# Metabolomics in Glaucoma: A Systematic Review

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**M**ETHODS. We searched PubMed and Web of Science for metabolomics studies of humans on glaucoma published before November 11, 2020. Studies were included if they assessed the biomarkers of any types of glaucoma and performed mass spectrometry-based or nuclear magnetic resonance–based metabolomics approach. Pathway enrichment analysis and topology analysis were performed to generate a global view of metabolic signatures related to glaucoma using the MetaboAnalyst 3.0.

**R**ESULTS. In total, 18 articles were included in this review, among which 13 studies were focused on open-angle glaucoma (OAG). Seventeen metabolites related to OAG were repeatedly identified, including seven amino acids (arginine, glycine, alanine, lysine, methionine, phenylalanine, tyrosine), two phosphatidylcholine (PC aa C34:2, PC aa C36:4), three complements (acetylcarnitine, propionylcarnitine, butyrylcarnitine), carnitine, glutamine, hypoxanthine, spermine, and spermidine. The pathway analysis implied a major role of amino metabolism in OAG pathophysiology and revealed the metabolic characteristics between different biological samples.

**C**ONCLUSIONS. In this review, we summarize existing metabolomic studies related to glaucoma biomarker identification and point out a series of metabolic disorders in OAG patients, providing information on the molecular mechanism changes in glaucoma. Additional studies are needed to validate existing findings, and future research will need to explore the potential overlap between different biological fluids.

Keywords: glaucoma, metabolomics, potential biomarkers, metabolic pathways

G laucoma is a main cause of irreversible blindness, contributing to about 12% of all global blindness.<sup>1</sup> It is estimated that the global prevalence of glaucoma in adults aged 40 to 80 years is 3.54%.<sup>2</sup> The number of people with glaucoma worldwide is projected to increase to 111.8 million in 2040, disproportionally affecting Asians and Africans.<sup>2</sup> Disease risk factors, such as increasing age, elevated intraocular pressure, inflammation, high myopia, and family history have been reported to be associated with glaucoma.<sup>3,4</sup> However, glaucoma is generally asymptomatic at early stages and always leads to severe vision impairment at advanced stages. Thus identifying biomarkers for early diagnosis of glaucoma or new therapeutic targets is critical to reducing the risk of visual impairment and blindness from the disease.<sup>5,6</sup>

Metabolomics is the study of metabolic products that all cellular processes leave behind in a biological sample<sup>7</sup> and could be used as a complement to the currently available diagnostic, classification, and progression detection tools.<sup>8</sup> In the past few years, metabolomics has been proved to be useful in the area of biomarker discovery for diseases including cancers, cardiovascular diseases, and endocrine diseases.<sup>9–12</sup> In ophthalmology, metabolomics has

been applied to investigate metabolic signatures and potential biomarkers for various eye diseases as well,<sup>13-15</sup> and exploratory studies have suggested metabolic alterations in vitamin metabolism, fatty acid oxidation, and glutaminolysis in patients with glaucoma.<sup>16-18</sup> However, the current application of glaucoma metabonomics research is limited by the sample size of the study, the lack of validation of results, the evaluation of long-term markers, and time-efficient and costeffective analysis techniques. We conducted this systematic review to summarize the current metabolic profiles of glaucoma in humans and to find potential glaucoma biomarkers. Although the values of many differential metabolites and metabolic pathways are not completely confirmed, the results may be helpful for understanding the disease pathophysiology, as well as developing target-based drugs and susceptibility biomarkers for diagnostic applications for this vision-threatening eye disease.

# METHODS

## Search Strategy

We performed a systematic search of electronic databases such as PubMed and Web of Science to identify

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FIGURE 1. Flow chart of the study screening.

metabolomics studies on glaucoma published before 11st November 2020 using the keywords: "metabolomics" or "metabonomics" or "metabolic profiling" or "metabolic profiles" or "metabolic biomarkers" or "metabolome" and "glaucoma." Additional sources were obtained from the reference lists of the included literature. All articles, including those obtained from electronic databases and through cross-referencing, were independently searched and scanned by two authors (Y.W. and X.W.H.) to determine their suitability for inclusion in the review. Disagreements were addressed by discussion with a senior author (C.W.P.).

#### **Inclusion and Exclusion Criteria**

Studies were eligible for inclusion if they assessed the biomarker of any types of glaucoma and performed mass spectrometry (MS)-based or nuclear magnetic resonance (NMR)-based metabolomics approach on human beings. We excluded animal studies, vitro model studies, review articles, abstracts without full texts, and the reports of drug therapy response and other experiments. Moreover, only literature published in English was considered.

#### **Quality Assessment**

Based on QUADOMIC described by Lumbreras et al.,<sup>19</sup> the quality of the studies was assessed with a 16-item scale. The criteria include sample characteristics, differential conditions in preanalytical, clinical, and physiological characteristics of research subjects, and overfitting during research and analysis. Studies achieved with 70% or more scores were included in this review.

#### **Data Extraction and Pathway Analysis**

A review of the findings of studies included in the final list of the sources was performed, including study subjects and their essential information (i.e., age, gender ratio, and study area), the types of glaucoma, biological samples, detection and analysis platforms, sample size, and creating a summary of major metabolites they concluded. The pathway analysis was derived from integrating of metabolites from different biological sample sources using the MetaboAnalyst software (version 3.0) on the basis of Kyoto Encyclopedia of Genes and Genomes and Human Metabolome Database. Studies with negative results were excluded from pathway analysis.

# RESULTS

#### **Characteristics of the Included Studies**

Eighteen studies were identified on the basis of the inclusion and exclusion criteria.<sup>17,18,20-35</sup> The flow chart for selection of the studies included in this review is shown in Figure 1. All the studies were designed as case-control studies with the sample sizes ranging from 19 to 506. Among the 18 studies, 13 focused on open-angle glaucoma (OAG),<sup>17,20-31</sup> two treated any glaucoma as cases,<sup>18,35</sup> and the other three investigated primary angle-closure glaucoma (PACG), primary congenital glaucoma (PCG), and pseudoexfoliation glaucoma, respectively.32-34 Among the 13 studies on OAG, four were performed with aqueous humor (AH) samples,<sup>20-23</sup> three with serum samples,<sup>24-26</sup> three with plasma samples,<sup>17,27,28</sup> and the other three with tear samples,<sup>29</sup> occipital brain region,<sup>30</sup> and optic nerve,<sup>31</sup> respectively. Characteristics of the studies are summarized in Table 1.

TABLE 1. Basic Characteristics of Literature Included

					Mean Age, Year	F/M Case/
First Authors (Year)	Country	Case (n)	Co ntrol (n)	Sample	Case/Control	Control
Cabrerizo (2017) <sup>20</sup>	Spain	OAG (10)	Myopia (10)	AH	68.8:55.9	6/4:6/4
Buisset (2019) <sup>21</sup>	France	POAG (26)	Cataract (26)	AH	74.69:74.92	12/14:12/14
Myer (2020) <sup>22</sup>	USA	POAG (23)	Cataract (35)	AH	73.74:70.71	3/20:0/35
Pan (2020) <sup>23</sup>	China	POAG (16)	Cataract (24)	AH	72.5:74.2	9/16:15/9
Burgess (2015) <sup>24</sup>	USA	POAG (72)	Healthy (72)	Plasma	67.8:68.5	45/27:41/31
Leruez (2018) <sup>25</sup>	France	POAG (36)	Cataract (27)	Plasma	72.00:73.04	21/15:12/15
Kouassi Nzoughet (2019) <sup>26</sup>	France	POAG (34)	Cataract (30)	Plasma	_	_
Javadiyan (2012) <sup>27</sup>	Australia	POAG (211)	Healthy (295)	Serum	78:76	100/111:160/135
Umeno (2019) <sup>17</sup>	Japan	POAG (198)	Control (119)	Serum	70.4:70.6	106/92:83/36
Gong (2020) <sup>28</sup>	China	POAG (30)	Healthy (30)	Serum	54.77:53.80	16/14:16/14
Rossi (2019) <sup>29</sup>	Italy	POAG (16)	Healthy (17)	Tear	64.63:61.53	9/7:10/7
Boucard (2007) <sup>30</sup>	Netherlands	POAG (7)	Control (12)	Occipital brain region	73:62	1/6:4/8
Sidek (2016) <sup>31</sup>	USA	Mild POAG (15) Severe POAG (15)	Healthy (15)	ON	64.9&69.7:53.9	9/6&6/9:3/12
Rong (2017) <sup>32</sup>	China	PACG (38)	Healthy (48)	Serum	60.45:60.25	19/19:24/24
Chen (2019) <sup>33</sup>	China	PCG (30)	Cataract (20)	AH	_	_
Myer (2020) <sup>34</sup>	USA	PEXG (31)	Cataract (25)	AH	_	_
Barbosa Breda (2020) <sup>35</sup>	Belgium	Glaucoma (54)	Cataract (29)	AH	71:75	38/16:16/13
Doganay (2012) <sup>18</sup>	USA	Glaucoma (29)	Healthy (13)	LGB & Vitreous body	65.8:62.8	13/16:7/6

PACG, primary angle-closure glaucoma; PEXG, pseudoexfoliation glaucoma; PCG, primary congenital glaucoma; ON, optic nerve; LGB, lateral geniculate body.

#### **Quality of the Included Studies**

The results of the quality assessment on studies that have identified significant differential metabolites using the QUADOMICS tool are shown in Supplementary Table S1. All these diagnostic studies assessed using QUADOMICS in this systematic review were phase I. Thirteen studies presented clear inclusion and exclusion criteria for study subjects.<sup>17,20–25,27,28,32–35</sup> Five studies failed to provide clinical and physiological factors in detail.<sup>22,23,25,33,34</sup> Ten studies described their approach in dealing with overfitting.<sup>17,20–23,25–27,34,35</sup>

#### Metabolic Biomarkers Identified for Glaucoma

All studies included in this review clearly described the analytical platforms on which the studies were performed and the changes of significant differential metabolites identified. Thirteen studies on OAG applied MS analytical platforms, consisting of eight studies using liquid chromatogram-mass spectrometry (LC-MS),<sup>17,20,21,24-27,29</sup> two studies using gas chromatography mass spectrometry (GC-MS),23,28 and one study using LC-MS combined with NMR platform.<sup>22</sup> In addition, two studies performed magnetic resonance spectroscopy examination by placing region of interest into occipital brain region<sup>30</sup> and optic nerve,<sup>31</sup> respectively. Rong et al.<sup>32</sup> and Chen et al.<sup>33</sup> adopted GC-MS to study the metabolomics on primary angle-closure glaucoma and primary congenital glaucoma, respectively, whereas Barbosa Breda et al.<sup>35</sup> and Doganay et al.<sup>18</sup> chose NMR and magnetic resonance spectroscopy as the identification method for any glaucoma, respectively. In addition, Myer et al.<sup>34</sup> concerned the metabolic portrait of pseudoexfoliation by a combination of LC-MS and NMR. Reported alterations in the levels of some metabolites in glaucoma that could be potential candidate biomarkers for clinical practice are summarized in Supplementary Table S2, and the available fold-changes for differential metabolites of glaucoma to controls are listed in Supplementary Table S3. In total, 144 differential metabolites were extracted from 18 included studies.

Seventeen high-frequency (reported twice or more) differential metabolites extracted from 11 studies on OAG<sup>17,20-29</sup> are displayed in Table 2. Arginine is the most significant metabolite that has been repeatedly reported up to four times,<sup>22,25,26,29</sup> followed by glycine, which is reported with three hits.<sup>21,22,28</sup> However, their changing orientation had some disagreements in different biological samples. The increasing of butyrylcarnitine (C4), lysine, propionylcarnitine (C3), PC aa C34:2 and PC aa C36:4, and the decreasing of phenylalanine, spermine, and spermidine were consistently observed in different studies. Also, alanine, acetylcarnitine (C2), carnitine, glutamine, hypoxanthine, methionine, and tyrosine, which were hit in two studies, are important differential metabolites. Rong et al.<sup>32</sup> compared the predictive performance using palmitoleic acid, linoleic acid, gammalinolenic acid, arachidonic acid and four combined metabolites, which generated area under receiver operating characteristic values of 0.724, 0.742, 0.797, 0.673, and 0.867, respectively. Leruez et al.<sup>25</sup> used metabolites with the most important coefficients obtained with the least absolute shrinkage and selection operator method to distinguish cases and control, which exhibited an area under receiver operating characteristic of 95.71% in the training set and 91.78% in the validation set.

#### **Pathway Analysis**

We integrated the metabolomic information of 11 studies on OAG<sup>17,20-29</sup> and detailed information of the pathways enriched at the significance level of 0.05 is presented in Supplementary Tables S4, S5, S6 and S7. In this analysis, 52, 24, nine, and nine differential metabolites, which were reported in AH, plasma, serum and tear, respectively, were imported to MetaboAnalyst for pathway enrichment analysis and pathway topology analysis to generate a global view of metabolic signatures of OAG. As a result, 11 metabolic pathways related to AH were significantly enriched, including taurine and hypotaurine metabolism; glycine, serine, and threonine metabolism; and alanine, aspartate, and glutamate metabolism (Fig. 2). In terms of studies using plasma samples, four metabolic pathways, including sphingolipid metabolism, arginine and proline metabolism, and betaalanine metabolism were significantly enriched (Fig. 3). Meanwhile, glutathione metabolism, glyoxylate and dicar-

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Metabolite Name	HMDB ID	Hits	<b>Biological Samples to Be Analyzed</b>	
Arginine	HMDB0000517	4	( $\uparrow$ ): AH <sup>22</sup> , Plasma <sup>25,26</sup> ; ( $\downarrow$ ): Tear <sup>29</sup>	
Glycine	HMDB0000123	3	( $\uparrow$ ): AH <sup>21,22</sup> ; ( $\downarrow$ ): Serum <sup>28</sup>	
Alanine	HMDB0000161	2	( $\uparrow$ ): AH <sup>21</sup> ; ( $\downarrow$ ): Tear <sup>29</sup>	
Acetylcarnitine	HMDB0000201	2	( $\uparrow$ ): AH <sup>21</sup> ; ( $\downarrow$ ): Tear <sup>29</sup>	
Butyrylcarnitine	HMDB0002013	2	( $\uparrow$ ): AH <sup>21</sup> , Plasma <sup>25</sup>	
Carnitine	HMDB0000062	2	( $\uparrow$ ): AH <sup>21</sup> ; ( $\downarrow$ ): Tear <sup>29</sup>	
Glutamine	HMDB0000641	2	$(\uparrow)$ : AH <sup>21</sup> ; $(\downarrow)$ : AH <sup>22</sup>	
Hypoxanthine	HMDB0000157	2	( $\uparrow$ ): Plasma <sup>26</sup> ; ( $\downarrow$ ): Serum <sup>28</sup>	
Lysine	HMDB0000182	2	$(\uparrow)$ : AH <sup>22</sup> , Serum <sup>28</sup>	
Methionine	HMDB0000696	2	( $\uparrow$ ): Plasma <sup>25</sup> ; ( $\downarrow$ ): Tear <sup>29</sup>	
Propionylcarnitine	HMDB0000824	2	( $\uparrow$ ): AH <sup>21</sup> , Plasma <sup>25</sup>	
PC aa C34:2	HMDB0007880	2	$(\uparrow)$ : AH <sup>21</sup> , Plasma <sup>25</sup>	
PC aa C36:4	HMDB0007982	2	$(\uparrow)$ : AH <sup>21</sup> , Plasma <sup>25</sup>	
Phenylalanine	HMDB0000159	2	$(\downarrow)$ : AH <sup>22</sup> , Tear <sup>29</sup>	
Spermine	HMDB0001256	2	$(\downarrow)$ : AH <sup>21</sup> , Plasma <sup>25</sup>	
Spermidine	HMDB0001257	2	$(\downarrow)$ : Plasma <sup>25</sup> , AH <sup>23</sup>	
Tyrosine	HMDB0000158	2	( $\uparrow$ ): Plasma <sup>25</sup> ; ( $\downarrow$ ): Tear <sup>29</sup>	



FIGURE 2. Pathway analysis for significant metabolites of OAG using AH.

boxylate metabolism, aminoacyl-tRNA biosynthesis, and biotin metabolism were significantly enriched in studies using serum (Fig. 4). Regarding the analysis performed in metabolites identified in tear samples, five metabolic pathways were significantly enriched, among which phenylalanine, tyrosine, and tryptophan biosynthesis showed the greatest impacts (Fig. 5).

Notably, aminoacyl-tRNA biosynthesis was significantly enriched in all four biological samples. Also, we observed arginine and proline metabolism consistently enriched in AH, plasma, and tear samples. In addition, we found three pathways (glutathione metabolism, glyoxylate and dicarboxylate metabolism, and biotin metabolism) significantly enriched in both AH and serum samples, and valine, leucine, and isoleucine biosynthesis pathway were significantly enriched in both AH and tear samples.



FIGURE 3. Pathway analysis for significant metabolites of OAG using plasma.

### DISCUSSION

In this review, we summarized 15 metabolomics studies on glaucoma and took a look at the profiling of valuable metabolic pathways of OAG. As a result, 17 metabolites identified in at least two studies were listed to be highfrequency differential metabolites of OAG, and arginine is the most promising metabolic biomarker with the highest rate of repetition. In the pathway analysis, we found some metabolism pathways that were significantly enriched in different samples, suggesting a series of metabolic dysregulations in OAG patients. Considering that glaucoma remains a disorder with limited therapeutic options, the findings of this review contribute to the further understanding of the molecular characteristics of disease, which will contribute to the understanding of disease mechanisms.



FIGURE 4. Pathway analysis for significant metabolites of OAG using serum.



FIGURE 5. Pathway analysis for significant metabolites of OAG using tear.

# Metabolic Dysregulations Implicated in OAG Pathogenic Mechanisms

According to the 17 high-frequency differential metabolites and the 24 significantly enriched metabolism pathways, amino acid dysregulation was the most prominent feature of OAG. Arginine is an important integral in the pathway of arginine and proline metabolism, which has been reported to be involved in the nitric oxide production pathway. Nitric oxide is an essential antioxidant, regulating AH dynamics, ocular blood flow, neuronal visual processing, and the apoptosis of retinal ganglion cell death.<sup>36,37</sup> In addition, the disor-

der of spermidine and spermine may be the reason for the disorder of methionine and arginine, as they are both precursors of the biosynthesis of spermidine and spermine. Previous reports have already identified the role of spermidine and spermine as a metabolic regulator of mitochondria with regard to apoptosis and the mitochondrial membrane potential and one of the central elements of the POAG signature.<sup>25,38</sup> Likewise, glycine was also identified as a highfrequency biomarker. A few studies have revealed that the level of glycine is associated with neurotransmission on the retina, and the dual effect of glycine in both inhibitory and excitatory neurotransmission is based on the precise regulation of its extracellular concentration.39,40 Moreover, it was also indicated that glycine could participate in cell oxidative stress by inducing lipid peroxidation and decreasing glutathione concentrations.<sup>41</sup>

Biotin metabolism was also shown to be crucial for the development of OAG. As a cofactor for five carboxylases, biotin is thought to be involved not only in fatty acid biosynthesis, gluconeogenesis, and catabolism of amino acids and fatty acids<sup>42</sup> but also in the maintenance of the normal structure and function of mitochondria.43 Chronic complement activation has been suggested to be a significant feature seen in glaucoma.44 This is consistent with our results that C2, C3, and C4, which are the activating unit of complements, were repeatedly identified in different studies. In addition, although aminoacyl-tRNA biosynthesis was significantly enriched in the four biofluids, its biological interpretation is still obscure. The mechanism of this metabolism pathway in the development of glaucoma might be related to the regulatory role of aminoacyl-tRNA synthetases in both cytosolic and mitochondrial translation.44

# Metabolic Changes Among Different Biological Samples

The levels of differential metabolites showed differences in the direction of change in different samples. According to our summary, the high-frequency metabolites of AH have always tended to change in the opposite direction to tears. According to the analysis of Csosz et al.,46 tear was different from AH in terms of the proinflammatory mechanism point of view, so that tear could not substitute for aqueous humor for diagnostic purposes. Interestingly, even in blood samples, the differential metabolites in plasma were not identical to that in serum. Several metabolites, including amino acids, glycerophospholipids, lipoproteins, and energy pathway metabolites, have been reported to be distinguished in the serum and plasma samples.<sup>47–49</sup> It might be explained by the influence of distinct collecting methods, different biochemical processing, and different constituents such as platelet-derived metabolites.49 However, it is well known that some circulating metabolites and eye metabolites could be connected either through the blood retina barrier or through sharing common mechanisms, such as by the same enzymes. AH is a transparent fluid present in the anterior chamber of the eye that provides nutrition and eliminates the metabolic waste moving from the eye to the blood by circulating through the vascular and lymphatic systems. This could partly explain the great synchronous variation trend of high-frequency differential metabolites from AH and plasma.

Biofluid testing is a less-damaging diagnostic method, compared to histological testing. Among the commonly used biofluids in ophthalmology, AH is perhaps the most closely linked to the pathological tissue and thus could provide information on normal and pathological conditions. However, AH is usually collected during an invasive eye surgery, which has a risk of complications (e.g., persistent diplopia and corneal edema),<sup>50</sup> preventing its application for the purpose of screening or follow-up. Blood is also a valuable biological sample for metabolomics because it is easy to collect, and plasma seems to be highly reproducible.<sup>51</sup> In addition, tears provide a more available and noninvasive choice for collection, although the sampling procedure still needs to improve. In all, because these different biological samples possess both shared and unique components, these differences may be an important consideration for biofluid selection and metabolite identification in metabolic phenotyping studies.

# Clinical Implications of Glaucoma Using Metabolomics

Glaucoma is an age-related disease that seriously threatens the vision of the elderly. In light of the growing number of senior citizens in many countries, the disease burden of glaucoma is increasing, and a large proportion of this population has undetected or untreated glaucoma.<sup>52,53</sup> Tang et al.54 performed decision-analytic Markov models to evaluate costs and benefits of glaucoma screening and found that community-based screening for glaucoma is likely to be costeffective in both urban and rural settings.<sup>54</sup> Metabolomics provides a promising method of analyzing accessible biological samples for the investigation of glaucoma biomarkers in predictive, preventive, and personalized medicine. The advancements of NMR and MS have enabled us to detect more and more metabolites and thus helped us obtain a comprehensive view on the metabolic changes in glaucoma. Meanwhile, the increasing understanding of metabolism pathways could promote an understanding of the mechanisms of glaucoma disease. Although lowering the intraocular pressure is regarded as the most efficacious and acceptable form of treatment,<sup>55</sup> there are other mechanisms that might lead to glaucoma. Besides, the interaction between many natural substances and specific metabolic pathways could arouse the emerging of drug discovery and adjuvant therapy for treatment of glaucoma.56

#### **Limitations and Future Direction**

The current reports of metabolic alterations serve significant clues to the early diagnostic capabilities. However, several limitations of the existing metabolomics studies on glaucoma should be addressed. First, different researches chose differential metabolites using different methods, including metabolomics technologies and statistical analysis, resulting in difficulty in replication and bias in the identification of potential biomarkers. Second, most studies did not provide quantitative information on metabolites, so we couldn't integrate the changes in metabolite concentration associated with glaucoma risk here. Third, all the studies included were cross-sectional, thus limiting the power of verifying causal relationships between differential metabolites and glaucoma. Fourth, most studies focused on OAG, and there is a lack of data on other types of glaucoma.

Application of metabolomics on glaucoma is a field that can benefit enormously from personalized medicine.<sup>1</sup> However, the development of glaucoma metabolomics has sadly lagged behind compared to other fields such as oncology. More studies, especially longitudinal cohort metabolomics and clinical intervention metabolomics studies, should be carried out to explore novel biomarkers of glaucoma and determine target metabolic pathways for prevention and treatment. Besides, we should pay more attention to the potential overlap or interaction of metabolism in different biological samples to enhance our understanding of the complex mechanisms underpinning glaucoma pathology. Furthermore, integrating metabolomics with other omics platforms, including genomics, transcriptomics, and proteomics, will provide services for precision medicine.

#### **CONCLUSIONS**

To sum up, several metabolites and metabolic pathways have been indicated to be associated with OAG in this review. These high-frequency differential metabolites are promising to as biomarkers of OAG for early diagnosis, and the prominent metabolic pathway may provide new idea for the explanation of the pathogenesis and the discovery of new therapeutic targets. However, applying these potential biomarkers to clinical diagnosis and treatment is still a challenge for us. More validation studies with larger numbers of cases are warranted to confirm the findings and exploring the potential overlap between different biofluids. Moreover, metabolomics studies on other glaucoma subtypes should be encouraged to make a precise signature for glaucoma detection and treatment.

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