# scientific reports



# **Comprehensive assessment OPEN of blood–brain barrier opening and sterile infammatory response: unraveling the therapeutic window**

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**Microbubbles (MBs) combined with focused ultrasound (FUS) has emerged as a promising noninvasive technique to permeabilize the blood–brain barrier (BBB) for drug delivery into the brain. However, the safety and biological consequences of BBB opening (BBBO) remain incompletely understood. This study aims to investigate the efects of two parameters mediating BBBO: microbubble volume dose (MVD) and mechanical index (MI). High-resolution MRI-guided FUS was employed in mouse brains to assess BBBO by manipulating these two parameters. Afterward, the sterile infammatory response (SIR) was studied 6 h post-FUS treatment. Results demonstrated that both MVD and MI signifcantly infuenced the extent of BBBO, with higher MVD and MI leading to increased permeability. Moreover, RNA sequencing revealed upregulation of major infammatory pathways and immune cell infltration after BBBO, indicating the presence and extent of SIR. Gene set enrichment analysis identifed 12 gene sets associated with infammatory responses that were signifcantly upregulated at higher MVD or MI. A therapeutic window was established between therapeutically relevant BBBO and the onset of SIR, providing operating regimes to avoid damage from stimulation of the NFκB pathway via TNF**ɑ **signaling to apoptosis. These results contribute to the optimization and standardization of BBB opening parameters for safe and efective drug delivery to the brain and further elucidate the underlying molecular mechanisms driving sterile infammation.**

**Keywords** Focused ultrasound, Blood–brain barrier opening, Microbubbles, Sterile infammatory response, Magnetic resonance imaging

Since the discovery of noninvasive BBBO through MB and FUS, several studies have investigated drug deliv-ery into the brain<sup>1,[2](#page-12-1)</sup>. This has been reflected in the rising number of clinical trials registered each year<sup>3</sup>. With the growing number of pre-clinical work utilizing MB+FUS, most attention has been devoted to optimizing BBBO parameters on the ultrasound (US) side, while conventional echocardiography contrast agent MBs with polydisperse size distributions have been employed at or near their clinical dose. As the feld moves to more sophisticated MB formulations with longer circulation persistence and monodisperse size distributions, there is a need to elucidate the efects of MB size and number on BBBO. Additionally, the full extent of the sterile infammatory response (SIR) from BBBO requires characterization, in terms of both ultrasound and MB doses. The safety of BBBO needs to be considered to minimize health concerns and mitigate harmful secondary effects<sup>4</sup>.

The BBB is crucial in maintaining homeostasis and is the first line of defense against pathogens and noxious insults<sup>[5](#page-12-4)</sup>. To avoid the passage of undesirable molecules, the BBB is made up of a basal layer of endothelial cells, which selectively excludes hydrophilic molecules larger than 400 Daltons<sup>[6](#page-12-5)[,7](#page-12-6)</sup>. Tight junction proteins such as occludins, claudins and junctional adhesion molecules exist on endothelial cell membranes and form complexes to fasten together neighboring cells<sup>[8](#page-12-7)[,9](#page-12-8)</sup>. Additionally, pericytes and astrocytic end feet processes envelop the

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vasculature, regulating vascular constriction and ensuring proper maintenance of the barrier<sup>10–12</sup>. Collectively, these constituents form a structure referred to as the neurovascular unit.

Microbubbles are ultrasound responsive colloidal particles that have a gas core encapsulated in a shell (e.g., polymer, phospholipid, protein)<sup>13-16</sup>. These 1-10 µm diameter spheres experience an isotropic but dynamic pressure field within the ultrasound focus, resulting in volumetric oscillations<sup>15</sup>. In therapeutic applications, particularly in the brain, ultrasound parameters operate within lower frequencies ( $F \sim 1$  MHz for mice and  $\sim 0.2-0.5$  MHz for humans) to ensure transcranial propagation. Both probability of cavitation and the extent of BBBO are correlated to the mechanical index. Mechanical index can be varied by holding the frequency constant and adjusting the peak negative  $(MI = PNP/\sqrt{F})^{17}$ . With increasing MI, the MB acoustic behavior progresses from mild harmonic oscillations to violent inertial implosions[18–](#page-12-15)[20](#page-12-16). In the context of BBBO, harmonic MB oscillations were found to pry apart tight junction proteins, creating transient pores in the brain endothelium and allowing blood-borne molecules to extravasate $21-24$  $21-24$ .

As the MB is the acoustic actuator that captures the acoustic energy and uses it to produce localized mechanical work on the endothelium, it is also an important parameter that must considered. Of particular interest is the size and concentration, which can be quantified as the injected microbubble volume dose (MVD,  $\mu L/kg$ )<sup>[25](#page-13-2),[26](#page-13-3)</sup>. When matching MVD, MBs of different sizes were found to produce similar pharmacokinetic profiles<sup>[27](#page-13-4),28</sup>, acous-tic response as measured by passive cavitation detection<sup>29</sup>, and extent of BBBO<sup>[25](#page-13-2)</sup>. Thus, MVD and MI serve as relevant MB and ultrasound dosing parameters, respectively, forming two axes to identify a window of safety and efficacy.

Despite technical characterization over the years, one of the most understudied areas is related to the biological consequences of BBBO. On a larger scale, it has been observed that temporarily permeabilizing the BBB with inertial cavitation can induce microhemorrhages, transient edema and even cell death. Upon closer examination, transcriptomic analyses of the parenchymal microenvironment following MB+FUS BBBO have revealed upregulation of inflammatory pathways, mostly notably the NF $\kappa$ B pathway<sup>[30,](#page-13-7)31</sup>. While occurring in the absence of an active infection, this event has been labeled as the sterile infammatory response (SIR) and is initiated when damage-associated molecular patterns are released from injured cells<sup>32-34</sup>. These include ATP, uric acid, DNA and HMBG proteins, which bind to pattern recognition receptors provoking the immune system<sup>[35,](#page-13-11)36</sup>. Subsequently, proinfammatory cytokines such as TNFɑ and IL2 are released from infammasomes and stimulate the activation of innate immunity<sup>37</sup>. Several studies have implicated the hallmark activation of the NFκB pathway in the persistence of SIR; however, the direct mechanism of activation and associated pathways remain unclear  $38-42$  $38-42$ . Moreover, microglia, the primary immune cells of the brain, migrate to the source of infammation and release cytokines, signaling the recruitment of peripheral immune cells and other cell types in the area<sup>[30](#page-13-7),[43](#page-13-16)</sup>. Peripheral immune cells such as CD68+macrophages circulate in the meninges via chemotaxis and migrate to the damaged area to investigate and resolve the inflammatory response<sup>30</sup>. Despite BBB closure within a 24-h window, peripheral immune cells have been shown to continue extravasating past the BBB<sup>44,45</sup>.

Here, we report on a study to determine the extent of BBBO and SIR using a combination of MI (0.2–0.6 MPa/ $\sqrt{MHz}$ ) and MVD (0.1–40  $\mu$ L/kg). By using MRI-guided FUS, we sonicated the right mouse striatum and collected brain samples for bulk RNA sequencing 6 h post-sonication. We defned signifcant BBBO as a 15% increase in signal intensity over a 1 mm<sup>3</sup> volume in contrast enhanced T1-weighted MRI (CE-T1w MRI). The normalized enrichment score (NES) indicated how statistically significant mRNA for a given pathway was increased (upregulation) or decreased (downregulation) following MB+FUS treatment. We propose a defnition of SIR according to three classes defned by NES analysis, which describe the statistical signifcance of a pathway (using an a priori set of genes from published bioinformatics databases like Gene Ontology, KEGG and MSigDB) to the observed phenomenon or phenotype through overrepresentation of specifc gene expression (NES>1.65) (Class I: TNFɑ signaling via NFκB gene set; Class II: both the TNFɑ signaling via NFκB and Infammatory response gene sets; Class III: TNFɑ signaling via NFκB, Infammatory response, and a damage-associated marker, apoptosis). Using these criteria, we developed a therapeutic window of ultrasound MI and microbubble MVD between the onset of BBBO and the onset of SIR, for each of the three classes. These windows will help to determine safe and efficacious  $MB + FUS$  parameters for BBBO in various applications.

#### **Materials and methods Animals**

All experiments involving animals were approved by the Institutional Animal Care and Use Committee (IACUC) at the University of Colorado in CD-1 IGS mice (strain code: 022), and all methods are reported in accordance with ARRIVE guidelines (<https://arriveguidelines.org>). All mice used were female 9–11-week-old and purchased from Charles River Laboratory.

#### **Microbubble preparation**

Lipid-coated microbubbles containing a perfuorobutane (PFB) gas core were synthesized via sonication, as described previously by Feshitan et al.<sup>46</sup>. A monodispersed population of MBs ( $3 \pm 0.5$  µm) was isolated by differential centrifugation. The isolation process, including centrifugation speeds, can be found in Supplemental Fig. S9. Microbubble concentration and number- and volume-weighted size distributions were measured with a Multisizer 3 (Beckman Coulter). Microbubble concentration  $(c_i, \text{MBs}/\mu L)$  versus microbubble volume  $(v_i, \mu L)$ MB) was plotted, and the gas volume fraction  $(\phi MB)$  was estimated as follows:

$$
\phi MB = \sum_{i=1}^{n} v_i \times c_i
$$

2

where  $i$  is the index of the sizing bin, 300 bins ranging from 0.7 to 18  $\mu$ m in diameter. Three independent MB preparations were measured 2 h before FUS treatment to confrm size distributions and concentration. MB stability 1 h afer dilution to relevant injection concentration was also measured (Supplemental Fig. S10).

#### **Magnetic resonance imaging**

A Bruker BioSpec 9.4/20 Tesla MR Scanner (Bruker, Billerica, MA) with a mouse head RF phase-array coil was used. Mice were placed into an custom designed MRI bed that contained a stereotaxic ear bar. Each MRI session consisted of a 3D-localizer, and T1w MSME (Multi-Spin Multi-Echo) images were acquired in the axial plane (Table S3) 12 min afer intravenous injection of 0.4 mmol/kg gadobenate dimeglumine (MultiHance, Bracco, Princeton, NJ). All mice underwent high-resolution 3D T2-turboRARE (Rapid Acquisition with Relaxation Enhancement) scans for anatomical imaging (Table S3). Mice remained stereo-tactically placed on an MRI bed and transferred to the FUS system for treatment. All image acquisition was performed using Bruker ParaVision NEO360 v.3.3 software.

#### **MR image analysis**

T1w MRI data sets quantifed the extent of BBBO using FIJI (Maryland, USA). All axial slices were analyzed by defining the contralateral hemisphere and determining the mean and standard deviation of voxel intensities. The treated hemisphere was then defned, and all voxels were found above two standard deviations of the contralateral side. The area was determined and multiplied by slice thickness (0.7 mm) to find BBBO volume. The contrast enhancement (CE) was determined by the average intensity within BBBO volume and divided by the average intensity of the control region. Using control images (mice without BBBO), CE variation on the right side was found to be  $0 \pm 6\%$  (Supplemental Fig. S1), therefore significant opening was defined as a greater than 15% CE.

### **MRI‑guided FUS treatment**

The experimental setup is shown in Fig. [1D](#page-3-0). A single element, geometrically focused transducer (frequency: 1.515 MHz, diameter: 30 mm) was driven by the RK-50 system (FUS Instruments, Toronto, Canada). A single element, geometrically focused transducer (frequency: 0.7575 MHz, diameter: 10 mm) coaxially inside the driving transducer was used for passive cavitation detection. Using the T2-weighted MR image (coronal), the center of the striatum was targeted (Fig. [1](#page-3-0)D). Ultrasound gel (Aquasonic gel, Clinton Township, MI) was placed on the mouse. An acoustically transparent tank flled with degassed water was placed on top of the gel Fig. [1D](#page-3-0). Microbubbles (0.1–40 μL/kg; 0.1 mL) and 0.1 mL MultiHance was injected intravenously through a retroorbital injection via 26 Ga needle. Aferward (within 10 s) FUS was applied. FUS parameters were as follows: 10 ms PL, 1 Hz PRF, 300 s treatment time, and a PNP of 0.308, 0.615, or 0.923 MPa (0.246, 0.492, or 0.738 MPa in situ). Voltage data from the PCD was collected during the entire FUS treatment and analyzed as previously described<sup>[29](#page-13-6)</sup>. The remaining PCD analysis was done using MATLAB (Massachusetts, USA) including the calculations of harmonic and broadband cavitation doses. Mice were sent back to MRI to complete post-FUS T1-weighted imaging. Groups were divided into n=3 for all 12 dose levels (3 MIs, 4 MVDs).

#### **RNA extraction and bulk RNA sequencing**

At 6 h post FUS treatment mice were sacrifced via perfusion with 60 mL of ice-cold PBS. Post dissection, the treated site was removed and snap-frozen using liquid nitrogen. Brain samples were weighed and then immediately placed into a cell lysing bufer (Qiagen, Hilden, Germany), and homogenized for 30 s. RNA was isolated and purifed using the RNAeasy Kit (74,004, Qiagen). Quality control and library preparation were performed through the Anschutz Genomics Core for sequencing. Poly A selected total RNA paired-end sequencing was conducted at 40 million paired reads (80 million total reads) on a NovaSEQ 6000 sequencer.

#### **Bulk RNA sequencing analysis**

FASTQ fles were obtained from Anschutz Genomics Core afer sequencing. RNA analysis was performed using Pluto [\(https://pluto.bio\)](https://pluto.bio). Principal component analysis (PCA)<sup>47</sup> was calculated by applying the prcomp() R function to counts per million (CPM)-normalized values for all 40,773 targets in samples from all groups. The data was shifted to be zero-centered. The data was scaled to have unit variance before PCA was computed. Differential expression analysis was performed comparing the groups to the isofurane-only control group unless otherwise noted in the fgure caption. Genes were fltered to include only genes with at least 3 reads counted in at least 20% of samples in any group. Diferential expression analysis was then performed with the DESeq2 R package[47](#page-13-20), which tests for diferential expression based on a model using the negative binomial distribution. Log2 fold change was calculated for the comparison of the experiment to the control group. Tus, genes with a positive log2 fold change value had increased expression in treatment samples. Genes with a negative log2 fold change value had increased expression in control samples. Gene set enrichment analysis (GSEA) was done using the fgsea R package and the fgseaMultilevel() function<sup>48</sup>. The log2 fold change from the experiment versus control diferential expression comparison was used to rank genes. Hallmark gene set collection from the Molecular Signatures Database (MSigDB) $49,50$  was curated using the msigdbr R package.

#### **Statistical analysis**

All data collected are presented as mean±SD. No preprocessing was done to the data except for voltage data collected from the PCD. PCD data were preprocessed as described in Martinez et al.<sup>[29](#page-13-6)</sup>. All statistical analysis was completed in Prism 9 (GraphPad, California, USA). Star representations of *p*-values are indicated in captions and less than 0.05 was indicative of statistical signifcance. An unpaired Student's t-test and ANOVA/multiple



<span id="page-3-0"></span>**Figure 1.** Microbubble Characterization and Treatment Timeline. (**A**) Brightfeld image of isolated microbubbles (3  $\mu$ m) in diameter. (**B**) Number- and volume-weighted size distributions. Vertical dotted lines represent mean values. (**C**) Microbubble concentration plotted against volume at a basis concentration of 1010 MBs/mL. Te shaded region under the curve represents the gas volume fraction. (**D**) Illustration of the MB+FUS treatment timeline. Initially, mice were imaged using T2w and CE-T1w MRI. Subsequently, they were moved to the RK-50 system to receive MB+FUS treatment. A more detailed timeline is provided at the bottom of panel D. Afer treatment, mice were imaged again with CE-T1w MRI. Data are presented as mean±standard deviation  $(n=5)$ .

comparisons were used to compare two groups and larger comparisons, respectively. The false discovery rate (FDR) method was applied for multiple testing correction[s51.](#page-13-24) An adjusted *p*-value of 0.05 was used as the threshold for statistical signifcance.

# **Results**

#### **Microbubbles have a narrow size distribution**

Microbubbles were isolated to a uniform size of  $3\text{-}\mu\text{m}$  ( $\pm 0.5$ ) diameter, as seen under brightfield microscopy (Fig. [1](#page-3-0)A). The size distribution of the MBs is monodisperse, with narrow peaks observed in both the number- and volume-weighted distributions (Fig. [1B](#page-3-0)). The mean diameters for the number- and volume-weighted distributions were 3.3 μm and 3.7 μm, respectively. The 10th and 90th percentiles in diameter were determined to be 2.53 µm and 4.19 µm respectively (Table S1). To ensure consistent MVD injection, each MB batch was analyzed. Figure [1C](#page-3-0) illustrates the relationship between MB concentration and volume, which was integrated to calculate the gas volume fraction (ϕMB). For a basis concentration of 1010 MBs/mL, the mean ϕMB was determined to be 17 µL/mL (Table S1). MVD is calculated by multiplying ϕMB by the fuid volume dose (mL/kg) injected intravenously into the subject.

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### **Blood–brain barrier opening is dependent on both MVD and MI**

The CE-T1wMRI revealed an intact BBB before the FUS procedure, as seen of minimal enhancement after MultiHance injection. Quantifcation of BBBO was performed on post-FUS CE-T1w MRI, based on the changes in T1 signal intensities in T1w versus CE-T1w MRI as illustrated in Fig. [2A](#page-4-0). The CE difference between the contralateral hemispheres before FUS treatment was determined to be  $0.05 \pm 6\%$  (mean  $\pm$  standard deviation) (Supplemental Fig. S1). T2w MRI confrmed normal brain morphology.

Figure [2B](#page-4-0) shows representative images of BBBO for all twelve doses (MI/MVD). Within these experimental parameters, a clear onset of BBBO occurs at MVDs greater than 1 µL/kg at 0.2 MI, and MVDs greater than 0.1 µL/ kg at both 0.4 and 0.6 MI. Irregular morphology was observed at the highest dose, as indicated by loss of brain structure in hypointense areas in T1w MRI (white arrow in Fig. [2](#page-4-0)B). As the MI or MVD was increased, both the BBBO volume and amplitude increased, as seen by increased relative signal intensity (Fig. [2C](#page-4-0),D). Linear trends between brain CE in BBBO (volume and intensity) and the MI/MVD were observed, yielding signifcant



<span id="page-4-0"></span>**Figure 2.** Assessment of BBBO using Gadolinium contrast enhancement. (**A**) Cartoon depicting post-CE-T1w MRI image analysis. (**B**) Representative images of post-FUS MRI for each MI/MVD dose, captured at the peak BBBO area. (**C**) Quantifcation of BBBO volume (*n*=3). Linear regression was performed for each mechanical index, resulting in R squared values of 0.86, 0.71, and 0.91 for 0.2, 0.4, and 0.6  $\tilde{M}$ I, respectively. The X-axis is presented on a logarithmic scale. (**D**) Quantifcation of BBBO CE (*n*=3). Linear regression was conducted for each mechanical index, resulting in R squared values of 0.79, 0.82, and 0.87 for 0.2, 0.4, and 0.6 MI, respectively. The X-axis is presented on a logarithmic scale. Data are presented as mean  $\pm$  standard deviation.

 $(p<0.05)$  trends for all MIs (Fig. [2](#page-4-0)C,D). Transposed plots comparing volume and CE to MI are shown in Supplemental Fig. S2A,B. Multiple regression analysis (MI+MVD) between BBBO CE resulted in  $R^2$ =0.86, although  $R^2$  increased to 0.90 when analyzed as MI\*MVD. This was similar for BBBO volume, with  $R^2$  moving from 0.89 (MI+MVD) to 0.94 (MI\*MVD). Using FIJI, a round and circle score was given to each shape of BBBO to determine any lobe efects at high ultrasound pressures, and no signifcant diferences were found between any dose pair (Supplemental Fig. S3). Based on the signifcance testing of pre-FUS controls (0.05±6%, Supplemental Fig. S1), significant BBBO after FUS was defined as a 15% CE over a 1 mm<sup>3</sup> volume. These intensity and volume thresholds are represented as dotted lines in Fig. [2](#page-4-0)C,D.

In addition to RNA sequencing, brains were stained fuorescently to visualize immune cell infltration at the site of MB+FUS treatment. Five markers for immune cells were utilized, including GFAP, Iba1, CD68, CD4 and CD8 staining, astrocytes, microglia, peripheral macrophages, helper T-cells and cytotoxic T-cells (Supplemental Table S2). Representative IHC images were taken of the major efector protein, NFκB, to detect qualitatively the presence of infammatory hotspots in the region of sonication on the post-FUS T1 images (Supplemental Fig. S4). Additionally, representative IHC images of CD4 (activated immune cells) showed increased signal with increasing MI. Meanwhile, Luxol fast blue staining for myelin (Supplemental Fig. S5) and hematoxylin and eosin staining to observe any changes to gross morphology (Supplemental Fig. S4) for each MI showed no diferences between the groups.

#### **Passive cavitation detection demonstrates microbubble activity varies with both MI and MVD**

During each sonication, PCD recordings assessed microbubble acoustic activity during treatment. Voltage data obtained from PCD recordings were preprocessed and converted to the frequency domain (Fig. [3](#page-6-0)A). The frequency content analysis revealed an increase in subharmonic and ultra-harmonic content with higher MVD and MI (Fig. [3B](#page-6-0)). The presence of significant broadband content was observed only when the MVD exceeded 1 µL/kg at 0.6 MI (Fig. [3](#page-6-0)B). Te frequency content throughout the treatments displayed a slight increase afer injection, followed by a decline as MBs were cleared from circulation. Tis phenomenon was particularly evident at the highest MVD of 40 µL/kg (Fig. [3](#page-6-0)C). The average harmonic cavitation dose (HCD) was calculated for all doses, and a signifcant linear trend was observed at all three MIs (*p*<0.05, Fig. [3D](#page-6-0)). Furthermore, there were no signifcant diferences in broadband cavitation doses (BCD) between 0.2 and 0.4 MI at any MVD. However, statistically signifcant diferences were observed at 0.6 MI with MVD higher than 1 µL/kg (Fig. [3](#page-6-0)D). Transposed plots comparing HCD/BCD to the MI can be found in Supplemental Fig. S6A,B. These values for no FUS and no MB controls are shown in Supplemental Fig. S7. Additionally, Fourier fast transform (FFT) plots of the PCD analysis have been added to Supplemental Fig. S11 to show the efects of retaining versus removing the fundamental frequency on the cavitation dose.

#### **RNA sequencing indicates diferential gene expression varies with MI and MVD**

Six hours afer MRI-guided FUS treatment, RNA was extracted from the treated brain region. Figure [4](#page-7-0)A illustrates our RNA sequencing pipeline, highlighting steps from extraction to analysis. To confrm variance between groups, all samples were initially plotted on a principal component analysis (PCA) graph. Figure [4](#page-7-0)B displays the primary two components with the highest variability, accounting for 14% and 9% of the total variance. Other variability testing was conducted on samples including UMAP and t-SNE plots found in Supplemental Fig. S8A,B.

Each triplicate sample was then analyzed for diferentially expressed genes (DEGs) against the no-FUS control (+Isoflurane) (Fig. [4](#page-7-0)C). Overall, the DEGs increased with a higher MI or MVD. The highest number of DEGs was observed in the highest MVD and MI dose (40 MVD+0.6 MI), totaling 1836 genes; the lowest observed number was 12 at the lowest MI and MVD. To understand their signifcance, the 1836 DEGs from the highest dose were analyzed for similarities with other doses. Among these genes, 536 were also found in at least two other doses, indicating a specific effect of MB+FUS treatment (Fig. [4](#page-7-0)D). The 536 genes were organized based on their fold change at the highest dose. As the dose was reduced in either MVD or MI, fewer genes in the set showed signifcant diferential expression, as indicated by the white bars. Notably, the lowest dose (0.1 MVD+0.2 MI) did not exhibit signifcant diferential expression among the 536 genes. Furthermore, the expression levels of these 536 genes remained consistent across all doses. The genes showing higher expression levels in the highest dose (40 MVD+0.6 MI) also demonstrated higher expression levels in all other doses. Similarly, the less expressed genes maintained their lower expression levels consistently across all doses, following a similar gradient.

#### **Hallmark gene set enrichment analysis reveals infammatory response after BBBO**

The next step in RNA analysis was to perform GSEA to provide a biological context for the DEGs. To cover a wide range of biological processes, we utilized the 50 hallmark gene sets from the Broad Institute (Cambridge, Massachusetts). Figure [5](#page-8-0)A illustrates the top gene sets identifed across all 12 doses. Notably, there are 12 distinct gene sets that show upregulation at the highest doses and decline as the MI or MVD decreases. These twelve gene sets include, beginning with the most significant: TNFa Signaling via NFKB, Inflammatory Response, Hypoxia, Allograft Rejection, Epithelial-Mesenchymal Transition, Interferon Gamma Response, IL6 Jak Stat3 Signaling, Apoptosis, Complement, P53 Pathway, IL2 Stat5 Signaling, and Coagulation. Importantly, all these gene sets are closely associated with infammatory responses.

Enrichment plots for all gene sets identifed in the highest dose (40 MVD+0.6 MI) are presented in Fig. [5B](#page-8-0). The high peak on the left side of the plots indicates the strong enrichment of these gene sets. Gene set relationships were illustrated via a Circos plot in Fig. [5C](#page-8-0), where direct gene connections (represented by purple lines) and connections via Gene Ontology (GO) biological processes (light blue lines) are established between each gene set. Purple lines indicate the presence of the same gene in diferent gene sets, while blue connections represent genes found in similar Gene Ontology (GO) pathways across diferent gene sets.



<span id="page-6-0"></span>**Figure 3.** Assessment of acoustic response using PCD. (**A**) Illustration of PCD data analysis. Voltage versus time data was cropped to remove the pre-FUS signal, followed by Tukey windowing and high-frequency filtering beyond PCD sensitivity (left). The resulting signal was then converted to the frequency domain using FFT, and the area under the curve (AUC) was quantifed for respective regions to determine harmonic cavitation dose (HCD) and broadband cavitation dose (BCD) (right). (**B**) Average FFT for each FUS pulse during a fve-minute treatment at each respective MI/MVD dose. (**C**) Representative spectrograms for 40 MVD doses are shown throughout the sonication time (300 s). Quantifcation of harmonic cavitation dose (**D**) and broadband cavitation dose (**E**) with respect to MVD and MI (*n*=3). Linear regression was performed for each MI, resulting in R squared values for harmonic cavitation dose was 0.71, 0.74, and 0.71 for 0.2, 0.4, and 0.6 MI, respectively. The R-squared values for broadband cavitation dose were 0.73, 0.52, and 0.75 for 0.2, 0.4, and 0.6 MI, respectively. Data are presented as mean±standard deviation.

Figure [5D](#page-8-0) provides another perspective by visualizing the major mechanisms between these gene sets through signaling molecules. Three main groups emerge from the analysis of these gene sets: the initial inflammatory response (TNFɑ signaling via NFκB), the major infammatory response (which involves more chemokine and cytokine signaling), and damage-associated gene sets (related to apoptosis). Overall, the results of the GSEA highlight the prominent role of infammatory responses and related pathways in the transcriptional changes observed owing to MB+FUS dose escalation.

#### **Blood–brain barrier opening by CE‑T1w MRI is the best indicator of SIR**

To better understand the relationship between our parameters and BBBO or SIR, we conducted a correlation matrix analysis of all major variables identifed. Figure [6A](#page-9-0) presents this matrix, highlighting both strong and weak correlations. Our analysis revealed a stronger correlation between hyperintense volume and CE in BBBO

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<span id="page-7-0"></span>

areas with MVD, as compared to the MI (0.83 vs. 0.76 and 0.41 vs. 0.48, respectively). PCD parameters exhibited consistent relationships (0.46–0.64) with both MVD and MI. In terms of RNA expression, indicated by normalized enrichment scores (NES), correlations varied with MVD or MI. MVD showed a stronger correlation with complement, hypoxia, and TNF $\alpha$  signaling via NF $\kappa$ B (R<sup>2</sup>=0.79, 0.68, and 0.70, respectively). On the other hand, MI displayed a stronger correlation with IL2/stat5 signaling, IL6/jak/stat3 signaling, interferon-gamma response, allograft rejection, and inflammatory response ( $R^2$ =0.60, 0.63, 0.75, 0.61, and 0.78, respectively). Our main finding indicated that BBBO volume and BBBO CE were the efects most strongly associated with RNA expression, with all correlations having  $R^2$  values greater than 0.86 (excluding allograft rejection and interferon-gamma response). We then plotted our top-represented gene sets against BBBO volume (Fig. [6](#page-9-0)B). At least half of all doses exhibited signifcant NES in each gene set, and each relationship demonstrated strong linear correlations.



<span id="page-8-0"></span>**Figure 5.** Hallmark gene set enrichment analysis. (**A**) Dot plot illustrating the 12 MI/MVD doses based on size (adjusted *p*-value) and color (normalized enrichment score). Gene sets are arranged by adjusted *p*-value for the highest MI/MVD dose. (**B**) Enrichment plot presenting the top 12 gene sets identified in (**A**). The x-axis displays the genes ranked by log2 fold change, with vertical ticks indicating the gene positions within the gene set. The heatmap represents gene expression, with red indicating higher expression in the first group (40 MVD + 0.6 MI), and blue representing higher expression in the isoflurane control group. The green line represents the running enrichment score. (**C**) Overlapped Circos plot demonstrating relationships between the top 12 enriched gene sets. Purple lines indicate the presence of the same gene in diferent gene sets, while blue connections represent genes found in similar Gene Ontology (GO) pathways across diferent gene sets. (**D**) Schematic representation of the top enriched gene set pathways.

A noteworthy observation was the identifcation of a small cluster of three MVD/MI doses: 1 MVD+0.6 MI, 10 MVD + 0.4 MI, and 40 MVD + 0.2 MI (red circles). These doses exhibited similar BBBO CE (between 31.6 and 38.5%) and NES in fve of six gene sets. To gain further insights, we performed DEG analysis between each dose (Fig. [6](#page-9-0)C). The volcano plots indicated minimal differences in gene expression, with a limited number of DEGs (4–125 genes). To corroborate these fndings, we examined the fold change in highly utilized genes (leading edge genes) within fve infammatory families (Fig. [6D](#page-9-0)). We observed similar expression levels among the cluster doses, while their expression difered signifcantly from the lowest and highest doses. Overall, our results suggest that the extent of BBBO plays a pivotal role in the SIR, surpassing the infuence of other parameters in isolation.





<span id="page-9-0"></span>**Figure 6.** Correlation of RNA expression and BBB opening. (**A**) Correlation heatmap showing the relationship between MI and MVD doses and resulting BBBO volume, contrast enhancement (CE), cavitation doses, and  $RNA$  expression. Pearson correlation coefficient  $(r)$  values are displayed in each box. The color scale represents the magnitude of the Pearson correlation coefficient. (**B**) Correlation between normalized enrichment score (NES) scores and BBBO volume. Only pathways from gene sets with more than six doses exhibiting signifcant NES scores are represented. Linear regression analysis was performed for each plot, and the corresponding R-squared value is shown in the top left corner. The plots indicate the fraction of significant doses in the bottom right. A red circle denotes a small cluster of three doses with similar BBBO volumes. (**C**) Volcano plot displaying the differentially expressed genes (DEGs) between doses within the small cluster  $(40 \text{ MVD} + 0.2 \text{ MI}, 10$  $MVD + 0.4$  MI, and 1  $MVD + 0.6$  MI). The number of DEGs is indicated in the top right corner. (**D**) Bar graph representing the log2 fold change of the lowest dose (0.1 MVD+0.2 MI), the cluster doses, and the highest dose  $(40 MVD + 0.6 MI)$ . The x-axis displays five of the most influential genes within five inflammatory signaling families.

#### **Therapeutic windows can be defned between BBBO and SIR**

We defined significant BBBO as a minimum of 15% CE in a volume greater than 1 mm<sup>3</sup>. Figure [7](#page-10-0)A presents a dot plot depicting all doses and their corresponding BBBO volume (size) and CE (color). With defned thresholds, we observed a region representing insignifcant BBBO (blue) and signifcant BBBO (red).

We recognized the gradient of responses and developed different classes of SIR (Fig. [7](#page-10-0)B). Each class encompassed previous classifcations, creating a hierarchical framework. Figure [7C](#page-10-0) illustrates the therapeutic window



<span id="page-10-0"></span>**Figure 7.** Therapeutic window between BBBO and onset of sterile inflammatory response (SIR). (A) Dot plot illustrating the mean blood–brain barrier opening (BBBO) in terms of volume (represented by the size of the dot) and contrast enhancement (indicated by the color of the dot). The grid is plotted based on microbubble volume dose (MVD) and mechanical index (MI). Signifcant BBBO is defned as 15% contrast enhancement in a 1 mm<sup>3</sup> volume. The red region represents significant BBBO, while the blue region represents insignificant BBBO. (**B**) Classes defned for the onset of the sterile infammatory response. Each circle represents the criteria required to meet a specifc class level. (**C**) Dot plot displaying the regions of neither signifcant BBBO nor SIR (purple), BBBO only (green), SIR only (light blue), or signifcant BBBO and SIR (pink). Each plot represents a diferent class level for the onset of SIR as defned in (**B**).

between signifcant BBBO and SIR. In Class I, the least strict classifcation, signifcant NES (>1.65) in the TNFɑ signaling via NFκB gene set serves as the defning criterion. Within this class, a small window of signifcant BBBO is observed before the onset of SIR (10 MVD + 0.2 MI and 1 MVD + 0.4 MI). The only instance where SIR occurs without signifcant BBBO is 0.1 MVD+0.6 MI.

Class II is defned by the onset of signifcant NES (>1.65) for both the TNFɑ signaling via NFκB and Infammatory response; the therapeutic window expands. Here, three doses exhibit signifcant BBBO without the onset of SIR (10–40 MVD+0.2 MI and 1 MVD+0.4 MI).

Finally, Class III is characterized by significant NES (> 1.65) for TNFa signaling via NFKB, Inflammatory response, and a damage-associated marker, apoptosis. We observe fve doses with signifcant BBBO but no onset of acute SIR ( $10-40$  MVD + 0.2 MI,  $1-10$  MVD + 0.4 MI, and 1 MVD + 0.6 MI). These findings delineate the therapeutic window between signifcant BBBO and the onset of acute SIR, providing valuable insights into the relationship between these two critical factors.

#### **Discussion**

FUS with MBs has gained significant attention as a promising approach for non-invasive delivery to the brain<sup>52–[56](#page-13-26)</sup>. This technique offers modularity with a diverse set of US and MB parameters that can be used, enabling BBBO manipulation and subsequent infammatory responses. However, defning appropriate thresholds can be challenging. We focused on two key parameters: mechanical index (MI, MPa/ $\sqrt{\rm MHz}$ ) to predict in situ pressure at the focus and microbubble volume dose (MVD,  $\mu$ L/kg) to quantify total injected gas volume. These parameters have demonstrated the crucial roles of US and MBs in determining BBBO<sup>[17](#page-12-14),[57](#page-13-27)</sup>. Consistent with previous studies investigating the relationship between BBBO and MI[56](#page-13-26)[–60,](#page-14-0) we observed a similar linear relationship between MI and cavitation activity with the extent of BBBO, as measured by MRI CE. Similarly, as MVD increased, a linear efect on BBBO was observed. Our multiple regression analyses concluded that the strongest relationship occurs when combining the influence of both MI and MVD as the product of these two doses. This synergy, represented through the term, MI\*MVD, exhibited a high coefficient of determination ( $R^2$ =0.9), indicating that the combined efect of MI and MVD has a greater impact on BBBO than either parameter alone.

PCD provided valuable insights into MB behavior in real-time during the treatments. The analysis of the voltage data<sup>[29](#page-13-6)</sup> determined the HCD/BCD, which showed linear trends with MI and MVD. Notably, the HCD exhibited a powerful relationship with both BBBO volume and CE, confrming its potential as a predictive parameter for assessing BBBO $^{20,42,56,61}$  $^{20,42,56,61}$  $^{20,42,56,61}$  $^{20,42,56,61}$  $^{20,42,56,61}$ .

Determining the threshold for signifcant BBBO is crucial for safe and efective treatments. While various studies have investigated this threshold, the wide array of parameters and metrics utilized makes direct comparisons between experiments challenging. Nonetheless, many studies have reported a threshold in the range of 0.3 to 0.5 MI at different MVDs. We found the threshold for significant BBBO (>15% CE in a volume of  $1 \text{ mm}^3$ ) to be greater than 1 MVD+0.2 MI and greater than 0.1 MVD+0.4/ 0.6 MI. Our estimates for a 15% increase in targeted signal intensity are dependent on our specifc MRI protocol. It is important to note that our highest dose (40 MVD+0.6 MI) resulted in irregular tissue morphology illustrated by hyperintense and hypointense regions on T1w+CE MRI. Tis observation suggests a potential maximum safety threshold at 40 MVD+0.6 MI at our tested ultrasound parameters (1 MHz, 10 ms PL, 10% D.C).

Bulk RNA sequencing enables us to understand the global transcriptomic activity in cells or tissues. To limit noise from areas outside of our focal region, we performed an MRI-guided dissection of the sonicated region for RNA isolation. Analysis of sequencing data revealed that at higher MB+FUS doses (e.g., 40 MVD + 0.6 MI), more DEGs were present indicating heightened transcriptomic activity. This was not the case when compared to combinations of lower MB+FUS doses (0.1 MVD+0.2 MI). In Fig. [5D](#page-8-0), we compared all DEGs in the highest dose (40 MVD + 0.6 MI) against DEGs in the remaining conditions (11/12). However, when compared against the most common DEGs, no genes were signifcantly up or downregulated, indicating that the 62 DEGs are not related to infammation or damage but rather other tangential biological processes.

GSEA was performed on all 12 combinations using the 50-hallmark gene set analysis, which compared gene expression against the 50 most fundamental biological pathways and functions in the body. Out of the 50 pathways analyzed, our DEG expression profle matched similar expression patterns and genes associated with infammation and damage, with the highest ranked pathway as TNFa signaling through NFKB. This finding corroborated results from other studies that identifed activation of the NFκB pathway as a primary driving force behind  $\rm SIR$  after  $\rm MB+FUS$   $\rm BBBO^{30,31,62}.$  Outside of broad inflammatory responses, other pathways that are upregulated are the JAK/STAT and Interferon family. These pathways have been associated with immune recruitment, specifi-cally involving T-cell activation and macrophage chemotaxis towards inflammatory hotspots<sup>[63](#page-14-3),[64](#page-14-4)</sup>. This supports the evidence of peripheral immune cell extravasation afer BBBO-induced SIR and implicates specifc immune cell populations that are responsible for mediating host-specifc responses. A third major event observed in the RNA sequencing data was the enrichment of genes in pathways related to hypoxia and apoptosis, indicative of cellular damage. Increased MI is known to infict cellular damage, as greater mechanical forces exerted on the vessel endothelium have been associated with hemorrhaging<sup>65,66</sup>. This has similarly been observed in multiple studies<sup>[56](#page-13-26),57</sup>, where increased peak negative pressures for BBBO produced cerebral microhemorrhages and damage consistent with traumatic brain injury<sup>[67](#page-14-7)</sup>. Another study showed transiently altered blood flow and hypoxia were observed with BBBO, and capillary vessel restriction was implicated as the source<sup>68</sup>. This study along with our observations adds a dimension to the SIR, which considers cellular damage in the potentiation of SIR.

Afer running the 50-hallmark analysis, we conducted a correlation analysis comparing the most enriched pathways identifed by GSEA against tested US and MB parameters. Interestingly, our fndings revealed distinct pathways that exhibited a stronger correlation with MVD, such as the activation of the complement system, hypoxia, and NFκB pathway via TNFɑ signaling. Unexpectedly, activation of the NFκB pathway exhibited a more pronounced correlation with MVD, while MI had a stronger relationship with pathways such as allograf rejection, IL2/STAT3, IL6/JAK/STAT3, IFNγ , and infammatory response. Despite obvious diferences observed between MI and MVD, all pathways correlated most highly to BBBO volume ( $R^2 > 0.70$ ) and CE ( $R^2 > 0.81$ ). A study performed by Mathew et al. in 2021 and McMahon et al. in 2017 similarly concluded that contrast enhancement from a gadolinium based contrast agent in CE-T1w MRI is a good predictor of gene expression associated with SIR following MB+FUS treatment $31,59$ .

When NES for the most signifcantly upregulated pathways were plotted against BBBO CE, a "cluster" of MVD and MI combinations was apparent on the trendlines. This phenomenon was most notably observed with 1.0 MVD+0.6 MI, 10 MVD+0.4 MI and 40 MVD+0.2 MI, which clustered together due to their similar intensities of BBBO and normalized gene enrichment scores. Tis is seen in 5 of 6 graphs in Fig. [7](#page-10-0)B, except hypoxia where 10 MVD+0.4 MI did not have a signifcant NES, further supporting the notion that the intensity of BBBO is the greatest indicator of bioefects. Moreover, exchanging higher MI dose with lower MVD, or vice versa, can yield comparable BBBO and SIR.

As defned previously, BBBO was considered signifcant when 15% CE was achieved in a volume greater than 1 mm3 . Applying these criteria in Fig. [7A](#page-10-0), regions of signifcant BBBO and insignifcant BBBO were delineated, serving as the basis for developing our therapeutic window. By comparing the RNA sequencing data from the 12 tested parameter combinations, diferences in gene expression amongst parameters were analyzed and distilled into three generic categories based on similarities in gene expression and pathway upregulation (Fig. [7B](#page-10-0)). NFκB signaling has been defned in many studies as a hallmark of the SIR[3,](#page-12-2)[30,](#page-13-7)[31,](#page-13-8)[62.](#page-14-2) Kovacs et al. frst defned this as the primary mechanism driving the SIR, especially after MB + FUS BBBO, launching subsequent studies aim-ing to further investigate the bioeffects<sup>[30](#page-13-7),[31](#page-13-8)</sup>. Due to this, we broadly defined "mild" SIR as the activation of the NFκB pathway via TNFɑ signaling (NES>1.65). Since the SIR acts in concert with adjacent immune processes, we considered a second defnition of "moderate" SIR that involved the upregulation of a broad infammatory response following activation of NFκB (NES>1.65). Recently, several groups have worked to operate alongside the activation of SIR after MB + FUS<sup>[69](#page-14-9)-71</sup> without triggering damage pathways (apoptosis). Likewise, our Class III ("acute") therapeutic window is defned as the onset of infammatory responses and activation of NFκB, which avoids activation of apoptosis through cellular damage. This class facilitates a controlled level of inflammation that may be beneficial in neurogenesis, amyloid-beta clearance<sup>[72](#page-14-11)</sup>, and microglial reprogramming<sup>55</sup>.

Our categories of SIR above are not standard defnitions of SIR but are based on our interpretation of observed patterns in RNA sequencing results. Specifc gene sets that were noticed to be enriched alongside the activation of the NFκB pathway via TNFɑ allowed us to formulate distinct defnitions of SIR. It is important to acknowledge that while we linked our classifcation of SIR with specifc pathways, such as upregulation of an infammatory response and apoptosis, these classes may not encompass the full mechanism of the SIR. Tis limitation arises from the GSEA 50 hallmark pathway, which sorted infammation observed afer SIR into basic categories and indicates the existence of prominent associations within pathways (e.g., infammatory response and apoptosis) included in our classifcations.

Moving forward, further investigations are warranted to address limitations in our study. Firstly, exploring other US parameters such as frequency, pulse length, duty cycle and sonication time, but also MB parameters such as MVD, size and formulation. Secondly, as SIR was only evaluated at one time point (6 h); future studies should explore sampling at diferent time points afer BBBO to assess the temporal extent of SIR. An additional limitation to this study is derived from the nature of bulk RNA sequencing, which cannot diferentiate expression profles from distinct cell populations. Instead, it only evaluates the broad transcriptome input for every cell. Future eforts will provide more tunable therapeutic windows that allow more safe and efective treatments.

In conclusion, our study highlights the substantial impact of both MVD and MI on MB+FUS BBBO and SIR. The combination of MI and MVD exhibited a more pronounced effect on BBBO compared to individual parameters. RNA analysis revealed unique DEGs associated with infammatory responses and immune recruitment. Our study defnes three therapeutic windows bridging together signifcant BBBO with the onset of SIR in three diferent levels of severity. Tis guidance is invaluable for studies aiming to deliver therapeutics without inducing infammation, thereby ensuring the safe and efective delivery of drugs into the brain.

#### **Data availability**

Sequence data that support the fndings of this study have been deposited in the NIH BioProject Archive with the primary accession code PRJNA1100543. Other data are available upon request.

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# **Competing interests**

The authors declare no competing interests.

# **Additional information**

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