

# Network Pharmacology Combined with Transcriptional Analysis to Unveil the Biological Basis of Astaxanthin in Reducing the Oxidative Stress Induced by Diabetes Mellitus

This article was published in the following Dove Press journal:  
*Diabetes, Metabolic Syndrome and Obesity: Targets and Therapy*

Xueliang Sun<sup>1,2</sup>  
Yanbin Ji<sup>2</sup>  
Ayesha Tahir<sup>3</sup>  
Jun Kang<sup>1</sup>

<sup>1</sup>School of Life Sciences, Tianjin University, Tianjin 300072, People's Republic of China; <sup>2</sup>Tianjin Key Laboratory of Aquaecology and Aquaculture, College of Fisheries, Tianjin Agricultural University, Tianjin 300384, People's Republic of China; <sup>3</sup>Department of Biosciences, COMSATS University Islamabad, Islamabad 45550, Pakistan

Correspondence: Ayesha Tahir  
Department of Biosciences, COMSATS  
University Islamabad, Park Road, Islamabad  
45550, Pakistan  
Email [ayesha.tahir@comsats.edu.pk](mailto:ayesha.tahir@comsats.edu.pk)

Jun Kang  
School of Life Sciences, Tianjin University, 92  
Weijin Road, Nankai District, Tianjin  
300072, People's Republic of China  
Tel +86-22-2740-1060  
Email [jun.kang@tju.edu.cn](mailto:jun.kang@tju.edu.cn)

**Purpose:** Astaxanthin (Ast) has been reported to reduce oxidative stress induced by diabetes mellitus (DM). The aim of this research was to give a systematic overview of the biological basis for this process.

**Methods:** Ast-targeted proteins were collected from the BATMAN database, Comparative Toxicogenomics Database, and STITCH database. Putative DM-related protein targets were collected from the GeneCards database. A DM-rat model was then built with streptozotocin (STZ) combined with a high-sugar, high-fat diet for 30 days. Total cholesterol (TC), triglycerides (TGs), and insulin levels were examined using whole tail-vein blood from overnight-fasted rats. SOD, GSH, and MDA activity was detected in liver tissue ( $p < 0.05$ ). In addition, we used RNA-sequencing analysis to detect gene-transcription level in liver tissue of rats and GO biological process analysis to show all the  $\log_2FC \geq 2$  genes in the Ast-fed DM rats compared with the DM group using the STRING database. Ast-intersecting targets were collected with Venn analysis. Docking analysis between Ast and targeted proteins was done with the SwissDock server. Ast targets–pathway networks were built using Cytoscape 3.7.2 software.

**Results:** A total of 120 Ast-targeted proteins and 13,784 DM-related targets were collected. Ast functioned in reducing TC, TG, and MDA levels, promoting SOD activity and GSH expression, and alleviating islet-cell injury in Ast-fed DM rats compared with DM control rats. Furthermore, genes involved in MAPK, TNF, AMPK, and FOXO signaling pathways were differently expressed in Ast-treated DM rats compared with DM rats. The differentially expressed genes were enriched in euchromatin, thyroid cancer, and metaphase-plate congression. Three Ast-intersecting targets — Col5A1, Nqo1, and Notch2 — were then identified. We found possible binding patterns of Ast with Nqo1 and Notch2, respectively. Ast targets–pathway networks were finally built to show a systematic overview of how Ast works in multiple pathways to reduce oxidative stress. Taken together, Ast is predicted to target Col5A1, Nqo1, and Notch2 to form a network of systemic pharmacological effects to: 1) promote insulin-releasing balance and relieve insulin resistance, 2) reduce testicular cell apoptosis, and 3) maintain normal size in marginal-zone B cells and inhibit autoimmune DM, all of which contribute to the balance of lipid metabolism and reduction of oxidative stress in DM patients.

**Conclusion:** Ast functions in reducing oxidative stress in DM rats by regulating a variety of targets to form a comprehensive antioxidative network.

**Keywords:** astaxanthin, diabetes mellitus, oxidative stress, RNA-seq analysis, network pharmacy

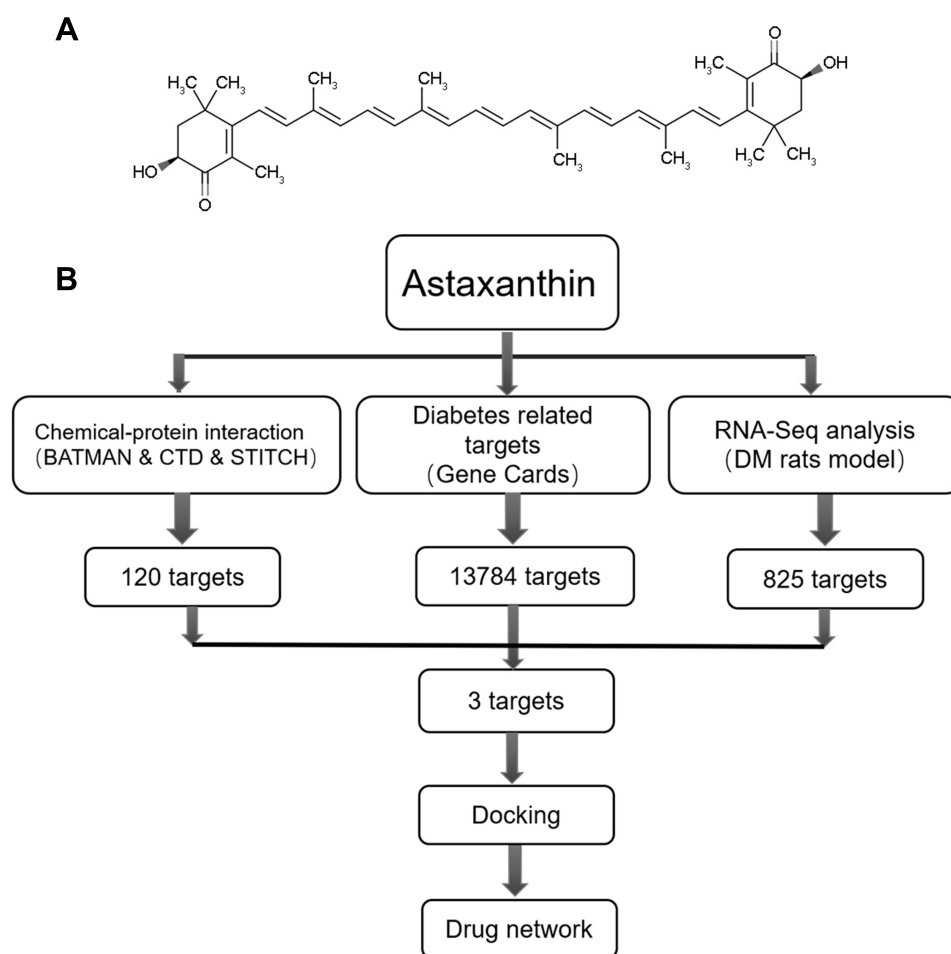
## Introduction

Astaxanthin (Ast; 3,3'-dihydroxy- $\beta,\beta'$ -carotene-4,4'-dione) is a type of red carotenoid that can be extracted from various microorganisms and marine animals, eg, algae, salmon, and shrimp.<sup>1,2</sup> Ast is red due to conjugated double bonds at the center of the compound (Figure 1A). These bonds are considered a strong antioxidant through donating electrons and reacting with free radicals to stabilize the latter and terminate free-radical chain reactions in huge amounts of living organisms.<sup>3,4</sup> Furthermore, with its special combined ketone-hydroxyl structure, Ast possesses better biological activity than other antioxidants, as it is long enough to link with cell membranes from inside to outside.

Diabetes mellitus (DM) puts a huge burden on health-care systems all over the world.<sup>5</sup> There are several complications caused by DM, such as disorders of lipid metabolism, fatty liver, and inflammation.<sup>6,7</sup> It has been

reported that oxidative stress is induced by hyperglycemia from dysfunction of pancreatic  $\beta$  cells, leading to tissue damage and complications in DM patients.<sup>8</sup> The oxidative stress is created by imbalance between reactive oxygen species (ROS) production and antioxidant defense. With increased electrons, ROS are reduced to a highly reactive, radical format in the cells, including  $O_2^-$ ,  $O_2^{2-}$ ,  $H_2O_2$ ,  $OH$ , and  $OH^-$ .<sup>9,10</sup> All these ROS have different actions and kinetics in cellular metabolism. Therefore, mitigating the symptoms of DM by reducing oxidative stress appears to be a feasible approach.

Ast has shown great potential in alleviating oxidative stress induced by DM. Ast reduces oxidative stress caused by hyperglycemia in pancreatic  $\beta$  cells and regulates glucose and serum-insulin levels.<sup>11</sup> Oxidative stress in streptozotocin (STZ)-induced DM rats is inhibited by combination treatment of Ast with  $\alpha$ -tocopherol.<sup>12</sup>



**Figure 1** (A) Chemical structure of Ast; (B) pipeline for identification of both predicted and detected Ast targets that integrate compound proteins, disease proteins, RNA-seq analysis, GO analysis, docking, and network construction.

Recently, Ast treatment has been reported to be involved in stimulating mitochondrial biogenesis and significantly ameliorating insulin resistance through activation of the AMPK pathway in skeletal muscle.<sup>13</sup> Ast inhibits glycation and glycated protein-induced cytotoxicity in human umbilical vein endothelial cells by preventing lipid/protein oxidation.<sup>14</sup> Ast also prevents DM nephropathy by reduction of oxidative stress and renal cell damage.<sup>15–17</sup> However, the biological basis of Ast in reducing oxidative stress induced by DM is not clear.

Network pharmacy is a new approach for drug discovery. It is a useful and comprehensive tool to elucidate complicated relationships among drugs, targets, and diseases through building a network.<sup>18</sup> In this work, we combined network-pharmacy methods and RNA sequencing (RNA-seq) to analyze the interacting network among Ast, target proteins, and DM. We collected the targets of Ast and DM from public databases. Then, differential gene-expression patterns were analyzed using liver tissue of DM rats fed with Ast using RNA-seq. Intersecting targets were identified and docking analysis between Ast and target proteins performed. A compound target–pathway network was finally built to illustrate how Ast targets multiple signaling pathways to reduce oxidative stress caused by DM. The overall procedures for Ast target prediction are shown in [Figure 1B](#).

## Methods

### Animals

The research was conducted in accordance with international principles for laboratory animal use and care and guidelines of the Animal Care Committee at the Faculty of Medicine, Tianjin University (China). Sprague Dawley rats aged 56 weeks without specific pathogens and weighing 180–200 g were purchased from Vital River (Beijing, China) and maintained under conditions of controlled temperature (22°C±1°C), 40% humidity, and a daily 12-hour photoperiod.

### Experimental Procedure

The rats were randomly divided into two groups: ten in the negative-control group and 40 rats in the DM group. The negative-control group was fed a normal diet, while the model group was fed a high-sugar, high-fat diet for 30 days. All rats were fed standard pellets and kept in standard cages. After 30 days, rats in the model group were given STZ (Sigma-Aldrich) 30 mg/kg intraperitoneally

after fasting for 12 hours. Five days after the STZ injection, tail-vein blood glucose of rats injected with STZ was measured. The DM model was successfully established when the blood glucose of rats injected with STZ was >200 mg/dL.

The 40 DM rats were randomly divided into four groups, with ten in each group. Ast was dissolved in olive oil. The low-dose group was treated with 200 mg/kg Ast, the high-dose group 300 mg/kg Ast, and the metformin (Met) group 200 mg/kg Met. No special treatment was given to rats in the DM-model group. All 40 rats were fed the high-sugar, high-fat diet for 30 days. Rats given low-dose Ast (200 mg/kg) were finally used for H&E staining and RNA-seq analysis.

### Quantitative Analysis of Triglyceride, Total Cholesterol, and Insulin Levels in Rats

About 50 µL tail-vein blood from overnight-fasted rats was collected in 1.5 mL Eppendorf tubes. Total cholesterol (TC), triglyceride (TG), and insulin levels were then tested using whole tail-vein blood with an ELISA kit produced by DG Biotech, China (DG20220D, DG20167D, and DG20757D) in accordance with the manufacturer's instructions.

### Quantitative Analysis of SOD, GSH, and MDA

SOD activity was measured kinetically as per Sun et al.<sup>19</sup> Lipid peroxide levels, expressed in terms of MDA, were determined as per Buege and Aust.<sup>20</sup> GSH was measured as per Ellman.<sup>21</sup> For SOD and GSH detection, liver homogenates of aliquots of 0.5 mL were used. SOD activity was detected using a SOD-assay kit (WST1) produced by Nanjing Jiancheng, China (A001-3-2). Spectrophotometry (absorbance) at 450 nm was recorded. Hepatic GSH was estimated with a reduced glutathione (GSH)–assay kit produced by Nanjing Jiancheng, China (A006-1-1) at absorbance of 420 nm. For MDA testing, 0.2 mL liver homogenates of aliquots were used. Malondialdehyde (MDA) levels were tested with an MDA-assay kit produced by Nanjing Jiancheng (A003-1-2) and assayed at absorbance of 532 nm. All these experiments were conducted in accordance with manufacturers' instruction. Triplicates of each sample were detected. Statistical significance was determined using SPSS with two-tailed unpaired Student's *t*-tests.

## Tissue Embedding and H&E Staining

Fresh islet tissue was placed in 10% formalin prepared in advance. It was dehydrated with alcohol, made transparent with xylene, and embedded in paraffin. Paraffin blocks were cut into 5–8  $\mu\text{m}$  slices, then scalded with hot water. Slices were dried and stained with H&E. Next, samples were dehydrated with alcohol and sealed. Stained slides were imaged on an Aperio ScanScope CS2 at 20 $\times$  magnification (Leica Biosystems).

## Total RNA Extraction and Preparation of RNA-Seq Libraries

Total RNA was isolated with Trizol reagent (Invitrogen Life Technologies). Concentration, quality, and integrity were detected using spectrophotometry (NanoDrop; Thermo Fisher Scientific). Three micrograms of RNA (3  $\mu\text{g}$ ) was used as input material for RNA-sample preparations. Sequencing libraries were generated using a TruSeq RNA sample-preparation kit (Illumina, San Diego, CA, USA). Briefly, mRNA was purified using poly-T oligo-attached magnetic beads. Then, fragmentation was carried out with divalent cations under elevated temperature. First-strand cDNA was synthesized using random oligonucleotides and SuperScript II, followed by second-strand cDNA using DNA polymerase I and RNase H. After adenylation of the 3' ends of the DNA fragments, Illumina PE adapter oligonucleotides were ligated to prepare for hybridization. To select cDNA fragments of the preferred 200 bp length, the library fragments were purified using the AMPure XP system (Beckman Coulter, Beverly, CA, USA). DNA with ligated adaptor molecules on both ends were enriched with Illumina PCR primer cocktail in a 15-cycle PCR process.

## Real-Time qPCR Analysis

Total hepatic RNA from frozen liver was extracted using an RNeasy Mini kit (74104; Qiagen, Hilden, Germany) and treated with DNase I (M0303L; NEB, Ipswich, MA, USA). cDNA was reverse-transcribed with oligo-dT primers with a transcriptor first-strand cDNA-synthesis kit (04896866001; Roche, Basel, Switzerland). A real-time qPCR assay was performed using a FastStart Essential DNA Green Master kit (6402712001; Roche) in a LightCycler 480 II system (Roche). Sequences of primers and cycling conditions for tubulin were forward 5'-TACCCTCGCATCCACTTCCCT-3' and reverse 5'-CGCTTGGTCTTGATGGTGGCA-3'. Each sampling point was run in triplicate.<sup>22</sup> Threshold cycle ( $C_T$ ) values of positive amplicons were analyzed using the

$\Delta\Delta C_T$  method in order to acquire a relative fold increase calibrated to the housekeeping gene and normalized to the control. Statistically significance was determined using SPSS with two-tailed unpaired Student's *t*-tests.

## Prediction of Ast-Related Targets

Ast-related targets were predicted based on similarity to known drug–target interactions via the BATMAN database (<http://bionet.ncpsb.org/batman-tcm/index.php/home>), Comparative Toxicogenomics Database (CTD; <http://ctdbase.org>), and STITCH (<http://stitch.embl.de>) database. In BATMAN, the prediction was considered a binary-classification issue. Predicted candidate targets (including known targets) with scores not  $<20$  for each ingredient were presented and used for further bioinformatic analyses. In the CTD, hierarchical interaction–type vocabulary is used to describe the common physical, regulatory, and biochemical interactions between chemicals and genes. Confidence scores supported by STITCH served as a reference to mark high-confidence interactions between compounds and protein modules.<sup>23</sup>

## Prediction of DM-Related Target Analysis with GeneCards

DM-related targets were predicted on GeneCards, which is a searchable and integrative database providing user-friendly and comprehensive information on all annotated and predicted human genes (<https://www.genecards.org>).

## GO, KEGG Analysis, and Network Construction

GO analysis was performed on STRING, a database of known and predicted protein–protein interactions (<https://string-db.org/cgi/info.pl>). KEGG analysis for key Ast targets was collected on DAVID 6.7 (<https://david.ncifcrf.gov>). For deeper understanding of the relationships among Ast, target proteins, and DM, networks were constructed and analyzed with Cytoscape 3.7.2.

## Validation of Binding Capacity Between Ast and Key Targets by Molecular Docking

We used SwissDock (<http://www.swissdock.ch>) to validate binding capacity between Ast and the targets.<sup>24</sup> This is a web service to predict molecular interactions that may

occur between a target protein and a small molecule.<sup>24</sup> Crystal-structure information of the key targets was obtained from PDB (<http://www.rcsb.org>). Docking results between Ast and key targets were analyzed on SwissDock to validate binding properties. The closer the binding of the target protein and Ast is, the more energy they release and the lower the energy of  $\Delta G$ . Therefore, we chose the lowest  $\Delta G$  value for demonstrating binding patterns between Ast and target-protein chains.

## Results

### Prediction of Ast Targets

Potential Ast targets were predicted with three different approaches. Firstly, we collected 43 potential protein targets of Ast using BATMAN, from which 34 genes showed protein–protein interaction (PPI) networks on Cytoscape (Figure 2A). The key proteins from the 34 targets were analyzed using the cluster function. These were VDR, RXRA, RARA, RARB, RXRB, RXRG, and RARG (Figure 2B). On the CTD, we found 68 potential targets of Ast, of which 47 targets were on PPI networks and 19 clustered (Figure 2C, and D). Eleven targets were collected using the STITCH database (Figure 2E). In total, 21 repeated genes were removed, while the remaining 101 targets were subjected to GO analysis. Significantly enriched GO terms with adjusted  $p < 0.05$  are shown in the figures. We found that the metabolic process was the most enriched, with 92 targets on biological process analysis (Figure 2F). In cellular component categories, 58 targets were involved in membranes (Figure 2G), which is consistent with the special structure features and function of Ast. In the molecular function categories, targets were mostly enriched in protein binding (Figure 2H).

### Potential Targets of DM Analysis Through GeneCards

In order to find whether the Ast targets were involved in DM-related genes, GeneCards was used to predict potential targets of the disease. The term “diabetes mellitus” was used, and 13,784 targets were collected. In sum, 118 clustered genes out of 13,784 targets were found using Cytoscape 3.7.2 (Figure 3).

### Ast Treatment Reduced TC and TG Levels and Induced Insulin Secretion in DM Rats

To confirm the effects of Ast in regulating TC, TG, and insulin levels, we built the DM rat model with STZ. The

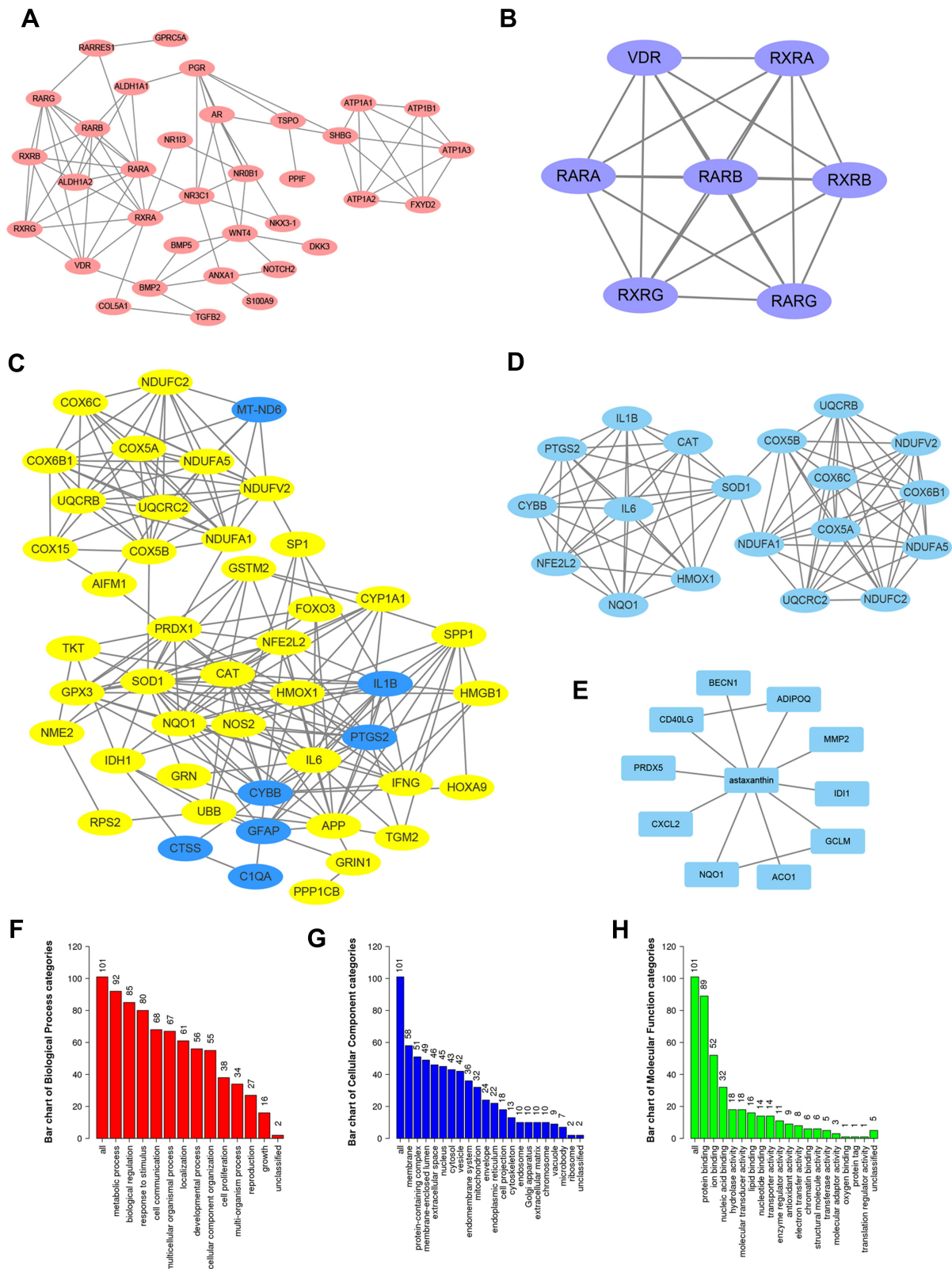
effects of Ast were examined in the negative-control, DM-model, DM with Met, and DM groups with low-dose (200 mg/kg) and high-dose (300 mg/kg) Ast. There was no significant difference in body weight among Ast-treated DM rats, the DM group, and the Met-treated group (Supplemental Figure 1). TC and TG levels in both low-dose (200 mg/kg) and high-dose (300 mg/kg) Ast-treated groups decreased significantly compared with DM rats (Figure 4A and B). High-dose Ast showed more effectiveness on insulin secretion than low-dose Ast (Figure 4C). These results confirmed that Ast treatment reduced TC and TG levels and induced insulin secretion in DM rats.

### Ast Treatment Reduced MDA Levels and Induced SOD and GSH Activity in DM Rats

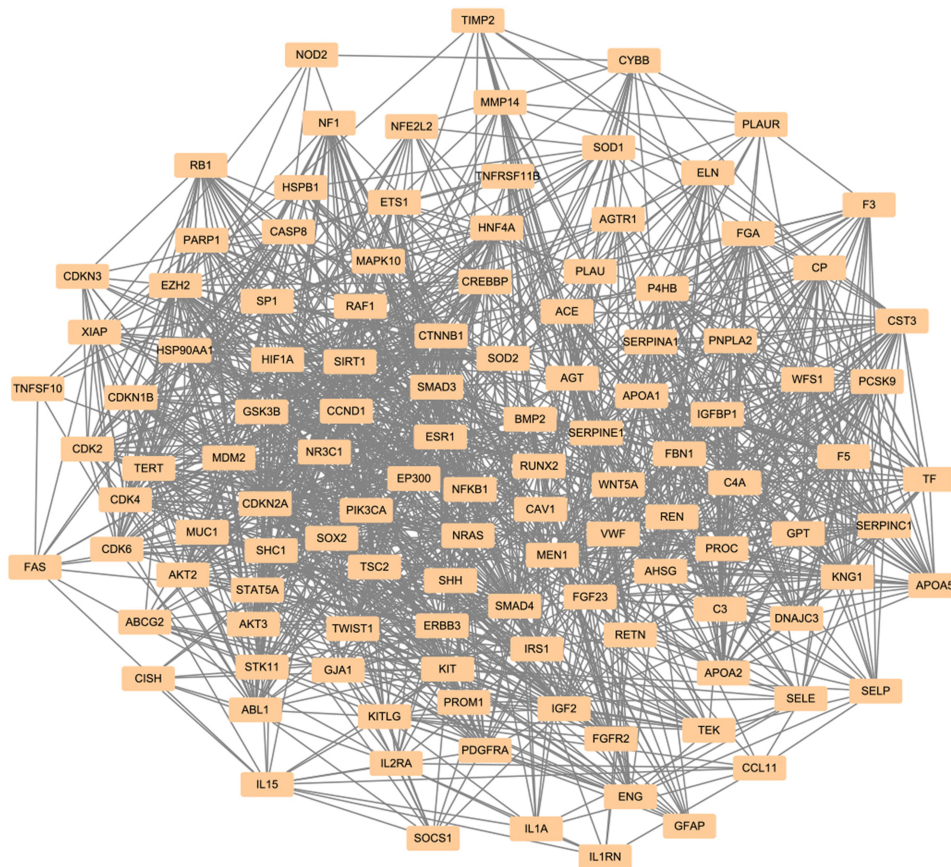
SOD is an antioxidant enzyme that through catalysis produces hydrogen peroxide and oxygen.<sup>25</sup> GSH is a small-molecule scavenger that can remove  $O_2^-$ ,  $H_2O_2$ , and LOOH. MDA is produced from oxygen free radicals attacking polyunsaturated fatty acids in the membrane, causing lipid peroxidation. Quantitative analysis of SOD, GSH, and MDA was done. The results are shown in Figure 4D–F. We found that SOD activity in DM rats was only ~50%–60% of the high- or low-dose Ast rats (Figure 4D). The level of GSH was also reduced in DM rats, while Ast treatment significantly increased it (Figure 4E). MDA levels was highly raised in DM rats, though reduced in Ast rats (Figure 4F). All significant differences were versus DM-model data. Taken together, all these results indicate that oxidation levels in DM rats decreased significantly and antioxidant status improved with Ast supplementation.

### Ast Treatment Helped Alleviate Islet-Cell Injury in DM Rats

The effects of Ast in regulating islet-cell status in DM rats were detected with H&E staining. Results showed that STZ caused extensive damage in islet cells of DM rats, including characteristic lipid vacuolization (Figure 4G). After Met treatment, cells in islets showed less vacuolation than in DM rats. Meanwhile, following low-dose Ast treatment, islet cells became less vacuolar than both DM and Met-treated rats (Figure 4G). These data suggested that Ast treatment helped alleviate islet-cell vacuolation in DM rats.



**Figure 2** Ast-target networks. **(A)** PPI network of potential Ast-target analysis predicted with BATMAN. **(B)** Key proteins from BATMAN-predicted targets analyzed by the cluster function of Cytoscape software. **(C)** PPI network of potential Ast-target analysis predicted with CTD database. **(D)** Key proteins from CTD predicted targets analyzed by the cluster function of Cytoscape software. **(E)** PPI network of potential Ast-target analysis predicted with STRING. **(F–H)** GO enrichment analysis of combined Ast targeted genes from BATMAN and CTD using STRING: number of genes enriched in biological process **(F)**, cellular component **(G)**, and molecular function **(H)**.

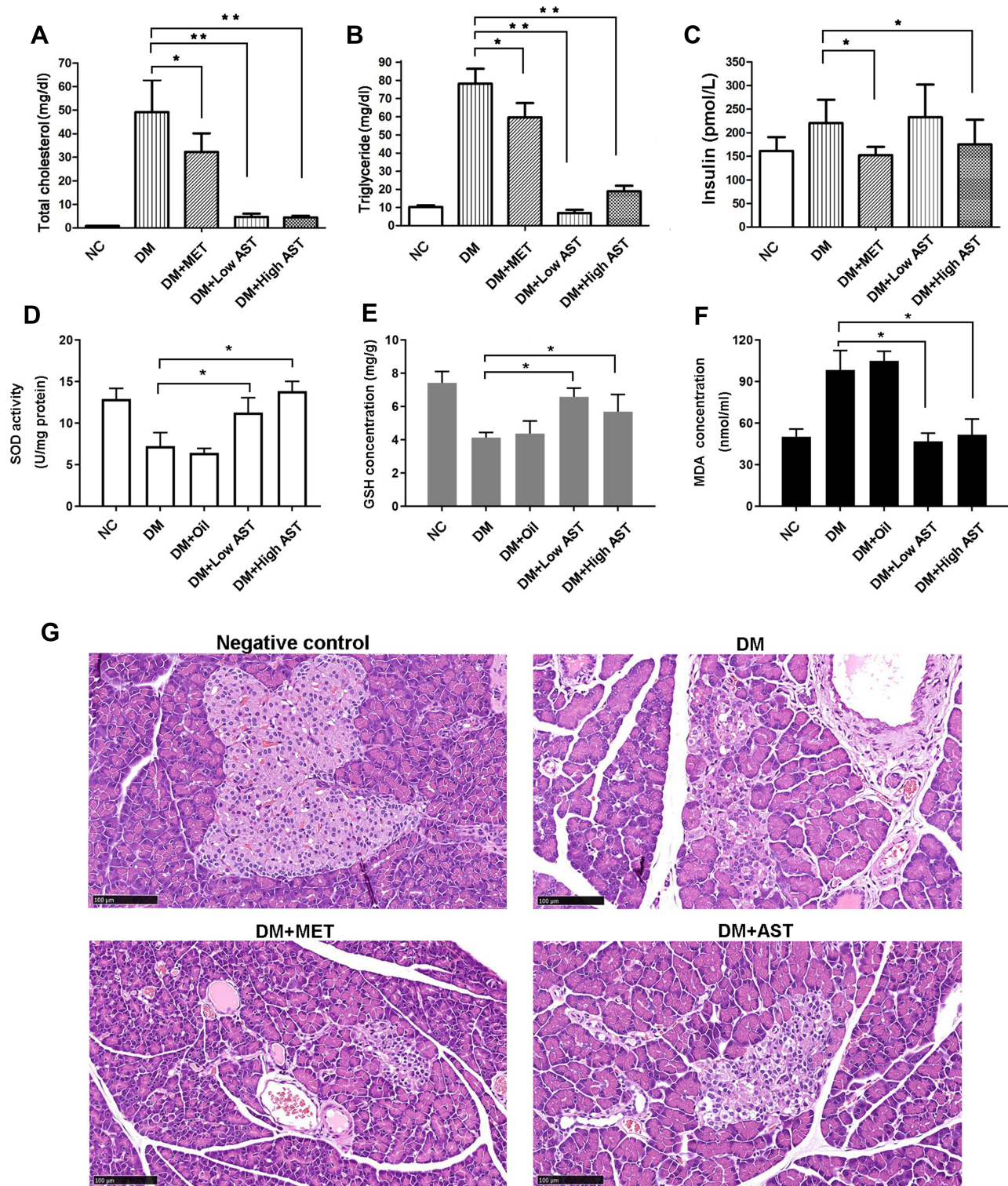


**Figure 3** Disease-target network of DM. The dark-yellow nodes represent DM-related targets.

## RNA-Seq Analysis of Ast- and Met-Treated DM Rats

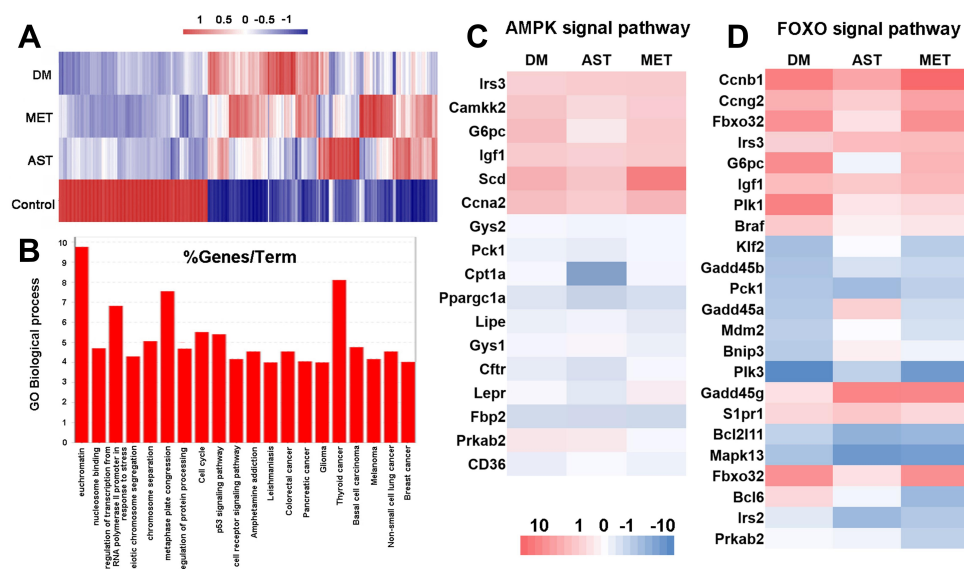
For further detection of genes related to DM rats receiving Ast treatment, RNA-seq analysis was conducted. With an Illumina HiSeq sequencer, after filtering low-quality reads and removing reads aligned to either rRNA or tRNA, 503,515,926 clean reads from liver tissue of negative-control rats (128,184,131 reads), DM-model rats (128,407,964 reads), and DM rats given Ast (116,628,228 reads) or Met (130,295,600 reads) were selected for further analysis ([Supplemental Table S1](#)). The raw data of Illumina reads are shown in the NCBI Sequence Read Archive browser (<http://ncbi.nlm.nih.gov/sra>, accession PRJNA644021). There was ~95.96% of reads for each sample mapped to the Genome *Rattus norvegicus*.Rnor\_6.0.dna.toplevel, fa. About 90.57% were aligned with unique genes without ambiguity. Gross comparisons against untreated rats (negative controls) were shown in [Figure 5A](#). All transcripts that were differentially expressed in DM rats compared to negative-control rats are shown in [Supplemental Table S2](#).

The transcriptome of Ast-treated DM rats was then compared to the DM-model group. In the Ast-treated group, expression was induced for 601 genes and repressed for 228 genes ([Figure 5A](#), [Supplemental Table S3](#)). With KEGG analysis, we found expression of nine genes involved in the endocytosis pathway was induced ([Table 1](#)). Seven genes involved in the cell-cycle pathway were induced ([Table 1](#)). Also, we noticed that the *SRC* proto-oncogene involved in cell adhesion was induced with a 1.53-fold change. We then analyzed repressed genes in Ast-treated rats compared to the DM group. Six genes involved in the TNF-signaling pathway were down-regulated ([Table 2](#)). Eight genes involved in the MAPK-signaling pathway were downregulated, and fold changes are shown in [Table 2](#). We also conducted GO biological process analysis for all the  $\log_2FC \geq 2$  genes (139 in total) involved in the Ast vs DM comparison ([Figure 5B](#)). The top three enriched processes were for euchromatin, thyroid cancer, and metaphase-plate congression. Taken together, these results provide showed that Ast had a comprehensive effect in regulating extracellular to intracellular signal-transduction effects in DM rats.



**Figure 4** Ast functions in regulating lipid metabolism and antioxidation activity in DM rats. Tail-vein blood (~50  $\mu$ L) from overnight-fasted or ad libitum-fed rats was collected. Changes in total cholesterol (**A**), triglycerides (**B**), and insulin (**C**) in rats treated with or without Ast or Met were detected using tail-vein blood. SOD activity (**D**), GSH concentration (**E**), and MDA concentration (**F**) were examined using liver tissue from rats treated with or without Ast or olive oil. In all tests, values are means of ten rats. Statistically significant differences were determined using SPSS with two-tailed unpaired Student's *t*-tests (\* $p$ <0.05; \*\* $p$ <0.01). (**G**) Representative images of H&E staining of fresh pancreas. Scale bar 100  $\mu$ m.





**Figure 5** RNA-seq analyses of differentially expressed transcripts in negative-control, Ast-treated, Met-treated, and positive-control DM rats. **(A)** Heat maps for cluster display of all differentially expressed transcripts. Red, upregulated genes; blue, downregulated genes. All comparisons were made relative to gene-expression levels of the negative-control rats. **(B)** GO biological process analysis of all the  $\log_2FC \geq 2$  genes in the Ast vs DM comparison group using the STRING database. **(C, D)** Heat maps for cluster display of AMPK-signaling pathway **(C)** and FOXO-signaling pathway.

The transcriptomes of Ast-treated DM rats were compared to Met-treated DM groups. Results showed that expression of 187 genes in Ast group was upregulated, while that of 153 genes was downregulated (Figure 5A, Supplemental Table S4). Cluster analysis showed that five genes involved in PPAR signaling were induced. Three genes from the cAMP-signaling pathway were also upregulated. In the AMPK-signaling pathway, four genes were induced. In contrast, genes that belonged to the steroid-biosynthesis and MAPK-signaling pathways were downregulated. For the steroid-biosynthesis pathway, eight genes were repressed. Furthermore, there were eight genes downregulated in the MAPK-signaling pathway (Table 3). Taken together, these results suggested that Ast had a more significant effect in promoting transmembrane conductance and calcium homeostasis, while Met produced greater inhibition of steroid biosynthesis and inflammation-related genes.

We also investigated differentially expressed genes involved in the AMPK- and FOXO-signaling pathways with heat-map analysis (Figure 5C and D). We found that expression of *SCD*, involved in the AMPK-signaling pathway, which contributes to the biosynthesis of membrane phospholipids, cholesterol esters, and TGs, was downregulated to 1.8, while this was 3.2 in DM rats.<sup>26</sup> Expression of *IRS3*, involved in both the AMPK- and FOXO-signaling pathways and upstream of *AKT*, was

much higher in Ast-treated DM rats than DM rats. We also observed that *CD36*, which functions in mitochondrial  $\beta$ -oxidation and free fatty-acid transport, was expressed at a much higher level in Ast-treated DM rats than DM control rats. Taken together, these results indicated that Ast had a comprehensive effect on regulating AMPK and FOXO signaling.

## Real-Time qPCR Analysis to Confirm RNA-Seq Analysis

To verify mRNA-expression levels obtained on RNA-seq analysis, real-time qPCR was performed using RNA extracted from the livers of DM-model rats and Ast-treated DM rats. Sequences of the primers used for qPCR are shown in Supplemental Table S5. Twelve related genes were analyzed for their expression: *UNC5C*, *SRGAP1*, *SEMA5A*, *SRC*, *PLXNA3*, *SEMA4D*, *SLIT3*, *SEMA3C*, *SMO*, *SSH1*, *SEMA6A*, and *SSH2*. As expected, all these genes were enhanced by Ast treatment, which was consistent with the RNA-seq results (Supplemental Figure 2).

## Intersecting Targets Identified and Molecular Docking

Three intersecting targets were identified from data obtained from Ast targets, DM targets, and RNA-seq

**Table 1** Upregulated genes involved in endocytosis and cell-cycle pathways in Ast-treated DM Rats compared to DM rats

Pathway	Gene	Description	Log <sub>2</sub> FC
			Ast vs DM
Endocytosis	<i>CBL</i>	Cbl proto-oncogene	1.91
	<i>RT1-M2</i>	RT1 class Ib, locus M2	1.81
	<i>ARRB1</i>	Arrestin $\beta_1$	1.71
	<i>GRK3</i>	G protein-coupled receptor kinase 3	1.59
	<i>DAB2</i>	DAB2 clathrin adaptor protein	1.44
	<i>ASAP2</i>	ArfGAP with SH3 domain, ankyrin repeat, and PH domain 2	1.43
	<i>MVB12B</i>	Multivesicular body subunit 12B	1.34
	<i>CSF1R</i>	Colony stimulating factor 1 receptor	1.21
	<i>ARAP1</i>	ArfGAP with RhoGAP domain, ankyrin repeat, and PH domain 1	1.18
Cell cycle	<i>ESPL1</i>	Extra spindle pole bodies like 1 separase	3.91
	<i>TTK</i>	Ttk protein kinase	3.30
	<i>CDK6</i>	Cyclin-dependent kinase 6	2.25
	<i>MCM5</i>	Minichromosome maintenance complex component 5	2.09
	<i>MCM6</i>	Minichromosome maintenance complex component 6	2.07
	<i>MCM3</i>	Minichromosome maintenance complex component 3	1.97
	<i>PRKDC</i>	Protein kinase, DNA-activated, catalytic polypeptide	1.15

**Table 2** Downregulated genes involved in MAPK- and TNF-signaling pathways in Ast-treated DM rats compared to DM rats

Pathway	Gene	Description	Log <sub>2</sub> FC
			Ast vs DM
MAPK signaling	<i>HSPA1B</i>	Heat-shock protein family A (Hsp70) 1B	-3.54
	<i>NTRK1</i>	Neurotrophic receptor tyrosine kinase 1	-3.14
	<i>FOS</i>	FBJ osteosarcoma oncogene	-2.16
	<i>GADD45G</i>	Growth arrest and DNA damage-inducible $\gamma$	-2.09
	<i>DUSP8</i>	Dual-specificity phosphatase 8	-1.72
	<i>DUSP5</i>	Dual-specificity phosphatase 5	-1.39
	<i>MAPK8IP1</i>	Mitogen-activated protein kinase 8 interacting protein 1	-1.11
	<i>ANAPC11</i>	Anaphase-promoting complex subunit 11	-1.02
TNF signaling	<i>JUN</i>	Jun proto-oncogene AP1 transcription factor subunit	-2.67
	<i>SOCS3</i>	Suppressor of cytokine signaling 3	-2.03
	<i>MAP2K6</i>	Mitogen-activated protein kinase kinase 6	-1.92
	<i>JUNB</i>	JunB proto-oncogene AP1 transcription factor subunit	-1.66
	<i>BCL3</i>	B-cell CLL/lymphoma 3	-1.21
	<i>TNFRSF1B</i>	TNF-receptor superfamily 1B	-1.08

analysis using Bioinformatics & Evolutionary Genomics (<http://bioinformatics.psb.ugent.be/webtools/Venn>) (Figure 6A): Col5A1, which functions in binding to insulin and has recently been identified as a new lipid species-associated loci associated with cardiovascular diseases risk,<sup>27</sup> Nqo1 a phase II enzyme that serves in the maintenance of cellular defense against oxidative stress and redox homeostasis,<sup>28</sup> and Notch2, which plays a crucial role in marginal-zone B-cell development.

To further certify binding capacity between Ast and the targets, molecular docking with SwissDock was performed. As Col5A1 lacks the crystal-structure information for docking, we performed docking analysis between Ast and Nqo1 and Ast and Notch2. (Figure 6B and C). The docking pattern with the lowest  $\Delta G$  value was chosen, as it showed the most closely binding capability.<sup>24</sup> For Nqo1 binding, the lowest  $\Delta G$  was  $-9.07$  kcal/mol, while the lowest  $\Delta G$  was  $-8.52$  kcal/mol for Notch2 binding, indicating the specific binding possibility between Ast and key targets for DM treatment.

**Table 3** Cluster analysis of differentially expressed genes in Ast-treated DM rats compared to Met-treated groups

Pathway	Name	Description	Log <sub>2</sub> FC
			Ast vs Met
PPAR signaling	<i>FABP2</i>	Fatty acid-binding protein 2	1.39
	<i>GK</i>	Glycerol kinase	1.38
	<i>PLTP</i>	Phospholipid-transfer protein	1.10
	<i>APOA1</i>	Apolipoprotein A1	1.13
cAMP signaling	<i>CACNA1C</i>	Calcium voltage-gated channel subunit $\alpha_{1C}$	2.11
	<i>PLD1</i>	Phospholipase D1	1.44
	<i>ATP2B2</i>	ATPase plasma membrane $Ca^{2+}$ transporting 2	1.43
AMPK signaling	<i>G6PC</i>	Glucose-6-phosphatase catalytic subunit	1.83
	<i>PFKFB1</i>	6-phosphofructo-2-kinase/fructose-2,6-biphosphatase 1	1.31
	<i>LEPR</i>	Leptin receptor	1.24
	<i>CFTR</i>	Cystic fibrosis transmembrane-conductance regulator	1.12
Steroid biosynthesis	<i>SQLE</i>	Squalene epoxidase	-2.20
	<i>MSMO1</i>	Methylsterol monooxygenase 1	-2.07
	<i>CYP51</i>	Cytochrome P450, family 51	-2.05
	<i>HSD17B7</i>	17 $\beta$ -hydroxysteroid dehydrogenase 7	-1.94
	<i>LSS</i>	Lanosterol synthase (2,3-oxidosqualene-lanosterolcyclase)	-1.76
	<i>TM7SF2</i>	Transmembrane 7 superfamily member 2	-1.30
	<i>EBP</i>	Emopamil-binding protein (sterol isomerase)	-1.28
	<i>SC5D</i>	Sterol-C5-desaturase	-1.10
MAPK signaling	<i>NTRK1</i>	Neurotrophic receptor tyrosine kinase 1	-2.75
	<i>FOS</i>	FBJ osteosarcoma oncogene	-2.39
	<i>HSPA1B</i>	Heat-shock protein family A (Hsp70) 1B	-2.38
	<i>JUN</i>	Jun proto-oncogene, API transcription-factor subunit	-1.75
	<i>GADD45A</i>	Growth arrest and DNA damage-inducible 45 $\alpha$	-1.73
	<i>MAP2K6</i>	Mitogen-activated protein kinase kinase 6	-1.36
	<i>SRF</i>	Serum response factor	-1.25
	<i>DUSP8</i>	Dual-specificity phosphatase 8	-1.16

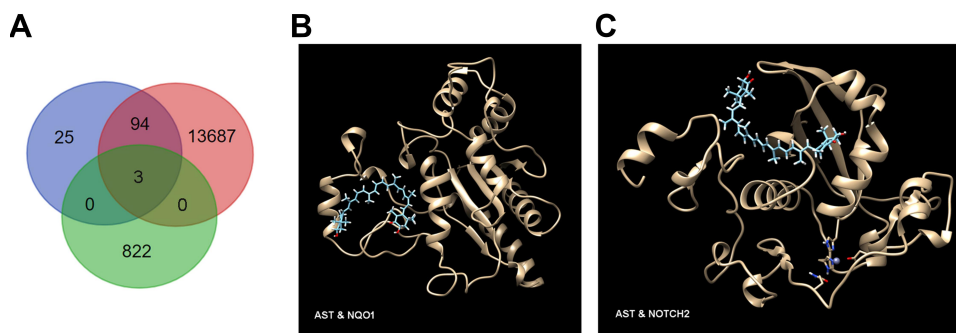
## Pathway Analysis and Network Construction

For understanding the regulated networks, related pathways were then collected with DAVID. Results showed that Nqo1 was involved in ubiquinone and other terpenoid-quinone biosynthesis, metabolic pathways, pathways in cancer, and hepatocellular carcinoma pathways. Col5A1 takes part in protein digestion and absorption, ECM-receptor interaction, the PI3K-Akt signaling pathway, and amoebiasis pathways. Notch2 functions in endocrine resistance, the Notch-signaling pathway, T<sub>H</sub>1- and T<sub>H</sub>2-cell differentiation, the thyroid hormone-signaling pathway, human papillomavirus infection, cancer, and microRNAs in cancer and breast cancer pathways. Based on pathway analysis, the entire Ast targets-pathway network was constructed with Cytoscape 3.7.2. As shown in Figure 7, the interaction network had 20 nodes and 19 edges. The red, green, and

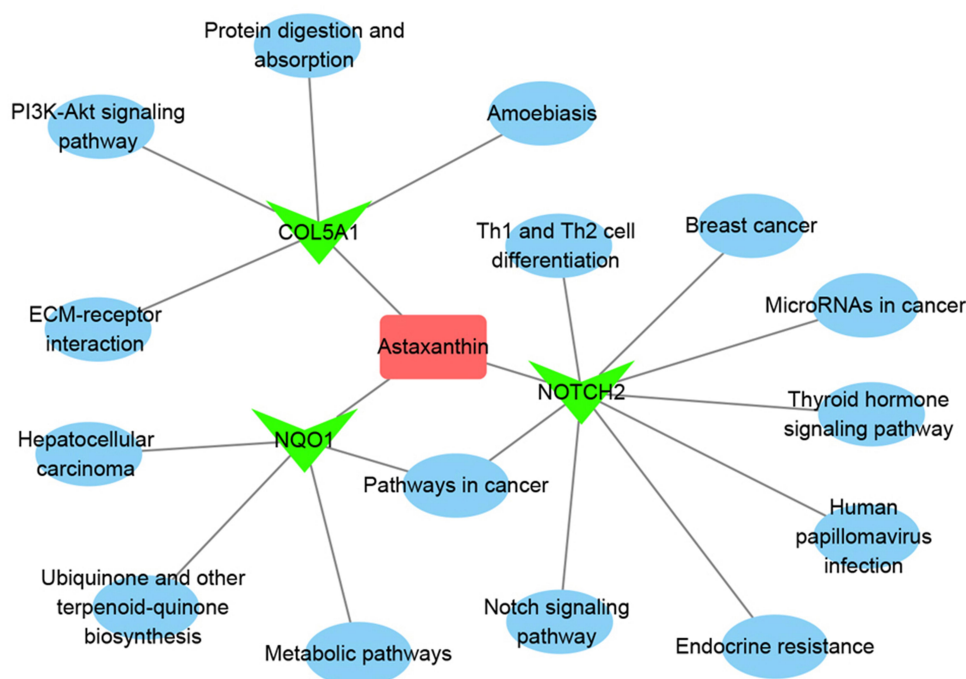
blue colors show Ast, target proteins, and pathways, respectively. These results suggested that Ast targets a variety of pathways to form a network of systemic pharmacological effects to reduce the oxidative stress caused by DM.

## Discussion

DM causes both psychological and physical distress to patients and their families.<sup>5</sup> Hyperglycemia, insulin resistance, and excess fatty acids in DM patients have been reported to increase oxidative stress and glycation end products, leading to vascular inflammation, vasoconstriction, thrombosis, and atherogenesis symptoms.<sup>29</sup> Ast is a safe and natural product with no side effects when consumed with food.<sup>30-32</sup> Ast works well in reducing oxidative stress in DM rats.<sup>8</sup> It is thus considered to be a good candidate for clinical studies. In this work, we identified three Ast protein targets — DM, Col5A1, Nqo1, and Notch2 — by RNA-seq and network-



**Figure 6** Identification of three intersecting targets. Targets were identified with Venn analysis (A). Molecular docking of NQO1 (B) and NOTCH2 (C) with Ast. The golden structure represents the target protein, with Ast structure in cyan.



**Figure 7** The Ast target-pathway network. The pink rectangle represents Ast, magenta triangle targets, and blue circles related pathways.

pharmacy analysis. The three target proteins were involved in metabolic pathways, protein digestion and absorption, endocrine resistance, the Notch-signaling pathway and other physiological processes. A systematic overview was built for understanding the possible regulatory mechanisms of Ast in reducing oxidative stress induced by DM.

Based on previous reports, overexpression of *SCD* in the AMPK-signaling pathway in the normal liver of mouse and rat strains is genetically susceptible to hepatocarcinogenesis, as it causes abnormal biosynthesis of membrane phospholipids, cholesterol esters, and TGs.<sup>33</sup> With RNA-seq analysis, we found *SCD* expression in Ast-treated DM rats was much lower than in DM control rats (Figure 5C).

This result could explain why Ast functions in reducing TC and TG levels in the DM rats efficiently, in that Ast inhibits *SCD* expression to balance TC and TG levels in DM patients. Furthermore, expression of the *IRS3* gene, which is upstream of *AKT* in the insulin-signaling pathway, was much higher in Ast-treated DM rats than DM rats (Figure 5C and D). This is consistent with a previous study showing that Ast treatment significantly enhanced insulin-stimulated phosphorylation of the Akt protein in high fat diet-fed mice.<sup>12</sup> Accordingly, Ast functions in promoting both transcription of *IRS3* and phosphorylation of the downstream protein Akt, which together contributed to the improved insulin sensitivity in the Ast-treated groups. We also observed that the *CD36* gene, which

functions in mitochondrial  $\beta$ -oxidation and free fatty-acid transport in the AMPK-signaling pathway, was expressed at much higher levels in the Ast-treated DM rats than the DM control rats (Figure 5C). It may help in mitochondrial biogenesis and muscle remodeling, which is consistent with Nishida et al.<sup>12</sup>

Col5A1 is associated with insulin resistance and is overexpressed in pathways related to integrin cell-surface interactions and insulin signaling in obese women.<sup>34</sup> Expression of Col5A1 mRNA in Ast-treated rats was induced 1.21-fold compared with DM rats (Supplemental Table S3). By targeting Ast, the high mRNA level of Col5A1 may play a crucial role in promoting insulin-release balance and relieving insulin resistance. As such, Col5A1 may have a positive effect on regulating insulin resistance and insulin signaling. Furthermore, with the help of Col5A1, Ast might easily colocalize with integrin and react with free radicals at the inner cell surface and also cross the cell membrane to protect it from oxidative stress. Whether there was direct interaction between Ast and Col5A1 needs to be checked in future.

Nqo1 belongs to the family of phase II enzymes, which play essential roles in the maintenance of cellular defense against oxidative stress and redox homeostasis.<sup>28</sup> It is regulated by Nrf2.<sup>35,36</sup> Expression of Nqo1 is induced by oxidative stress.<sup>37</sup> Nqo1 is involved in cellular antioxidant defense and plays a pivotal role in the detoxification of quinine. It protects cells against oxidative stress.<sup>38</sup> In type 2 DM rats, repeated low-dose radiation reduces testicular cell apoptosis and oxidative stress by inducing Nrf2 and Nqo1.<sup>39</sup> According to the RNA-seq analysis, the expression level of Nqo1 was 1.06-fold ( $\log_2$ FC) in Ast-treated DM rats of the DM-model group (Supplemental Table S3). Combined with the prediction of Ast binding to Nqo1 (Figure 6), all this gives us a clue that Ast may directly bind and induce the expression of Nqo1, which leads to low-dose radiation and reduces testicular cell apoptosis and oxidative stress.

The marginal zone of NOD mice is enlarged and has been considered to contribute to autoimmune DM.<sup>40–42</sup> Notch2 plays an essential role in marginal-zone B-cell development. On the surface of B cells, Notch2 interacts with its ligands at low affinity in the marginal sinus.<sup>37,43–48</sup> Ast treatment induced the expression of Notch2 mRNA to 1.21 times that of the DM-model group. This induction pattern of Ast binding Notch2 might function in maintaining the normal size of marginal-zone B cells and inhibit autoimmune DM to some extent.

Organisms are composed of complex molecular and protein-regulation networks. By interacting with a variety of proteins, compound molecules can play multiple roles in related signal-transduction pathways, thus regulating the process of diseases and complications. Ast is predicted to target a variety of targets and pathways to form a network of systemic pharmacological effects to reduce oxidative stress in DM patients. Although we have provided some clues that Ast might interact with particular targets, more research needs to be carried out to confirm the wide and reliable clinical application of Ast in DM research.

## Conclusion

Three Ast protein targets — Col5A1, Nqo1, and Notch2 — were identified. Molecular docking showed a possible interaction of Ast with Nqo1 or Notch2. Ast targets-pathway networks showed that the three target proteins were related to metabolic pathways, protein digestion and absorption, endocrine resistance, the Notch-signaling pathway and other physiological processes. Therefore, Ast is predicted to target a variety of pathways to form a network of systemic pharmacological effects to reduce oxidative stress in DM patients.

## Abbreviations

Ast, astaxanthin; DM, diabetes mellitus; CTD, Comparative Toxicogenomics Database ROS, reactive oxygen species; TC, total cholesterol; TG, triglyceride; STZ, streptozotocin; GSH, glutathione; H&E, hematoxylin-eosin; NOD, no-obesity diabetes.

## Ethics Approval

This research was conducted in accordance with international principles for laboratory animal use and care and the guidelines of the Animal Care Committee at the Faculty of Medicine, Tianjin University (China), and was approved by the Animal Care Committee of the Faculty of Medicine, Tianjin University.

## Acknowledgments

The authors wish to express their sincere gratitude to the laboratory partners who patiently accompanied the entire experimental process.

## Funding

This work was supported by the Modern Aquacology and Health Aquaculture Innovation Team of Tianjin (grant

TD13-5089) and the Scientific Program of Tianjin City (16ZXZYNC00120 and 14ZCZDSY00053).

## Disclosure

The authors declare that they have no conflicts of interest.

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