Secreted chemokines and transcriptomic analyses reveal diverse inflammatory and degenerative processes in the intervertebral disc of the STZ-HFD mouse model of Type 2 diabetes

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Abstract

The chronic inflammation resultant from type 2 diabetes (T2D) is also associated with spinal

pathologies, including intervertebral disc (IVD) degeneration and chronic neck and back pain.

Although confounding factors, such as increased weight gain in obesity, studies have shown that

even after adjusting age, body mass index, and genetics (e.g. twins), patients with T2D suffer

from disproportionately more IVD degeneration and back pain. We hypothesize that chronic

T2D fosters a proinflammatory microenvironment within the IVD that promotes degeneration

and disrupts disc homeostasis. To test this hypothesis, we evaluated two commonly used mouse

models of T2D – the leptin-receptor deficient mouse (db/db) and the chronic high-fat diet in mice

with impaired beta-cell function (STZ-HFD). STZ-HFD IVDs were more degenerated and

showed differential expression of chemokines from the db/db models. Moreover, the RNAseq

analysis revealed vast transcriptional dysregulation of many pathways in the STZ-HFD but not in

the db/db tissues. Taken together, the STZ-HFD may better recapitulates the complexities of the

chronic inflammatory processes in the IVD during T2D.

Introduction

{Figure 1}

Type 2 diabetes (T2D) is a prevalent metabolic disorder marked by insulin resistance and prolonged hyperglycemia, impacting millions around the globe and leading to significant healthcare expenses (Srinivasan and Ramarao, 2007; Boucher et al., 2014; Petersen and Shulman, 2018; United States, Center for Disease Control, 2022). This disease shares several characteristics with autoimmune disorders, including the chronic, systemic overexpression of immunomodulating cytokines, which can gradually lead to widespread accrual of tissue damage across multiple organ systems (Itariu and Stulnig, 2014; Chen et al., 2017; de Candia et al., 2019; Daryabor et al., 2020). Among these complications, IVD degeneration is a comorbidity of particular interest due to its chronic-inflammatory etiology (Risbud and Shapiro, 2014; Molinos et al., 2015; Navone et al., 2017; Lyu et al., 2021; Pinto et al., 2023). Additionally, there is a strong association between low back pain and chronic T2D (Robinson et al., 1998; Jhawar et al., 2006; Sakellaridis, 2006; Liu et al., 2018; Alpantaki et al., 2019; Cannata et al., 2019; Broz et al., 2021). Chronic inflammation in T2D, driven by a persistent milieu of chemokines may foster a pro-degenerative microenvironment within the IVD, potentially linking T2D-induced inflammation to accelerated IVD degeneration. While chronic inflammation connects T2D and disc degeneration, the underlying mechanism driving this connection is not well known.

Animal models are essential for studying T2D's impact on IVD degeneration. The db/db mouse model, which harbors a point mutation in the gene encoding for the leptin receptor (Chen et al., 1996; Lee et al., 1996), is widely used to study T2D-related metabolic dysfunctions (Wang et al., 2014). Despite exhibiting many human T2D-like traits—including severe obesity, hyperglycemia, and insulin resistance—its leptin receptor deficiency differs from the

multifactorial etiology of human T2D. In spine research, db/db mice show signs of IVD

degeneration, such as increased cell apoptosis and extracellular matrix degradation (Li et al.,

2020; Natelson et al., 2020; Lintz et al., 2022). However, the lack of leptin signaling could

confound interpretations of disc degeneration, since leptin appears to promote anabolic processes

and reduce catabolic activities in IVD cells (Francisco et al., 2018; Gruber et al., 2007; Li et al.,

2013; Han et al., 2018; Sharma, 2018; Segar et al., 2019; Curic, 2021).

In contrast, the Streptozotocin-High Fat Diet (STZ-HFD) model offers a non-genic

approach to replicating T2D. It induces the condition through pro-glycemic diet and low-dose

streptozotocin-induced pancreatic beta-cell dysfunction, avoiding the genetic ablation of

systemically impactful hormonal pathways like leptin (as seen in the db/db model) [**Fig. 1A**].

This model is characterized by significant metabolic disturbances to glycemic status, insulin

resistance, and body weight, mirroring the human T2D phenotype more closely (Kusakabe et al.,

2009; Islam and Wilson, 2012). Additional metabolic characteristics reported in STZ-HFD

mouse studies include elevated serum insulin levels, dyslipidemia (increased triglycerides, LDL

cholesterol, and total cholesterol), and increased markers of inflammation and oxidative stress

(Gilbert et al., 2011; Alquier and Poitout, 2018; Yin et al., 2020). This sets this mouse model

apart as valuable tool for studying the complex interactions within diabetic complications

without the confounding factor of complete leptin signaling ablation (Kusakabe et al., 2009).

Previously this model has been employed in studying diabetic complications in bone (Eckhardt

et al., 2020). Our study aims to uncover the mechanisms behind inflammatory-pathway

contribution to IVD degeneration and dysfunction, advancing the field's understanding of T2D-

related IVD complications.

Inflammatory cytokines are pivotal in both IVD degeneration and T2D, mediating acute

inflammatory responses while perpetuating chronic inflammation and tissue degradation (Guest

et al., 2008; Velikova et al., 2021). They regulate key proteins such as ADAMTs and MMPs,

driving the degradation of the IVD's extracellular matrix (Bond et al., 1998; Malemud, 2019).

The identification and characterization of these cytokines in T2D can highlight new therapeutic

targets and early intervention markers (Al-Shukaili et al., 2013; Herder et al., 2013). In the spine,

inflammatory cytokines contribute to the breakdown of IVD tissue and the development of pain

(Shamji et al., 2010; Risbud and Shapiro, 2014). Pro-inflammatory cytokines like TNF-α, IL-1β,

and IL-6 are upregulated in degenerated and herniated disc tissues, exacerbating the

inflammatory response and advancing tissue damage (Wuertz and Haglund, 2013; Molinos et al.,

2015; Navone et al., 2017; De Geer, 2018). These cytokines also influence the expression of

matrix-degrading enzymes such as ADAMTS-4 and MMP-9, thereby accelerating disc

degeneration (Tian et al., 2013; Zhang et al., 2015). Their role in T2D is similarly significant,

contributing to insulin resistance and beta-cell dysfunction (Calle and Fernandez, 2012).

Elevated levels of pro-inflammatory cytokines in patients with T2D underline their importance in

disease progression (Guest et al., 2008; Velikova et al., 2021), and targeting these cytokines

could open novel therapeutic avenues for both T2D and IVD degeneration (Al-Shukaili et al.,

2013; Herder et al., 2013).

This study aims to compare IVD health in db/db and STZ-HFD mouse models of T2D,

focusing on inflammation, transcriptomics, and morphological as well as mechanical changes

during tissue degeneration [**Figure 1C**] to better understand pathways through which T2D

exacerbates IVD degeneration. Our findings will enhance the understanding of the interplay

between T2D and IVD homeostasis and demonstrate validity of the STZ-HFD model in

recapitulating discogenic changes observed in patients with T2D.

Materials & Methods

Animals.

We used skeletally-mature (12-week-old) male C57BL/6 mice (N = 20) for their established

susceptibility to T2D when exposed to a high-fat diet (HFD) and treated with streptozotocin

(STZ). Previous findings have indicated that this strain, particularly males, exhibits rapid obesity

development under HFD and pronounced insulin resistance following STZ administration (Luo

et al., 1998; Mu et al., 2006; Mu et al., 2009). As a result of estrogen-mediated mechanisms of

protection, female STZ-HFD mice are resistant to developing T2D and are thus excluded from

this study (Medrikova et al., 2012; Pettersson et al., 2012; Stubbins et al., 2012). To contrast the

STZ-HFD model's pathology with a well-characterized model of chronic T2D, we included a

parallel cohort of 3-month-old homozygous (db/db) male $Lepr^{db}$ mutant mice (n=9) with

heterozygous (db/+) littermate controls (n=9), since at this timepoint they have endured a similar

duration of T2D symptoms as the STZ-HFD mice. All mice were group-housed (max. 5 mice per

cage) under pathogen-free conditions in standard cages; the environment was controlled with a

stable temperature and a 12-hour light/dark cycle, with *ad libitum* access to food and water. All

procedures were approved by the Institutional Animal Care and Use Committee (IACUC) of

Washington University in St. Louis. Regular health and welfare assessments were conducted,

including general monitoring of weight, food supply, and behavior.

Study Design.

The study was organized into two phases **[Fig. 1B]**. During the lead-in phase (phase 1), mice

were maintained on a HFD for four to six weeks, after which they received a one-time dose of

STZ. Following injection, mice continued on the HFD for an additional 12 weeks during the

experimental phase (phase 2). The STZ-HFD group (n = 13) was given a high-fat diet (Research

Diets, Inc., D12492i, 60% kcal from fat) for the duration of the study, with the Control + Vehicle

group (n = 7) receiving standard mouse chow (5053 PicoLab® Rodent Diet 20, 13% kcal from

fat). At the end of the initial phase, baseline measurements of body weight and fasting blood

glucose were collected. Following the first phase, STZ-HFD mice were injected intraperitoneally

with 100 mg/kg Streptozotocin (MilliporeSigma) in 50 mM sodium citrate buffer (pH 4.5), with

Con+Veh animals receiving the sodium citrate buffer only. The two experimental groups

received their respective diets for 12 weeks following the injection (experimental phase), and

animals were assessed for diabetic status via glucose tolerance. Finally, animals were euthanized,

and sterile coccygeal functional spine units (FSUs) including IVDs were harvested from each

animal for organ culture and terminal measurements.

Measures of diabetic status.

Several measures of diabetic status were collected at various points throughout the experimental

phase, including fasting blood glucose, % A1C, and glucose tolerance **[Fig. 1A]**. Blood glucose

levels (mg/dL) were measured using a glucometer (GLUCOCARD Vital® Blood Glucose Meter).

Blood samples were drawn via superficial incision to the tail tip of fasted mice using a scalpel;

the tail was immediately treated with analgesic (Kwik Stop® Styptic Powder) after blood

collection. The percentage of glycated hemoglobin (% A1C) was measured using the

A1CNow®+ system (PTS Diagnostics) according to kit instructions. Blood samples were drawn

in the same way as during the blood glucose test. Finally, to assess glucose tolerance (glucose

tolerance test, GTT), mice were fasted and had their blood glucose measured as described above

to establish a baseline. Mice were then injected intraperitoneally with 2 g/kg glucose in sterile

water. Additional blood glucose measurements were taken at 30 min., 60 min., and 90 min. post

injection. The area-under-the-curve (AUC) of blood glucose (mg•h/dL) was calculated over the

course of the test. For the purpose of evaluating diabetic status for inclusion in the study, a cutoff

of 435 mg•h/dL on the GTT, established in previous studies on human T2D criteria (Sakaguchi et

al., 2015), was adjusted for time and interspecies differences in blood glucose levels.

Organ culture.

Following extraction, FSUs were cultured in 2 mL Dulbecco's Modified Eagle Medium/Nutrient

Mixture F-12 Ham with L-glutamine and 15 mM HEPES (Sigma-Aldrich, D6421). Culture

medium was supplemented with 20% fetal bovine serum (Gibco No. A5256801) and 1%

penicillin-streptomycin (Gibco No. 15140122). Cultures underwent a preconditioning period of 7

days with regular media changes to account for the inflammatory response from extraction (Fig.

1C). Conditioned media was collected 48 hours after the final media change at the end of the

preconditioning period and immediately frozen in -80° C.

Chemokine assay.

A multiplex assay of remodeling factors and inflammatory chemokines (45-Plex Mouse

Cytokine Discovery Assay, Eve Technologies Assays; CCL-2,3,4,5,11,12,17,20,21,22; CSF-

1,2,3; IL-1α,1β,2,3,4,5,6,7,9,10,11,12A,12B,13,15,16,17; CXCL1,2,5,9,10; CX3CL1; IFN-γ,β1;

TNFα; LIF; VEGF; EPO; TIMP-1) was performed on conditioned media samples. Cytokine

levels were analyzed using Welch's t-Test. Cytokines with greater than 25% missingness (values

outside of assay range) across all experimental groups were excluded from further analysis.

Significantly upregulated cytokines in each model were selected for a secondary fold change

analysis, where protein expression levels for db/db and STZ-HFD mice were used to calculate

fold change for each cytokine over the corresponding average expression of the control (db/+ and

Con+Veh respectively).

Cytokine Interaction Network Construction and Analysis.

To further investigate the inflammatory profiles of these T2D models, networks of cytokine

interactions were constructed and analyzed using a custom MATLAB (Version: 9.13.0.2080170

R2022b) script. Networks were generated by calculating a Pearson correlation matrix for each

experimental group based on cytokine expression data from the multiplex panel of conditioned

media. To interrogate the strong protein correlations, a threshold ($|r| > 0.7$) was applied to the

correlation matrices. The filtered matrices were used to create undirected graphs, with nodes

representing cytokines and edges representing significant interactions. Centrality measures were

calculated to determine the importance of each cytokine within the networks. Eigenvector

centrality and betweenness centrality were computed for each network using the centrality

function. The resulting centrality values were organized into tables and sorted to identify the top-

ranking cytokines. For each centrality metric, shared high-ranking cytokines between the

diabetic models and unique cytokines for each diabetic model were aggregated. Additionally, key

network characteristics were extracted to understand the structure and function of the cytokine

networks. The average path length was determined using the distances function to compute the

shortest finite paths between all pairs of nodes. Modularity and community structure were

assessed using the Louvain community structure and modularity algorithm (Blondel et al., 2008).

We also computed k-hop reachability to assess the extent to which cytokines can influence each

other within one (k=1) or two (k=2) steps. The Jaccard index was used to compare the

reachability matrices between different groups, providing a measure of similarity. Finally, the

networks were visualized using force-directed layouts with nodes colored by eigenvector

centrality and sized by betweenness centrality.

Histology.

Following removal from culture, FSUs were fixed in 10% neutral-buffered formalin (Epredia™

5735) overnight and decalcified in ImmunoCal (StatLab STL14141) for 72 hours. Samples were

fixed in paraffin, sectioned in the sagittal plane at 10 µm thickness, and stained with Safranin-

O/Fast Green prior to being imaged via Hamamatsu NanoZoomer with a 20x objective. Blinded

histological images of the IVDs were evaluated for degeneration based on a standardized

histopathological scoring system (Melgoza et al., 2021).

Contrast-enhanced Micro-computed Tomography.

Functional spine units were incubated in a 175 mg/mL Ioversol solution (OptiRay 350; Guerbet,

St. Louis) diluted in PBS at 37 °C. Following 4 hours of incubation, the samples underwent

scanning with a Viva CT40 (Scanco Medical) at a 10-µm voxel size, using 45 kVp, 177 µA, high

resolution, and a 300 ms integration time. CEµCT data was exported as a DICOM file for

analysis in a custom MATLAB program

(https://github.com/WashUMusculoskeletalCore/Washington-University-Musculoskeletal-Image-

Analyses). After an initial Gaussian filter (kernel size = 5), functional spine units were

segmented by drawing a contour around the perimeter of the IVD every 10 transverse slices and

morphing using linear interpolation. This was defined as the whole disc mask. The NP was

segmented from the whole disc by thresholding and performing morphological close and

morphological open operations to fill interior holes and smooth NP boundaries. The volumes and

intensities were calculated from the NP and whole disc regions. Disc height index (DHI) was

measured by averaging the height-to-width ratio of the IVD over five slices in the mid-sagittal

plane. Finally, the NP intensity/disc intensity (NI/DI) ratio and NP volume fraction (NPVF; NP

volume / total volume) was computed using the intensity and volume metrics reported by the

output analysis within the MATLAB program. All thresholding and analysis were performed

using blinded and validated methods (Lin et al., 2016; Lin and Tang, 2017).

Mechanical Testing.

Mechanical testing of functional spine units was performed using cyclic compression on a

microindentation system (BioDent; Active Life Scientific) with a 2.39 mm probe as previously

described (Liu et al., 2015). Samples were adhered to an aluminum plate and placed in a PBS

bath prior to aligning the sample beneath the probe with a 0.03 N preload. Each unit was then

sinusoidally loaded in compression at 1 Hz for 20 cycles with a 35 μm amplitude. A loading

slope value was calculated from the linear region of the force-displacement curve, and the loss

tangent (tan delta) was calculated from the phase delay between loading and displacement (Liu et

al., 2015).

Matrix Protein Assays.

Whole extracted discs were used to measure the biochemical content of various matrix proteins.

First, discs were digested overnight in a papain digestion buffer, after which the buffer was

collected for a 1,9-dimethylmethylene blue assay of sulfated glycosaminoglycan content with a

chondroitin sulfate standard (Liu et al., 2017). The disc was then subjected to high temperature

244 bulk hydrolyzation in 12 N HCl. Hydrolysates were desiccated and reconstituted with 0.1x

245 phosphate-buffered saline (PBS) and measured against a quinine standard for advanced glycation

246 end product content (Liu et al., 2017). Finally, a hydroxyproline assay was used to quantify

247 collagen content (Liu et al., 2017).

249 *RNA Collection and Sequencing Analysis.*

250 Sterile extracted IVDs were placed directly into cold media. After extraction, IVDs were flash-

251 frozen in liquid nitrogen and homogenized via ball mill (Sartorius Mikro-Dismembrator U).

252 Homogenates were resuspended in TRIzol Reagent (Invitrogen 15596-026) and centrifuged at

253 800 RCF for 5 minutes. Supernatant was collected, purified, and isolated using column filtration

254 (Zymo Research Direct-zol RNA Microprep Kit R2060). Samples were prepared, indexed,

255 pooled, and sequenced on an Illumina NovaSeq X Plus, with basecalls and demultiplexing done

256 using DRAGEN and BCLconvert version 4.2.4. RNA-seq reads were aligned to the Ensembl

257 release 101 assembly with STAR 2.7.9a1, and gene counts were derived using

258 Subread:featureCount version 2.0.32. Isoform expression was quantified with Salmon 1.5.23,

259 while sequencing performance was assessed using RSeQC 4.04. Gene counts were normalized

260 using EdgeR, and low-expressed genes were excluded. The count matrix was transformed to

261 moderated log 2 counts-per-million with Limma's voomWithQualityWeights, and differential

262 expression analysis was performed. Specific genes related to sugar reduction and dicarbonyl-

263 compound formation (a precursor reaction in the formation of AGEs) were initially identified,

264 along with ligands for RAGE, regulators of NF-kappaB function, and adipokines. A subsequent

265 broader analysis of global perturbations in GO terms, MSigDb, and KEGG pathways was

266 performed using GAGE. To better understand the types of the pathways altered in T2D, pathway

analysis was grouped into functional categories for visualization. For shared or similar pathways

within each category, the broader pathway encompassing more genes was elected for

visualization. All pathways and genes were filtered for significance with corrections for false-

discovery rate, and individual genes were excluded if the absolute value of $\log_2$ (fold change)

was less than 1. All visualization was performed using GraphPad Prism 10.3.1 v509.

Results

{Figure 2}

The db/db and STZ-HFD Mouse Models Exhibit a Characteristically Diabetic Phenotype

Both db/db and STZ-HFD mice demonstrate hallmark features of diabetes **[Fig. 2]**. Both

groups exhibit AUC GTT values above the defined threshold, indicating impaired glucose

tolerance [**Fig. 2A**]. The STZ-HFD mice show severe glucose intolerance compared to Con+Veh

mice ($p < 0.0001$). The terminal body weights show that db/db mice weigh significantly more

than both db/+ and STZ-HFD mice, [**Fig. 2B**]. The terminal fasting blood glucose levels indicate

a significant difference only between the STZ-HFD and Con+Veh groups, demonstrating notable

fasting hyperglycemia in the STZ-HFD mice, but not in db/db mice [**Fig. 2C**]. HbA1c levels

reveal no difference between db/db mice and STZ-HFD mice, but each group significantly

differs from their respective controls [**Fig. 2D**]. This indicates that both models exhibit chronic

hyperglycemia, confirming their relevance as models of T2D.

{Figure 3}

Histopathological Analysis Reveals IVD Degeneration in STZ-HFD Mice

The IVDs of STZ-HFD mice exhibited more degeneration compared to the IVDs of

controls and the db/db mice. **Figure 3** presents a comparison of histological phenotypes across

the four groups (db/+, db/db, Con+Veh, and STZ-HFD), showing the range of histopathological

scores within this study [**Fig. 3A**]. Histopathological scoring revealed that only the STZ-HFD

mice exhibit significantly greater IVD degeneration compared to the control group [**Fig. 3B**]. In

the Con+Veh samples, the annulus fibrosus has healthy, convexed outer lamellae (➡) and well-

organized, concentric inner lamellae (▼). In contrast, the STZ-HFD samples show degenerate

crimped, concave outer lamellae (⇨) and wavy, disorganized inner lamellae (▽), indicating

altered matrix structure in the AF **[Fig. 3C]**.

{Figure 4}

CT Analysis, Matrix Assays, and Mechanical Testing All Show No Major Effects in T2D IVD

The analysis of CEμCT data, mechanical testing, and matrix protein assays revealed only one

significant difference among the four groups across all nine measured outcomes. Specifically,

parameters such as NI/DI, NPVF, loading slope, hysteresis energy, tan delta, and biochemical

content showed no variations between groups. The only statistically significant result was a

difference in morphology between the db/db and STZ-HFD groups, as indicated by the DHI.

These findings suggest that the structural integrity, mechanical behavior, and biochemical

composition of the IVDs are mostly consistent across the db/db and STZ-HFD models. The lack

of significant differences broadly implies that, under the conditions tested, type 2 diabetes does

not markedly affect IVD properties in these models and cannot further establish the degenerate

features gleaned in the histopathological analysis. This highlights the need for more sensitive

measures or longer study durations to detect subtle changes related to T2D.

{Figure 5}

Immunomodulatory Cytokines Are Chronically Upregulated in STZ-HFD IVDs

The comparative analysis of cytokine expression levels between db/db and STZ-HFD

models provides novel insights into diabetic inflammation of the IVD. The initial comparative

analysis of the two models' protein expression levels revealed that two cytokines (CCL2, CCL3)

and sixteen cytokines (CCL2,3,4,5,12; CXCL1,2,9,10; CX3CL1; IL-2,6,16; CSF-3; VEGF; LIF)

were upregulated in the db/db and STZ-HFD models respectively, and thus included in the fold

change analysis. The fold change in cytokine levels is computed over their respective controls

(db/+ for db/db, Con+Veh for STZ-HFD) **[Fig. 4A]**. The STZ-HFD model exhibited a

significantly higher fold increase compared to the db/db model for 8 cytokines: CXCL2, CCL2,

CCL3, CCL4, CCL12 (monocyte/macrophage associated cytokines) (Sagar et al., 2012; Arendt

et al., 2013; Lança et al., 2013; Etna et al., 2014; Motwani and Gilroy, 2015; He et al., 2016; Lim

et al., 2016; DeLeon-Pennell et al., 2017; Ruytinx et al., 2018; Sindhu et al., 2019; Zhang et al.,

2019, 38; Huang et al., 2020; Pelisch et al., 2020; Yang et al., 2020; Xu et al., 2021a; Xu et al.,

2021b; Sheng et al., 2022), IL-2, CXCL9 (T-cell associated cytokines) (Chang and Radbruch,

2007; Venetz et al., 2010; Shachar and Karin, 2013; Ochiai et al., 2015; Boff et al., 2018; Kuo et

al., 2018; Mortara et al., 2018; House et al., 2020; Marcovecchio et al., 2021; Markovics et al.,

2022), and CCL5 (pleiotropic cytokine) (Juhas et al., 2015; Atri et al., 2018; Kranjc et al., 2019;

Chen et al., 2020; Zeng et al., 2022). Representing the overlapping cytokine expression profiles

through a Venn diagram revealed that the STZ-HFD model encompassed a large number of

upregulated cytokines [**Figure 4B**]. The inner circle represents the db/db model, containing only

the two upregulated cytokines, both of which are also upregulated in the STZ-HFD model. This

indicates that the STZ-HFD model has a broader and more pronounced cytokine response

compared to the db/db model.

{Figure 6}

Differential Network Structures Reveal Unique Inflammatory Pathways of T2D in IVD

Our analysis of cytokine networks in these two models revealed several key insights into

the inflammatory pathways associated with T2D (**Fig. 6A**). CCL2 and CCL4 emerged as pivotal

cytokines in both models based on betweenness centrality, highlighting their crucial roles in

maintaining network connectivity (**Error! Reference source not found.**). In the db/db mouse

model, unique cytokines were identified that are likely influenced by the absence of leptin

signaling. These included CSF-3 (betweenness centrality), CXCL-5, CXCL-9, CXCL-10, and

IL-4 (eigenvector centrality), and IL-11 (both centralities) (**Error! Reference source not**

found.). In contrast, the STZ-HFD mouse model, which maintains functional leptin signaling

and mimics human T2D etiology, presented a different profile of unique cytokines. CXCL2 and

IL-6 (betweenness centrality), and IL-16, CCL11, and CSF3 (eigenvector centrality) were central

in this model (**Error! Reference source not found.**). This indicates that these cytokines may be

independently regulated through pathways that are either bypassed or inhibited in the

simultaneous presence of leptin signaling and T2D-associated chronic inflammation. The db/db

model demonstrated a shorter average path length compared to the STZ-HFD model (**Error!**

Reference source not found.), indicating more efficient communication within the cytokine

network of the db/db model. The longer path length in the STZ-HFD model suggests a more

dispersed network structure, consistent with the wide array of upregulated cytokines across

multiple signaling cascades. Additionally, the STZ-HFD network had the highest modularity

(**Error! Reference source not found.**). Higher modularity in the STZ-HFD model indicates

well-defined communities within the cytokine network, reflecting distinct functional signaling

pathways in a broad inflammatory response. The lower modularity in the db/db model suggests a

less distinct community structure and a more generic inflammatory response. The Jaccard index

values for the STZ-HFD and WT comparisons were 0.144 (k=1) and 0.246 (k=2), indicating low

similarity between these networks. Comparisons between db/db and db/+ showed slightly higher

values, indicating closer similarity (**Error! Reference source not found.**). This suggests

significant changes in the cytokine networks of the STZ-HFD model, while the db/db model

retains more similarity to its control, reflecting less drastic alterations to the inflammatory

signaling cascade.

{Figure 7}

STZ-HFD IVDs Show Distinct Gene Expression and Pathway Dysregulation in RNA-Seq

Analysis

The RNA-seq analysis revealed significant differences between the db/db and STZ-HFD

models in several biological processes, particularly those related to type 2 diabetes-related

pathways, immune response, ECM organization, metabolic function, and signal transduction.

Seven genes associated with non-enzymatic glycosylation and sugar reduction, both critical

processes in Type 2 Diabetes pathology through the formation of AGEs, were differentially

expressed between the db/db and STZ-HFD models (**Fig. 7A**). In the db/db model, 2 genes were

upregulated and 1 was downregulated (*Cbr3*, *Aldoa; Pfkp*), whereas in the STZ-HFD model, 4

genes were upregulated and 2 were downregulated (*Tpi1, Aldoa, Pfkfb1, Pfkm; Aldoc, Pfkp*).

This indicates a more pronounced alteration in pathways related to formation of advanced

glycation end products (AGEs), under STZ=HFD conditions. Additionally, *ITGB2*, a component

of an alternative ligand for the receptor for AGEs (RAGE), which play a key role in diabetic

complications, was downregulated compared to controls in both models (**Fig. 7A**). Notably, the

RAGE receptor itself did not show significant changes in either model. Furthermore, NF-κB

signaling, a pathway implicated in inflammatory responses downstream of RAGE signaling, was

moderately affected; in the db/db model, one gene was upregulated and one downregulated

(*Tank; Nfkbiz*), while only one gene (*Nfkbiz*) was downregulated in the STZ-HFD model (**Fig.**

7A). Regarding adipokine signaling, which is critical in the regulation of glucose and lipid

metabolism in Type 2 Diabetes, 2 genes related to leptin signaling (*Lepr, Lep*) were differentially

expressed in the STZ-HFD model and not in the db/db model (**Fig. 7A**). This ultimately

strengthens our initial hypothesis regarding the role of leptin signaling in mediating diabetic

inflammation and degeneration of the IVD.

Enrichment analysis identified eight pathways in the Molecular Signatures Database

(MSigDB, https://www.gsea-msigdb.org/gsea/msigdb) significantly affected in the STZ-HFD

model, all of which are crucial for immune response and inflammation. These included the

upregulation of ubiquitination and proteasome degradation, and the downregulation of pathways

such as Fcgamma receptor-dependent phagocytosis, cell surface interactions at the vascular wall,

innate immune system, transcriptional regulation of granulopoiesis, the Tyrobp causal network in

microglia, complement cascade, and lymphoid/non-lymphoid interactions (**Fig. 7B**).

Interestingly, none of these pathways were significantly altered in the db/db model, highlighting

a distinct inflammatory and immune regulation in the STZ-HFD model.

Eight MSigDB pathways related to ECM and structural organization were significantly

altered between the models. In the db/db model, the pathway associated with cell adhesion

molecules was downregulated. Conversely, in the STZ-HFD model, several pathways were

downregulated, including amyloid fiber formation, collagen formation, chondroitin sulfate

metabolism, proteoglycans, glycosaminoglycan metabolism, ECM glycoproteins, and the

matrisome (**Fig. 7C**). This suggests that ECM remodeling and structural integrity are more

disrupted under STZ-HFD conditions compared to db/db at the transcriptional level.

The analysis also revealed six MSigDB pathways significantly impacted by metabolic

function. Both models showed upregulation in oxidative phosphorylation, TCA cycle and

respiratory electron transport, and fatty acid metabolism. However, additional pathways were

specifically upregulated in the STZ-HFD model, including glyoxylate metabolism and glycine

degradation, amino acid metabolism, and glycolysis and gluconeogenesis (**Fig. 7D**). This

indicates a greater depth to the metabolic dysfunction in the STZ-HFD model relative to db/db.

414   Finally, six MSigDB pathways were identified as being significantly involved in signal

transduction and tissue differentiation. In the STZ-HFD model, pathways related to protein

localization and PPAR signaling were upregulated, while pathways involved in secreted factors,

the formation of beta-catenin complexes, IGF transport and IGFBP uptake, and endochondral

ossification were downregulated (**Fig. 7E**). These findings suggest alterations in signaling

mechanisms and tissue differentiation processes that are more pronounced in the STZ-HFD

model compared to db/db. Overall, the STZ-HFD model exhibited more extensive and varied

disruptions across multiple canonical biological pathways, as well as type 2 diabetes-related

genes and processes, including those involved in glycosylation, immune response, ECM

structure, metabolism, and signal transduction, indicating its utility in studying complex

metabolic and inflammatory disorders compared to the db/db model.

Discussion

This study offers novel insights into the chronic inflammatory profiles and degeneration in the IVD of murine T2D models, specifically comparing the db/db and STZ-HFD mouse models. Our key findings indicate that while both models display characteristic diabetic phenotypes (Dalgaard and Pedersen, 2001; Cefalu, 2006; Lin and Sun, 2010), the STZ-HFD model shows pronounced IVD degeneration and a more extensive inflammatory response, positioning it as a more clinically relevant model for studying T2D-related complications and inflammation in the IVD. (Gilbert et al., 2011; Stott and Marino, 2020).

In terms of IVD degeneration, our study demonstrates that histopathologically STZ-HFD mice exhibit significantly greater IVD degeneration compared to controls, indicating a notable degenerative phenotype. Assessment of structural integrity, mechanical behavior, and biochemical composition did not reveal further significant differences, however. In contrast, db/db mice, despite severe obesity, insulin resistance, and chronic hyperglycemia, show milder IVD degeneration compared to littermate controls. This observation aligns with existing literature which reports moderate IVD degeneration in db/db mice influenced by variables such as sex and specific metabolic disruptions (Lintz et al., 2022; Natelson et al., 2020; Li et al., 2020).

Our findings establish the STZ-HFD model as a superior and more physiologically relevant platform to study T2D associated inflammation. This model demonstrated a pronounced upregulation of 16 different cytokines, including key mediators involved in monocyte and macrophage recruitment, T-cell activation, and pleiotropic immune response. Notably, the upregulation of cytokines such as CXCL2 (Rebuffat et al., 2018; Pan et al., 2021), CCL2, CCL3 (Neumeier et al., 2011; Arner et al., 2012; Sullivan et al., 2013; Sindhu et al., 2017; Chang et al.,

2021), CXCL9, IL2 (Higurashi et al., 2009; Nawaz et al., 2013; Pan et al., 2021; Suri et al.,

2022), CCL4 (Chang et al., 2021; Pan et al., 2021; Mir et al., 2024) and CCL5 closely mirrors

inflammatory profiles observed in human T2D (Keophiphath et al., 2010; Pettigrew et al., 2010;

Inayat et al., 2019; Chang et al., 2021; Pan et al., 2021; Alshammary et al., 2023; Mir et al.,

2024), highlighting its translational potential. In contrast, the db/db model, while still relevant,

exhibits a more limited cytokine profile, limited by the absence of leptin signaling (Francisco et

al., 2018).

Cytokine network analysis further identified the distinct cytokine interactions in STZ-

HFD IVD, revealing regulatory mechanisms and broader pathway activation. This model

exhibited greater network modularity and longer average path length, suggesting a highly

structured and complex inflammatory response involving specific functional pathways, reflecting

the interplay between obesity, insulin resistance and systemic inflammation (Francisco et al.,

2018; Rebuffat et al., 2018; Sharma, 2018; Segar et al., 2019; Pan et al., 2021). Key cytokines

such as CXCL2, IL-6, IL-16, CCL11, and CSF3 emerged as central mediators, indicating their

potential as therapeutic targets for attenuating T2D inflammation in the IVD. In contrast, the

db/db model and the absence of leptin signaling resulted in a compensatory inflammatory

network dominated by cytokines like CSF-3, CXCL-5, CXCL-9, CXCL-10, IL-4, and IL-11.

Leptin's role in regulating the immune responses is essential (Francisco et al., 2018); and its

deficiency may have resulted in a stifled, less complex inflammatory response, which also aligns

with the less severe increase in IVD degeneration over controls

The RNA-seq data reveals significant transcriptional alterations in T2D related pathways

within the IVD, underscoring that the IVD is not spared from the metabolic and inflammatory

complications of T2D, particularly in the STZ-HFD model. This model showed alterations in

non-enzymatic glycosylation and sugar reduction pathways, indicate a hyperglycemic

environment conducive to the formation of AGEs (Twarda-Clapa et al., 2022), and effectively

captured early molecular events that lead to AGE accumulation and subsequent tissue damage

within the IVD, though the 12 week timepoint may not suffice for AGEs deposition in the IVD

matrix. Additionally, changes in leptin, RAGE, and NF-kB pathways indicate the STZ-HFD

model's potential for studying chronic inflammation and oxidative stress-related complications

within the IVD, a key aspect of T2D pathology (Broz et al., 2021). The lack of significant

changes in the RAGE receptor itself, combined with downregulation of RAGE ligands in the

STZ-HFD model, suggests a complex inflammatory profile that might be indicative of a chronic

rather than acute response within the IVD tissue.

Canonical pathway analysis further emphasizes the distinct biological functions altered in

these T2D models. In the STZHFD model, the significant upregulation of ubiquitination and

proteasome degradation pathways, coupled with the downregulation of immune-related pathways

within the IVD, suggests a stress response aimed at managing protein damage, reflecting the

chronic inflammatory state associated with metabolic diseases like T2D (Garcia-Martinez et al.,

2015). The downregulation of ECM and structural organization pathways, including collagen

formation and ECM glycoproteins, hints at impairment of tissue remodeling and fibrosis within

the IVD, aligning with the structural changes observed in the histopathological analysis of the

STZHFD IVD. In contrast, metabolic pathways such as oxidative phosphorylation and fatty acid

metabolism were upregulated in both models, reflecting increased metabolic demands. However,

the STZHFD model showed additional upregulation in pathways like glyoxylate metabolism and

glycolysis/gluconeogenesis, indicating more extensive metabolic reprogramming within the IVD,

further illustrating the model's ability to capture the systemic nature of T2D-related

complications (Joshi et al., 2020; Dhawan et al., 2022).

The transcriptional data, while revealing, must be interpreted with caution, particularly

within the context of IVD tissue. While the STZHFD model showed downregulation of ECM-

related pathways at the mRNA level, compensatory translational mechanisms may prevent a

corresponding reduction in ECM proteins, and the modest changes in NF-κB signaling

underscore the limitations of transcriptomic data alone (Mobeen and Ramachandran, 2020; Wang

et al., 2020). Consequently, integrating proteomic data with transcriptomic analyses is essential

for fully understanding the molecular underpinnings of T2D in the IVD.

Despite these significant findings, this study has several limitations. The selection of

cytokines examined was relatively small, potentially missing other important inflammatory

mediators involved in IVD degeneration. Additionally, the mechanistic link between

inflammation and degeneration remains unclear and warrants further investigation. While the

STZ-HFD model provides a comprehensive inflammatory profile, the specific pathways driving

the observed IVD degeneration need to be elucidated through future studies to appropriately

identify therapeutic targets. Future directions for research based on our findings include

expanding the panel of cytokines and other inflammatory mediators examined in the STZ-HFD

model to gain a more complete understanding of the inflammatory landscape in T2D.

Investigating the specific molecular and cellular mechanisms linking inflammation to IVD

degeneration will be crucial to furthering future therapeutic approaches. Finally, exploring

therapeutic interventions targeting the identified cytokine pathways could provide insights into

potential treatments for T2D-related IVD degeneration.

In conclusion, our findings establish the STZ-HFD model as a more physiologically

relevant model for studying T2D-related inflammation and IVD degeneration. The extensive

cytokine upregulation and significant degenerative phenotype observed in this model provide a

valuable framework for future research into T2D-associated pathologies. The db/db model, while

still relevant, exhibits a more stunted cytokine profile and limited IVD degeneration, making it

less representative of the chronic inflammatory environment seen in human T2D. These insights

enhance our understanding of T2D-induced IVD degeneration and identify key cytokine

pathways for therapeutic development, emphasizing the need to address these pathways

holistically for effective intervention.

Competing Interests

Authors declare no competing interests.

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Figure 1. Experimental design, animal model, and workflow of the current study. (A) The db/db model arises due to a point mutation in the leptin receptor gene, while the STZ-HFD model develops diabetes through a pro-glycemic diet and beta cell impairment. Both models present symptoms of obesity, chronic hyperglycemia, and insulin resistance, though the magnitude can vary both between and within each model. **(B)** The experimental timeline outlines the progression of the study for both models. The db/db mice are acquired at skeletal maturity (12 weeks old) and sacrificed after metabolic measurements are collected. For the STZ-HFD model, mice undergo a lead-in phase of 4-6 weeks on a HFD followed by a single low dose of STZ. Subsequently, the experimental phase for the STZ-HFD mice continues with HFD for 12 weeks, with periodic assessments of fasting blood glucose, A1c levels, and glucose tolerance. **(C)** After sacrifice, FSUs, consisting of the intervertebral disc and the adjacent vertebral bodies, are extracted from mice. FSUs are then utilized for terminal measures pictured above.

Figure 2. Both db/db and STZ-HFD mice represent a characteristically T2D phenotype. (A) AUC GTT shows elevated glucose intolerance in db/db and STZ-HFD mice, with a highly significant difference between Con+Veh and STZ-HFD (p < 0.0001). **(B)** Terminal body weights indicate db/db mice are significantly heavier than db/+ and STZ-HFD mice. **(C)** Terminal fasting blood glucose levels are significantly higher in STZ-HFD mice compared to Con+Veh. **(D)** HbA1c levels indicate chronic hyperglycemia in both db/db and STZ-HFD mice, with no difference between them, but significant differences from their respective controls.

Figure 3. STZ-HFD mice exhibit more severe histopathological IVD degeneration compared to db/db mice. (A) Comparison of histological phenotypes in db/+, db/db, Con+Veh, and STZ-HFD groups, showing best, median, and worst samples. **(B)** Histopathological scoring shows significantly greater IVD degeneration in STZ-HFD mice versus controls. **(C)** Con+Veh samples have healthy lamellae (▼➡); STZ-HFD samples show degenerate, disorganized lamellae (⇨▽).

Figure 4. Comparative analysis of IVD structure, mechanics, and composition are similar between db/db and STZ-HFD mice. (A)-(C) NPVF, NIDI, and DHI indicate few significant differences in structural integrity between the models. **(D)-(F)** Load slope, energy dissipated, and phase shift demonstrating no significant variations in viscoelastic mechanical behavior. **(G)-(I)** Biochemical content measurements, including collagen, s-GAG, and AGEs, show no significant differences.

Figure 5. STZ-HFD IVD Produces a More Pro-Inflammatory Microenvironment than the db/db IVD in Comparative Analysis of Cytokine Expression. (A) The STZ-HFD model shows a significantly higher fold increase for eight cytokines: CXCL2, CCL2, CCL3, CCL4, CCL12 (monocyte/macrophage associated), IL-2, CXCL9 (T-cell associated), and CCL5 (pleiotropic). **(B)** The STZ-HFD model encompasses a broader and more pronounced cytokine response compared to the db/db model, highlighting the extensive upregulation of inflammatory cytokines in the STZ-HFD model.

Figure 6. STZ-HFD IVD Invokes Unique Inflammatory Signaling Pathways in Networks of Cytokine Expression. (A) The STZ-HFD model shows a distinct network structure, demonstrating the unique upregulation of various inflammatory pathways **(B)** The STZ-HFD and db/db networks each rely on a number of unique (red/blue) and shared (purple) cytokines, indicating both leptin-dependent and leptin-independent inflammatory signaling cascades **(C)** The STZ-HFD mouse model displays a fragmented and modular cytokine network, indicating the parallel signaling of multiple signaling pathways.

Figure 7. Enhanced Pathway Disruption in the STZHFD Model Highlights the Complexity of T2D Pathophysiology in the IVD (A) The STZHFD (marked with 2) model exhibits greater transcriptional alterations in T2D-related pathways than db/db (marked with 1) model, particularly in non-enzymatic glycosylation and RAGE signaling. **(B)** Immune response and inflammation pathways, including ubiquitination and proteasome degradation, are significantly disrupted in the STZHFD model but remain unaltered in db/db. **(C)** ECM remodelingd structural integrity pathways are more extensively downregulated in the STZHFD model, suggesting greater tissue disruption. **(D)** Metabolic dysfunction is more pronounced in the STZHFD model, with additional upregulation of pathways involved in amino acid metabolism and gluconeogenesis. **(E)** Signal transduction and tissue differentiation pathways show significant alterations in the STZHFD model, indicating complex changes in cellular communication and development processes.

(A)

	Best	Median	Worst
db/+	Score: 4	Score: 7	Score: 7
db/db	Score: 9	Score: 10	Score: 11
Con+Veh	Score: 4	Score: 6	Score: 6
STZHFD	Score: 7	Score: 10	Score: 12

500 µm

(B) IVD Degeneration

Degeneration Score (0-35)

p = 0.0143

db/+ db/db Con+Veh STZHFD

NP
AF
IF
EP

(C)

(A)

Control+Vehicle

STZHFD

Eigenvector Centrality

High

Low

(B)

Heatmap of Most Central Cytokines

Cytokines

CCL11
CSF3
CXCL2
IL16
IL6
CCL2
CCL4
CXCL10
CXCL5
CXCL9
IL11
IL4

STZHFD — db/db

Condition

Unique Centrality (Diabetic Δ Control)

Shared Centrality (STZHFD ∩ db/db)

No Centrality

(C)

Metric	Con+Veh	STZHFD	db/+	db/db
Path Length	1.3	2.3	1.3	1.3
Modularity	0.34	0.45	0.29	0.18
	Con+Veh vs STZHFD	db/db vs STZHFD	db/+ vs db/db	db/+ vs Con+Veh
Jaccard Index (k=1)	0.14	0.13	0.21	0.15
Jaccard Index (k=2)	0.25	0.24	0.37	0.32

(A) Heatmap of T2D associated genes

(B) Immune Response and Inflammation

(C) ECM and Structural Organization

(D) Metabolism

(E) Signal Transduction and Differentiation