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An engineered culture vessel and flow system to improve the in vitro analysis of volatile organic compounds



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Volatile organic compounds (VOCs) are a biologically important subset of an organism's metabolome, yet in vitro techniques for the analysis of these small molecules vary substantially in practice, restricting the interpretation of study findings. Here, we present an engineered culture tool, termed the "Biodome", designed to enhance endogenous analyte recovery by integrating dynamic headspace sampling methodology for the recovery of VOCs from biological cultures. We validate the functionality of the device for in vitro volatile metabolomics utilizing computational modeling and fluorescent imaging of mammalian cell culture. Leveraging comprehensive two-dimensional gas chromatography coupled with a time-of-flight mass spectrometer and the enhanced sampling capabilities afforded by our tool, we identify 14 statistically significant VOCs not found in the media or exogenously derived from the sampling method, four of which have not been previously reported in vitro. To demonstrate applicability beyond mammalian cell culture, we assess the production of VOCs throughout the log and stationary phases of growth in ampicillin-resistant DH5α *Escherichia coli*. We identified 19 compounds with results supporting endogenous production, two of which had not previously associated with *E. coli*, 3-Octanone and 3-Tridecanone. Our findings emphasize the improved capabilities of the Biodome for in vitro volatile metabolomics.

Volatile metabolites, part of the broad class of compounds known as volatile organic compounds, are products of cellular metabolism with low molecular weight and a sufficient vapor pressure to exist as a gas at standard temperature and pressure. VOCs have long been recognized to confer information about biological processes in health and disease^{1–3}, yet reliable methods for the study of these molecules in vitro have lagged behind. Works overcoming the challenges associated with in vitro sampling methodology have provided evidence for the extensive roles of volatile metabolites in biology, including but not limited to, serving as putative disease biomarkers^{4–6}, extracellular signaling molecules in archaea, fungi, bacteria, protists, plants, and animals^{7–16}, and drivers of inter- and intra-kingdom phenotype and function^{7,9–11,17–20}. Despite the insights gained, nearly all approaches suffer from one or more of the following major limitations: i) detection of exogenous VOCs from plastics or the sampling environment^{18,21,22}, ii) low analyte sensitivity and poor signal-to-noise

relative to VOCs originating from non-endogenous sources, as a consequence of indirect^{18,23} and passive (equilibrium-based) sampling techniques^{21,24,25} and/or iii) disruption of culture viability^{26–28}, prohibiting biological response to environmental stimuli or perturbation. Thus, in vitro VOC studies would largely benefit from a standardized method and tool to reduce signal from contaminants, enhance endogenous signal recovery, and maintain viability for time-dependent applications.

Previous groups have recognized these limitations and worked to develop a broad family of approaches known as purge-and-trap or dynamic headspace sampling (DHS)^{4,29–33}. These approaches involve the continuous sampling or removal of the headspace, often trapping the VOCs on sorbent material fixed to solid support^{33–36}, or directly analyzing the extracted gas by coupling the sampling methodology to a mass spectrometer^{37–39} or sensor array^{24,40}. DHS has been shown to yield an increase in signal when considering the volatilome emitted from fruit extract^{41,42} and other complex

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matrices⁴³. Despite the advantages of DHS methodology, engineered tools and systems designed to facilitate its use in an in vitro biological setting have been limited and a standardized approach does not yet exist^{4,18,29–31,44}. Challenges contributing to this gap include organism viability and material compatibility, exogenous contaminants, imaging capabilities, liquid-to-headspace ratio and signal sensitivity, gas flow characteristics and reproducibility, reusability, throughput, and adaptability for automation.

Here, we worked to address many of these gaps surrounding the analysis of VOCs from in vitro cultures through the design, development, and application of a custom borosilicate glass culture vessel (the “Biodome”) and demonstrate the advantages of our tool for biological analysis through the unbiased characterization of mammalian cell and bacterial volatilomes. Similar to a recently published approach³², this work leverages the enhanced sensitivity, resolution, and separation capabilities of thermal desorption coupled to comprehensive two-dimensional gas chromatography with time-of-flight mass spectrometry (GC×GC-TOFMS) for metabolomic analysis⁴⁵. We pair this instrumentation with an offline, open flow system designed to trap culture-derived VOCs using a tri-phase thermal desorption tube. The modular aspects of our system support offline culturing in a standard incubator and easy replacement of the input gas for adaptation to oxygen-sensitive organisms. The borosilicate glass culture vessel enables sterilization by autoclaving while also allowing for imaging directly through the device.

Given the intended biological applications, we first use fluorescent imaging to demonstrate that SK-OV-3 mammalian cell growth is roughly equivalent to a standard T-75 flask. We then work to extensively characterize the exogenous VOCs originating from the flow system and culture media over 96 h of continuous sampling to identify 31 VOCs observed in ≥50% of SK-OV-3 ovarian adenocarcinoma volatilome samples and in fewer than 50% of all controls, four of which have not been previously reported in vitro. Mammalian volatilomes typically show hydrocarbons and esters as major components, both in biofluid and cell lines^{46,47}. Therefore, to validate endogenous origin using an independent approach, we apply RNA interference (RNAi) to globally evaluate the role of fatty acid metabolism in the production of VOCs in vitro, transiently inhibiting expression of mitochondrial lipid transporter protein carnitine palmitoyltransferase 2 (encoded by the gene *CPT2*). In doing so, we identify at least four VOCs with evidence supporting a weak association with lipid metabolism. We extend the functionality of the tool by characterizing the *Escherichia coli* (*E. coli*) volatilome across the log and stationary phases of growth and identify seven previously reported and two low abundance VOCs not formerly observed in *E. coli* volatilome. Finally, through direct comparison to more traditional equilibrium-based SPME methodology, we find reduced contaminant signal compared to a T-25 flask in the SK-OV-3 volatilome, and higher signal recovery of *E. coli* specific VOCs throughout the log and stationary phases of growth. Through this work, we demonstrate that our tool enables the reproducible sampling of complex biological matrices and provides sufficient analyte recovery to allow for the identification of endogenous volatile metabolites and low abundance VOCs not present in the culture media or flow system. Thus, the Biodome tool should serve as a promising platform for the growing field of volatile metabolomics.

Results

Design and Development

The biological VOC sampling system is comprised of a circular glass culture vessel, compressed gas cylinder and dual stage regulator, Nalgene™ 890 FEP tubing (Catalog # 8050-0310, Thermo Scientific, Waltham, MA, USA), oxygen-compatible PTFE tape (Catalog # 22485, Restek, Bellefonte, PA, USA), hydrocarbon trap (Catalog # 22013, Restek), flow meter (Catalog # 40402-0010, Riteflow, Bel-Art, Wayne, NJ, USA), sterile filter (0.2 µm pore size, Pall Corporation, Port Washington, NY, USA), bead bath (LabArmor, Plano, TX, USA), Carboxpack C, Carboxpack B, and Carboxieve SIII sorbent thermal desorption tube (TDT; Gerstel, Linthicum, MD, USA), and inexpensive laboratory-made TDT adapter – incorporating a modular design to facilitate adoption for a variety of biological organisms (Fig. 1a – d). For

example, the bead bath temperature can be raised to promote growth of thermophiles or replaced with an ice bath to allow study of psychrophiles. Similarly, the inflow gas can be replaced to support the analysis of oxygen-sensitive microorganisms. The system is designed to enable the continuous sampling of the headspace VOCs in the Biodome by flowing the desired compressed gas through the culture vessel, effectively increasing the cumulative VOC signal as compared to static equilibrium-based systems (i.e. solid phase microextraction (SPME) in a culture vessel or closed vial), as a consequence of Henry’s Law.

The Biodome culture vessel is glass blown from borosilicate glass and features a 6.35 mm OD (1/4 inch) inlet and 18 mm OD outlet (Fig. 1a, d), with heights equal to 10 mm. The internal chamber height also measures 10 mm, selected to enhance VOC signal recovery and reproducibility by optimizing surface area to volume ratio while limiting turbulent interactions between the inflowing gas and the surface of the liquid culture media. The thickness of the glass is roughly 1–2 mm and the diameter of the biodome is 70 mm, giving an approximate surface area of 38.5 cm². Vented caps from standard T-25 flasks were found to maintain a favorable environment for growth when allowed to rest over the inlet and outlet (Fig. 1a). Worth noting, no surface coating was required to promote cell adhesion and growth, increasing throughput, and reducing user burden.

The TDT adapter (Fig. 1b, c, Fig. S1) is comprised of a size 3 silicon rubber stopper adjusted to a ~15 mm diameter using a sterile razor (VWR, Radnor, PA, USA) with 6 mm hole introduced by a biopsy punch (Integra LifeSciences, Princeton, NJ, USA), Nalgene tubing (6.35 mm ID, 7.9375 mm OD, see above), one 6.35 mm (1/4 inch) and one 7.9375 mm (5/16 inch) 316 stainless steel compression nut with metal ferrule (Swagelok Southwest Co., Phoenix, AZ, USA), and a 316 stainless steel 6.35 mm male to 7.9375 mm male adapter (Swagelok). For assembly of the adapter, see Methods. Although the initial design was intended for TDT sampling by two dimensional GC×GC-TOFMS (Fig. 1e), given the popularity of SPME for VOC analysis, we further modified the adapter in an inexpensive manner to enable this method by adding a 1 mL disposable syringe body (Electron Microscopy Sciences, Hatfield, PA), with the plunger removed, in line with the 6.35 mm (1/4 inch) nut (replacing the TDT, Fig. S1) and completely sealing the interface with oxygen-compatible PTFE.

To assess the gas flow characteristics through the headspace of the culture vessel, fluid modeling was performed in ANSYS Fluent® 2019 R3. Results show that laminar flow is maintained for gas flow rates ≤20 mL/min, using the defined geometry (Fig. 1d, f – h, Supplementary Video 1). A flow rate of 11.7 mL/min was maintained for all testing, corresponding to a reading of 30 on the flow meter, unless otherwise noted. To enhance throughput, a multiplexed part was designed in SOLIDWORKS® 2019 and flow characteristics were assessed using ANSYS Fluent (Fig. S1). Results show the part provides consistent flow rates at each of the three outlets, equal to 1/3 the total flow rate, while maintaining a single inlet (Fig. S1, Supplementary Video 2). Given an internal chamber volume of approximately 200 cm³, the internal chamber can be flushed of environmental gas using a purge flow rate of 20 mL/min and a duration of 10 min.

Cell viability was considered in SK-OV-3 ovarian adenocarcinoma cells (HTB-77, ATCC, Manassas, VA) using live/dead fluorescence assays. 0.5×10^6 cells were seeded into the Biodome containing a total of 5 mL of RPMI1640 culture media containing 10% FBS and 1% Pen/Strep and given 24 h to allow cell attachment. Brightfield images show time-dependent increases in Biodome confluency and high viability (Fig. 1i). A standard T-75 flask (VWR) 24 h after seeding is shown for reference, equivalent to $t = 0$ in the Biodome (Fig. 1i). Results from independent live/dead fluorescence assays (NucBlue and NucGreen ReadyProbes, Invitrogen, Carlsbad, CA) show no significant differences in SK-OV-3 cell viability in the Biodome, as compared to a standard T-75 flask in a humidified incubator, for a minimum duration of 4 days (Fig. 1j). Growth rates are comparable in the Biodome to that seen in plastic culture flasks, as cells reach 70–90% confluency in roughly four days when seeded at 500,000 cells total. We further considered cell viability through morphological fluorescence staining using a live actin tracking stain (CellMask, Invitrogen). To enable imaging on a

Leica DMI8 microscope, we designed a custom imaging tray in SOLIDWORKS® 2019 (Fig. 1k). Following seeding in the appropriate culture vessel, SK-OV-3 cells were allowed to proliferate for 48 h before staining, and our results show that cell morphology in the Biodome is comparable to a T-75 flask grown in a standard incubator (Fig. 1l–n). Taken together, our findings demonstrate that the Biodome tool maintains favorable growth conditions for at least 4 continuous days, without the need for surface treatment.

Characterizing device performance in mammalian culture

SK-OV-3 cells (human origin) were seeded into the Biodome glass culture vessel and allowed to adhere and proliferate for 24 h. Prior to sampling, culture media was replaced to ensure the accumulation of VOCs were minimized. Based on the previously observed growth characteristics (Fig. 1h–l), cells were subject to VOC collection for 4 continuous days with

the TDT replaced every 24 h, although shorter sampling times were also shown to be viable (Fig. S2). RPMI 1640 was maintained as the primary medium, however dialyzed FBS was implemented in place of FBS. This change is supported by a previous work that demonstrated serum-free growth media is favorable for VOC analysis⁴⁸ and will be further considered in a future work. Chromatograms were aligned using ChromaTOF® (see Methods), and VOCs were reported according to the naming confidence scheme presented by the Metabolomics Standards Initiative⁴⁹. TDU tubes were stored for a maximum of 8 days at 4 °C to limit degradation⁵⁰ prior to analysis by GC×GC-TOFMS. All experimental conditions were performed in biologically independent triplicate.

Results show the Biodome system supports the identification of cellular VOCs absent in the flow system and culture vessel, both with and without culture media. Features observed in fewer than 50% of observations within an experimental condition, those observed in all internal blank samples, and

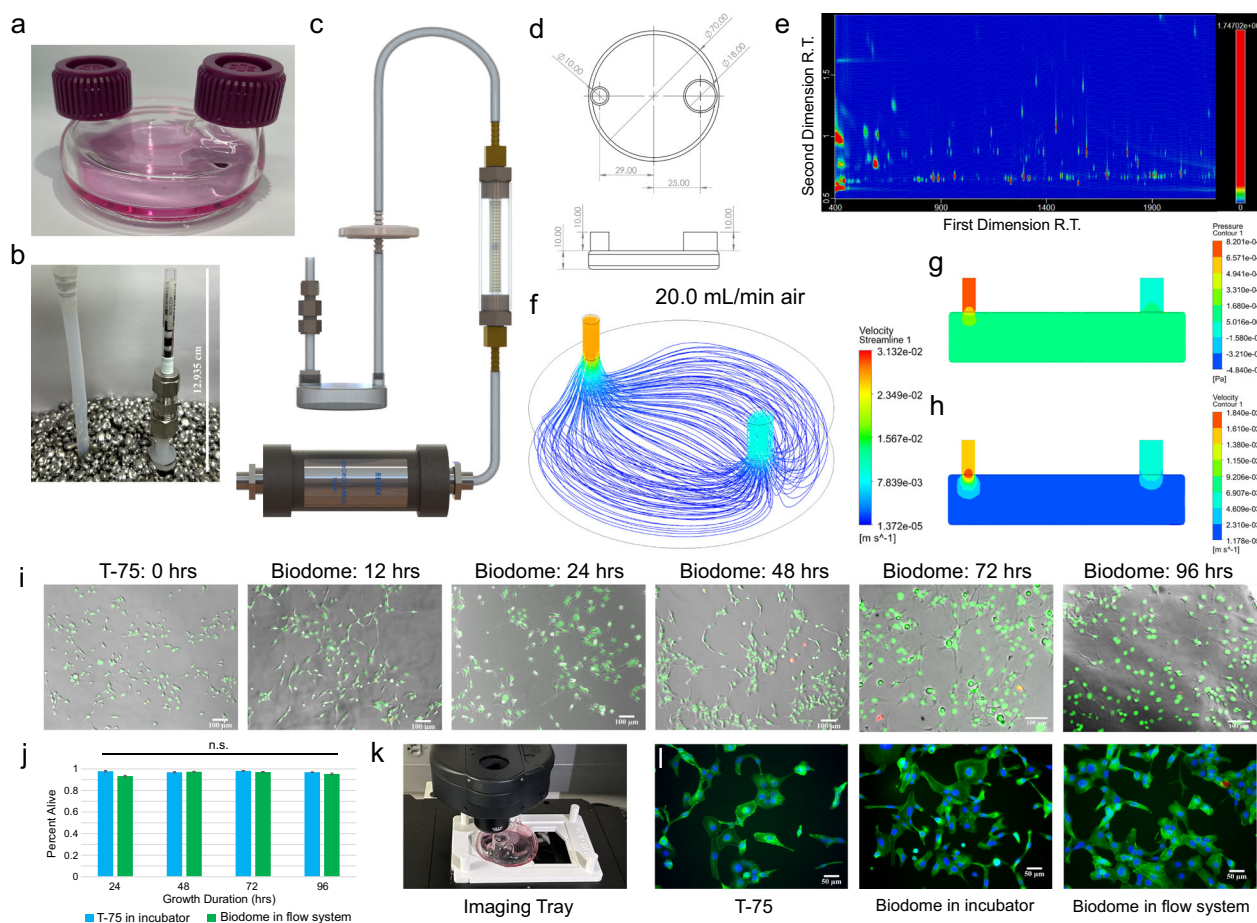


Fig. 1 | Design and biological validation of the Biodome. **a** The borosilicate glass culture vessel, termed the Biodome, containing 5 mL RPMI 1640 media. T-25 gas permeable flask caps were allowed to rest over the inlet and outlet of the vessel while in an incubator. **b** Placement of the Biodome during VOC sampling shows the glass vessel is fully submerged in beads at 37 °C. Also shown is the interface between the Biodome, thermal desorption tube (TDT), and TDT adapter. A sterile rubber stopper and PTFE tape are used to create an airtight seal at the interface between the TDT and the adapter. **c** 3D rendering showing the major components of the gas flow system including the hydrocarbon trap, flow meter, sterile filter, tubing, Biodome, TDT adapter, and TDT sampling tube. The compressed gas cylinder is not shown. **d** Schematic showing relevant dimensions (in mm; OD) for the Biodome culture vessel. **e** Representative two-dimensional gas chromatography chromatogram spanning 400–2200 seconds in the first dimension and 0.5–2 seconds in the second dimension, following 24 hours of sampling SK-OV-3 ovarian adenocarcinoma cells. Fluid modeling in ANSYS™ demonstrates **f** laminar flow conditions are maintained at flow rates ≤ 20 mL/min (TDT adapter insert included) and **g** gauge pressure and **h** velocity changes due to the inflowing gas are negligible at roughly half

the Biodome height, limiting turbulent interactions with the surface of the cell culture media. **i** Live/dead assay images in the Biodome show viability across 0.5–4 days. A T-75 flask at $t = 0$ (24 hours post seeding) is shown for reference. **j** Independent live-dead assays were performed using NucBlue™ (Hoechst 33342) and NucGreen™ ReadyProbes™ at 24-hour intervals, with live percentages estimated from 10 independent regions of the T-75 or Biodome culture vessels. Error bars represent standard error of the mean. No statistically significant differences in cell viability are observed using a two-sided t-test, demonstrating equivalence as compared to standard culture vessels. Scale bar = 100 μ m. **k** Custom imaging tray was designed in SolidWorks® 2019 and 3D printed to allow imaging using a Leica DMI8. **l–n** Typical SK-OV-3 morphology was visualized using fluorescent imaging and a live actin tracking stain (green color), Hoechst 33342 (blue color; live stain), and NucGreen (red color; dead stain), and no differences are observed using different culture vessels and growth environments. All brightfield and fluorescent images were taken using cells at passage <10. Scale bar = 50 μ m.

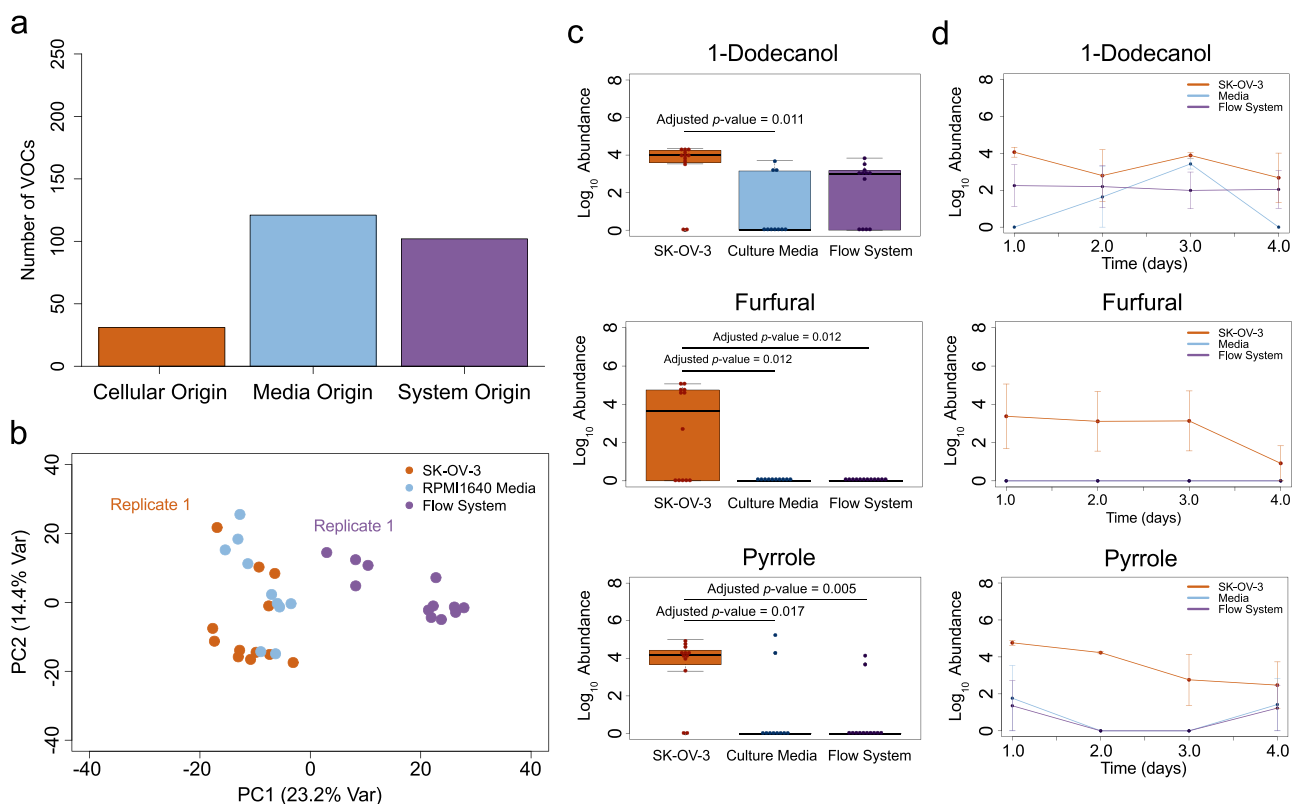


Fig. 2 | Volatile characterization using the *in vitro* Biodome sampling tool. **a** Bar chart showing the number of VOCs detected after filtering inconsistently observed peaks, categorized according to their proposed origin. **b** Principal component analysis plot shows distinct clusters when considering the first two principal components, using the 254 features comprising the filtered volatilome. Batch effects are primarily attributed to i) instrument maintenance and ii) user variability that occurred between the first replicate and the remaining runs. Representative **c** boxplots and **d** line plots show three low-abundance VOCs reproducibly detected in the SK-OV-3 ovarian adenocarcinoma *in vitro* volatilome. Abundance values were calculated by integrating the peak area using the unique mass and log₁₀ transformed. The adjusted *p* value was calculated using a two-tailed student's *t*-test

and corrected using the Benjamini-Hochberg procedure⁵¹. Day 1 represents the cumulative volatilome between 0 and 24 hours, and so forth. Each time point was measured in biologically independent triplicate, with line plot error bars representing \pm standard error of the mean. For boxplots, the median is indicated by the solid black line, and first and third quartiles are captured by the bounds of the box. Boxplot whiskers are defined as the first and third quartiles \pm interquartile range times 1.5, respectively. Minimum and maximum values are captured by the lowermost and uppermost points, respectively, or whisker bound if no outliers are shown. The orange color represents SK-OV-3 observations, light blue captures the RPMI1640 media control, and purple indicates the empty flow system control.

analytes eluting with a first-dimension retention time <400 s were removed (see Methods), resulting in a total of 254 unique peaks (Fig. 2a). The filtered volatilome was subsequently subject to principal component analysis (PCA) and clusters corresponding to the control and SK-OV-3 conditions were observed (Fig. 2b). Noticeable batch effects were seen in the first replicate of the SK-OV-3 and empty tool volatilomes and are attributed to instrument maintenance and user variability (Fig. 2b). Roughly 40% (102/254) of the unique features were observed in $\geq 50\%$ of the empty Biodome controls and fewer than half of SK-OV-3 samples, suggesting these are inherent contaminants associated with the use of the *in vitro* tool or analytical system (Fig. 2a, Supplementary Dataset 1). An alkane standard (Fig. S3) was run to allow identification of VOC retention indices (RI) and used to support name assignment where possible (see Methods). A further 45% (115/254) of the unique features were observed in $\geq 50\%$ of the experimental conditions containing culture media but not the empty Biodome control, suggesting media origin (Fig. 2a, Supplementary Dataset 2). Interestingly, 6 low abundance VOCs (2.4%) with a mean signal-to-noise ratio <200:1 were observed in the media volatilome but not the SK-OV-3 or empty volatilomes (allowing for one spurious peak in both), which may indicate SK-OV-3 metabolic biotransformation (Supplementary Dataset 3). Lastly, a total of 31 VOCs (12.2%) were observed in $\geq 50\%$ of the experimental runs containing SK-OV-3 cells and fewer than 50% of controls (Table 1; Fig. 2c, d; Fig. S4). Four of these VOCs were significantly more abundant in cellular volatilomes after application of a student's *t*-test with a Benjamini-Hochberg *p*-

value correction⁵¹, with a mean signal-to-noise ratio <200:1 and have not previously been detected in mammalian cells *in vitro* (bolded names), emphasizing the improved signal recovery afforded by the Biodome tool (Table 1; Fig. 2c, d; Fig. S4).

Cell-specific VOCs spanned multiple chemical classes and includes the detection of two hydrocarbons and one ester that fell below the naming threshold. Despite the lower naming confidence, mass spectral data could be used to support their identification as a cyclic hydrocarbon eluting at 1213 and 0.69 s in the first- and second-dimension columns (average), respectively, an alkane at 2102 and 0.71 s, and an ester eluting at 2535 and 1.20 s (Table 1, Fig. S5). Of the VOCs observed primarily in the SK-OV-3 volatilome, roughly 80% (25/31) had a mean signal-to-noise ratio <200:1, emphasizing the capability of our approach to recover low abundance volatiles that may be missed using equilibrium-based sampling approaches.

To determine if the noise due to plastic contaminants is reduced in the Biodome compared to more standard *in situ* SPME techniques (in a culture flask), we analyzed 11 of the most abundant contaminants reported by Schallschmidt et al.²¹ that were present in the volatilome from either culture technique (2-butanone, acetic acid, benzene, cyclohexanone, di-tert-butylphenol (2,4-di-tert-butylphenol), decane, dodecane, ethylbenzene, m-di-tert-butylbenzene (1,3-bis(1,1-dimethylethyl)-benzene), octane, and styrene). The aggregated signal abundance was compared between the two methods, with missing values imputed to 0 (Supplementary Dataset 4). Cell seeding densities and media volume were scaled to be equivalent to that of

Table 1 | VOCs reproducibly detected from SK-OV-3 cells

| VOC | Chemical Class | SK-OV-3 vs Media FDR adjusted <i>p</i> -value | SK-OV-3 vs System Control FDR adjusted <i>p</i> value | Avg ¹ <i>t_R</i> (s) | Avg ² <i>t_R</i> (s) | RI | ID |
|---|------------------------|---|---|---|---|------------------|----|
| Unknown 1 ^b | | 3.51E-01 | 1.81E-02 | 685 | 0.83 | 677 ^a | 4 |
| Unknown 2 ^b | | 7.55E-02 | 1.81E-02 | 688 | 1.59 | 679 ^a | 4 |
| 2-Pentanone | Ketone | 5.11E-01 | 1.89E-02 | 773 | 0.78 | 738 ^a | 2 |
| Pyrrole ^{b,c} | Heteroaromatic | 1.69E-02 | 5.42E-03 | 968 | 1.61 ^c | 853 | 2 |
| n-Butyl acetate | Ester | 1.81E-02 | 1.81E-02 | 1007 | 0.76 | 871 | 2 |
| Unknown 3 ^b | | 1.33E-01 | 1.15E-02 | 1083 | 0.63 | 905 | 4 |
| Furfural ^b | Other | 1.15E-02 | 1.15E-02 | 1124 | 1.22 | 924 | 2 |
| Hydrocarbon 1 ^b | Hydrocarbon | 1.61E-01 | 2.26E-02 | 1213 | 0.69 | 965 | 4 |
| 7,7-Dimethyl-1,3,5-Cycloheptatriene ^b | Hydrocarbon | 4.83E-01 | 1.84E-02 | 1216 | 0.80 | 967 | 2 |
| Unknown 4 | | 1.15E-02 | 1.15E-02 | 1303 | 0.93 | 1007 | 4 |
| Dimethyl trisulfide ^b | Other | 1.81E-02 | 1.81E-02 | 1353 | 0.90 | 1032 | 2 |
| Aniline ^b | Functionalized Benzene | 1.81E-02 | 1.81E-02 | 1406 | 1.49 | 1058 | 2 |
| 2,3,5,8-Tetramethyldecane | Hydrocarbon | 4.58E-01 | 6.83E-01 | 1423 | 0.66 | 1066 | 3 |
| 2-Ethyl-1-hexanol | Alcohol | 6.09E-02 | 1.15E-02 | 1451 | 0.88 | 1080 | 2 |
| Phenol ^{b,c} | Alcohol | 7.41E-03 | 7.41E-03 | 1505 | 0.18 | 1107 | 2 |
| Unknown 5 ^b | | 1.81E-02 | 1.81E-02 | 1513 | 1.01 | 1111 | 4 |
| Unknown 6 ^b | | 9.74E-01 | 4.88E-01 | 1528 | 0.85 | 1119 | 4 |
| Unknown 7 ^b | | 7.41E-03 | 5.27E-03 | 1575 | 0.74 | 1143 | 4 |
| 2-Nonanone ^b | Ketone | 9.90E-01 | 3.30E-01 | 1578 | 0.83 | 1145 | 2 |
| Acetophenone | Ketone | 4.91E-02 | 1.15E-02 | 1584 | 1.04 | 1148 | 2 |
| 3-Methylheptyl acetate ^b | Ester | 2.93E-01 | 2.80E-02 | 1647 | 0.73 | 1181 | 3 |
| Naphthalene ^b | Aromatic Hydrocarbon | 1.15E-02 | 1.15E-02 | 1801 | 1.01 | 1265 | 2 |
| Succinic acid diisopropyl ester ^b | Ester | 4.71E-02 | 1.81E-02 | 1856 | 0.83 | 1296 | 3 |
| Unknown 8 ^b | | 1.15E-02 | 1.15E-02 | 2031 | 0.85 | 1399 | 4 |
| 2,6,10-Trimethyldodecane ^b | Hydrocarbon | 2.94E-01 | 6.90E-01 | 2066 | 0.70 | 1421 | 3 |
| Unknown 9 ^b | | 7.41E-03 | 4.43E-01 | 2082 | 0.69 | 1431 | 4 |
| Hydrocarbon 2 ^b | Hydrocarbon | 3.04E-01 | 5.72E-01 | 2102 | 0.71 | 1444 | 4 |
| 1-Dodecanol ^b | Alcohol | 1.15E-02 | 1.15E-01 | 2232 | 0.87 | 1526 | 2 |
| Unknown 10 ^b | | 3.04E-01 | 8.00E-01 | 2381 | 0.59 | 1622 | 4 |
| Unknown 11 ^b | | 2.80E-02 | 1.15E-02 | 2442 | 1.20 | 1658 | 4 |
| Ester 1 ^b | Ester | 5.27E-03 | 2.28E-01 | 2535 | 1.20 | 1699 | 4 |

The compound name is presented first, followed by the functional group class. Bolded names indicate that the VOC was not detected in the media or system controls and have not been previously reported in vitro. The adjusted *p* value was calculated using a two-tailed student's *t*-test, comparing the control and SK-OV-3 volatiles post-filtering. The first (¹*t_R*) and second (²*t_R*) dimension retention times are included, with the retention index calculated using a C8-C20 alkane standard mix. Finally, the VOC naming confidence level (ID) is reported according to previously established standards⁴⁹.

^aExtrapolated RI from linear alkane series.

^bMean signal-to-noise ratio <200:1.

^cPeak drift.

the Biodome tool with triplicate measures performed at the time point of 0–24 h. Demonstrating that the Biodome effectively addresses one major existing limitation associated with the study of cellular volatiles, DHS in the glass Biodome led to the recovery of a fraction of the total contaminant signal (~18%) as compared to the in situ SPME methodology. It is important to note that sorbent material differences were present between the two approaches. Given that SPME fibers comprised of TDT carbopack and carboxisieve materials were not commercially available, we elected to utilize the multi-phase SPME fiber consisting of divinylbenzene, carboxen, and PDMS (Sigma-Aldrich, St. Louis, MO, USA).

Gene knockdown supports endogenous production of cellular VOCs

Most mammalian VOCs have an unknown or poorly understood biosynthesis pathway, with traditional approaches reaching limited insight, restricted by the pitfalls described above. Highlighting many of the

improvements afforded by the Biodome tool, including temporal viability, reduced contaminant signal, and improved analyte recovery, we investigated the relationship between the biosynthetic origin of cellular VOCs and fatty acid metabolism via *CPT2* transcriptional levels in SK-OV-3 cells. The *CPT2* expression levels were altered by treating the SK-OV-3 cells with pooled siRNA oligonucleotides mediating gene knockdown (see Methods). The expression levels of *CPT2* relative to the housekeeping gene *GAPDH* was determined using RT-qPCR (see Methods). Results show *CPT2* expression was significantly reduced in siRNA-treated SK-OV-3 cells to $35.7 \pm 13.6\%$ (mean \pm S.E.M; $p = 6.76\text{E-}9$) at $t = 0$ hrs, indicating successful transfection and gene knockdown (Fig. 3a). The expression levels of *CPT2* in the transfected SK-OV-3 cells were also monitored transiently in a 6-well plate format over a 96-hour timeframe. As depicted in Fig. 3b, the *CPT2* expression level during the initial 24 h showed a significant decrease to $9.83 \pm 4.20\%$ ($p < 0.05$). Subsequently, after 48 h, the expression levels increased to $53.0 \pm 7.82\%$ ($p < 0.05$). Following 72 h, the expression levels

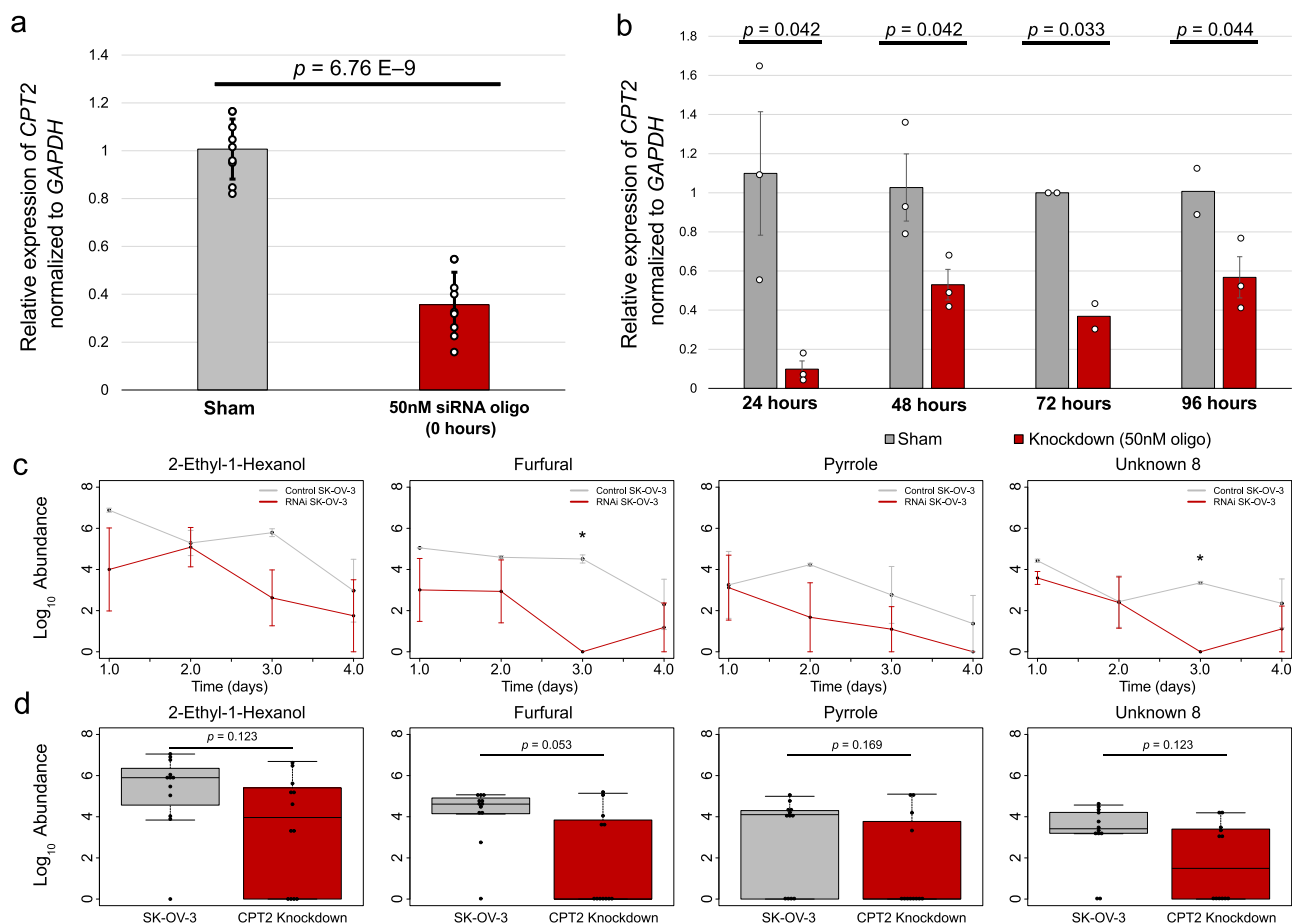


Fig. 3 | Knockdown of *CPT2* supports endogenous VOC production. **a** Expression of *CPT2* quantified by RT-qPCR at the start of volatile organic compound (VOC) collection (time = 0) using biologically independent triplicate in a 6-well plate to estimate Biodome *CPT2* expression levels. *P*-values were determined using a one-tailed t-test. **b** The expression of *CPT2* was independently mapped across the four days of VOC sampling following siRNA-mediated knockdown in SK-OV-3 cells at equal passage number using biologically independent duplicate or triplicate as indicated with individual points. **c** Four VOCs not found in controls showing decreased abundance following the inhibition of β -oxidation via *CPT2* knockdown, across 4 days of measurement. *P* values were determined using a one-tailed t-test and adjusted using the Benjamini-Hochberg procedure⁵¹. * denotes an adjusted *p*

values < 0.05. Each time point was measured in biologically independent triplicate. Error bars represent the standard error of the mean. **d** Boxplots showing significant or trending toward significant decreases in endogenous VOC abundance following integration by unique mass and \log_{10} transformation. *P*-values, same as **c**. The median is indicated by the solid black line, and first and third quartiles are captured by the bounds of the box. Boxplot whiskers are defined as the first and third quartiles \pm interquartile range times 1.5, respectively. Minimum and maximum values are captured by the lowermost and uppermost points, respectively, or whisker bound if no outliers are shown. The gray color represents the non-targeting siRNA pool while red indicates the *CPT2* targeted siRNA pool.

decreased to $36.8 \pm 6.49\%$ ($p < 0.05$) and were recorded as $56.8 \pm 10.5\%$ ($p < 0.05$) after 96 h.

The knockdown of fatty acid metabolism via *CPT2* RNA inhibition in transfected SK-OV-3 cells was carried out with the goal of perturbing endogenous hydrocarbon (alkane, alkene) and ester production, although ketones and aldehydes are also known to arise as a product of fatty acid metabolism^{52,53}. Nearly all VOCs were found to have decreased median abundances when compared to the unperturbed SK-OV-3 volatilome across the 96-hour timeframe (Fig. 3c, d; Fig. S6; Supplementary Dataset 5). In the case of 2-Ethyl-1-hexanol, the average decrease in raw peak abundance across all samples was found to be 70.0%, with a roughly 87% decrease observed during the first day of sampling, although average expression increased on the second and fourth days, which may reflect the complex relationship between alcohols and fatty acid metabolism⁵⁴ (Fig. 3c, d). Furfural was observed to have an average raw abundance decrease of 56.5% across all samples (adjusted $p = 0.053$), with a similar decrease observed during the first two days, but followed by lower abundance on days 3, and 4 – weakly consistent with the transient recovery of *CPT2* expression (Fig. 3c, d). The average raw abundance of pyrrole after 24 h was roughly equivalent to the control following knockdown of *CPT2* (1% increase), with

a mean signal reduction of 8%, indicating pyrrole production is not related to fatty acid metabolism and consistent with other studies that show amino acids as precursors⁵⁵ (Fig. 3c, d). The unknown analyte was seen to have an average raw abundance decrease of 66.3% across all samples, with transformed abundances mirroring the trend observed in furfural. Collectively, results show some possible candidates for endogenous origin associated with fatty acid metabolism (Fig. 3c, d; Fig. S6), although VOC abundance generally does not correlate well with the transient recovery of *CPT2* expression and additional work is needed to confirm the proposed link.

Bacterial adaptation

To extend the functionality of our tool, we analyzed VOCs originating from *Escherichia coli*, strain DH5 α , across 3 days, during the log and stationary phases of growth. *E. coli* was transformed with plasmid containing ampicillin resistance gene and seeded into the Biodome containing LB Broth and 100 $\mu\text{g/mL}$ ampicillin. Turbid broth, indicating an increase in cell density, was observed at the conclusion of the sampling period for the run containing *E. coli* but not in the broth control (Fig. S7a). Following in vitro VOC sampling and analysis by GC \times GC-TOFMS, chromatographic peaks were aligned in ChromaTOF[®], yielding 206 unique features after the removal of

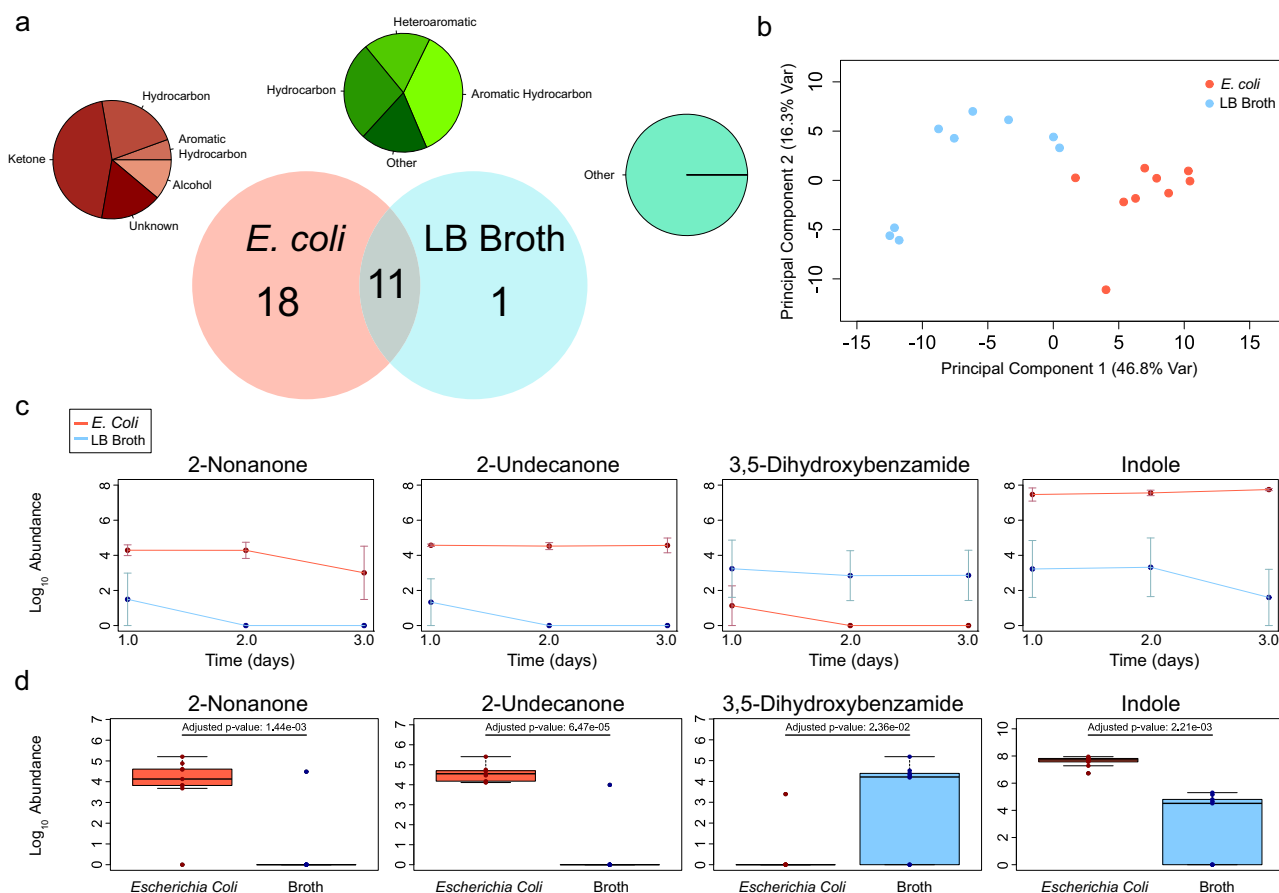


Fig. 4 | Application of the Biodome tool to characterize the *E. coli* volatilome across the log and stationary phases of growth. **a** Venn diagram shows the number of unique and common volatile organic compounds (VOCs) detected in the bacterial and broth conditions. Pie charts show the breakdown of VOC functional groups specific to each group. **b** Principal component analysis using VOCs presented in Table 2 shows the *E. coli* volatilome is distinct from the broth control. **c** Line plots for four high confidence VOCs showing log₁₀ transformed abundance across three days of sampling. Each time point was measured in biologically independent triplicate, with error bars representing \pm standard error of the mean. Day one represents the cumulative volatilome between 0–24 hours of growth, day 2 between 24–48 hours,

and the final day capturing 48–72 hours. **d** Boxplots for the same four VOCs showing expression of these metabolites are significantly elevated in the *E. coli* experimental condition, after correcting for multiple hypothesis testing using the Benjamini-Hochberg *p*-value adjustment procedure⁵¹. The median is indicated by the solid black line, and first and third quartiles are captured by the bounds of the box. Boxplot whiskers are defined as the first and third quartiles \pm interquartile range times 1.5, respectively. Minimum and maximum values are captured by the lowermost and uppermost points, respectively, or whisker bound if no outliers are shown. The light red color represents the *E. coli* observations while the light blue indicates the LB broth control.

known contaminants and compounds observed in the instrument blanks. Most of the recovered volatiles were variably present in the broth and bacterial conditions (85.4%) (Supplementary Dataset 6). For statistical analysis, compounds not detected in at least 70% of all samples were filtered. VOCs specific to the *E. coli* or broth volatilome were also retained—allowing up to three spurious observations in the alternative condition, resulting in a total of 30 features (Fig. 4a, Table 2). Using the filtered bacterial and broth volatilomes, we performed PCA and observe separation of the experimental groups when considering the first two components (Fig. 4b). After adjusting for multiple hypothesis testing using the Benjamini-Hochberg procedure⁵¹, 12 VOCs were found to be significantly elevated in the condition containing ampicillin-resistant *E. coli* (Fig. 4c, d, Fig. S7; Table 2). Results show the Biodome has sufficient sensitivity to repeatedly identify low abundance bacterial-derived VOCs, even when initially present in the culture media, including indole (FDR *p* value = 0.002) and 2-decanone (FDR *p* value = 0.004) (Fig. 4c, d, Fig. S7). Finally, of the 18 VOCs reproducibly observed in the *E. coli* volatilome, roughly 45% (8/18) had a mean signal-to-noise ratio <200:1, across the log and stationary phases of growth, highlighting the analyte recovery advantages of our tool for untargeted volatile metabolomics (Table 2).

Many of the high confidence VOCs observed in the *E. coli* volatilome have been previously linked to this microorganism, however, we first report

the production of 3-Octanone and 3-Tridecanone during the log and stationary phases of growth (Table 2; Fig. S7). Both VOCs had a mean signal-to-noise ratio <200:1. We also briefly consider VOCs distinguishing the log phase from the stationary phase of growth and note distinct production of Bicyclo[3.2.0]hepta-2,6-diene, Dimethyl trisulfide, and an unknown hydrocarbon with average first- and second-dimension retention times of 938 s and 0.64 s respectively, corresponding to a retention index of 840 (Fig. S7). The observation of significantly elevated 3,5-dihydroxybenzamide in the broth controls may suggest consumption by the bacteria during log and stationary phases of growth, provided structural similarity with endogenously produced enterobactin, although additional work is needed to validate the proposed consumption (Fig. 4c, d).

Finally, leveraging the *Escherichia coli* volatilome, we directly compared equilibrium headspace sampling methodology (SPME) to the DHS approach utilized in the Biodome tool (Fig. S8). Triplicate measures were made at each time point after inoculating a baked 20 mL glass vial with ampicillin-resistant *Escherichia coli* with the same target optical density (0.1) and analytical method, excluding the use of a septumless head inlet (Gerstel) in place of the TDU 2 inlet. To ensure findings were not affected by the liquid to headspace volume ratio, the volume of broth in the 20 mL vial was set at 3 mL to ensure equivalency to the Biodome tool. Results show that the Biodome tool with dynamic headspace sampling outperforms traditional

Table 2 | *Escherichia Coli* and Broth volatilome

| VOC | Chemical Class | p-value | FDR adjusted p value | Avg 1tR (s) | Avg 2tR (s) | RI | ID Level |
|---|----------------------|-----------|----------------------|-------------|-------------|------------------|----------|
| Unknown 1 ^c | | 3.196E-03 | 8.717E-03 | 669 | 0.83 | 668 ^a | 4 |
| Dimethyl disulfide | Other | 1.775E-01 | 2.420E-01 | 913 | 0.86 | 828 | 2 |
| 3-Methyl-1-butanol ^c | Alcohol | 1.153E-03 | 3.844E-03 | 925 | 0.96 | 834 | 2 |
| Bicyclo[3.2.0]hepta-2,6-diene | Hydrocarbon | 2.533E-01 | 3.304E-01 | 933 | 0.80 | 837 | 3 |
| Hydrocarbon 1 ^c | Hydrocarbon | 3.172E-01 | 3.964E-01 | 938 | 0.64 | 840 | 4 |
| 3,5-Dihydroxybenzamide ^d | Other | 9.437E-03 | 2.359E-02 | 950 | 1.09 | 845 | 3 |
| Ketone 1 ^c | Ketone | 1.598E-02 | 3.688E-02 | 1005 | 0.80 | 870 | 4 |
| Hydrocarbon 2 ^{b,c} | Hydrocarbon | 3.331E-02 | 7.139E-02 | 1069 | 0.65 | 899 | 4 |
| Ethylbenzene | Aromatic Hydrocarbon | 5.098E-01 | 5.533E-01 | 1135 | 0.85 | 929 | 2 |
| o-Xylene | Aromatic Hydrocarbon | 1.059E-01 | 1.673E-01 | 1184 | 0.85 | 952 | 2 |
| Hydrocarbon 3 ^{b,c} | Hydrocarbon | 7.796E-02 | 1.299E-01 | 1199 | 0.65 | 959 | 4 |
| 1-Ethyl-4-methylbenzene ^b | Aromatic Hydrocarbon | 5.349E-01 | 5.533E-01 | 1301 | 0.81 | 1006 | 2 |
| 2,2,4,6,6-Pentamethylheptane ^c | Hydrocarbon | 3.003E-03 | 8.717E-03 | 1327 | 0.68 | 1019 | 3 |
| Dimethyl trisulfide | Other | 3.375E-01 | 4.050E-01 | 1358 | 1.05 | 1034 | 2 |
| Heteroaromatic 1 | Heteroaromatic | 5.033E-01 | 5.533E-01 | 1369 | 1.02 | 1040 | 4 |
| 1,2,3-Trimethylbenzene ^b | Aromatic Hydrocarbon | 5.194E-01 | 5.533E-01 | 1371 | 0.86 | 1040 | 2 |
| 3-Octanone ^{b,c} | Ketone | 5.363E-02 | 1.006E-01 | 1371 | 0.80 | 1041 | 2 |
| Aromatic Hydrocarbon 1 ^{b,c} | Aromatic Hydrocarbon | 1.572E-01 | 2.246E-01 | 1436 | 0.88 | 1073 | 4 |
| 4-Methylundecane ^b | Hydrocarbon | 1.329E-01 | 1.994E-01 | 1539 | 0.63 | 1125 | 2 |
| 2-Nonanone ^c | Ketone | 2.404E-04 | 1.442E-03 | 1577 | 0.83 | 1144 | 2 |
| 2-Decanone ^c | Ketone | 1.042E-03 | 3.844E-03 | 1764 | 0.84 | 1245 | 2 |
| 2-Undecanone ^c | Ketone | 6.809E-06 | 6.469E-05 | 1942 | 0.83 | 1347 | 2 |
| 4,6-Dimethyldodecane ^b | Hydrocarbon | 6.781E-01 | 6.781E-01 | 1946 | 0.69 | 1349 | 3 |
| Indole ^c | Heteroaromatic | 4.424E-04 | 2.212E-03 | 2095 | 0.82 | 1439 | 2 |
| Unknown 2 ^{b,c} | | 6.026E-09 | 1.808E-07 | 2240 | 0.85 | 1531 | 4 |
| 3-Tridecanone ^{b,c} | Ketone | 7.741E-02 | 1.299E-01 | 2253 | 0.83 | 1540 | 2 |
| Alcohol 1 ^{b,c} | Alcohol | 8.813E-04 | 3.777E-03 | 2261 | 0.89 | 1545 | 4 |
| 2-Tridecanone ^c | Ketone | 2.776E-06 | 4.164E-05 | 2265 | 0.84 | 1548 | 2 |
| Unknown 3 ^{b,c} | | 3.805E-02 | 7.610E-02 | 2344 | 0.73 | 1600 | 4 |
| Ketone 2 ^c | Ketone | 8.625E-06 | 6.469E-05 | 2427 | 0.90 | 1649 | 4 |

The compound name is presented first, followed by the functional group class. The *p*-value was calculated using a two-tailed student's *t*-test, comparing the LB broth and *Escherichia coli* volatilomes post-filtering and adjusted using the FDR procedure in R. The first (*t*₁) and second (*t*₂) dimension retention times are included, with the retention index calculated using a C8-C20 alkane standard mix. The VOC naming confidence level is reported according to previously established standards⁴⁹.

^aExtrapolated RI from linear alkane series.

^bMean signal-to-noise ratio <200:1.

^c*E. coli* specific VOCs.

^dLB broth specific VOCs.

SPME methodology for some VOCs including indole and the previously unreported 3-Octanone (Fig. S8), with total signal recovery 77% greater compared to traditional SPME sampling after filtering contaminant peaks. Inconclusively, others show lower variability and higher abundance using SPME including VOCs in the same chemical class (ketone), which is attributed to sorbent material differences (Fig. S8). SPME fibers comprised of the TDT carbopack and carbosieve materials were not commercially available, therefore we elected to use multi-phase SPME fiber consisting of divinylbenzene, carboxen, and PDMS (Sigma-Aldrich, St. Louis, MO, USA). While these differences limit the interpretation to some extent, we note that this specific sorbent coating is commonly reported in the study of human and microbial volatiles using SPME^{56–58} and is known to be well-suited to capture a wide range of analytes⁵⁸.

Discussion

In this study, a glass culture vessel was designed and developed to facilitate the in vitro analysis of biological volatilomes and pair the

engineered tool with the enhanced analytical sensitivity associated with GC×GC-TOFMS, which is recognized to directly support the improved recovery of endogenous low abundance VOCs independent of the tool. We validate the functionality of our tool by integrating computational modeling and fluorescent imaging to demonstrate desirable sampling and growth conditions. We then extensively characterize the origin of VOCs from the flow system itself, the culture media, and human-derived SK-OV-3 ovarian adenocarcinoma cells. In doing so, we identify at least low abundance three compounds not previously observed in vitro but reported in vivo (furfural, aniline, and naphthalene). With the aim of verifying the endogenous origin of some cell-specific VOCs, we inhibit lipid metabolism leveraging RNAi-mediated knockdown of *CPT2* and find four volatile metabolites that show a decrease in abundance across the 4 days of analysis weakly consistent with the transient recovery of *CPT2* expression (furfural and unknowns 4, 7, and 8). Finally, to broaden the scope of use for in vitro volatile metabolomics, we characterized the DH5α *Escherichia coli* volatilome across the log and stationary phases of

growth (0–72 h) and identify two low abundance VOCs not previously reported (3-Octanone and 3-Tridecanone).

Considering the four mammalian cell VOCs not previously reported⁴⁶, all were low abundance with a mean signal-to-noise ratio <200:1. Furfural (HMDB0000617)⁵⁹ has not been previously detected in vitro, however, studies report observing this VOC in urine, feces, breath, and skin of healthy humans⁴⁷ but has been linked to exogenous exposure⁵⁹. Clearance is known to be rapid⁶⁰ and thus sustained detection over 4 days of sampling strictly in the cellular volatilome indicates exogenous sources do not fully explain the observed signal, further supported by the results following RNA inhibition of *CPT2*. Moreover, furfural has been shown to act as a breath biomarker for gastric cancer^{61,62} and has been shown to influence DNA replication⁶³, potentially linking this VOC to cancer. Aniline (HMDB0003012)⁵⁹ is a naturally occurring metabolite that can arise from the condensation of ketones and amines^{59,64} and has been observed in the breast milk of healthy women⁴⁷, suggesting sex-dependent differences in natural abundance. Thus, our use of an ovarian adenocarcinoma cell line for this study may partially explain the in vitro recovery of aniline using the Biodome. Aniline been detected exclusively in the breath of lung cancer patients but not healthy controls⁶⁵, potentially linking increased abundance to cancer. Naphthalene (HMDB0029751)⁵⁹ has been observed in the feces, breath, skin, milk, and saliva of healthy individuals⁴⁷ and is generally associated with exogenous sources like environmental exposure⁵⁹. It is bioactive and known to be metabolized by intracellular enzymes like cytochrome P450⁶⁶ and detected in the breath of lung cancer patients⁶⁷ – although biosynthesis routes through polyketide synthases are not known to be present in the human genome⁶⁸. Lastly, very little has been reported on succinic acid diisopropyl ester as a mammalian metabolite^{46,47}. Ester functional groups may arise from the metabolism of fatty acids, although abundance measures following inhibition of *CPT2* suggests this VOC is not directly associated with the process. The expansion and culturing of cells prior to analysis is known to influence the volatile profile²¹ and potentially providing a source for the observed naphthalene signal and possibly others. In general, our results demonstrate that the Biodome enhances total signal recovery allowing for repeatable detection of low-abundance VOCs, and given the comparison to in situ SPME methodology, reduces signal abundance of common plastic contaminants.

In addition to the mammalian VOCs not previously reported, compounds statistically significantly elevated in the mammalian cell volatilome include pyrrole, n-butyl acetate, acetophenone, dimethyl trisulfide, and phenol. All five metabolites have been previously observed in mammalian cell culture in vitro. The A549 cell line (non-small cell lung cancer) has been reported to release pyrrole⁴⁶ while acetophenone has been consumed by the Lu7387 lung cancer cell line⁴⁶ and released from HUVEC primary endothelial cells⁶⁹. Similarly, n-butyl acetate is reportedly taken up by human fibroblast and lung cancer cell line CALU-1^{46,70} and released by normal (SV-HUC-1) and cancerous (Scaber, J82, 5637) bladder cell lines⁷¹. Phenol has been previously reported as a VOC released by healthy human tracheo-bronchial epithelial cells^{46,72}. Lastly, dimethyl trisulfide has been detected in the headspace of culture flasks containing melanoma cell lines WM983B and WM1158 but not non-cancerous cell lines⁷³, indicating an association with cancer given our findings utilizing the SK-OV-3 cell line. Trending towards significance, 2-Ethyl-1-hexanol (adjusted $p = 0.061$) is reportedly released by healthy human fibroblasts and lung cancer cell line NCI-H2087^{46,70}.

Many VOCs detected from mammalian culture in vitro often feature a relatively long hydrocarbon backbone⁴⁶ and are generally thought to originate from fatty acid metabolism. To globally evaluate the role of fatty acid metabolism in the production of VOCs in vitro, we elected to transiently inhibit expression of lipid transporter *CPT2* using RNA interference. Furfural and three unknown VOCs were primarily observed in cellular volatilomes and demonstrated abundance decreases weakly consistent with the knockdown of *CPT2* across 4 days, although other sources of variability cannot be ruled out. Furfural could be associated with the inhibition of fatty acid metabolism through the aldehyde functional group on the 2-position of

furan⁵³. However, high abundance on days 1 and 2 followed by an absence on day three entirely and weak recovery on day 4 suggests a complex relationship between its biosynthesis and fatty acid metabolism, with proposed reaction mechanisms involving xylose and O₂ protonation⁷⁴. This approach represents an early application of RNAi to assess pathway origin of VOCs in mammalian cells, however methodological success has recently been demonstrated in plants^{75,76}. Although a specific enzymatic step cannot be assigned to their production, our findings lend some strength to claims for cellular origin and provide a methodological platform for the secondary verification of VOC producing pathways in mammalian volatilomes. Future work will look to apply a similar approach to the less complex bacterial volatilome.

In the case of the *E. coli* volatilome the significant increase in indole, relative to the broth control, is an indication of the advantages of the Biodome tool for in vitro volatile metabolomics. Conversion of tryptophan to indole by tryptophanase is a well characterized process in *E. coli*^{77,78}. Tryptophanase catalyzes the production of pyruvate in conditions of excess tryptophan, as expected in starter broth cultures⁷⁹, generating indole as a byproduct^{77,78}. Here, we find indole is the most abundant peak across the log and stationary phases of growth (0–72 h) in the *E. coli* volatilome, although one recent study has shown bacterial transformation to induce ampicillin resistance may act as a confounding factor⁸⁰. Generally, our results agree with many previous studies, which demonstrate indole is a biomarker for *E. coli*, acting as an extracellular signaling molecule with import and export complexes, and serving to regulate biofilm formation, cell division, and gene expression^{81–85}. Worth discussing, indole was detected with high confidence in the broth controls and had similarly broad peaks. Therefore, to ensure consistency, peaks within the first-dimension retention time window of 2092–2110 s were summed in all chromatograms, likely explaining the high reported signal in broth controls despite clear differences in abundance (Fig. S7). Demonstrating similar agreement, recent studies also report 2-nonanone in the *E. coli* volatilome, including the DH5 α strain we detected it from in this study^{86,87}. Further, biosynthesis of 2-nonanone is known to be naturally derived from the decarboxylation of 10 carbon β -keto acids⁸⁸ and has been shown to regulate gene expression associated with quorum sensing⁸⁹. We also observe related 2-ketones: 2-decanone, 2-undecanone, and 2-tridecanone in good agreement with previous studies^{90–93}. Similarly, both 3-methyl-1-butanol and 2,2,4,6,6-pentamethylheptane have been previously observed in the *E. coli* volatilome^{93–95}. Taken together, our findings demonstrate that volatile profiles acquired using the Biodome tool accurately reflect active metabolic processes in *E. coli* and agree with previous studies regarding the abundance of these VOCs relative to the remainder of analytes comprising the volatilome.

While we detected the well-established *E. coli* VOCs, indole and 2-ketones⁹¹ (e.g. 2-nonanone) we report the observation of low abundance 3-Octanone and 3-Tridecanone in the DH5 α *E. coli* volatilome. Interestingly, 2-ketones are known to be derived from fatty acid metabolism through the production of β -keto acyl-CoAs⁹⁶ and while 3-ketones have not been previously observed in vitro, their detection implies the same precursor molecules may be used but involve a separate mechanism of biosynthesis. Furthermore, 3-octanone has been shown to act as a potent inhibitor of *E. coli* growth⁹⁷ and line plots generally show increasing abundance of 3-ketones over the 72 h of sampling (Fig. S7d), possibly suggesting these VOCs may act to regulate growth as nutrient availability grows increasingly scarce, although additional work is needed to confirm their bioactivity and endogenous origin.

As demonstrated, the total signal emitted from cells is far less than that of the media or flow system, lending strength to claims of advantageous sampling in the Biodome associated with the implementation of dynamic headspace sampling. By enhancing the total analyte signal recovered from the biological culture, low abundance analytes have a better ability to generate a sufficient quality spectrum for database searches. While many single advantages of the Biodome tool have been incorporated into other designs, no single device had been developed that leveraged the analyte recovery advantages of dynamic headspace sampling while also addressing common

pitfalls associated with contaminant plastic signal or relatively large headspace volumes. Thus, the Biodome tool provides a platform to build upon existing knowledge for in vitro volatilomics by integrating a (i) dynamic headspace methodology and low headspace volume to enhance total signal recovery allowing detection of lower abundance VOCs, and (ii) borosilicate glass culture vessel to reduce exogenous signal due to plastics, support dual imaging function, and allow for sterilization and reuse. Through the direct comparison of *E. coli* volatilomes by SPME and the Biodome tool we find improved reproducibility for some *E. coli* specific VOCs, including the volatile biomarker indole, while operating in the laminar flow range. The non-destructive nature of collection allows for analysis of VOCs across time and in response to perturbation, as demonstrated by the application of a standard RNA interference workflow. Given the advantages of the tool established through this work, the engineered Biodome can be readily adapted to meet experimental requirements, including temporal viability and easy modification of the temperature and flow gas composition. Analytical flexibility may be of notable usefulness for the study of anaerobes and extremophiles. Furthermore, off-line sampling enables the convenient storage of captured volatiles, as performed in this work, and the sampling adapter can be readily modified for non-TDU sampling (SPME), expanding tool accessibility. The gas inlet has been specifically designed to enable an airtight seal using standard (US) tubing sizes. The modular aspect of the system enables ease of sample replacement and reuse through autoclave sterilization, while the design of a secondary part to enable multiplexing of Biodomes improves throughput. Beyond the unique elements of the engineered Biodome for in vitro volatilomics, the flow system is generally comprised of low-cost elements and provides important manual control over the flow rate while minimizing exogenous carbon sources from the compressed cylinder and environment. Thus, the Biodome should serve as a powerful tool for the characterization of in vitro VOCs in this growing field of metabolomics.

Methods

Biodome Development and Fabrication

A CAD model of the Biodome culture vessel, with the TDT adapter included, was designed in SOLIDWORKS® 2019. Flow characteristics were then modeled in the CAD part using ANSYS Fluent® 2019 R3. For meshing, the target skewness was adjusted to 0.65, smoothing set to high, a mesh metric set to Orthogonal Quality, and default for all other parameters. The inlet and outlet mesh were then refined using a value of 2. Boundary conditions were then set, using inlet velocities ranging from 1 – 50 mL/min and the pressure outlet condition. The operating pressure was assumed to be 1 atm, the fluid set to air, and acceleration due to gravity was included in the model. The residual threshold was adjusted to 1E-5. Solution parameters were as follows: Pressure-Velocity Coupling Scheme set to SIMPLE, Spatial Discretization Gradient set to Least Squares Cell Based, Pressure set to Second Order, and Momentum set to Second Order Upwind. Solution results were visualized using ANSYS CFD Post GUI.

Fabrication of the glass culture vessel leverages specialized trade techniques, but in brief begins with rotation of Pyrex tubing using a glass-blowing lathe. A natural gas or oxygen flame was used to pull the tube down into a flat bottom. The inlet and outlet were then added to onto the flat bottom. Using a custom holder to retain that piece in the lathe, another flat bottom was pulled to create the internal chamber. Additional attention was given to the curvature of the bottom and top to ensure the flattest surface possible for imaging applications.

To assemble the TDT adapter, Nalgene tubing was inserted into the 7.9375 mm nut head (with moderate force) and the other end was inserted into the rubber stopper. A metal ferrule and tubing insert was attached to the free end and the nut-ferrule assembly was then connected to the male-to-male adapter (Fig. S1e). A ferrule was then added to the 6.35 mm stainless steel nut and screwed firmly into the other end of the male-to-male adapter. The opening of the 6.35 mm stainless-steel nut served as the interface for TDT sampling. An airtight seal was ensured by wrapping 7-8 cm of oxygen-compatible PTFE tape around the beveled end of the TDT tube before

inserting it into the TDT interface. A visible decrease in the flow rate (>2 mL/min) was always observed when the TDT was inserted into the adapter and the regulator was readjusted to achieve the original flow rate after roughly 5-10 min of equilibration. To adapt the system for SPME sampling methodology, a 1 mL disposable syringe body (Electron Microscopy Sciences, Hatfield, PA), with the plunger removed, in line with the 6.35 mm (1/4 inch) nut (replacing the TDT, Fig. S1f) and completely sealing the interface with oxygen-compatible PTFE. The SPME fiber then rests naturally at the narrow end of the syringe body – without contacting the sides of the syringe. Other SPME adapters were considered, including the use of a GC SPME glass liner insert, however the added volume of the syringe was found to help with the condensation of water during sampling durations >24-48 h (depending on flow rate).

Cell Culture

SK-OV-3 ovarian adenocarcinoma cells (human origin; HTB-77) were obtained from ATCC. Cells were maintained in RPMI 1640 (Sigma-Aldrich) supplemented with 10% FBS (ATCC) and 1% penicillin (100 I.U. / mL; ATCC) / streptomycin (100 µg/mL; ATCC). Cells were maintained in a humidified incubator at 37 °C and 5% CO₂. Cultures were grown in standard T-75 flasks and passaged at 70-85% confluency.

To seed the Biodome for VOC analysis, approximately 500,000 cells – estimated using a hemacytometer – were seeded in the Biodome. Cells were allowed to adhere from within a standard incubator (see above) for 24 h, and the culture media was replaced immediately before the start of analysis. Vented caps from standard T-25 flasks (VWR) were allowed to rest on top of the inlet and outlet of the Biodome – maintaining an enclosed environment and CO₂ exchange with the media. The total media volume in the Biodome was maintained at 5 mL for all experiments. To limit the background signal from the culture media and maintain growth rates, dialyzed fetal bovine serum (FBS) was used in place of traditional FBS, ensuring small molecule (<10,000 Da) concentration was reduced. Finally, to improve the consistency of heating and reduce condensation, the Biodome was completely submerged within a bead bath maintained at 37 °C. Gas flow was set 24 h before the start of experimentation to ensure an equilibrium was reached within the two-stage regulator.

Bacterial Culture

DH5α *E. coli* were transformed with plasmid containing the ampicillin resistance gene (pUC19, Addgene Plasmid #50005) and streaked on LB agar plates spiked with 100 µg/mL ampicillin. Isolated colonies were inoculated in 100 µg/mL ampicillin spiked LB broth and grown for 24 h. OD₆₀₀ measurements were taken and used to dilute the bacterial culture such that the initial OD₆₀₀ seeding concentration was approximately 0.1 at the start of VOC collection. Bacteria were seeded into the Biodome containing a total of 5 mL of LB broth spiked with 100 µg/mL ampicillin and TDU tubes were replaced every 24 h. The carrier gas composition was 95% air / 5% CO₂, to allow compatibility with cellular analysis, and a flow rate of 18 mL/min was maintained for the duration of sampling. Gas flow was set 24 h before the start of experimentation to ensure an equilibrium was reached within the two-stage regulator.

Fluorescent Imaging

Prior to the start of the live/dead assay, seeded cells were allowed to adhere for 24 h in a humidified incubator at 37 °C and 5% CO₂ and culture media was replaced immediately before introduction to the flow system. The Biodome was then incubated in the flow system for durations spanning 0 and 4 days. Following growth in the flow system, live/dead fluorescent probes (Blue/Green ReadyProbes, Invitrogen) were added to the Biodome according to the manufacturer guidelines. In brief, 2 drops of the ready-to-use stain were added per millimeter, totaling 8 drops. The biodome was then placed in a humidified incubator at 37 °C and 5% CO₂ for 30 min. After 30 min, the Biodome was imaged using Eclipse Ts2R microscope (Nikon, Minato City, Tokyo, Japan) with a Coolsnap Dyno CCD (Photometrics, Tucson, Arizona, USA) and 10x objective. A FITC filter (EX: 482 nm, EM:

536 nm; Nikon) was used to excite the live stain (Hoechst 33342) while a DAPI filter (EX: 390 nm, EM: 475 nm; Nikon) was used to visualize the dead stain. Fluorescent image processing and cell counting was performed using ImageJ.

To evaluate cell morphology, actin fluorescence staining was performed in live cells using CellMask™ Orange Actin Tracking Stain (Invitrogen). Cells were grown out in the specified incubation system for approximately 3 days until the confluency had reached 70–80%. 1000x stock solution of the actin tracking stain in DMSO was diluted to 1x in the RPMI1640 culture media described previously. Live/dead fluorescent probes were concurrently added to the staining media at a ratio of 2 drops per milliliter and cells were incubated for 30 min in a humidified incubator as previously described. Cells were rinsed twice with a wash buffer comprised of culture media previously equilibrated in a humidified incubator at 5% CO₂ and 37 °C for 30 min. Cells were imaged using a Leica DMi8 (Leica, Wetzlar, Germany) microscope with DFC345 FX monochrome camera (Leica) and Texas Red (EX: 560 nm, EM: 645 nm), DAPI, and FITC filters to visualize the actin, dead cell nuclei, and live cell nuclei, respectively. Images were processed and fluorescent channels overlaid using ImageJ. All fluorescent images were captured using cells at passage <10 using a 20x objective.

RNA inhibition

Pooled siRNA oligonucleotides were purchased from Dharmacon (Lafayette, CO, USA) targeting *CPT2* [siGENOME SMARTpool Human *CPT2*; 5' – GGCAGAAGCUGAUGAGUAG – 3', 5' – UGGCAUACCUGACCAGUGA – 3', 5' – GGAAAGUGGACUCGGCAGU – 3', 5' – CAAGAGACUCAUACGCUUU] and a non-silencing (sham) control [siGENOME Non-Targeting siRNA Pool #1; 5' – UAGCGACUAAACACAUCAA – 3', 5' – UAAGGCUAUGAAGAGAUAC – 3', 5' – AUGUAUUGGCCUGUAUUAG – 3', 5' – AUGAACGUGAAUUGCUCAA – 3']. SK-OV-3 cells were grown in a 6-well format and transfected at 80% confluency with complexes consisting of 50 nM pooled RNAi probes and 2 µg/mL Lipofectamine™ 2000 (Invitrogen) in Opti-MEM® I Reduced Serum Medium (ThermoFisher, Waltham, MA, USA). In the 6-well format, an extra well was allocated for direct seeding into the Biodome for VOC analysis. After 24 h in a humidified incubator at 37 °C and 5% CO₂, the media was aspirated and the transfected cells were trypsinized. Approximately 500,000 cells were then seeded into the Biodome containing 5 mL of RPMI1640 with 10% dialyzed FBS and 1% Pen/Strep. The cells were allowed to adhere for roughly 1 h in an incubator before being transferred to the flow system. For the transient RNAi assay, media was replaced after 24 h, defining the 0-hour time point.

RNA Extraction

Following RNAi, cellular RNA was extracted using PureLink® RNA Mini Kit (Life Technologies, Carlsbad, CA, USA) according to manufacturer guidelines. In brief, fresh lysis buffer containing 1% 2-mercaptoethanol (Sigma Aldrich) was used to lyse the cells directly in the 6-well plate. Lysate was homogenized using 10 repeat passes through an 18-gauge needle (BD, Franklin Lakes, NJ). Binding, washing, and elution of purified RNA was performed according to kit specifications. Purity was assessed using absorbance values from a NanoDrop™ One (ThermoFisher Scientific) and all samples were found to have A₂₆₀/A₂₈₀ ratios between 1.98 – 2.06. Samples were stored at –80 °C.

RT-qPCR

Purified RNA samples were thawed on ice and subject to reverse transcription using the QuantiTect Reverse Transcription Kit (Qiagen, Germantown, MD, USA). In brief, 100 ng of RNA was used as the starting weight. The genomic DNA elimination and reverse transcription reactions were prepared according to kit specifications. Reverse transcription reaction was allowed to proceed for a total of 15 min. Samples were stored for less than two weeks at –20 °C before proceeding to qPCR.

The resulting cDNA was then subject to quantitative PCR to determine expression of *CPT2* and housekeeping gene *GAPDH*. Primers for *CPT2*

[RefSeq Accession: NM_000098; forward primer 5' – TGGTTTA TCTGCCCCGTATGC – 3' and reverse primer 5' – TGCTCCAAGTACC ATGGC – 3'] and *GAPDH* [RefSeq Accession: NM_002046; forward primer 5' – ACATCGCTCAGACACCATG – 3' and reverse primer 5' – TG TAGTTGAGGTCAATGAAGGG – 3'] were purchased from IDT (Newark, NJ, USA). The qPCR reaction was prepared in a 96-well format (ThermoFisher Scientific) using iTaq Universal SYBR Green Supermix (Bio-Rad Laboratories, Hercules, CA, USA), according to manufacturer guidelines. In brief, a 20 µL reaction size was selected, using 500 nM of the forward and reverse primer, 1 µL of cDNA, 10 µL of 2x iTaq, and remaining volume balanced with nuclease-free H₂O. 96-well plates were transferred to a qTOWER 2.0 instrument and expression quantified using the following cycling conditions: 50 °C for 2 min, 95 °C for 5 min, followed by 40 cycles of amplification at 95 °C for 15 s then 60 °C for 1 min. Annealing at 72 °C was allowed to proceed for 10 min, at which point the dissociation characteristics were assessed by ramping the temperature from 65 °C to 95 °C using a step size of 2 °C, equilibration time of 6 s, and heating rate of 0.5 °C/second. Independent biological replicates were analyzed in technical triplicate and averaged.

GC×GC-TOFMS

Thermal desorption tubes (Carbopack C, Carbopack B, and Carbosieve SIII, see Results) containing retained VOCs were analyzed using comprehensive GC×GC-TOFMS (Pegasus 4D®, LECO Corp. St. Joseph, MI), equipped with an autosampler (Multipurpose Sampler RoboticPro®, Gerstel Inc., Linthicum Heights, MD). TDTs were stored for a maximum of 8 days at 4 °C to limit degradation⁴⁹ and analyzed in order of collection. Volatiles were desorbed into the TDU 2 (Gerstel Inc.) inlet for a total of 4 min using variable temperature programming and splitless desorption mode. The TDU 2 inlet was initially held at 50 °C for 30 s after which a ramp rate of 700 °C/min was applied until the final temperature of 300 °C was achieved. The inlet temperature was held at 300 °C for 3 min prior to the start of chromatographic analysis. The transfer temperature was maintained at 310 °C. The TDU 2 inlet was paired with a cooled injection system (CIS) to enhance analyte sensitivity. The CIS was initially maintained at –100 °C for the first 30 s of the run. The CIS temperature was then ramped at a rate of 12 °C/sec until the final temperature of 275 °C was achieved. The CIS was then maintained at 275 °C for 3 min.

The instrument was fitted with a two-dimensional column set consisting of a Rxi-624Sil MS (60 m × 250 µm × 1.4 µm; Restek®, Bellefonte, PA) first dimension column and a Stabilwax (1 m × 250 µm × 0.5 µm, Restek) second dimension column joined together by a press-fit connection (length × internal diameter × film thickness, respectively). The first-dimension column was set at an initial temperature of 50 °C and held for 2 min. The temperature was increased at a rate of 5 °C/min until reaching the target temperature of 230 °C, where a final hold time of 5 min was applied. The secondary oven was maintained at a + 5 °C offset relative to the primary oven. A quad-jet modulator was used with a 2 s modulation period and a + 15 °C offset relative to the secondary oven. The transfer line was maintained at 250 °C and the ion source at 200 °C for the duration of the run. Helium (UHP, 99.999%) was used as the carrier gas at a flow rate of 2 mL/min. Mass spectra were acquired at 100 Hz over a mass range of 35–300 Da with an ionization energy of –70 eV. Prior to all sample analysis, a PFTBA standard was run to tune the mass spectrometer. Empty vials (blanks) were run at the start of each sample set to monitor the system for contamination. An alkane standard (C8–C20; Sigma Aldrich, St. Louis, MO) was sampled at the conclusion of testing for use in determination of retention indices.

Data Processing

Within individual sample chromatograms, subpeaks in the second dimension were required to meet a signal-to-noise ratio ≥6 to be combined. The signal-to-noise cutoff for peak selection was set at 20:1 for a minimum of two apexing masses. The baseline signal was drawn through the middle of the noise. To align peaks across chromatograms, the Statistical Compare software package in ChromaTOF® Version 4.72.0.0 (LECO Corp.) was

utilized. Peaks were allowed to shift by a maximum of 18 s (9 modulation periods) in the first dimension and 0.25 s in the second dimension. The resulting aligned peaks were compared to the National Institute of Standards and Technology (NIST) 2011 Mass Spectral Library and tentative peak names were assigned if the spectral similarity score was ≥ 600 (60%). A secondary round of peak picking was performed on aligned chromatograms using a signal-to-noise threshold of 5 and a minimum spectral similarity $\geq 60\%$. Peaks with a spectral similar score that fell below the threshold were labeled 'Analyte'. The resulting dataset was then manually filtered to remove poorly resolved peaks eluting before 400 s and known contaminants (siloxanes). Split peaks that fell outside the data processing thresholds were manually summed with first- and second-dimension retention times averaged. Quantitative values for signal abundance were obtained by integrating peaks areas using the unique ion mass.

VOC identities were assigned according to the metabolomic reporting standards established previously⁴⁹. Compounds received an ID confidence level between 1 and 4, with 1 representing the highest confidence supported by two independent and orthogonal data sources⁴⁹. In brief, compounds with mass spectral match $\geq 85\%$, to the NIST 2011 Mass Spectral Library, received an initial confidence level of 3. Compounds below this mass spectral threshold were assigned an ID level of 4 and labeled as unknown. The tentative VOC name and functional group is reported for all compounds with an ID level ≤ 3 . A C8-C20 alkane standard was analyzed (Fig. S3) and used to assign retention indices for all VOCs. An ID level of 2 was the highest classification in this study, verified with a $\geq 85\%$ mass spectral match and a retention index that is consistent with the mid-polar Rxi-624Sil stationary phase using the mean of published RIs, according to an approach previously established^{156,98}. If mass spectral and polar second dimension chromatographic information supported the assignment of a functional group to a compound with an ID level of 4, then the compound was named by the functional group. The reverse library search was used to identify 3,5-dihydroxybenzamide and 3-octanone in the bacterial volatome and pyrrole, furfural, aniline, phenol, and 1-dodecanol in the SK-OV-3 volatome. When compared to the unperturbed SK-OV-3 volatome, furfural abundance variability in the RNAi volatome is attributed to alignment post-processing and retention time drift.

Statistics and Reproducibility

To focus on the reproducible aspects of the biological volatomes, compounds variably present ($>20\%$ missing observations) in the experimental and control volatomes were removed, unless otherwise indicated. Integrated peaks were \log_{10} transformed in R, Version 4.0.3 (The R Foundation for Statistical Computing, Vienna, Austria) and missing values were imputed to 0 abundance. Pairwise, two-sided students' t-tests were applied comparing biological and control VOC abundances across the sampling duration. Abundance observations were assumed to be unpaired, with unequal variance. The resulting *p*-values were then adjusted according to the Benjamini-Hochberg procedure⁵¹ using the *p.adjust* function in the base R stats library. All experiments were performed in biologically independent triplicate.

Sterilization and re-use Procedure

Following the conclusion of sampling and analysis in the Biodome, the TDT adapter was removed and submerged in a 100% ethanol bath for at least 1 h and subsequently sonicated for 2 min. Removal of the live culture is dependent on the organism considered. For microbiological analysis, a freshly prepared 10% bleach solution was added directly through the outlet of the Biodome and left at room temperature for 15 min. For adherent cell culture, spent media was aspirated and 5 mL of 0.25% Trypsin / 0.53 mM EDTA was added to the Biodome and incubated at 37 °C for 5-10 min to dissociate cells from the surface. Trypsinization was deemed a highly beneficial step to prevent accumulation of leftover cellular debris on the culture surface following autoclaving (later step). In both cases, the liquid culture was then emptied, and the Biodome was subject to two additional wash steps using bleach with vigorous lateral motion. Afterwards, the Biodome was

flushed thoroughly with DI water and then autoclaved for 1 h. Following sterilization in the autoclave, the biodome was then placed in an acid bath (3 M HCl) overnight (≥ 10 h), although 3 h was found to be sufficient. Following the acid bath, the Biodome was flushed with DI water and transferred to a base bath (approximately 150 mM NaOH) for at least 3 h. Finally, to reduce noise from the culture vessel, the Biodome was flushed again with DI water, placed in a glass beaker, and heat treated for >12 h at 100 °C. The authors recommend treating the Biodome in the base bath second, to limit the detection of acid-related contaminants.

Reporting Summary

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

Data availability

Supplementary datasets 1–3 include all tentative VOCs associated with the flow system and culture media following alignment of experimental replicates using ChromaTOF. Supplementary dataset 4 reports the abundance of common contaminants in a direct comparison of in situ SPME and Biodome sampling methodologies. Supplementary dataset 5 includes all tentative VOCs identified after the inhibition of *CPT2* expression in SK-OV-3 mammalian cells. Supplementary dataset 6 presents all tentative VOCs identified in the *E. coli* and LB Broth volatomes. Supplementary videos show laminar flow in the Biodome culture vessel and multiplexed component under experimental conditions. All raw chromatographic and mass spectral data have been made publicly available in the MetaboLights⁹⁹ repository at: <https://www.ebi.ac.uk/metabolights/MTBLS8252>. All relevant supplementary files not presented in the supplementary datasets, including raw chromatographic data, can be found at: https://figshare.com/authors/Jarrett_Eshima/13813720.

Code availability

Custom R code for the post-processing and statistical analysis of SK-OV-3 and *E. coli* volatomes has been made publicly available in the Smith Lab Github repository (<https://github.com/BSmithLab/Biodome>).

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Author contributions

J.E. helped design the tool, analyzed all samples by GC×GC-TOFMS, performed the knockdown of *CPT2* and transformation of *E. coli*, developed the code to perform statistical analysis of the results, and wrote the manuscript. T.R.P. cultured ampicillin-resistant *E. coli*, collected all bacterial volatilome samples, performed the knockdown of *CPT2*, and edited the manuscript. Y.A. performed the transient inhibition assay following *CPT2* knockdown, collected RNAi volatilome samples, analyzed gene expression by RT-qPCR, and helped write the manuscript. A.P.O. supported the collection of samples from various experiments, performed the manual assessment of mass spectral data, and helped write the manuscript. J.F.L. played a key role in the design of the tool, established early methodology, and reviewed the manuscript. B.D.A. performed the characterization of fluid flow in the Biodome using ANSYS Fluent®, performed live-dead fluorescence assays, collected morphological images following live actin staining, and reviewed the manuscript. E.M. developed high-quality CAD renders and schematics of the system and tool, fabricated the custom tray device to enable imaging in the tool, and reviewed the manuscript. C.M. contributed to early methodological development used throughout the study, developed

code for determination of chemical functional group, and reviewed the manuscript. P.P. and C.A. performed live-dead fluorescence assays, assisted with RNA inhibition experiments, and reviewed the manuscript. B.S.S. devised the idea, designed the tool and coordinated fabrication by glassblowing, and wrote the manuscript.

Competing interests

J.E., J.F.L., and B.S.S. hold a non-provisional patent, filed by Arizona State University, related to the device described in the manuscript. Non-Provisional US Patent Application No. 17/715,352, “Devices and Systems for Non-Destructive Collection and Monitoring of Biological Volatiles”. All other authors declare no competing interests.

Additional information

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