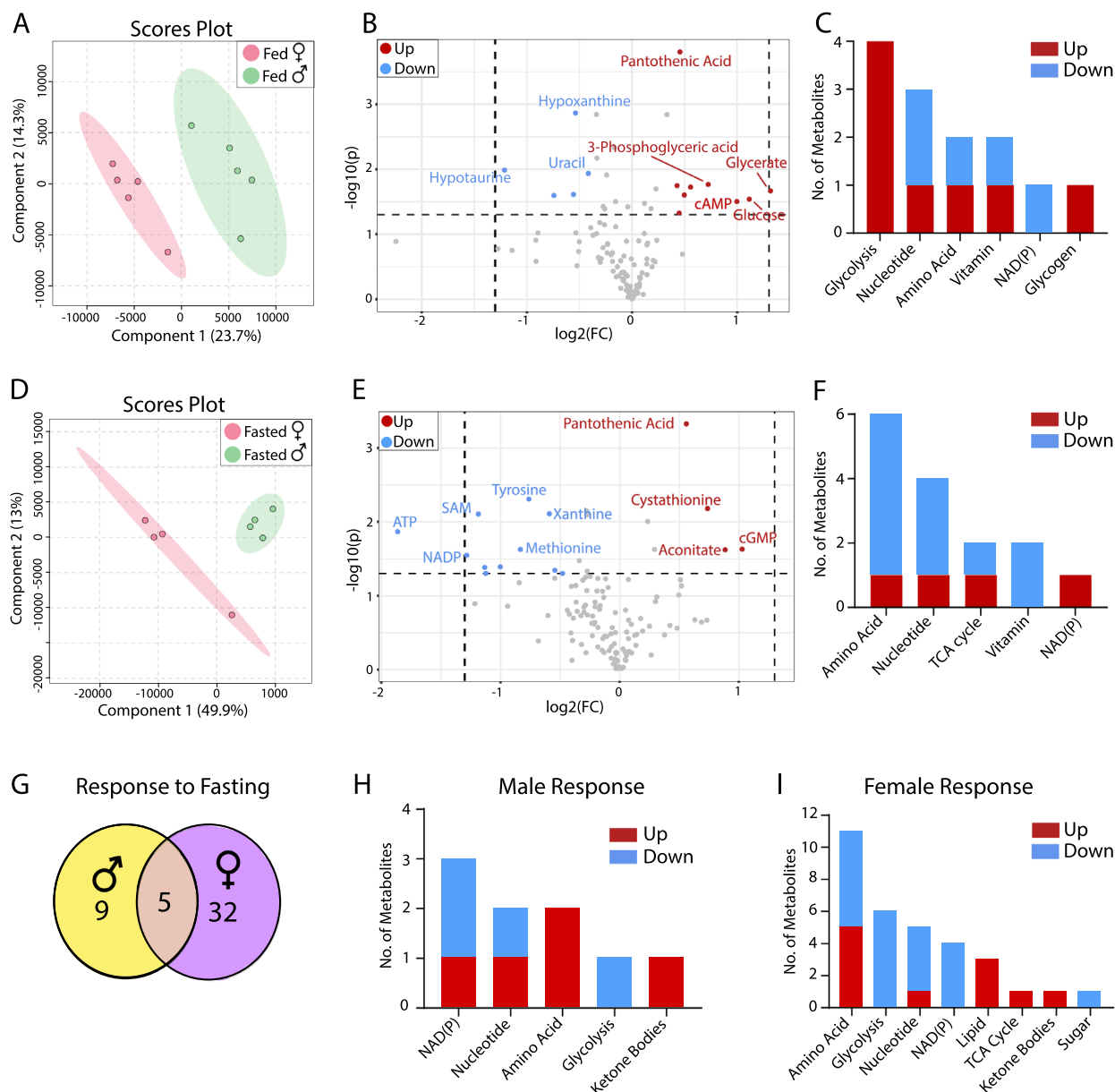


FIGURE 4. Sex difference in brain metabolites in fed and fasted states. **(A)** PLSDA plots of mouse brain metabolites from the fed state. **(B)** Volcano plot of retinal metabolites in the fed state ($N = 5$). **(C)** The number of changed metabolites in metabolic pathways in the fed state. **(D)** PLSDA plots of mouse brain metabolites from the fasted state. **(E)** Volcano plot of brain metabolites in the fasted state ($N = 4$). **(F)** The number of changed metabolites from the volcano plot in metabolic pathways in the fasted state. **(G)** The number of common and sex-specific changes in retinal metabolites in response to fasting in fasted versus fed males or females, respectively. **(H)** The number of changed retinal metabolites in male mice in response to fasting. **(I)** The number of changed retinal metabolites in female mice in response to fasting. FC, fold change.

However, the female brain had massive changes of metabolites in amino acid and glucose metabolism but not the male brain (Figs. 4H, 4I, Supplementary Tables S14, S15). These results suggest that the female brain is more sensitive to fasting and more flexible in fuel use than the male brain.

Sex Difference in Plasma Metabolites

We analyzed plasma metabolites to investigate whether the sex-different metabolites in the eye and brain are from the circulation. Scores plots showed minor overlapping between male and female plasma in the fed state but clear separation in the fasted state (Figs. 5A, 5D). Sex-different

metabolites from plasma were much less than those from the eye and brain, with nine and seven sex-different metabolites in the fed and fasted states, respectively (Figs. 5B, 5E). Like brain and eye tissues, pantothenic acid was higher in the female plasma in the fed state, suggesting that pantothenic acid is a common sex-different metabolite. We found 4-hydroxyproline, pyroglutamic acid, and aconitic acid to be lower in the female than male plasma in either fed or fasting states (Figs. 5B, 5E). Sex-different plasma metabolites were enriched in amino acid metabolism in both states, but the female plasma had overall more decreased metabolites than the male, especially in the fasted state (Figs. 5C, 5F). In response to fasting, female plasma had slightly more

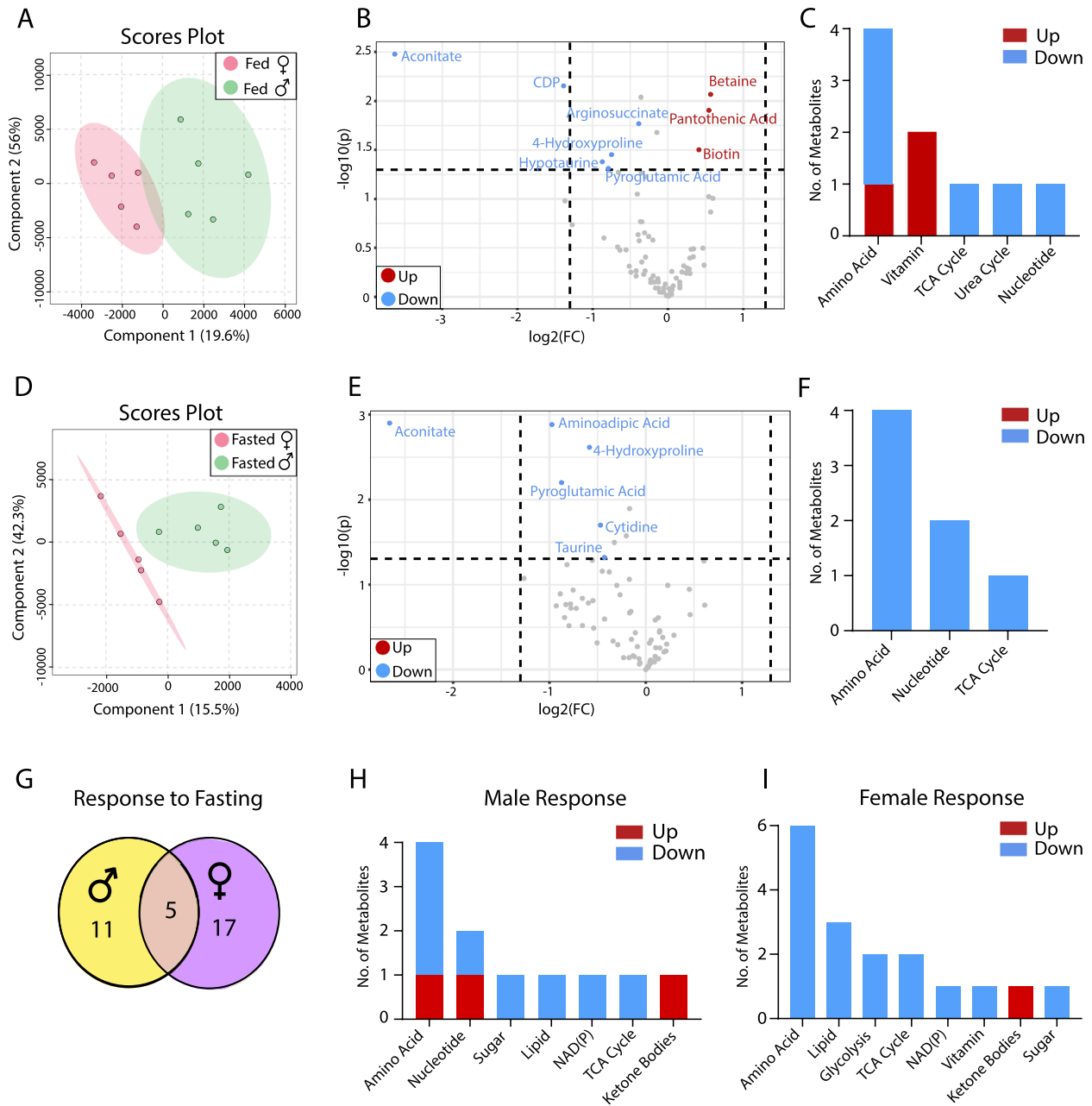


FIGURE 5. Sex difference in plasma metabolites in fed and fasted states. **(A)** PLSDA plots of mouse plasma metabolites from the fed state. **(B)** Volcano plot of plasma metabolites in the fed state ($N = 5$). **(C)** The number of changed metabolites in metabolic pathways in the fed state. **(D)** PLSDA plots of mouse plasma metabolites from the fasted state. **(E)** Volcano plot of plasma metabolites in the fasted state ($N = 5$). **(F)** The number of changed metabolites from the volcano plot in metabolic pathways in the fasted state. **(G)** The number of common and sex-specific changes in plasma metabolites in response to fasting in fasted versus fed males or females, respectively. **(H)** The number of changed retinal metabolites in male mice in response to fasting. **(I)** The number of changed plasma metabolites in female mice in response to fasting. FC, fold change.

changed metabolites than males, with less than half of overlapping changes (Fig. 5G). Plasma glucose was significantly decreased after fasting in the data from both glucometer and targeted metabolomics. However, there was no difference in males and females in either metabolic state (Supplementary Fig. S5, Supplementary Tables S16, S17). Similar to other tissues after fasting, 3-HB and trigonelline changed, demonstrating that these two metabolites are common fasting-sensitive metabolites (Fig. 5H, %I, Supplementary Fig. 6, and Supplementary Tables S16, S17). Both sexes were enriched in the changes of amino acid metabolism, but the female had more decreased metabolites after fasting (Fig. 5H, SI).

Overall, these results suggest that except for several metabolites such as pantothenic acid, 3-HB, and trigonelline, most of the sex-specific metabolic changes in the tissues may not directly from the systemic circulation.

Common and Tissue-Specific Metabolic Changes in Different Sexes

Thirty-two metabolites were commonly changed in two or more tissues and 64 metabolites were tissue-specific (Figs. 6A, 6B). There were more common and tissue-specific

the eye, suggesting an intrinsic connection between the eye and the brain.^{42,43} Our study also showed that eye tissues and the brain shared 13 sex-different metabolites. Pantothenic acid is higher in the female brain, eye, and plasma, suggesting it is a common sex-different metabolite. In a human adult metabolomics study, pantothenic acid is increased in the female urine.⁴⁴ Interestingly, pantothenic acid and CoA-dependent mitochondrial enzymes are decreased in brain regions of patients with Alzheimer's disease.^{45,46} However, dietary pantothenic acid intake is associated with increased cerebral amyloid β burden in patients with cognitive impairment.⁴⁷ It will be interesting to investigate the role of pantothenic acid in sexual dimorphisms in neurological diseases and their ocular symptoms.

Remarkably, the lens shows more overlapping changes with the brain, particularly in glucose metabolism, than with the neural retina and RPE. Recent studies showed extensive similarities between neurons and lens fiber cells in cell morphology and gene expression.^{48,49} Similar to the brain, lens metabolism highly depends on glucose and the deficiency of glucose transporter 1 in lens epithelium can lead to cataract formation.⁵⁰

Tissue-Specific, Sex-Different Metabolites

Sex hormones play critical roles in regulating energy metabolism by modulating substrate metabolism, the permeability of retina–blood and brain–blood barrier, transcriptional factor bindings, and epigenetic regulation.^{54,40,51–53} The different signaling of sex hormones in the retina, RPE, lens, and brain regions^{52,54,55} may lead to differential gene expressions and nutrient availability. The differential expression of genes from sex chromosomes, sex-different sensitivity to insulin and different levels of adipokines can also contribute to tissue-specific metabolism in different metabolic states.^{56–59}

The retina is metabolically demanding to maintain active visual transduction and renew daily shed outer segments.^{23,60} The retina primarily uses glucose but also prefers glutamate and aspartate for its metabolism.^{22,36} Female retinas have higher availability of amino acids including aspartate, short-chain acyl-carnitines, and metabolites in NAD(P)(H) metabolism, probably accounting for much fewer metabolite changes upon fasting compared with the male retinas. It remains to be determined the mechanisms that cause the higher nutrient availability in the female retina and their implications in the sex difference in retinal physiology and diseases.

Unlike the neural retina, RPE shows lower levels of metabolites in the female under both fed and fasted states. These decreased metabolites are mainly amino acids (histamine, taurine, carnosine, creatinine and beta-alanine) and mitochondrial intermediates (acetyl-CoA, succinate). Taurine, carnosine, and its precursor beta-alanine have beneficial antioxidant properties.^{61,62} A decrease in these amino acids may predispose the female RPE to oxidative damage. Consistently, female mice show more severe RPE damage and decreased retinal thickness under oxidative damage induced by sodium iodate.^{63,64} RPE mitochondria prefer to oxidize succinate from the retina to produce malate and fumarate for the retina.^{65–67} However, succinate is lower in the female RPE under both fed and fasted states. The female RPE may import less succinate from the retina and circulation or oxidize more succi-

nate, resulting in sex differences in RPE mitochondrial metabolism.

The lens has the greatest number of sex-different metabolites among eye tissues. Except for cystine and adenine, most the changed metabolites, including mitochondrial intermediates, purine metabolites, acyl-carnitines, and amino acids, were lower in the female lens. Mouse lens transcriptome shows the sex-different gene expression in mitochondrial metabolism, amino acid transport, and acyl-CoA metabolism.⁶⁸ Lens mitochondria exist only in anterior epithelial cells, providing approximately 30% of the energy for the entire lens.⁶⁹ The lens epithelial cells are critical to maintaining lens transparency through nutrient transport, metabolism, and synthesis. The dysfunction of lens epithelial cells can lead to female-prevalent cataracts.¹⁰ In human donor eyes, the female has a greater epithelial cell density than the male.⁶ The lens metabolism relies on nutrients from the aqueous humor. There are significant sex differences in human aqueous humor proteome and protein.^{70,71} However, sex-different metabolites in aqueous humor remain unclear; most aqueous humor metabolomics are sex matched without an analysis of the sex differences.^{72,73} Further studies on the metabolites of lens epithelial cells and aqueous humor will help understand the sex difference in lens metabolism and its implications in cataracts.

Our results show that the female brain has a more sensitive glucose metabolism in different metabolic states, which may be implicated in the sex differences in brain metabolism, physiology, and diseases. The brain relies on glucose as its primary source of energy. Human studies with positron emission tomography show that young women have higher cerebral blood flow and glycolysis than men.^{74,75} Aerobic glycolysis is positively correlated with brain aging,⁷⁶ and the adult female brain shows a few more years of metabolic youthfulness than the male.⁷⁴ However, this metabolic youthfulness starts to disappear in cognitively impaired patients such as Alzheimer's disease, probably owing to a higher rate of decline in glucose metabolism in female patients.⁷⁷ Both human studies and animal models also show that one of the earliest signs of Alzheimer's disease is a decrease in cerebral glucose metabolism, and the disturbed glucose metabolism is associated with disease progression.⁷⁸ These findings are consistent with our results that the female brain has higher glycolytic metabolites in the fed state and more sensitive in changes of glucose metabolism to nutritional stress, suggesting that early intervention to glucose metabolism may be important in the female under stressed conditions such as neurological diseases.

In conclusion, our findings demonstrate substantial sex differences in metabolic profiles in different eye tissues, supporting the urgent need to include animals and humans of both sexes in eye metabolomics research. We also find similarities in sex-different metabolites between the eye and brain, supporting that eye metabolomics can serve as an important window to reflect brain metabolism and diseases.

Acknowledgments

Supported by National Institutes of Health Grant EY031324 (JD), EY032462(JD), Bright Focus Foundation M2020141 (JD), the Retina Research Foundation (JD) and funds for Core

facilities P20 GM103434 and P20 GM144230 (WV INBRE grant). The funders had no role in the study design, data collection and analysis, decision on publishing, or manuscript preparation.

Disclosure: **M. Saravanan**, None; **R. Xu**, None; **O. Roby**, None; **Y. Wang**, None; **S. Zhu**, None; **A. Lu**, None; **J. Du**, None

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