TOXICOGENOMICS AND OMICS TECHNOLOGIES



# Transcriptional profiling of the response to the trichloroethylene metabolite *S*-(1,2-dichlorovinyl)-L-cysteine revealed activation of the eIF2α/ATF4 integrated stress response in two in vitro placental models

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## Abstract

Trichloroethylene (TCE) is an industrial solvent and widespread environmental contaminant. Although TCE exposure is prevalent, epidemiological studies of TCE exposure associations with adverse birth outcomes are inconclusive. Prior studies show that the TCE metabolite S-(1,2-dichlorovinyl)-L-cysteine (DCVC) exhibits toxicity in a placental cell line. In the current study, genome-wide gene expression and gene set enrichment analyses were used to identify novel genes and pathway alterations in the HTR-8/SVneo human trophoblast cell line and human placental villous explants treated with DCVC at concentrations relevant to human exposures. In the cells, concentration- and time-dependent effects were observed, as evidenced by the magnitude of altered gene expression after treatment with 20 µM DCVC versus 10 µM, and 12-h versus 6-h of treatment. Comparing the two models for the transcriptional response to 12-h 20 µM DCVC treatment, no differentially expressed genes reached significance in villous explants, whereas 301 differentially expressed genes were detected in HTR-8/SVneo cells compared with non-treated controls (FDR < 0.05 + LogFC > 0.35 [FC > 1.3]). GSEA revealed five upregulated enriched pathways in common between explants and cells (FDR < 0.05). Moreover, all 12-h DCVC treatment groups from both models contained upregulated pathways enriched for genes regulated by the ATF4 transcription factor. The overrepresentation of ATF4 regulation of differentially expressed genes indicated activation of the integrated stress response (ISR), a condition triggered by multiple stress stimuli, including the unfolded protein response. DCVC-induced ISR activation was confirmed by elevated eIF2a phosphorylation, ATF4 protein concentrations, and decreased global protein synthesis in HTR-8/SVneo cells. This study identifies a mechanism of DCVC-induced cytotoxicity by revealing the involvement of a specific stress signaling pathway.

Keywords Trichloroethylene · S-(1,2-dichlorovinyl)-l-cysteine (DCVC) · Placenta · Integrated stress response · ATF4

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# Introduction

Trichloroethylene (TCE) is a volatile organic compound that belongs to a class of chlorinated hydrocarbons with potent solvent properties. Throughout the twentieth century, the chemical was widely used as a dry cleaning solvent and vapor metal degreaser with little attention paid to disposal methods (Chiu et al. 2013; Waters et al. 1977). Despite substantial efforts in recent decades to clean up and prevent further TCE environmental contamination, legacy pollution of soil and groundwater remains, as evidenced by TCE detection in thousands of hazardous waste sites across the United States (U.S. EPA (Environmental Protection Agency) 2019a; U.S. EPA (Environmental Protection Agency) 2019b). Due to ongoing usage and persistent environmental contamination, occupational and community-based TCE exposure in humans is widespread.

TCE exposure during pregnancy is associated with adverse birth outcomes, including multiple measures of restricted (or reduced) fetal growth (Forand et al. 2012; Ruckart et al. 2014). In rats, TCE treatment during midgestation decreases fetal weight and elevates oxidative stress biomarkers in the placenta (Loch-Caruso et al. 2019). Despite links between TCE exposure and elevated risks of adverse birth outcomes in humans and rats, the underlying toxicological mechanisms of these associations have scarcely been explored, as previously reviewed by Elkin et al. (2020c). The placenta, the multifaceted organ that supports the fetus during pregnancy, is at risk of TCEinduced toxic injury because it is capable of metabolizing TCE to its reactive metabolites (Burton and Fowden 2015), and is likely in direct contact with the chemical and its metabolites circulating in maternal blood (Laham 1970). Indeed, one study reported TCE blood concentration levels of approximately 2 mg/L in females volunteers exposed to 100 ppm TCE for 4 h via inhalation (Fisher et al. 1998).

Placental development during the first trimester is especially vulnerable to xenobiotic insult because the first trimester encompasses a critical window for establishing adequate maternal blood supply to the placental bed. Fetal origin extravillous trophoblasts are specialized placental cells that play a critical role in placentation. During the first trimester, these cells acquire an invasive phenotype and migrate into the maternal decidua from the chorionic villi. Once in the decidua, the cells facilitate remodeling of the spiral arteries necessary for increased maternal blood supply to the placenta (Burton and Jauniaux 2015; Pijnenborg et al. 1981). Furthermore, as the pregnancy progresses to the second and third trimesters, the extravillous trophoblasts form cell columns at the tips of chorionic villi that anchor the villi to the maternal basal plate and stabilize them in the intervillous space (Kaufmann and Castellucci 1997). Dysfunctional trophoblasts may jeopardize the maternal blood supply to the placenta and result in abnormal placental development. Moreover, placental insufficiency, a condition caused in part by inadequate spiral artery remodeling, may contribute to intrauterine growth restriction (Burton and Jauniaux 2015), preterm birth (Morgan 2014) and pre-eclampsia (Brosens et al. 1972; Steegers et al. 2010).

The TCE glutathione conjugation-derived metabolite S-(1,2-dichlorovinyl)-L-cysteine (DCVC) induces cytotoxicity in HTR-8/SVneo, a placental cell line that models first-trimester extravillous trophoblasts (Elkin et al. 2020a; Hassan et al. 2016). However, prior mechanistic studies of DCVC-induced cytotoxicity in placental cells have focused on specific molecular signaling pathways and biological responses, including reactive oxygen species generation, lipid peroxidation, inflammatory responses, mitochondrial dysfunction and apoptotic signaling (Elkin et al. 2019, 2018; Hassan et al. 2016). Application of comprehensive discovery approaches such as genome-wide gene expression profiling allows for the unbiased characterization of toxicity mechanisms without relying on individual pre-selected pathways and/or processes.

In the current study, high throughput RNA sequencing was used to quantify genome-wide DCVC-induced differential gene expression in two different first trimester placental models in vitro. The HTR-8/SVneo cells, with an extravillous trophoblast phenotype, were used to evaluate transcriptional responses in this specific critical cell type. Villous explants from first trimester placentae were used to evaluate transcriptional responses in intact villi tissue with multiple interacting cell types, including extravillous trophoblasts. Both of these placental models have been used extensively to study placental biology and pathophysiology (Huckle 2017; Orendi et al. 2011) and to study the effect of xenobiotics on the placenta (Kovo and Golan 2008). Subsequently, gene set enrichment testing was used to identify biological pathways and/or processes targeted by DCVC and re-evaluate previously identified pathways. The most notable pathway identified was the endoplasmic reticulum unfolded protein response (UPR), a cellular response designed to rid cells of accumulated misfolded proteins in the endoplasmic reticulum (ER). Upon further characterization of genes enriched in this pathway, the specific involvement of the integrated stress response (ISR), a condition triggered by the UPR and other stress stimuli, was revealed (Pakos-Zebrucka et al. 2016). Because the ISR is characterized by eIF2 $\alpha$  phosphorylation, causing protein synthesis restriction and selective activation of transcription factor 4 (ATF4)-mediated upregulation of amino acid biosynthesis and transport genes (Pakos-Zebrucka et al. 2016), additional experiments were conducted to confirm ISR activation by measuring global protein synthesis, phosphorylation levels of eIF2 $\alpha$  and protein concentrations of ATF4 as key regulators of ISR activation. Lastly, cell cycle progression and proliferation were determined in the cell model to evaluate functional consequences of DCVC treatment and ensure no acute cellular toxicity.

## **Materials and methods**

The overall experimental design is outlined in Fig. 1. The effects of DCVC on gene expression were determined in placental villous explants and HTR-8/SVneo cells using RNA sequencing and gene set enrichment analysis. Follow-up experiments were conducted to verify the affected genes and pathways in HTR-8/SVneo cells.

1597



Fig. 1 Overall experimental design. HTR-8/SVneo cells and villous explant tissues were exposed to 0, 10 or 20  $\mu$ M DCVC for 6 or 12 h. RNA sequencing and gene set enrichment analysis were performed to

identify novel genes and pathways affected by DCVC treatment. Follow-up experiments were conducted to verify the affected genes and pathways in HTR-8/SVneo cells

## **Tissue and cell culture reagents**

Cell and tissue culture reagents including RP mine and without phenol red, advanced DMEM/F-12 culture medium, 10,000 U/mL penicillin and 10,000 µg/mL streptomycin (P/S) mixed solution, Antibiotic–Antimycotic (Anti-Anti) mixed solution and fetal bovine serum (FBS) were purchased from Gibco, a division of Thermo Fisher Scientific (Waltham, MA, USA). Phosphate buffered saline (PBS) and 0.25% trypsin were purchased from Invitrogen Life Technologies (Carlsbad, CA, USA).

The TCE metabolite *S*-(1, 2-dichlorovinyl)-L-cysteine (DCVC) was synthesized as a powder by the University of Michigan Medicinal Chemistry Core according to published procedures (McKinney et al. 1959). Purity of 98.7% was measured using high-performance liquid chromatography analysis. A stock solution of 1 mM DCVC was prepared by dissolving DCVC powder in PBS. The chemical structure was confirmed periodically by nuclear magnetic resonance analysis MI 1640 culture medium with L-glutamine performed at the University of Michigan Biochemical Nuclear

Magnetic Resonance Core. The DCVC stock solution was stored in aliquots at -20 °C until use.

## **Cell culture**

HTR-8/SVneo cells, a gift from Dr. Charles H. Graham (Queen's University, Kingston, Ontario, Canada), were cultured as previously described (Graham et al. 1993; Hassan et al. 2016; Tetz et al. 2013). Briefly, cells were cultured between passages 78-84 in RPMI 1640 medium supplemented with 10% FBS and 1% P/S at 37 °C in a 5% CO<sub>2</sub> humidified incubator. Cells were cultured in RPMI 1640 growth medium with 10% FBS and 1% P/S prior to and during experiments to ensure optimal cell growth as previously described by Graham et al. (Graham et al. 1993). Cells were grown to 70-90% confluence at least 24 h after plating prior to use in any experiments. For gene expression experiments, cells were seeded at a density of 800,000 cells per well in 6-well cell culture plates. 24 h later, cells were treated with RPMI 1640 complete medium alone (control) or complete medium plus DCVC diluted to a final concentration of 10 or  $20 \ \mu\text{M}$  for 6 or 12 h. Four independent biological replicate experiments were performed.

# **Cell line validation**

Microsatellite genotyping via fragment analysis was performed using AmpFLSTR Identifiler Plus PCR Amplification Kit run on an 3730XL Genetic Analyzer (Applied Biosystems; Waltham, MA, USA). DNA for 8 tetranucleotide repeat loci and the Amelogenin sex determination marker were identified. The short tandem repeat profile generated for our cells was compared to the short tandem repeat profile for cells identified as HTR-8/SVneo (ATCC<sup>®</sup> CRL-3271<sup>TM</sup>) by ATCC<sup>®</sup> (2015) (Manassas, VA, USA). The short tandem repeat profile was an exact match: CSF1PO: 12, D13S317: 9,12, D16S539: 13D5S818: 12, D7S820: 12, TH01: 6,9.3, vWA: 13,18, TPOX: 8, Amelogenin sex determination marker: X (ATCC 2015).

#### **Explant tissue procurement and culture**

First-trimester placental tissues (N=5; 4 male and 1female) ranging in gestational age from 8.4 to 11 weeks  $(\text{mean} = 9.68 \pm 0.98 \text{ weeks})$  were acquired as discarded tissues at the time of termination at a Michigan family planning clinic with Institutional Review Board approval (Wayne State University IRB# 013515MP4E) and written informed consent obtained by collaborating Wayne State University physicians. Tissues were transported to the laboratory in ice-cold PBS. Chorionic villi were dissected under a microscope into approximately 20 mg (wet) segments and cultured in DMEM/ F12 supplemented with 10% FBS and 1% Anti-Anti. The villous segments were floated one per well in clear 24-well cell culture plates and allowed to acclimate in a 5% CO<sub>2</sub> humidified incubator for 24 h, as previously described (Bolnick et al. 2017). For gene expression experiments, the culture medium was removed and explants were treated with fresh DMEM/ F12 complete medium alone (control) or complete medium plus DCVC diluted to a final concentration of 20 µM, and then cultured for an additional 12 h. Five independent biological replicate experiments were performed using placentae from 5 different donors on different days. Each experiment was conducted with a placenta from a different donor, and villous explants from the same placenta were assigned randomly to the non-treated control and DCVC-exposed groups.

## Cell and tissue toxicant treatment

Prior to each experiment, a DCVC stock solution aliquot was thawed in a 37 °C water bath and then diluted in DMEM/ F12 supplemented with 10% FBS and 1% Anti-Anti (villous explants) or RPMI 1640 supplemented with 10% FBS and 1% P/S (HTR-8/SVneo) to final concentrations of 10 or 20  $\mu$ M DCVC. PBS alone was used as the 0  $\mu$ M DCVC

negative control. These concentrations of DCVC were chosen because we previously demonstrated that they did not induce cytotoxicity at the time points used in the current study (Elkin et al. 2020a, 2019, 2018; Hassan et al. 2016). Moreover, these concentrations are comparable to the average concentration of the DCVC precursor *S*-(1,2-dichlorovinyl) glutathione (DCVG), 13.4  $\mu$ M, measured in the serum of female volunteers exposed to 100 ppm of the parent compound, TCE, by inhalation for 4 h (Lash et al. 1999).

## Cell cycle phase determination

HTR-8/SVneo cells were seeded at a density of 400,000 cells per well in a 6-well plate and allowed to adhere for 24 h prior to treatment. Cells were treated for 12 h with medium alone (control) or DCVC (10 or 20 µM). The percentage of cells in each well in G1/G0, S, and G2/M phases were measured using the Cell Cycle Phase Determination Kit (Cayman Chemical; Ann Arbor, MI, USA) and flow cytometry, performed according to the manufacturer's protocol. This assay uses propidium iodide (PI) to label DNA. Briefly, after exposure, cells were treated with 0.25% trypsin-EDTA and incubated for 2 min to detach adherent cells from the substrate. After incubation, trypsin was deactivated with FBS-containing medium, and the suspended cells were transferred to 5-ml round-bottom fluorescence-activated cell sorting (FACS) tubes. Cells were washed twice with 1 ml of assay buffer, resuspended in 500 µl of cell fixative assay buffer solution, and chilled for 2 h at -20 °C. After fixation, cells were washed and resuspended in 500 µl PI staining solution, incubated for 30 min at room temperature, and transported to the University of Michigan Flow Cytometry Core for analysis. Cell phases were quantified using a LSRFortessa Flow Cytometer (BD Biosciences; San Jose, CA, USA). Quantification and dye-based visualization were performed using BD FACSDiva Software (BD Sciences). Cell aggregates and cellular debris were excluded using the forward scatter (FSC) and side scatter (SSC) modes and the analysis was performed using 10,000 events per sample. PI was detected using the 488 nm laser.

#### **Cell proliferation measurement**

HTR-8/SVneo cells were seeded at a density of 10,000 cells per well in a 96-well plate and allowed to adhere for 24 h. Cells were then treated with medium alone (control) or DCVC (10 or 20  $\mu$ M) in quintuplicate for 6 or 12 h. CyQUANT<sup>®</sup> Cell Proliferation Assay (Invitrogen) was used to quantify cell proliferation. The stain specifically binds to cellular DNA, and the fluorescence is proportional to the number of cells. The assay was performed according to the manufacturer's protocol. Briefly, dye binding solution was prepared by diluting CyQUANT<sup>®</sup> reagent in

Hank's Balanced Salt Solution (HBSS). After exposure to DCVC, the growth medium was removed and CyQUANT<sup>®</sup> dye binding solution was added to each well. Cells were incubated for 1 h at 37 °C. After incubation, fluorescence was measured (excitation: 485 nm; emission 530 nm) using a SpectraMax M2e Multi-Mode Microplate Reader (Molecular Devices).

## **RNA** isolation

#### HTR-8/SVneo cells

After exposure, cells were scraped and lysed with RLT lysis buffer containing beta-mercaptoethanol. Cell lysates were homogenized using QIA shredders (Qiagen), and mRNA was extracted using the RNeasy Plus Mini Kit (Qiagen) following the manufacture's recommended protocol. RNA concentrations were determined with a Nanodrop 1000 Spectrophotometer (Thermo Fisher Scientific) and stored at - 80 °C. RNA was transported on dry ice to the University of Michigan Advanced Genomics Core for further processing. Four independent experiments were performed. Each treatment group within a given experiment was performed in triplicate. RNA from triplicates were pooled according to the treatment group within the experiment. In total, RNA was analyzed from 24 cell samples: 4 replicates at 2 time points and 3 treatment groups.

#### Placental villous explants

After the treatment period, each explant was transferred to a 1.5-mL microcentrifuge tube, lysed in QIAzol reagent and homogenized in a TissueLyser LT (Qiagen) for 5 min at 50 Hz, using one 3.2 mm stainless steel bead per tube. mRNA was extracted using the miRNeasy Mini Kit (Qiagen) following the manufacturer's recommended protocol. RNA was eluted in RNase-free water. RNA concentrations were determined with a Nanodrop 1000 Spectrophotometer (Thermo Fisher Scientific) and stored at - 80 °C. RNA was transported on dry ice to the University of Michigan Advanced Genomics Core for further processing. Each treatment group within a given experiment (N=5) was performed in triplicate (3 separate villous explants from the same placenta). RNA from triplicates were pooled according to the treatment group within the experiment. In total, RNA was analyzed from 10 explant samples (5 placentas and with 2 treatment groups).

## **RNA** sequencing

At the University of Michigan Advanced Genomics Core, mRNA concentrations and quality were evaluated using a

Bioanalyzer instrument (Agilent; Santa Clara, CA, USA). Stranded sequencing libraries for RNA isolated from HTR-8/ SVneo cells were prepared with the TruSeq Stranded mRNA Library Prep Kit (Illumina; San Diego, CA, USA). Libraries were sequenced (on one lane) using single-end 50 cycle reads on a HiSeq 4000 sequencer (Illumina). The average total number of reads per sample for HTR-8/SVneo cells was 26,515,09. Stranded sequencing libraries for RNA isolated from villous explants were prepared with the KAPA Stranded RNA-Seq Kit with RiboErase (Roche; Basel, Switzerland). Libraries were multiplexed (on two lanes) and sequenced using single-end 50 cycle reads on a HiSeq 4000 sequencer (Illumina). The average total number of reads per sample was 13,368,165.

#### **RNA sequencing data analyses**

The Flux high-performance computer cluster at the University of Michigan was used for computational analysis. Sequencing read quality was assessed using FastQC (Andrews 2010). Reads were aligned to the human genome using STAR (Dobin et al. 2013), with the options "outFilterMultimapNmax 10" and "sjdbScore 2". Aligned reads were assigned to GRCh37 genes using featureCounts (Liao et al. 2014). HTR-8/SVneo had 85.38% uniquely mapped reads. Villous explants had 82.46% uniquely mapped reads. Prior to differential gene expression testing, genes with mean read counts-per-million less than four (HTR-8/SVneo) or five (explants) across all samples were filtered out and excluded from the analysis to reduce dispersion due to low expression levels. After filtering, 12,855 (HTR-8/SVneo) or 13,972 (explants) genes were included in the analyses. Data were normalized using the trimmed mean of M values (TMM) method (Robinson and Oshlack 2010). Differential gene expression testing was performed using the edgeR package (version 3.1) for R statistical computing (Robinson et al. 2010). Quasi-likelihood general linear modeling was used for differential gene expression testing (Lun et al. 2016). For HTR-8/SVneo cells, comparisons were made within each time point between 0 (control) and 10 or 20 µM DCVC, respectively, adjusting for experiment day as a covariate using the glmQLFit function in edgeR. For villous explants, comparisons were made between 0 (control) and 20 µM DCVC, adjusting for a placental donor as a covariate. The log<sub>2</sub>fold change/fold change values reported for each gene were calculated from normalized (TMM method) gene expression counts averaged from each matching treatment/exposure replicate and directly compared to the average normalized gene expression counts of time-matched controls. Genes were considered differentially expressed between non-treated and treated samples with an adjusted *p*-value < 0.05 using the Benjamini–Hochberg false discovery rate (FDR) method (Benjamini and Hochberg 1995). DCVC-induced upregulation > 1.3-fold or downregulation < -1.3-fold are denoted throughout the results section. These fold-change (FC) values equate to  $\log_2$  fold-change (logFC) > 0.35 (upregulation) or < -0.35 (downregulation). We selected a relatively inclusive  $\log_2$  fold change threshold to facilitate discussion of our genome-wide discovery results. This selection was a balance of prioritizing genes with larger comparative gene expression changes, while still conducting a thorough evaluation of differential gene expression. Moreover, we conducted sensitive analyses to demonstrate that using a more conservative logFC cutoff does not change the overall conclusions of the paper (Suppl. Table 7).

Multidimensional scaling (MDS) plots constructed from RNA expression data were used to observe how samples, treated or non-treated from each respective experiment, clustered on relevant covariates including treatment, treatment duration and experimental day (HTR-8/SVneo cells), or treatment, sex, gestational week, and donor placenta (explants). Student's t-test (for two groups) or one-way ANOVA (for three or more groups) were used to test for associations between covariates and MDS dimension 1 or 2.

#### Correlation and linear regression testing

To compare the effects of DCVC across time (6 vs. 12 h), dose (10  $\mu$ M vs. 20  $\mu$ M DCVC), or model system (villous explants vs. HTR-8/SVneo), differential gene expression patterns were tested for correlation. Across all genes tested, Pearson's correlation coefficients were calculated and linear regression models were fitted. Comparisons were tested within each time point between non-treated controls and 10 or 20  $\mu$ M DCVC using logFC values for 12,855 genes. Likewise, comparisons were tested between non-treated controls and each DCVC concentration for 6 or 12 h of exposure, also using log FC values for 12,855 genes. Lastly, comparisons were tested between placental villous explants and HTR-8/ SVneo cells each exposed to 20  $\mu$ M DCVC for 12 h using logFC values for 11,912 commonly expressed genes.

#### Gene set enrichment analyses

To identify biological pathways and processes impacted by DCVC treatment, gene set enrichment analyses were performed using GSEA software (Mootha et al. 2003; Subramanian et al. 2005). For each gene set within a specified Molecular Signatures Database (MSigDB, RRID: SCR\_016863, version 7.0) curated collection, we used GSEA pre-ranked analyses to compute permutation-based tests that calculate a Normalized Enrichment Score (NES) and statistical FDR (Benjamini and Hochberg 1995; Liberzon et al. 2011). Additionally, the GSEA analyses returned a list of enriched genes for each gene set based on differential gene expression. The enriched gene list for a gene set was derived from all genes

annotated to that gene set. Here, the hallmark gene set collection was used in the analyses because it represents welldefined biological pathways, processes and states with strong gene expression concordance and reduced redundancy often seen within other collections (Liberzon et al. 2015). To conduct separate analyses for HTR-8/SVneo cells and placental villous explants, 12,855 (HTR-8/SVneo) or 13,972 (villous explants) genes included in the differential gene expression tests, respectively, were pre-ranked according to the logFC value for each gene. All genes (regardless of FDR or log<sub>2</sub>fold change values) thus, cutoffs do not impact the enriched pathways. We used 1000 permutations to test for enrichment within each of the hallmark gene sets. Because our genes were ranked based on logFC values, the magnitude of the NES above or below 0 corresponds directly with DCVCinduced up-regulation or down-regulation, respectively, of an enriched pathway or process. Gene sets representing an FDR < 0.05 were considered significantly enriched (positive or negative).

# Evaluation of temporal patterns in regulation of gene expression in HTR-8/SVneo

Differentially expressed genes with a logFC magnitude difference > 0.35 were grouped together by treatment based on temporal expression patterns (upregulated, downregulated or no change) for the two treatment durations (6 and 12 h). There were a total of 8 groups within each DCVC concentration: consistent responders (up  $\rightarrow$  up and down  $\rightarrow$  down) temporary responders (up  $\rightarrow$  down, and down  $\rightarrow$  up) early responders (down  $\rightarrow$  no change and up  $\rightarrow$  no change), late responders (no change  $\rightarrow$  up and no change  $\rightarrow$  down. Groups that contained > 100 genes were tested for enrichment on the Enrichr platform (RRID: SCR\_001575) (Chen et al. 2013; Kuleshov et al. 2016) for transcription factors (TRRUST) (Han et al. 2018) and histone modifications (ENCODE-2015) (Davis et al. 2018; Encode Project Consortium 2012).

# Enrichment testing and visualization of ATF4 gene targets from HTR-8/SVneo RNA sequencing analysis

Because ATF4-driven transcriptional activity is a key indicator of ISR activation, ATF4 gene targets, were tested for overrepresentation among DCVC-induced differentially expressed genes. Individual ATF4 gene targets were identified from a mouse model ChIP-seq analysis and included in our study (Han et al. 2013). Two additional ATF4 gene targets, *PMAIP1 and PSPH*, were also included (Sharma et al. 2018; Yang et al. 2018; Zhao et al. 2014). Genes regulated by ATF4 (N=383) were tested for enrichment in DCVCtreated HTR-8/SVneo genes with significant differential expression (FDR < 0.05 + LogFC > 0.35 [FC > 1.3]). ATF4 mouse target genes were converted to human homologues using the biomaRt package (Durinck et al. 2005, 2009). ATF4 target gene enrichment tests were performed using the phyper function (hypergeometric test) (R Core Team 2019). To visualize significantly enriched individual differential gene expression for ATF4 targets from the RNA sequencing analyses, a heatmap displaying the logFC levels of treated compared to control samples, along with a hierarchical clustering diagram were generated using the heatmap.2 function in the gplots package (Warnes et al. 2019).

#### Western blotting analyses

HTR-8/SVneo cells were seeded at a density of 400,000 cells per well in a clear 6-well culture plate and allowed to adhere for 24 h. Cells were treated with medium alone (control) or DCVC (20 µM) for 12 h. Cells were lysed in RIPA lysis buffer containing both protease and phosphatase inhibitors or protease inhibitors alone and then centrifuged at  $14,000 \times g$  for 10 min at 4 °C. Lysates were heated with loading buffer at 85 °C for 2 min. Samples were loaded into commercially available Novex 4-20% Tris-Glycine Mini Gel cassettes (Invitrogen) and proteins were separated by polyacrylamide gel electrophoresis run at 140 V for 1.5 h. SeeBlue Plus2 pre-stained protein standard (Invitrogen) was used as a reference for protein molecular weight. After separation, proteins were transferred to nitrocellulose membranes at 75 V for 4 h at 4 °C. Membranes were first blotted with Revert Total Protein Stain (Li-Cor Biosciences) and washed with Revert wash. Membranes were then blotted at room temperature using ATF4 (molecular weight 49; catalog no. 11815; Cell Signaling Technologies; RRID: AB\_2616025), and eukaryotic initiation factor 2 alpha subunit -phosphorylated (p-eIF2 $\alpha$ ) or non-phosphorylated (eIF2 $\alpha$ ) [molecular weight 38; catalog nos. 3597 or 9722; Cell Signaling Technologies; Research Resource Identifier (RRID): AB\_ 390740 and AB\_ 2230924]. Antibody complexes were detected by Alexa Fluor anti-mouse and anti-rabbit fluorescent-conjugated antibodies (Invitrogen) and visualized using an Odyssey CLx image scanner (Li-Cor Biosciences; Lincoln, NE, USA). Blots were quantified using LI-COR<sup>®</sup> Image Studio software (version 5.2) and normalized to Revert Total Protein Stain (Li-Cor Biosciences).

#### Measurement of protein synthesis

HTR-8/SVneo cells were seeded at a density of 10,000 cells per well in a black clear-bottomed 96-well plate and allowed to acclimate for 24 h. Cells were treated with medium alone (control) or DCVC (10 or 20  $\mu$ M) for 6 or 12 h. Protein synthesis was measured with a Protein Synthesis Assay Kit (Thermo Fisher Scientific) according to the manufacture's recommended protocols. This assay utilizes cell-permeable O-propargyl-puromycin (OPP), which halts the translation of polypeptide chains by incorporating into the C-terminus. Briefly, cells were incubated with OPP solution for 2 h at 37 °C, fixed, and incubated with FAM-Azide solution (FAM-Azide, copper sulfate and ascorbic acid) for 30 min in the dark at room temperature. After incubation, protein synthesis was measured fluorescently (excitation: 485 nm; emission 535 nm) using a SpectraMax M2e Multi-Mode Microplate Reader (Molecular Devices; Sunnyvale, CA, USA).

# Statistical analysis for non-RNA sequencing experiments

Western blotting, protein synthesis measurement, cell cycle determination, and proliferation experiments were performed independently and repeated a minimum of three times. When applicable, technical replicates were averaged within each experiment and these values were analyzed using one-way or two-way analysis of variance (ANOVA) followed by Tukey's post-hoc test for comparison of means. GraphPad Prism software version 7 was used for statistical analysis (GraphPad Software Inc.; San Diego, CA, USA). Data are expressed as means  $\pm$  stand error of the means (SEM). N = number of independent experiments. P < 0.05 was considered statistically significant.

#### Results

# Effect of DCVC on cellular proliferation and cell cycle progression in HTR-8/SVneo cells

We evaluated key biological processes as indicators of acute cytotoxicity after exposure to 0-20 µM DCVC for up to 12 h in the HTR-8/SVneo cell line. We previously reported that 12-h 20 µM DCVC treatment did not cause cell death in the same cell line (Elkin et al. 2020b). Here, we extended those findings by showing that the maximal 12-h 20 µM DCVC treatment did not cause significant expression changes in genes that regulate apoptosis (Suppl. Table 1). Moreover, there were no significant DCVC-induced changes in cell cycle progression (Suppl Fig. 1), proliferation (Suppl Fig. 2) or the majority of genes that regulate these cellular functions (Suppl. Table 2). These results suggest that the concentrations and time durations used in this study did not cause overt toxicity in the cell model, likely due to biological resilience at these stages.

# Effects of DCVC on placental HTR-8/SVneo gene expression

In order to evaluate the effects of DCVC on the first trimester placental extravillous trophoblasts, RNA sequencing analyses were performed on HTR-8/SVneo cells to measure differential gene expression between treated cells and controls. Average LogFC of expression levels for comparisons between all treated versus control samples are displayed in a heatmap in Fig. 2. Genes were ordered based on hierarchical clustering. In MDS diagrams depicting all samples plotted on relevant covariates, clustering by treatment duration and replicate were observed (Suppl Fig. 3). The replicate covariate ( $P=3.84 \times 10^{-04}$ ) was associated with MDS dimension 1, while treatment duration ( $P=9.03 \times 10^{-11}$ ) was associated with MDS dimension 2.

# Concentration-dependent differential gene expression after 6-h DCVC treatment

Comparison of altered gene expression in cells exposed to 10 versus 20  $\mu$ M DCVC for 6 h was conducted by calculating pairwise correlation coefficients of logFC estimates. Differential changes in gene expression relative to control were strongly correlated for cells exposed to 10  $\mu$ M DCVC versus 20  $\mu$ M DCVC after a 6-h treatment [r=0.51,  $P < 1.0 \times 10^{-15}$ ] (Suppl Fig. 4a). Furthermore, for genes that met the FDR criterion for significant differential gene expression (FDR < 0.05) and had a logFC > 0.35 [FC > 1.3], 20  $\mu$ M DCVC treatment-induced larger magnitude altered gene expression compared with 10  $\mu$ M DCVC, indicating a concentration-dependent response (Fig. 3a).

Both 10 and 20  $\mu$ M DCVC treatment in cells for 6 h caused differential gene expression with some

overlap. For example, the only gene that met both criteria  $(FDR < 0.05 + \log FC > 0.35 [FC > 1.3])$  for significant differential gene expression with 10 µM, 5'-aminolevulinate synthase 1 (ALAS1) (0.37 logFC [1.3 FC], FDR =  $2.15 \times 10^{-03}$ ), was also differentially expressed with 20 µM (0.37 logFC  $[1.3 \text{ FC}], \text{FDR} = 5.51 \times 10^{-04})$  (Fig. 3b). The 10 µM DCVC treatment group yielded an additional 276 genes that had a logFC magnitude difference > 0.35 [FC > 1.3] but did not meet the FDR criterion (Fig. 3c, Suppl. Table 3). Consequently, 10 µM treatment for 6 h demonstrated the smallest transcriptional response out of all the comparisons made for HTR-8/SVneo cells. Whereas 20 µM DCVC treatment for 6 h yielded 7 differentially expressed genes that met FDR < 0.05 criterion only, an additional 354 genes had a logFC magnitude difference > 0.35 [FC > 1.3] only. Moreover, a total of 12 genes met both criteria (Fig. 3d, Suppl. Table 3). Among the genes that met both criteria, the highest magnitude differentially expressed genes between 20 µM-treated and controls were oxidative stressinduced growth inhibitor (OSGIN1) (0.91 logFC [1.9 FC], FDR = 0.036), tripartite motif-containing 16-like (TRIM16L)  $(0.63 \log FC [1.5 FC], FDR = 0.036)$  and glutathione-specific gamma-glutamylcyclotransferase 1 (CHAC1) (0.62 logFC [1.5 FC], FDR = 0.015) (Suppl. Table 3). Overall, these results indicate an increase in the number of genes differentially expressed with 20 µM DCVC, compared to 10 µM treatment.

Genes differentially expressed by 6-h DCVC treatment were also enriched in pathways, as identified by GSEA. Although 6 h DCVC treatment yielded no pathways that were upregulated with 10  $\mu$ M DCVC, two pathways were downregulated (Fig. 3e). Treatment with 20  $\mu$ M DCVC upregulated one pathway and downregulated six pathways (Fig. 3f). Of the six downregulated pathways, four



Fig. 2 Top logFC expression levels for comparisons between treated versus control samples. HTR-8/SVneo cells were treated with 0 (control), 10 or 20  $\mu$ M DCVC for 6 or 12 h. Heatmap depicts expression levels for the 40 genes with the largest magnitude logFC (up and

were involved in embryonic development, the most common category. Representative pathways in this category include epithelial-mesenchymal transition (NES = -1.97, FDR = 0.001) and myogenesis (NES = -1.79, FDR = 0.004). Other categories represented among downregulated pathways included immune response (2) proliferation (1) and cellular organization (1). The overall pattern of pathways affected by DCVC treatment for 6 h consisted primarily of the downregulation of pathways associated with embryonic development.

# Concentration-dependent differential gene expression after 12 h DCVC treatment

In order to evaluate patterns in gene expression caused by 12-h DCVC treatment, correlation of expression levels across DCVC treatment concentrations (10 versus 20  $\mu$ M), were evaluated. Changes in gene expression levels (relative to control) were strongly correlated for cells exposed to 10  $\mu$ M versus 20  $\mu$ M DCVC after a 12-h treatment [r=0.67,  $P < 1.0 \times 10^{-15}$ ] (Suppl Fig. 4b). Furthermore, for genes that met the FDR criterion for significant differential gene expression (FDR <0.05) and had a logFC > 0.35 [FC > 1.3], 20  $\mu$ M DCVC treatment-induced larger magnitude altered gene expression compared with 10  $\mu$ M DCVC, further indicating a concentration-dependent response (Fig. 4a).

Similar to 6-h results, both 10 and 20 µM DCVC treatment for 12 h caused significant differential gene expression with substantial overlap. For example, the 15 genes that met both criteria (FDR  $< 0.05 + \log FC > 0.35$  [FC > 1.3]) for significant differential gene expression with 10 µM DCVC, were also differentially expressed with 20  $\mu$ M (Fig. 4b). Additionally, 10 µM DCVC treatment yielded 17 differentially expressed genes that met FDR < 0.05 criterion only, and 373 genes had a logFC magnitude difference > 0.35[FC > 1.3] only (Fig. 4c, Suppl. Table 4). Compared to 10 µM, 20 µM DCVC treatment increased the number of genes with altered expression, yielding 526 differentially expressed genes that met FDR < 0.05 criterion only, 436 genes with a logFC magnitude difference > 0.35 [FC > 1.3] only, and 301 genes that met both criteria (Fig. 4d, Suppl. Table 4). Among the genes that met both criteria, 113 were upregulated and 188 were downregulated. The three genes with the largest magnitude logFC included, inhibin subunit beta (*INHBE*) (3.71 logFC [13 FC], FDR =  $3.00 \times 10^{-04}$ ), *CHAC1* (2.55 logFC [5.9 FC], FDR =  $1.25 \times 10^{-09}$ ) and sodium- and chloride-dependent glycine transporter 1 (SLC6A9) (1.81 logFC [3.0 FC], FDR =  $5.46 \times 10^{-04}$ ) (Suppl. Table 4). Although more downregulated genes met both FDR and logFC criteria, the upregulated genes had larger magnitude differential gene expression.

Multiple enriched biological and molecular signaling pathways connected to differential gene expression were

upregulated by 12-h DCVC treatment. Ten micromolar treatment upregulated 2 pathways (Fig. 4e). Twenty micromolar treatments upregulated 9 pathways, 5 of which were involved in response to stress stimuli (Fig. 4f). Representative pathways included unfolded protein response (NES = 2.36, FDR > 0.001) and mTORC1 signaling (NES = 2.16, FDR > 0.001). Moreover, 12–79% of individual genes enriched within each of these pathway gene sets were targets of the ATF4 gene, which codes for a key transcription factor associated with ISR, a branch of the UPR. (Suppl. Table 6). In addition to the response to stress stimuli, upregulated pathways also involve metabolic processes (4), immune processes (2) and proliferation (1).

Likewise, DCVC treatment for 12 h downregulated numerous biological and molecular signaling pathways. With 10 µM DCVC, 6 pathways were downregulated, half of which were associated with the most common category, embryonic development (Fig. 4e). Twenty micromolar DCVC treatment downregulated 13 pathways (Fig. 4f). Similar to 10 µM DCVC, the majority of these pathways (7) were associated with embryonic development. Representative pathways included epithelial-mesenchymal transition (NES = -2.12, FDR < 0.001), myogenesis (NES = -1.66, NES = -1.66)FDR = 0.021) and hedgehog signaling (NES = -1.61, Other categories represented among the pathways downregulated with 12-h 20 µM DCVC treatment included proliferation (3), cellular organization (2) and response to stress stimuli (2). Summarizing the overall pattern of pathways affected by DCVC treatment, pathways involved in cellular response to stress stimuli were upregulated and pathways related to embryonic development were downregulated.

## Time-dependent differential gene expression after 10 or 20 µM DCVC treatment

In addition to concentration-dependent DCVC effects, altered gene expression associated with treatment duration was investigated. Comparison of gene expression changes in cells exposed for 6 versus 12 µM DCVC was evaluated by calculating pairwise correlation coefficients of logFC estimates. The overall differential gene expression levels (relative to control) were moderately correlated by time for both 10  $\mu$ M DCVC treatment [r=0.14,  $P < 1.0 \times 10^{-15}$ ] (Suppl Fig. 5a) and 20 µM DCVC treatment  $[r=0.24, P < 1.0 \times 10^{-15}]$  (Suppl Fig. 5b). Moreover, differentially expressed genes with a  $\log FC > 0.35$  [FC > 1.3] and FDR < 0.05 after 12-h treatment, had larger expression changes than 6-h treatment, indicating time-dependent responses for both concentrations tested (Fig. 5a, c). For 10 µM treatment, the only gene significantly differentially expressed (FDR < 0.05 + logFC > 0.35 [FC > 1.3]) with 6-h DCVC treatment, ALAS1, was also differentially expressed with 12-h treatment along with 14 additional genes (Fig. 5b).



◄Fig. 3 Effects of 6-h DCVC treatment on HTR-8/SVneo gene expression. HTR-8/SVneo cells were treated with 0 (control), 10 or 20 µM DCVC for 6 h. Differential gene expression was analyzed with the edgeR package for R using quasi-likelihood general linear modeling. N=4 independent experiments. **a** Spaghetti plot depicting concentration-dependent expression levels for genes meeting FDR and logFC criteria. Blue dots represent individual genes differentially expressed (FDR < 0.05 + logFC > 0.35 [FC > 1.3]) with 20 µM DCVC. Lines connecting blue dots to green dots represent the same respective genes with 10 µM expression levels. b Venn diagram depicting overlap in differentially expressed genes (FDR  $< 0.05 + \log FC > 0.35$ [FC > 1.3]) at 6 h, between 0 (control) vs.10 µM and 0 vs. 20 µM DCVC. Volcano plots comparing differential gene expression between non-treated (controls) cells and 6-h DCVC-treated cells are depicted for: c 10 µM DCVC and d 20 µM DCVC. Genes were considered differentially expressed with FDR < 0.05. Genes fulfilling the following criteria are denoted by color: FDR < 0.05 only (light pink), logFC magnitude>0.35 [FC>1.3] only (dark pink), and FDR  $< 0.05 + \log$ FC magnitude > 0.35 [FC > 1.3] (red). Upregulated and downregulated gene sets from the MSigDB hallmark collection were identified through GSEA as enriched after treatment with e 10 µM DCVC or f 20 µM DCVC. Relevant characteristics of enriched gene sets are reported as: FDR, biological pathway categories and normalized enrichment score (NES). Gene sets are ordered according to magnitude of NES and were considered enriched with an FDR < 0.05

Likewise, among the 12 genes differentially expressed after 6-h 20  $\mu$ M DCVC treatment, 10 genes were also differentially expressed after 12-h 20  $\mu$ M treatment (Fig. 5d). Moreover, there were 2 genes exclusively differentially expressed with 6-h 20  $\mu$ M treatment and 289 genes with 12-h 20  $\mu$ M treatment.

Time-dependent differential gene expression was further investigated by evaluating temporal patterns in the regulation of gene expression. When grouped by chronological expression patterns, the majority of genes with a logFC magnitude > 0.35 [FC > 1.3], fit into one of the four different groups consisting of early and late responders: that is, differential expression (up or downregulated) at one time point and unchanged expression at the other time point. Each of these groups contained > 100 genes (Fig. 6). These results indicate a pattern of nonlinearity in gene expression over time. Furthermore, the no change  $\rightarrow$  upregulated groups were enriched for the ATF4 transcription factor for both 10  $\mu$ M (enriched odds ratio: 26, FDR = 6.51  $\times$  10<sup>-4</sup>) and 20  $\mu$ M DCVC (enriched odds ratio: 23, FDR = 2.84  $\times 10^{-5}$ ). Additionally, the no change  $\rightarrow$  downregulated group for 20 µM was enriched for two transcription factors and one histone modification that regulate gene expression during embryonic development: transcription factors PAX6 (enriched odds ratio: 8,  $FDR = 1.28 \times 10^{-2}$ ) and SMAD3 (enriched odds ratio: 7,  $FDR = 1.54 \times 10^{-2}$ ), and histone tri-methylation site H3K27me3 (enriched odds ratio: 23,  $FDR = 1.18 \times 10^{-10}$ ). The other 4 groups consisting of temporary and consistent responders-genes with expression  $\log FC$  magnitude > 0.35 [FC > 1.3], at both 6 and 12 h (up and/or down-regulated)—each contained < 50 genes with no enrichment for specific regulation of gene expression (Fig. 6).

# DCVC effect on ISR-associated ATF4 regulation of gene expression in cells

Because ATF4-driven transcriptional activity is a key indicator of UPR/ISR activation, ATF4 gene targets, previously determined elsewhere (Bao et al. 2016; Han et al. 2013; Quiros et al. 2017; Shpilka and Haynes 2018), were tested for overrepresentation among DCVC-induced differentially expressed genes using a statistical enrichment test. Of the 301 differentially expressed genes (FDR < 0.05 + logFC > 0.35 [FC > 1.3]) resulting from exposure to 20  $\mu$ M DCVC for 12 h, 15.6% (47 genes) were identified as ATF4 gene targets, reflecting a statistically significant overrepresentation (Fig. 7a,  $P = 5.52 \times 10^{-22}$ ). Of the 47 ATF4 gene targets, 44 were upregulated and 3 were downregulated (Fig. 7b, FDR < 0.05 + logFC > 0.35 [FC > 1.3]). These results support ISR activation as a major response in HTR-8/SVneo cells to DCVC exposure.

To further characterize the specific roles of individual ATF4 gene targets during ISR activation, the ATF4 gene plus the 47 ATF4-regulated genes with an FDR < 0.05and magnitude  $\log FC > 0.35$  [FC > 1.3] (up or down) were grouped by function with single gene-level logFC displayed (Fig. 7c). Most of the ATF4-regulated genes are involved in various biological processes necessary for cellular compensation to DCVC-induced stress. Notably, 5 amino acid transporter genes were significantly differentially expressed: SLC1A4, SLC1A5, SLC6A9, and SLC7A11  $(FDR < 0.05 + \log FC > 0.35 [FC > 1.3])$  (Fig. 7c). Contrarily, some of the ATF4-regulated genes control biological processes that contribute to cell death. Moreover, many of these genes are co-regulated by dimerization with C/EBP homologous protein (CHOP), another transcription factor which is itself regulated by ATF4 (Han et al. 2013; Hu et al. 2018; Su and Kilberg 2008). Particularly, 9 amino acid biosynthesis genes were differentially expressed at a significant level: AARS, ASNS, CARS, GARS, MARS, SARS, TARS and YARS (FDR  $< 0.05 + \log FC > 0.35$  [FC > 1.3]) (Fig. 7c). These findings suggest complex ISR signaling in the cells involving both compensation and cell death.

# Validation of DCVC-induced integrated stress response in HTR-8/SVneo cells

#### elF2a phosphorylation and ATF4 protein levels

Because the majority of gene sets positively enriched by 12-h exposure to DCVC contained substantial core enrichment of ISR-associated genes in HTR-8/SVneo cells, we



**Fig. 4** Effects of 12-h DCVC treatment on HTR-8/SVneo gene expression. HTR-8/SVneo cells were treated with 0 (control), 10 or 20  $\mu$ M DCVC for 12 h. Differential gene expression was analyzed with the edgeR package for R using quasi-likelihood general linear modeling. *N*=4 independent experiments. **a** Spaghetti plot depicting concentration-dependent expression levels for genes meeting FDR and logFC criteria. Blue dots represent individual genes differentially expressed (FDR < 0.05 + logFC > 0.35 [FC > 1.3]) with 20  $\mu$ M treatment. Lines connecting blue dots to green dots represent the same respective genes with 10  $\mu$ M expression levels. **b** Venn diagram depicting overlap in differentially expressed genes (FDR < 0.05 + logFC > 0.35 [FC > 1.3]) at 12 h, between 0 (control) vs.10  $\mu$ M and 0 vs. 20  $\mu$ M DCVC. Volcano plots comparing differential gene expression between non-treated (controls) cells

and 12-h DCVC-treated cells are depicted for: **c** 10  $\mu$ M DCVC and **d** 20  $\mu$ M DCVC. Genes were considered differentially expressed with FDR <0.05. Genes fulfilling the following criteria are denoted by color: FDR <0.05 only (light pink), logFC magnitude >0.35 [FC>1.3] only (dark pink), and FDR <0.05+logFC magnitude >0.35 [FC>1.3] (red). Upregulated and downregulated gene sets from the MSigDB hallmark collection were identified through GSEA as enriched after treatment with **e** 10  $\mu$ M DCVC or **f** 20  $\mu$ M DCVC. Relevant characteristics of enriched gene sets are reported as FDR, pathway categories and normalized enrichment score (NES). Gene sets are ordered according to magnitude of NES and were considered enriched with an FDR <0.05. Gene sets with an asterisk indicate they that the pathways contained ISR/ATF4-regulated enriched genes (detailed information found in suppl. table 6)

Е				2 Ster Ster & S
	12 h DCVC			500 20 Star Barrow Strate Star Star
	Treatment	HALLMARK Gene Sets Pathways and Processes	FDR	250 550 50 50 50 50 50 50 50 Normalized Enrichment Score
	Upregulated (2)	OXIDATIVE PHOSPHORYLATION	0.020	
		UNFOLDED PROTEIN RESPONSE**	0.048	
10	Downregulated (6)	KRAS SIGNALING DOWN	0.003	
10		MYOGENESIS	0.003	
μινι		UV RESPONSE DOWN	0.000	
		HEDGEHOG SIGNALING	0.002	
		HYPOXIA	0.000	
		EPITHELIAL MESENCHYMAL TRANSITION	0.000	
F				-2 -1 0 1 2
		UNFOLDED PROTEIN RESPONSE*	0.000	
		MTORC1 SIGNALING*	0.000	
		IL6 JAK STAT3 SIGNALING	0.019	
		REACTIVE OXIGEN SPECIES PATHWAY	0.015	
		XENOBIOTIC METABOLISM	0.014	
		UV RESPONSE UP*	0.015	
		P53 PATHWAY*	0.028	
	11	HEME METABOLISM	0.031	
20	Opregulated (9)	TNFA SIGNALING VIA NFKB*	0.046	
		NOTCH SIGNALING	0.049	
μινι	Downregulated (13)	APICAL SURFACE	0.036	
		TGF BETA SIGNALING	0.028	
		ΗΥΡΟΧΙΑ	0.027	
		ESTROGEN RESPONSE EARLY	0.018	
		HEDGEHOG SIGNALING	0.011	
		ESTROGEN RESPONSE LATE	0.010	
		KRAS SIGNALING DN	0.011	
		APICAL JUNCTION	0.013	
		MITOTIC SPINDLE	0.016	
		MYOGENESIS	0.021	
		UV RESPONSE DN	0.000	
		EPITHELIAL MESENCHYMAL TRANSITION	0.000	
				-2 -1 0 1 2

Fig. 4 (continued)

verified DCVC-induced ISR activation in cells using western blot analysis to measure phosphorylation levels of eIF2 $\alpha$  and protein concentrations of ATF4, key regulators of ISR activation (Fig. 8, P < 0.05). Exposure to 20  $\mu$ M DCVC for 12 h increased the ratio of phosphorylated to non-phosphorylated eIF2 $\alpha$  protein by 61% compared to non-treated controls (Fig. 8a, P = 0.031), indicating ISR activation. Furthermore, DCVC increased ATF4 protein concentrations by more than fourfold compared to controls (Fig. 8b, P = 0.027), consistent with activation of the ISR.

## DCVC effect on global protein synthesis

We measured global protein synthesis attenuation, a principal functional feature of ISR signaling through phosphorylation of eIF2 $\alpha$ . Although protein synthesis was not significantly altered after a 6-h exposure to DCVC, treatment with 20  $\mu$ M DCVC for 12 h significantly attenuated protein synthesis 37% compared with controls (Fig. 9, *P*=0.0003). The effect of 12-h treatment with 10  $\mu$ M DCVC was not statistically significant compared with controls.

# Effects of DCVC on placental villous explant gene expression

To further characterize the effects of DCVC treatment on differential gene expression in placenta, RNA sequencing analysis was performed on another first trimester in vitro model, villous explants-a model that retains the native cells and tissue structure of the villi functional unit (Fig. 10; Suppl. Table 5). In MDS diagrams depicting samples plotted on relevant covariates, clustering by donor placenta, sex, and gestational week were observed (Suppl Fig. 6). Gestational week ( $P=4.00 \times 10^{-4}$ ) and placental donor ( $P=5.00 \times 10^{-4}$ )

Fig. 5 Time-dependent differential gene expression after DCVC treatment in HTR-8 SVneo cells. Comparison of differential gene expression across DCVC treatment durations (6 versus 12 h) was evaluating by calculating pairwise correlation coefficients of logFC estimates  $(P < 1.0 \times 10^{-15})$ . Spaghetti plot depicting time-dependent expression levels for differential expressed genes meeting FDR and logFC criteria (FDR < 0.05 + logFC > 0.35)[FC>1.3]) for a 10 µM DCVC and C) 20 µM DCVC treatment. Tan dots represent individual genes differentially expressed (FDR < 0.05 + logFC > 0.35)[FC > 1.3]) with 12-h treatment. Lines connecting yellow dots to tan dots represent the same respective genes with 6-h expression levels. Venn diagrams depicting overlap in differentially expressed genes (FDR < 0.05 + logFC > 0.35[F C > 1.3]) between 6 and 12 h DCVC treatment for: b 0 (control) vs.10 µM DCVC and d 0 (control) vs. 20 µM DCVC



were associated with MDS dimension 1. Gestational week  $(P=4.00 \times 10^{-4})$ , and placental donor  $(P=5.00 \times 10^{-4})$  were associated with MDS dimension 2. Twelve-hour 20 µM DCVC treatment altered gene expression levels in villous explants by a magnitude logFC > 0.35 [FC < 1.3] for 2684 genes, compared to non-treated controls (Fig. 10a). Among these genes, 1499 were upregulated and 1185 downregulated. Although differential expression for many genes surpassed the logFC criterion, as indicated, no genes met the primary false discovery rate criterion (FDR < 0.05).

Despite no gene-specific expression levels meeting the FDR criterion, gene set enrichment analysis identified enriched biological and molecular signaling pathways (FDR < 0.05). Five pathways were upregulated and each of these involves a cellular response to stress stimuli (Fig. 10b, FDR < 0.05). Representative pathways included: TNF $\alpha$  signaling via NFKB (NES = 2.60, FDR < 0.0001), p53 pathway (NES = 1.93, FDR = 0.002) and unfolded protein response (NES = 1.91, FDR = 0.002). Furthermore, similar to HTR-8/SVneo cells, 8–31% of individual genes enriched within each pathway gene set are specifically regulated by ATF4 (Suppl. Table 6). Despite the lack of significant differential expression for individual genes (FDR < 0.05), these results reflect a collective transcriptional response to DCVC exposure.

## Relationship between placental villous explants and HTR-8/ SVneo ATF4-regulated differential gene expression

In addition to conducting separate evaluations of DCVCinduced differential gene expression in HTR-8/SVneo cells and explants, a comparison of altered gene expression



**Fig. 6** Temporal patterns in regulation of gene expression in HTR-8/ SVneo cells. Differentially expressed genes with logFC magnitude>0.35 [FC>1.3], regardless of FDR, were grouped together by treatment based on chronological expression patterns (upregulation, downregulated or no change) for the two treatment durations (6 and 12 h). There were a total of 8 groups for: **a** 10  $\mu$ M DCVC and **b** 20  $\mu$ M DCVC consistent responders (up  $\rightarrow$  up and down  $\rightarrow$  down),

across the two models was evaluated by calculating pairwise correlation coefficients of logFC estimates. Differential expression for all dually expressed genes between cells and tissues was correlated  $[r=0.18, P < 1.0 \times 10^{-15}]$  (Fig. 11a). A separate pairwise comparison of logFC values for the 383 ATF4-regulated genes targets in HTR-8/SVneo cells versus explants further revealed that the two models were more strongly correlated with ATF4-regulated gene expression  $[r=0.32, P < 1.2 \times 10^{-9}]$  (Fig. 11b), than all genes. These results support ISR activation in both models.

temporary responders (up $\rightarrow$ down, and down $\rightarrow$ up), early responders (down $\rightarrow$ no change and up $\rightarrow$ no change), and late responders (no change $\rightarrow$ up and no change $\rightarrow$ down). Groups that contained>100 genes were tested for enrichment on the Enrichr platform for transcription factors (TF) and histone modifications (HM). The enrichment odds ratio is abbreviated EOR. TF and HM were considered to be significantly enriched with an FDR <0.05

## Discussion

# Concentration- and time-dependent DCVC effects in HTR-8/SVneo

In the current study, the HTR-8/SVneo cell line was used the evaluate DCVC concentration- and time-dependent effects on gene expression patterns in placental cells. Both 6-h and 12-h differentially expressed genes demonstrated larger magnitude altered gene expression with 20  $\mu$ M DCVC treatment compared to 10  $\mu$ M, indicating a concentration-dependent response. Likewise, genes differentially



**Fig.7** DCVC effect on ISR-associated ATF4 regulation of gene expression in HTR-8/SVneo cells. Because ATF4 transcriptional regulation is a key regulator of the ISR, ATF4 gene targets were tested for overrepresentation among DCVC-induced differentially expressed genes using a statistical enrichment test. **a** Venn diagram depicting overlap between the number of ATF4 gene targets and genes differentially expressed (FDR <0.05 + logFC > 0.35[FC > 1.3]) after a 12-h exposure to 20  $\mu$ M DCVC compared with control (P=5.52×10<sup>-22</sup>). **b** Heatmap visualizing hierarchical clustering and logFC expression

expressed by 10  $\mu$ M and 20  $\mu$ M DCVC had larger expression changes with 12-h, compared to 6-h, indicating a time-dependent response. These results are consistent with several of our previous studies that demonstrated DCVC time- and concentration-dependent effects on mitochondrial dysfunction (Elkin et al. 2019) and molecular apoptotic signaling (Elkin et al. 2018).

# DCVC-induced upregulation of the integrated stress response

In agreement with overall concentration- and time-dependent effects, the upregulated UPR pathway was enriched with 10  $\mu$ M and 20  $\mu$ M DCVC treatment. Moreover, evaluation of temporal patterns revealed that the groups of late responder genes upregulated by 10  $\mu$ M and 20  $\mu$ M DCVC were enriched for the ATF4 transcription factor, specifically

of 47 genes differentially expressed (FDR <  $0.05 + \log FC > 0.35$ [FC > 1.3]), after exposure to 20  $\mu$ M DCVC for 12 h. Expression levels of other comparisons were included for reference purposes. **c** Visualization of *ATF4* expression, along with the same 47 significantly expressed ATF4 and ATF4 + CHOP gene targets grouped by function and cell fate, with single gene-level logFC displayed. Genes displayed in blue are regulated by ATF4 alone, whereas genes displayed in salmon are co-regulated by ATF4 and CHOP

indicating activation of the ISR. When ISR activation is triggered at the cellular level by stress stimuli, including the PERK branch of the UPR, the principal initiating event is the phosphorylation of the translation initiation factor eIF2 $\alpha$  (Pakos-Zebrucka et al. 2016). Furthermore, in order for cellular recovery to occur from stress-induced homeostatic perturbations, eIF2a phosphorylation concomitantly suppresses global CAP-dependent protein translation while allowing for transcription and translation of selected stress response genes with open read frames in their promotors; namely the central ISR regulatory transcription factor ATF4 (Pakos-Zebrucka et al. 2016; Walter and Ron 2011; Wortel et al. 2017). Indeed, further verification of ISR activation in HTR-8/SVneo cells-beyond differential gene expressiondemonstrated DCVC-induced increased eIF2a phosphorylation, global attenuation of protein synthesis, and elevation





Fig. 7 (continued)

Fig. 8 DCVC effect on principle proteins involved in ISR activation. HTR-8/SVneo cells were treated with 0 (control) or 20 µM DCVC for 12 h. Western blotting was used to measure eIF2a phosphorylation and ATF4 protein levels by a blot scanning system as described in the methods section. Graphical representation of: a relative eIF2 $\alpha$  phosphorylation and **b** relative ATF4 protein concentrations normalized to total protein. Bars represent means  $\pm$  SEM. Data were analyzed with student t-test. Asterisks indicate significant difference compared to control: \*P < 0.05. N = 4 independent experiment, with 3 replicates per treatment in each experiment. Representative western blot images for c eIF2 $\alpha$ /eIF2 $\alpha$ and d ATF4 (All western blots are included in Suppl Fig. 7)







**Fig. 9** DCVC effects on global protein synthesis. HTR-8/SVneo cells were treated with 0 (control) or DCVC (10 or 20  $\mu$ M) for 6 or 12 h. Protein synthesis was measured with O-propargyl-puromycin (OPP) and 5 FAM-azide fluorescent staining quantified by plate reader. Bars represent means±SEM. Data were analyzed by two-way ANOVA (interaction between time and treatment, *P*=0.019) with posthoc Tukey multiple comparisons. Plus sign indicates significant difference compared to control and 10  $\mu$ M DCVC within same time point: <sup>+</sup>*P* < 0.05. *N*=3 independent experiments for each time point, with 4 replicates per treatment in each experiment

of ATF4 mRNA and protein concentrations, confirming ISR activation, as summarized in Fig. 12.

During initial ISR activation,  $eIF2\alpha$  is phosphorylated by one or more of the four enzymes in the eIF2 $\alpha$  kinase family, each of which responds to different stress stimuli: GNC2 (amino acid deprivation), PKR (viral infection), HRI (heme deficiency and ROS), and PERK (endoplasmic reticulum and mitochondrial stress) (Pakos-Zebrucka et al. 2016). In the present study, because we previously measured elevated amino acid concentrations with 12-h 20 µM DCVC treatment (Elkin et al. 2020a), GNC2 is likely not the source of eIF2 $\alpha$  phosphorylation. Although not directly tested here, previous evidence suggests that mitochondrial dysfunction, which is closely associated with ER stress (Malhotra and Kaufman 2011), may be the primary stimulus driving the DCVC-induced ISR, most likely activated by  $eIF2\alpha$ kinases HRI and/or PERK (Quiros et al. 2017; Shpilka and Haynes 2018). Specifically, we previously reported that 20 µM DCVC decreases mitochondrial-dependent basal, maximum, and reserve oxygen consumption rates, decreased ATP-linked respiration and coupling efficiency, increased proton leak, and dissipated mitochondrial membrane potential in HTR-8/SVneo cells (Elkin et al. 2019; Hassan et al. 2016). Moreover, it is well established that mitochondria are the key target of DCVC toxicity in kidney proximal tubular cells (Chen et al. 2001; Lash and Anders 1987; Lash et al. 2003; van de Water et al. 1993; van de Water et al. 1994; Xu et al. 2008). The ATF4-mediated gene expression pattern we observed in HTR-8/SVneo cells closely resembles the mitochondrial stress signature response reported in a multi-omics study by Quiros et al. (2017), including up-regulation of 9 amino acid biosynthesis and 5 transport genes. Moreover, we previously reported elevated SLC1A5 protein concentrations with 12-h 20  $\mu$ M DCVC in HTR-8/SVneo cells (Elkin et al. 2020a). Together, the available evidence suggests that mitochondrial dysfunction is likely a major stimulus driving DCVC-induced ISR activation.

Molecular signaling through the ISR has a degree of complexity that allows for tight regulation and tailored response. Although the ISR largely promotes an adaptive, pro-survival program through attenuation of global protein synthesis (Pakos-Zebrucka et al. 2016; Wortel et al. 2017), if restoration to equilibrium fails due to prolonged or severe stress, then protein synthesis may resume via amino acid biosynthesis and transport, ultimately triggering apoptosis (Han et al. 2013). Contrary to the role of amino acid biosynthesis in triggering cell death as reported by Han et al (2013), we previously demonstrated that HTR-8/SVneo cells are highly dependent on amino acids as a fuel source for successful compensatory mechanisms in response to DCVC treatment, demonstrating ISR complexity (Elkin et al. 2020a). Furthermore, ATF4-regulated gene expression plays a role in both compensation and cell death (Han et al. 2013). ATF4 regulates the gene expression of other transcription factors, while simultaneously interacting with them to co-regulate additional gene targets. For example, ATF4 regulates the expression of DDIT3 while also dimerizing with the gene's translated protein product CHOP. While adaptive genes are largely regulated by ATF4 alone, genes associated with cell death are primarily co-regulated by ATF4 and CHOP upon dimerization. (Han et al. 2013).

Here, we report evidence of conflicting ISR pro-survival and pro-apoptotic signaling in HTR-8/SVneo cells after 12 h of 20 µM DCVC treatment, highlighting both compensatory and pathological processes at play. The differential gene expression analysis revealed many upregulated ATF4 transcriptional gene targets involved in compensatory responses including metabolism, redox balance, amino acid transport, general stress response and autophagy (Fig. 7c). On the other hand, co-regulated ATF4 and CHOP gene targets-implicated in cell death-were also upregulated including amino acid biosynthesis and apoptosis (Fig. 7c). Additionally, we observed no change in cell cycle progression or proliferation, suggesting that, overall, the cells were compensating for DCVC-induced stress after 12 h of exposure. These results are consistent with several of our previous studies that demonstrated simultaneous DCVC-induced pathogenic signaling and functional compensation in HTR-8/ SVneo cells. Specifically, prior work demonstrated DCVCinduced altered macronutrient and metabolic pathway utilization despite no overall change in ATP levels (Elkin et al. 2020a). Additionally, we reported elevated caspase activity despite no detectable apoptosis (Elkin et al. 2018). Taken together, these results indicate that treatment with 20 µM



**Fig. 10** Effects of DCVC on placental villous explant gene expression. First-trimester placental villous explants were treated in vitro with 0 (control) or 20  $\mu$ M DCVC for 12 h. Differential gene expression was measured with edgeR using quasi-likelihood general linear modeling. *N*=5 independent experiments, each performed with tissue obtained from a different placental donor. **a** Volcano plot comparing differential gene expression between non-treated and DCVC-treated villous explants. No genes were differentially expressed (FDR <0.05). Genes fulfilling the following criteria are denoted by

DCVC for 12 h encompasses a critical molecular signaling transition in which, cell death signaling increases despite ongoing compensation, but without concomitant functional consequences.

In addition to specific cellular stresses, elevated ISR signaling components have been implicated in early pregnancy disorders characterized by placental abnormalities. For example, phosphorylated eIF2 $\alpha$ , ATF4 protein, and/or CHOP protein were elevated in placental tissue obtained from pre-eclamptic pregnancies compared with normal pregnancies (Du et al. 2017; Fu et al. 2015). Another

dark pink color: logFC magnitude >0.35 [FC > 1.3]. **b** Upregulated and downregulated gene sets from the MSigDB hallmark collection identified through GSEA as enriched after DCVC treatment. Gene sets are ordered according to the magnitude of normalized enrichment score (NES) and were considered significantly enriched with an FDR <0.05. Gene sets with an asterisk indicate that the pathways contained ISR/ATF4-regulated enriched genes (detailed information found in suppl. Table 6). Columns within grid denote biological categories to which gene sets belong (indicated by black square)

study reported mRNA expression suppression of an ATF4mediated placental growth factor (*PlGF*) in placentae from women diagnosed with early-onset pre-eclampsia and confirmed those results using two trophoblast cell lines (Mizuuchi et al. 2016). Furthermore, prolonged eIF2 $\alpha$  phosphorylation decreased proliferation and invasion of trophoblast cell lines in vitro (Yung et al. 2008), a defining pathological characteristic of IUGR and pre-eclampsia (Brosens et al. 1972; Caniggia et al. 1999; Kadyrov et al. 2006; Meekins et al. 1994). Consequently, ISR activation in trophoblasts, as modeled here by HTR-8/SVneo cells, maybe a mechanism



Fig. 11 Relationship between placental villous explants and HTR-8/ SVneo differential gene expression. In order to characterize the relationship between differential gene expression in first trimester villous explants and HTR-8/SVneo cells exposed to 20  $\mu$ M DCVC for 12 h, respectively, Pearson's correlation coefficients (*r*) were calculated for the pairwise comparison of logFC values, either for all

dually expressed genes (11,913), or ATF4 gene targets only (383). Displayed are correlation plots of logFC in gene expression between tissue and cells for 0 (control) vs. 20  $\mu$ M DCVC for: A) All genes ( $P < 1.0 \times 10^{-15}$ ), or B) ATF4 gene targets only ( $P < 1.2 \times 10^{-9}$ ). Pearson's correlation coefficient values are shown on each respective correlation plot and trend lines are displayed in red

Fig. 12 Summary of proposed DCVC-induced activation of the Integrated Stress Response. DCVC-induced mitochondrial dysfunction activates one or more of the eIF2 $\alpha$  kinases. Kinase(s) phosphorylate eIF2α. Phosphorylated  $eIF2\alpha$  activates transcription and translation of ATF4 and causes global protein attenuation. ATF4 transcription factor up-regulates many genes involved in biological processes necessary to restore homeostasis. ATF4 also up-regulates transcription factor CHOP, which then interacts with ATF4 to activate transcription of genes involved in cell death signaling



by which the TCE metabolite DCVC contributes to placental dysfunction.

## Villous explants versus HTR-8/SVneo differential gene expression

In the present study, two in vitro models were utilized to measure DCVC effects on first-trimester placental gene expression: villous explants and HTR-8/SVneo cells. Due to the limited availability of first-trimester placental tissues, only one experimental comparison was made between the two models, non-treated controls versus 20 µM DCVC treatment for 12 h. Gene-specific expression levels varied considerably between tissues and cells. Treated tissues yielded no differentially expressed genes with an FDR < 0.05, yet thousands were altered with a magnitude  $\log FC > 0.35$ [FC>1.3]. On the other hand, treated cells yielded hundreds of differentially expressed genes meeting FDR criterion, but only half the number of genes were altered with a magnitude logFC>0.35 [FC>1.3] compared to villous explants. These variable results are consistent with the relatively weak calculated correlation between genome-wide differential gene expression in tissues and cells. Differences in these results may be attributed to the tissue model containing multiple non-deconvoluted cell types, versus the cell line model containing only one genetically identical cell type (Campbell et al. 2020).

Although individual differential gene expression results differed between the models, the collective impact of differentially expressed genes-analyzed by GSEA-yielded multiple upregulated biological processes and signaling pathways that were positively enriched with DCVC treatment in both models. Moreover, two of the commonly enriched pathways, TNF $\alpha$  and p53, were previously reported to be upregulated by DCVC treatment in HTR-8/SVneo cells (Elkin et al. 2018). Perhaps most strikingly, the commonly enriched pathways in both models contained enrichment of genes regulated by the transcription factor ATF4. These results were supported by the moderate correlation between differential gene expression of ATF4 gene targets in tissues and cells; a correlation that was nearly twice the magnitude of that between all differential gene expression in tissues and cells. Moreover, the consistent enrichment of ATF4 gene targets across both models is indicative of ISR activation with 12-h DCVC treatment. As such, the presence of multiple cell types may hinder the ability to accurately detect differential gene expression ascribed to extravillous trophoblasts in the tissue model. Moreover, because villous explants preserve the intact villi structure, there is more variability in the underlying physiology of the two models. For example, explants retain elements of functional paracrine regulation between cells types through release of secreted signaling molecules. Therefore, explants more closely mimic in vivo conditions, than cell lines (Mannelli et al. 2015).

## DCVC-induced downregulation of pathways involved in embryonic development

Biological processes and signaling pathways involved in embryonic tissue development comprised the most common category among the downregulated pathways enriched by DCVC treatment. This was a consistent finding across DCVC concentrations and exposure durations in HTR-8/ SVneo cells, but was not evident in tissues. Lending further evidence, PAX6 and SMAD3, two key transcription factors that regulate gene expression patterns in developing embryonic tissues (Liu et al. 2004; Manuel et al. 2015), were enriched with the group of genes with no expression changes at 6 h but downregulation after 12 h of 20 µM DCVC treatment. Furthermore, the histone modification tri-methylation site H3K27me3, which also regulates genes expression during embryonic development, was enriched with the same group of genes. Interestingly, H3K27me3 has been shown to regulate a pattern of gene expression in the placenta that protects tissues from environmental insults (Nugent et al. 2018). These results indicate that the pattern of downregulated genes induced by DCVC treatment may be a response similar to the ISR that is intended to protect the cells and promote adaption.

#### DCVC concentrations

As for any toxicology study, concentrations of the toxicant tested must be carefully selected and justifiable. For the current study, concentrations of 10-20 µM DCVC were used as relevant to potential human exposure levels. The concentrations used in our study are relevant to the Occupational Safety and Health Administration (OSHA) Permissible Exposure Limit (PEL) of 100 parts-per-million (ppm) averaged over an 8-h work day (ATSDR 2016). TCE concentrations up to 229 ppm were reported in 80 exposed workers (29% women) wearing aerosolized monitoring devices (29% women) (Walker et al. 2016). Moreover, female volunteers exposed to the PEL of TCE for 4 h by inhalation had an average peak blood concentration of 13.4 µM for the metabolic precursor to DCVC, S-(1,2-dichlorovinyl)glutathione (DCVG) (Lash et al. 1999), which is comparable to the concentrations used in this study. Finally, the concentrations that caused differential gene expression in our study are considerably lower than those used previously as high as 1 mM DCVC (Chen et al. 2001; Lash et al. 2001; Lash et al. 2003; van de Water et al. 1995; Xu et al. 2008).

In addition to using low concentrations, we also investigated the effects of DCVC on placental cells for short exposure durations. Although longer exposures may more accurately reflect real-life exposures in vivo, this approach enabled us to evaluate the cells' initial response to DCVC exposure, otherwise lost, and elucidate compensatory mechanisms used by the cells during the process of stress-driven compensation. Nevertheless, studies exploring longer DCVC exposure durations on the placenta should also be undertaken to understand the full range of effects on the cells.

# Use of villous explants and HTR-8/SVneo as experimental models

The study was conducted with a cell line and placental tissues in vitro, which may not represent biological interactions that occur in vivo. Although the tissue model keeps the villi structure intact, the critical interplay is lost ex vivo between fetal and maternal cells that play a pivotal role in placental development. Furthermore, genetic and epigenetic profile differences have been reported in HTR-8/SVneo cells when compared to primary extravillous trophoblasts cultured in similar conditions (Bilban et al. 2010; Novakovic et al. 2011). Nevertheless, HTR-8/SVneo cells express a signature combination of molecular markers particular to extravillous trophoblasts, including cytokeratin 7 and HLA-G when grown on Matrigel (Irving et al. 1995; Khan et al. 2011; Kilburn et al. 2000; Takao et al. 2011). Despite the drawbacks of using these in vitro models, both have been extensively used to investigate placental biology and the complex processes involved in placental development (Mannelli et al. 2015).

# Conclusion

In summary, we used transcriptomics and gene set enrichment analyses in two first trimester placental models to identify previously unknown biological processes and molecular signaling pathways altered in response to short-term treatment with DCVC concentrations relevant to human exposures. Western blot analysis confirmed the involvement of these pathways and the functional consequences in the cell model. Although transcriptomics differed between models, GSEA demonstrated that the most substantially altered molecular signaling pathway was the ISR, and the most abundantly altered biological processes included amino acid transport, metabolism and biosynthesis, and regulation of tissue development. Evidence showed decreased global protein synthesis in agreement with ISR signaling. Despite these findings, we found no evidence for the change in cell cycle progression or proliferation under the exposure conditions used, suggesting that compensation occurred after 12 h of DCVC treatment. To our knowledge, this is the first report of DCVC-mediated activation of the ISR in any cell type. These findings support the biological plausibility of DCVC-induced placental toxicity, providing a compelling rationale for further studies of DCVC and its parent chemical TCE on placental pathophysiology.

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Author contributions ERE designed and performed the experiments, analyzed data, and wrote the manuscript. KMB and JAC assisted with experimental design, data analysis, and data interpretation. DB provided laboratory equipment and assisted with laboratory techniques, data analysis, and data interpretation. BAK obtained placental tissues and performed laboratory work on the tissues. RLC and DRA provided funding for the project and offered insight into the interpretation of the results. All authors reviewed and contributed to the manuscript and approved the final version.

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**Data availability** All data have been deposited Gene Expression Omnibus (GEO) and are publicly available. GEO accession numbers are as follows: GSE154339 (HTR-8/SVneo) and GSE154489 (placental villous explants).

### **Compliance with ethical standards**

Conflict of interest The authors declare no conflicts of interest.

**Ethical approval** Placental tissues were acquired as discarded tissues at the time of termination at a Michigan family planning clinic with Institutional Review Board approval (Wayne State University IRB# 013515MP4E) and written informed consent by patients, obtained by collaborating Wayne State University physicians.

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1619

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