

Original Research Article

# Assessment of chimeric antigen receptor T cytotoxicity by droplet microfluidics in vitro

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## ABSTRACT

Chimeric antigen receptor T (CAR-T) cells are cytotoxic T cells engineered to specifically kill cancer cells expressing specific target receptor(s). Prior CAR-T efficacy tests include CAR expression analysis by qPCR or ELISA, in vitro measurement of interferon- $\gamma$  (IFN $\gamma$ ) or interleukin-2 (IL-2), and xenograft models. However, the in vitro measurements did not reflect CAR-T cytotoxicity, whereas xenograft models are low throughput and costly. Here, we presented a robust in vitro droplet microfluidic assay for CAR-T cytotoxicity assessment. This method not only enabled assessment of CAR-T cytotoxic activity under different fluid viscosity conditions, but also facilitated measurement of CAR-T expansion and dissection of mechanism of action via phenotype analysis in vitro. Furthermore, our data suggested that label-free cytotoxicity analysis is feasible by acquiring data before and after treatment. Hence, this study presented a novel in vitro method for assessment of cellular cytotoxicity that could potentially be applied to any cytotoxicity experiment with varying solvent composition.

**Statement of Significance:** This paper presents a robust in vitro droplet microfluidic assay for assessment of cellular cytotoxicity under varying solvent composition. This method rigorously interrogates cell number expansion and reduction with strong statistical power. Phenotype analysis by fluorescence imaging provides mechanistic insight.

**KEYWORDS:** cytotoxicity assessment; droplet microfluidics; chimeric antigen receptor T cell therapy; immunotherapy; precision cancer therapy

## INTRODUCTION

Chimeric antigen receptor T (CAR-T) cells have been approved by the US Food and Drug Administration

(FDA) for application in cancer immunotherapy. Prior CAR-T efficacy tests are summarized in Table 1. The major drawback of current CAR-T cytotoxicity assessment

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methods is that a large pool of both the CAR-T and cancer cells is required, especially for the xenograft models.

Recently, novel microfluidic technologies enable cytotoxicity assessment using different cytotoxic cells as model [1]. Among these microfluidic assays, the T- or Y-channels are very robust droplet generation systems, but the low cell occupancy of the majority of these systems impedes real-life applications. First, >99% of droplets are empty when these systems are tailored to obtain one cell per droplet unless very specific conditions can be met [2]. Second, it is difficult to precisely quantify droplets maintained in large, open chambers [3]. Third, confining droplets into microwells [4] may aid time-lapse imaging and effective clone selection from a pool, but the propensity of empty droplets will greatly increase workload if all cells of a tumor need to be analyzed to address heterogeneity. In contrast, our microfluidic chip [5] enables 100% microwell occupancy and 100% cell-containing droplets when used appropriately. Additionally, the large droplets allow imaging of cell morphology and movement at multiple time points, which cannot be achieved by cell traps [6]. Hence, our chip assay minimizes empty droplet incidences and provides cell morphology information that other systems could not accomplish.

Alternatively, as opposed to microwell microfluidic systems, our chip enables flexible sample replicates (i.e. the number of loaded microwells) without the need to fabricate new chips. This flexibility can be partially achieved by a microfabricated 96-well plate [7], if there is sufficient sample to fill at least one well. Additionally, these plates are relatively costly unless the full plate is used at the same time, whereas our chip is designed for one sample per chip to ensure sterile condition and avoid cross-contamination. Alternatively, in open microwell systems, adjusting cell concentration to adjust sample size will not only affect cell distribution per microwell, but also microwell occupancy rate, the latter of which is unaffected in our system unless one cell per drop is desired. Micropatterning potentially increases microwell occupancy in microwell systems, but it complicates chip fabrication and increases cost. Therefore, our chip assay provides loading flexibility while retaining screening efficacy.

On the other hand, more sophisticated systems have been built to investigate the invasiveness of therapeutic cells through biogels [8–10]. However, quantification in these assays will be compromised. Furthermore, many systems were developed to address the issue of cytokine production [11–13], but most of these systems are either delinked from quantitative cytotoxicity assessment or impractical for multi-timepoint analysis. In conclusion, each assay has its pros and cons. Our chip design provides genuine advantage for rapid cell-based cytotoxicity screens applied to cells that are adaptable to suspension culture.

In this study, we exploited our previously developed droplet microfluidic chip [5] to establish a two-cell type model for screening CAR-T cells against cancer cells. The basic chip design and data acquisition procedures remained the same, but cell type identification became challenging. Eventually, we tested the application using a CD19<sup>+</sup> Nalm6 cancer cell line stably expressing green fluorescent protein

(GFP) and luciferase [14] to setup our model. We analyzed two batches of CAR-T cells in vitro using luciferase assay on plate and our chip assay, where luciferase activity measurements were calibrated by a standard curve plotted by gradient Nalm6 cell numbers against blank control (Fig. S1 available at ABT Online) for comparison between methods. The two CAR-T batches demonstrated similar cytotoxic activity by luciferase activity, but significantly different cytotoxicity on chip. Therefore, we performed in-depth analysis of the chip assay to exemplify the capability of this method.

## MATERIALS AND METHODS

### Preparation of CAR-T cells

Human primary peripheral mononuclear cells (PBMCs) were separated in Lymphoprep™ (STEMCELL™ Technologies) by density gradient centrifugation. Primary human T cells were isolated from PBMCs by negative selection using the Pan T Isolation Kit (Miltenyi Biotec). Batch 1 T cells were cultured in IMDM medium containing Icove's modified Dulbecco's medium (IMDM) (Life Technologies) supplemented with 10% (v/v) fetal bovine serum (Life Technologies) and 100 U/mL penicillin–streptomycin (Life Technologies), and stimulated with TransAct™ (Miltenyi Biotec). Batch 2 T cells were cultured in R10 medium containing RPMI 1640 (Life Technologies) supplemented with 10% fetal bovine serum (Life Technologies), 100 U/mL penicillin–streptomycin (Life Technologies), 2 mM l-glutamine (Life Technologies), 25 mM HEPES pH 7.5 (Life Technologies) and 100 µg/mL Streptavidin (Sigma-Aldrich), and stimulated with particles coated with anti-CD3/anti-CD28 antibodies (Miltenyi Biotec) at a cell-to-bead ratio of 1:2. Approximately, 48 h after activation, T cells were transfected with supernatant containing lentiviral vector expressing CAR. After transduction for 12 h, all transduced T cells were sorted by fluorescence activated cell sorting (FACS) using anti-EGFR antibody (BioLegend). Purified CAR-T cells were cultured or assayed with activation medium containing IMDM medium or R10 medium supplemented with 300 U/mL IL-2 (clinical grade). The CAR-T cells were fed every 2 days with fresh media for no more than 5 days, and frozen in liquid nitrogen until use following standard freezing procedures.

### Preparation of Nalm6 cancer cells stably expressing GFP

Nalm6 cells (ATCC®) were transduced with a lentiviral vector co-expressing GFP and luciferase. Nalm6 cells were cultured in culture medium containing RPMI 1640 (Life Technologies) supplemented with 10% (v/v) fetal bovine serum (Life Technologies), 100 U/mL penicillin–streptomycin (Life Technologies), 2 mM l-glutamine (Life Technologies), 25 mM HEPES pH 7.5 (Life Technologies) and 50 µM β-mercaptoethanol (Sigma-Aldrich).

### Luciferase assay

$1.0 \times 10^5$  Nalm6 cells were incubated with CAR-T cells in activation medium at the indicated ratios in triplicate

**Table 1.** Summary of CAR-T efficacy tests [17, 18]

Type	Method	Description
In vitro	qPCR	Quantitative PCR is used to measure mRNA expression of CAR. Pros <ul style="list-style-type: none"> <li>• Robust and low cost.</li> </ul> Cons <ul style="list-style-type: none"> <li>• Indirect indicator of CAR expression on CAR-T cell surface.</li> <li>• No assessment of cytotoxicity.</li> </ul>
	ELISA	ELISA assay on protein expression of CAR is performed. Pros <ul style="list-style-type: none"> <li>• Robust and low cost.</li> <li>• Direct indicator of CAR expression on CAR-T cell surface.</li> </ul> Cons <ul style="list-style-type: none"> <li>• No assessment of cytotoxicity.</li> </ul>
	Flow cytometry	Flow cytometry is performed after CAR labeling. Pros <ul style="list-style-type: none"> <li>• Robust and low cost.</li> <li>• Direct indicator of CAR expression on CAR-T cell surface.</li> </ul> Cons <ul style="list-style-type: none"> <li>• No assessment of cytotoxicity.</li> </ul>
	Antibody microarrays	A panel of antibodies targeted against cytokines of anti-tumor effector (Granzyme B, IFN- $\gamma$ , MIP-1 $\alpha$ , TNF- $\alpha$ ), stimulatory (GM-CSF, IL-2, IL-8), regulatory (IL-4, IL-13, IL-22), and inflammatory (IL-6, IL-17A) functions is used. Pros <ul style="list-style-type: none"> <li>• Indirect indicator of the immune response triggered by CAR-T cells.</li> </ul> Cons <ul style="list-style-type: none"> <li>• Higher cost than other in vitro techniques.</li> <li>• Reliance on microarray quality.</li> </ul>
	<sup>51</sup> Cr release assay	<sup>51</sup> Cr labeling is used to measure cell viability of cancer cells in co-cultures with and without CAR-T cells. Pros <ul style="list-style-type: none"> <li>• Direct indicator of CAR-T cell cytotoxicity.</li> </ul> Cons <ul style="list-style-type: none"> <li>• Usage of radioactive substance.</li> <li>• Requirement for a large pool of CAR-T and cancer cells.</li> </ul>
	BATDA assay	BATDA Reagent is used to label cancer cells for cell viability measurement Pros <ul style="list-style-type: none"> <li>• Direct indicator of CAR-T cell cytotoxicity</li> </ul> Cons <ul style="list-style-type: none"> <li>• Requirement for a large pool of CAR-T and cancer cells</li> </ul>
In vivo	Mouse xenograft model	Relevant genetically engineered mouse model(s) or implantation of relevant cancer cells/tissue into immunocompromised mice is used Pros <ul style="list-style-type: none"> <li>• Direct indicator of CAR-T cell cytotoxicity in vivo</li> </ul> Cons <ul style="list-style-type: none"> <li>• High cost and time consuming</li> <li>• CAR-T efficacy is affected by physiological and environmental factors that may be irrelevant to human patients</li> </ul>

**Table 1.** Continued

Type	Method	Description
In vitro	Droplet microfluidics	<p>CAR-T cells and cancer cells are co-cultured on a droplet microfluidic chip, followed by single cell counting to evaluate cancer cell viability</p> <p>Pros</p> <ul style="list-style-type: none"> <li>• Direct indicator of CAR-T cytotoxicity</li> <li>• Observation of CAR-T expansion</li> <li>• Visualization of the interaction between CAR-T and cancer cells via phenotype analysis</li> <li>• Microvolume requirement for both CAR-T and cancer cells</li> <li>• Low cost</li> </ul> <p>Cons</p> <ul style="list-style-type: none"> <li>• Limitation on data acquisition frequency due to microscope capability</li> <li>• Requirement for sophisticated image processing techniques</li> </ul>

wells of a 96-well U-bottomed plate for 18 h. Luminescence was obtained after applying the Dual-Luciferase Assay Kit (Promega) in a 96-well opaque plate following manufacturer's protocol and measured on Perkin Elmer Victor X3 Plate Reader. Background luminescence was negligible (signal: noise (S/N) ratio < 0.01). Subsequently, cell viability was calculated by the following formula:

$$\text{Cell viability} = \frac{\text{Luminescence (CT : N6 = } n) - \text{Blank}}{\text{Luminescence (CT : N6 = 0) - \text{Blank}}$$

For comparison to on-chip results, a standard curve of serially diluted Nalm6 cells from  $2.0 \times 10^5$  cells/well to  $3.1 \times 10^3$  cells/well was plotted against luminescence. Linear regression was performed using Microsoft Excel 2013 for calculation of absolute cell numbers from relative luminescence.

$$y = 22.9x - 7749.1$$

where  $y$  denoted luminescence and  $x$  denoted Nalm6 cell number.

Blank controls contained culture medium but no cells.

### On-chip CAR-T cytotoxicity assay

CAR-T and Nalm6 cells were mixed at a final concentration of  $5.0 \times 10^6$  and  $1.0 \times 10^6$  cells/mL in activation medium, respectively. About, 1% (w/v) methyl cellulose (Sigma-Aldrich) was added to high viscosity medium (HiVis), whereas the same volume of ultrapure water was added to low viscosity medium (LoVis). About,  $2 \mu\text{M}$  ethidium homodimer 1 (Life Technologies) was added to stain dead cells if indicated. Chip loading was performed as previously described [5]. Chips were incubated in a  $37^\circ\text{C}$  humidified incubator supplemented with 5%  $\text{CO}_2$ . All wells on chip were imaged under  $10\times$  objective in the channels of

brightfield, GFP and RFP on Life Technologies EVOS FL Imaging System at 0 and 24 h post-treatment, respectively. Absolute cell numbers in each well were counted to obtain total cells, where GFP-positive cells were considered Nalm6 cancer cells and GFP-negative cells were considered CAR-T cells; ethidium homodimer 1-positive cells indicated dead cells.

### Bioimaging assay

One polydimethylsiloxane (PDMS) well was fabricated at the center of a 35-mm cell culture dish by mixing 1:10 (w/w) PDMS catalyst: substrate (Silmore) followed by incubation at  $65^\circ\text{C}$  overnight. Fabricated dishes were kept in a sealed box at room temperature until use.

$1.0 \times 10^6$  CAR-T cells and  $2.0 \times 10^5$  Nalm6 cells were loaded into the PDMS well of a fabricated dish, followed by addition of 1.5 mL activation medium to fill the dish. Next, the dish was calibrated in the  $37^\circ\text{C}$  humidified chamber supplemented with 5%  $\text{CO}_2$  of Nikon Biostation IM-Q Imaging System for 30 min. Time-lapse imaging at  $10\times$  or  $20\times$  magnification was performed at 2–10-min intervals for no more than 24 h. Raw image sequences were exported as TIFF.

### Data analysis and visualization

All images were initially imported as image stacks into ImageJ v1.52e, followed by brightness and contrast adjustment, cropping, trimming, and image stack reduction to obtain the final image sequence or montage as depicted. Video clips were edited by CyberLink PowerDirector 17 to include annotations, followed by export to MPEG4. All graphs and plots were drawn by GraphPad Prism v5.1 or using *ggplot* in R v3.3.2. Statistical analysis was performed as indicated in Data S1 or in corresponding figure legend(s).

Figures were prepared by assembling images, graphs and plots using Adobe® Illustrator® CS6 v16.0.0.

## RESULTS

We established our model using anti-CD19 CAR-T cells (Fig. 1a). In our assay, CAR-T and Nalm6 cells were initially mixed in activation medium at a cell number ratio of 5:1, followed by chip loading and imaging before and after incubation for 24 h (Fig. 1b). Addition of 1% methyl cellulose, which increased fluid viscosity and facilitated adherent cell suspension on chip [5], was conducted to observe cell behavior under different fluid viscosity conditions. Eventually, the cells were identified, classified and counted before and after incubation, followed by calculation of cell viability and CAR-T:Nalm6 (CT:N6) ratio in each droplet (Fig. 1c).

### Validation of chip performance

Because cell–cell interaction has never been studied on our chip, we initially verified the performance of our droplet microfluidic chip for the quantitative measurement of CAR-T cytotoxicity. Firstly, we validated the cell number distribution frequency in each droplet. In consistence to our one-cell type model [5], the number of each cell type in each droplet displayed Poisson distribution in LoVis without additive and in HiVis containing methyl cellulose, respectively (Fig. 2a and b). Notably, no well contained 0 CAR-T cells under both fluid conditions, implying that no Nalm6 cell had nil probability to interact with CAR-T cells. Secondly, the total number of the two cell types in each droplet displayed Poisson distribution under both fluid conditions (Fig. 2c). Thirdly, the CT:N6 ratio in each droplet displayed Gaussian distribution under both fluid conditions (Fig. 2d). Cell number and ratio distribution patterns were conserved in Batch 2 CAR-T cells (Fig. S2 available at ABT Online). Collectively, these data confirmed the statistical patterns of cell distribution in the two-cell type model.

### Analysis of CAR-T cytotoxicity on chip

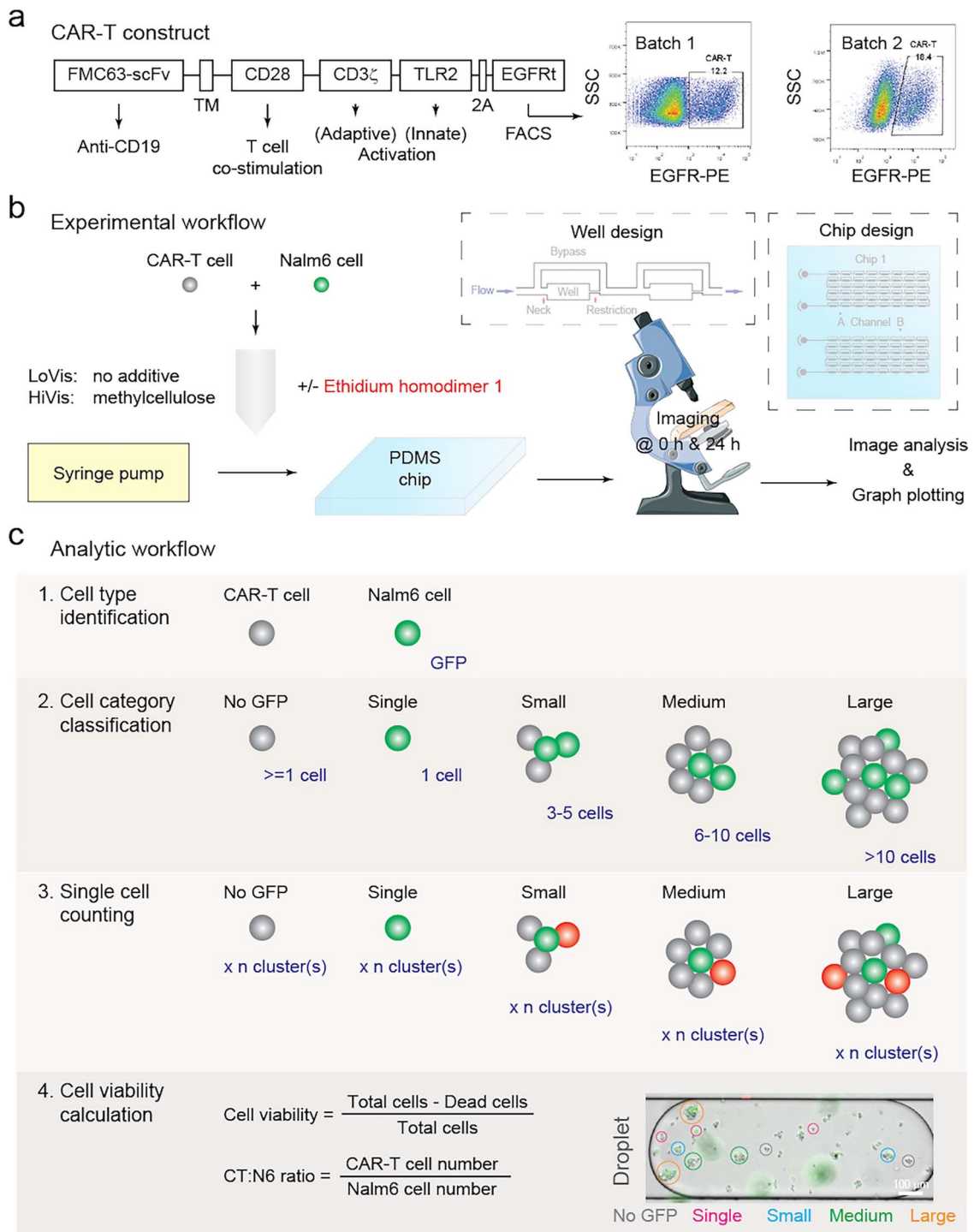
After confirming chip performance, we started to analyze CAR-T cytotoxicity on chip.

Firstly, we analyzed the cytotoxicity of Batch 1 CAR-T cells against Nalm6 cells. Taking EH1-labelled cells into account, results showed that the overall droplet cell viability of Nalm6 cells was 53.6 and 100.7% in LoVis and HiVis, respectively (Fig. 3a). To exploit our assay to its full potential, we dissected the cell killing paradigm under each fluid condition after classifying cells into arbitrary cell categories (Fig. 1c). Analysis of Nalm6 occupancy depicted that Nalm6 cells were evenly distributed in all cell categories without significant difference under both fluid conditions (Table S1 available at ABT Online). However, significant CAR-T cytotoxicity occurred in single ( $P = 9.5e-11$ ), small ( $P = 5.0e-6$ ) and medium clusters ( $P = 1.5e-3$ ) but not in large clusters ( $P = 4.7e-1$ ) in LoVis (Fig. 3b),

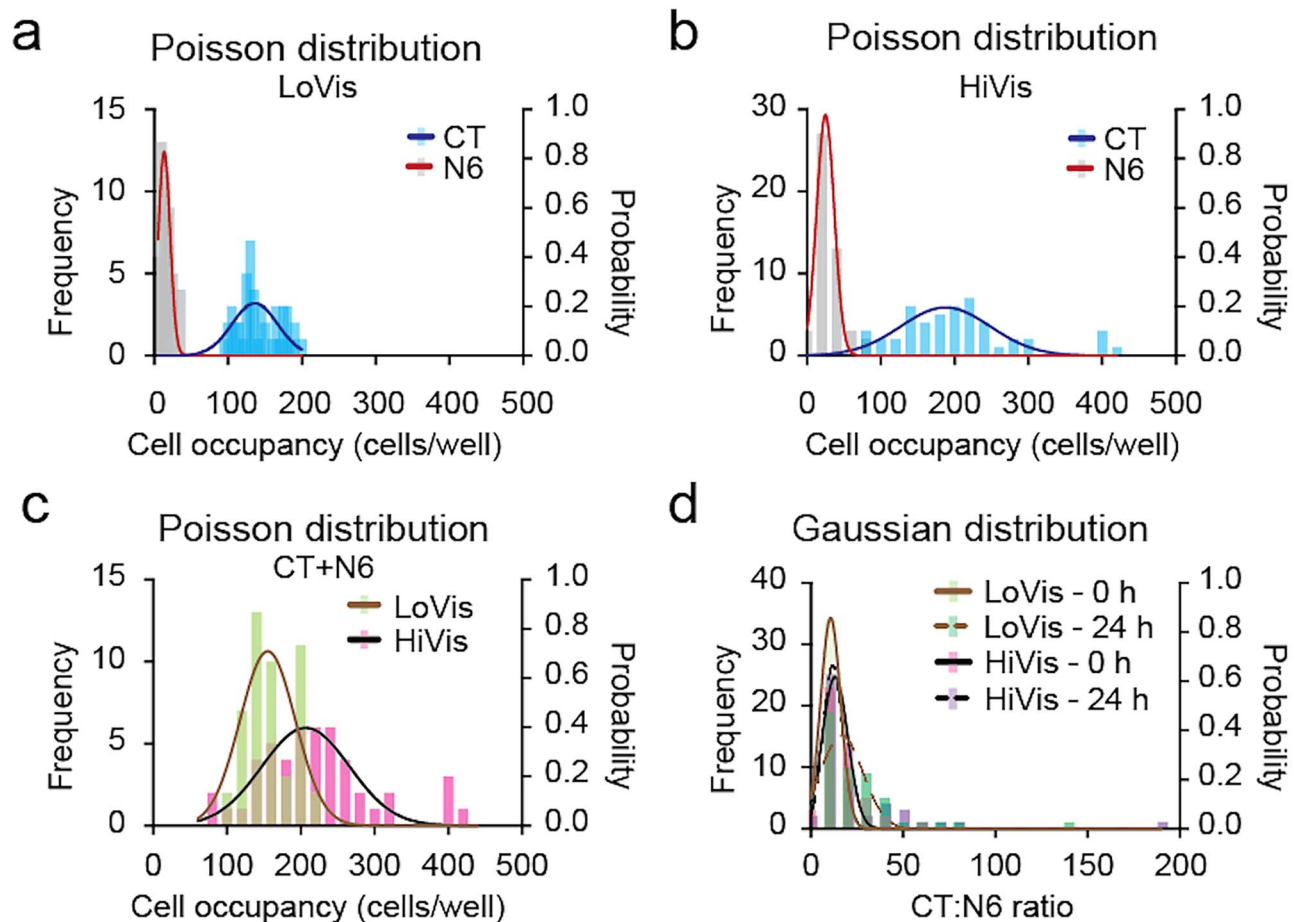
whereas CAR-T cytotoxicity was only significant in single ( $P = 1.2e-5$ ) and small clusters ( $P = 6.7e-7$ ) in HiVis (Fig. 3c), suggesting that CAR-T cytotoxicity diminished in larger clusters as compared to smaller ones.

To further dissect the mechanism, we summarized CAR-T cytotoxicity by the well ratio and the cell ratio that are correlated to Nalm6 cell number variance in droplets. The well ratio, expressed as the number of wells with decreasing Nalm6 cells to that of increasing Nalm6 cells, suggested of CAR-T cytotoxicity in a population of droplets. Alternatively, the cell ratio, expressed as the number of decreased Nalm6 cells divided by the number of increased Nalm6 cells, suggested of the cytotoxic activity of CAR-T cells as a population. Analysis of CAR-T cytotoxicity in different cell categories showed that single cells (well ratio = 21.0, cell ratio = 21.3) demonstrated exquisite CAR-T cytotoxicity in LoVis (Fig. 3d and f), whereas both single cells (well ratio = 4.7, cell ratio = 8.0) and small clusters (well ratio = 6.7, cell ratio = 14.4) depicted good CAR-T cytotoxicity in HiVis (Fig. 3e and g). Conversely, large clusters showed poor CAR-T cytotoxicity under both fluid conditions (Fig. 3d–g).

Next, we tested if Nalm6 occupancy or CAR-T cytotoxicity could be correlated to well position on chip, which is critical to multi-drug loading [5]. First, no apparent distribution of Nalm6 occupancy was observed along the wells on chip under both fluid conditions (Fig. 3h and i). Second, two-way ANOVA analysis of Nalm6 occupancy in different cell categories against well position showed that there was insignificant difference between Nalm6 occupancy and well position in all cell categories in LoVis ( $P = 0.291$ ), whereas minor correlation arisen from extreme Nalm6 cell numbers as demonstrated by Tukey's honestly significant difference (HSD) test was observed in HiVis ( $P = 0.047$ ) (Table S2 available at ABT Online). Therefore, we deduced that Nalm6 occupancy in droplets and in clusters are both uncorrelated to well position. Third, two-way ANOVA analysis of the difference of Nalm6 occupancy between 0 and 24 h post-treatment against well position showed that there was no significant correlation between CAR-T cytotoxicity and well position in LoVis ( $P = 0.941$ ) and HiVis ( $P = 0.964$ ), respectively (Table S3 available at ABT Online). In contrast, variant CAR-T cytotoxicity among different cell categories led to significant difference of Nalm6 occupancy after 24 h treatment in HiVis ( $P < 0.0001$ ) but not in LoVis ( $P = 0.186$ ) (Table S3 available at ABT Online). This observation was consistent to the disparity between the ratiometric parameters of the two fluid conditions that CAR-T cells as a population were still actively killing Nalm6 cells in large clusters in LoVis, whereas Nalm6 cell proliferation dominated over CAR-T cytotoxicity in large clusters in HiVis (Fig. 3d–g). Collectively, these data suggested of the lack of global modulation factor(s) that coherently affect CAR-T cytotoxicity within one droplet. This suggested that the droplet merely defines the spatial constraint of cell–cell interaction, whereas the cell clusters in each droplet provide microreaction centers for CAR-T cytotoxic activity.



**Figure 1.** Paradigm of this study. (a) CAR-T construct design and FACS characterization. CAR was constructed with the CD19-targeting FMC63-scFv domain (FMC63-sFv), the CD28 transmembrane domain (TM), the CD28 endodomain (CD28), CD3 $\zeta$  signaling domain (CD3 $\zeta$ ), the Toll/interleukin-1 receptor domain of Toll-like receptor 2 (TLR2), the 2A self-cleaving peptide (2A) and the extracellular and transmembrane domains of truncated human epidermal growth factor receptor (EGFRt). CAR-T cells were purified 12 h post-transduction using anti-human EGFR antibody and side scattering (SSC); the percentage of CAR-T cells in the population of all transduced T cells was indicated. (b) Experimental workflow of this study. CAR-T and Nalm6 cancer cells were mixed and loaded on chip, followed by 24 h incubation and imaging. The design of the chip and its wells was shown in the insets. (c) Analytic workflow of this study. Nalm6 cells were initially identified by GFP fluorescence, followed by cell category classification, cell counting and viability calculation. Cell category classification was arbitrary as shown in the inset. Dead cells were indicated by the red fluorescent dye ethidium homodimer 1 (EH1); for EH1-free assays, cell viability was calculated by the difference of the number of Nalm6 cells before and after treatment.



**Figure 2.** Cell occupancy analysis of Batch 1 CAR-T cells. (a–c) Poisson distribution of Batch 1 CAR-T and Nalm6 cells on chip. Frequency distribution analysis of CAR-T (CT) and Nalm6 (N6) cells in low-viscosity medium (LoVis) and high-viscosity medium (HiVis) on chip at 0 h was performed. Distribution frequency and probability was plotted against cell occupancy in all wells on chip; each column represented one data grid automatically classified by GraphPad Prism; the lines indicated Poisson distribution curves generated by GraphPad Prism. (d) Gaussian distribution of CT:N6 ratio on chip. Frequency distribution analysis of CT:N6 ratio under both fluid conditions before and after treatment was performed. Distribution frequency and probability was plotted against CT:N6 ratio in all wells on chip; each column represented one data grid automatically classified by GraphPad Prism; the lines indicated Gaussian distribution curves generated by GraphPad Prism.

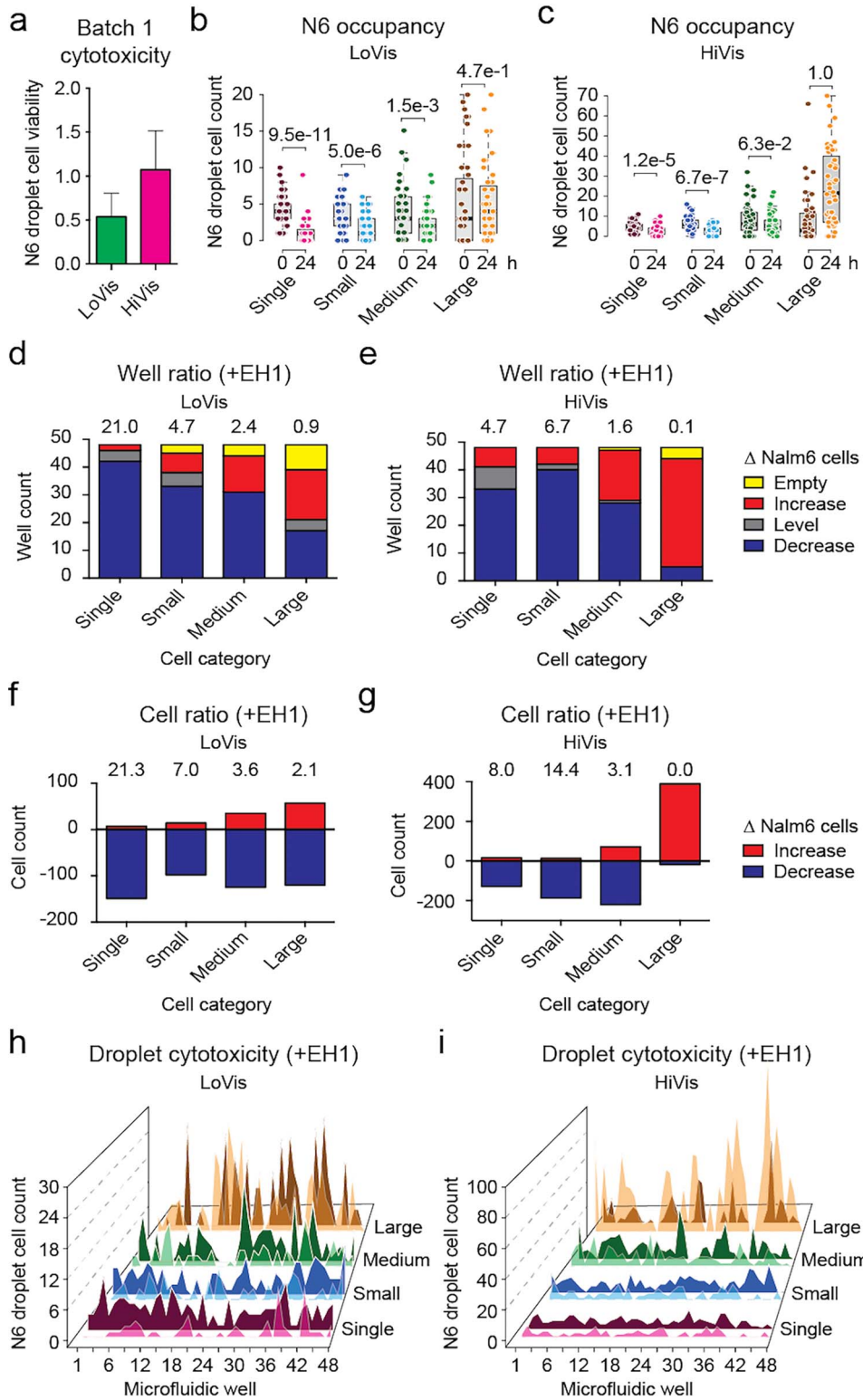
Hence, this method enables robust assessment CAR-T cytotoxicity and dissection of mechanism of action via phenotype analysis *in vitro*.

### Comparison between analysis with and without EH1 labelling

Ethidium homodimer 1 (EH1) was used as a dead cell indicator dye in our previous study [5]. Although EH1 exhibited unapparent cytotoxicity in primary tumor dissociated cells in the investigated time frame [5], we tested if analysis without consideration of EH1 labelling influenced data interpretation to explore the feasibility of label-free cytotoxicity assessment.

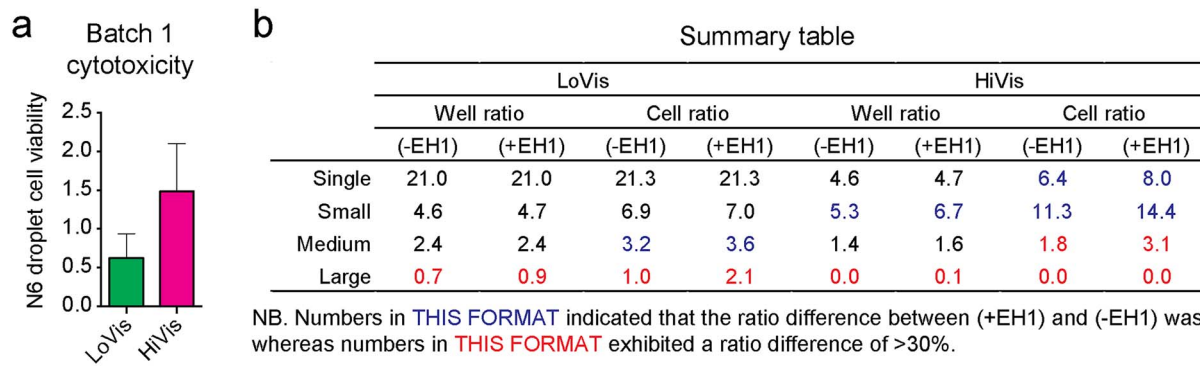
In comparison to analysis with EH1 labelling, Nalm6 droplet cell viability was slightly higher without consideration of EH1 labelling, measured as 62.4 and 148.5% for the two fluid conditions, respectively (Fig. 4a). This phenomenon is reasonable because EH1 indicates cells with

compromised membrane integrity prior to death, so these cells are counted as viable if EH1 labelling is neglected. Concordantly, comparing Nalm6 droplet cell viability with or without consideration of EH1 labelling demonstrated that the difference was statistically insignificant in LoVis ( $P = 1.4e-20$ ) and HiVis ( $P = 4.1e-19$ ) (Table S4 available at ABT Online). Similarly, comparison between Nalm6 occupancy in different cell categories between the two analytic methods showed that there was insignificant difference at 0 and 24 h under both fluid conditions (Table S5 available at ABT Online). In concordance, the well ratio and cell ratio followed similar patterns but lower absolute values in analysis without EH1 as compared to analysis with EH1 (Fig. 4b). Hence, we concluded that EH1 labelling is dispensable for assessment of CAR-T cytotoxicity using our droplet microfluidic chip. In multi-drug assessment, we rationalize that drug ranking would remain the same on identical criteria. This conclusion thus implies that label-free assessment solely by cell counting before and after treatment is feasible.



**Figure 3.** Cytotoxicity assessment of Batch 1 CAR-T cells. (a) Overall cytotoxicity of Batch 1 CAR-T cells under different fluid conditions. Mean Nalm6 droplet cell viability was plotted against LoVis and HiVis, respectively; the error bars denoted standard deviation of all replicate wells. (b and c) Analysis of Nalm6 occupancy before and after treatment on chip. Analysis of Nalm6 occupancy in different cell categories at 0 and 24 h post-treatment on chip was performed. Nalm6 droplet cell count was plotted against cell category and treatment time; each dot represented one well; the thick black line, grey box and dotted error bars of the box plot indicated median Nalm6 droplet cell count, interquartile range between  $-1\sigma$  and  $1\sigma$ , and range of Nalm6 droplet cell count of all wells, respectively; the numbers indicated *P*-values of two-tailed *t* test. (d and e) Well ratio analysis of CAR-T cytotoxicity under





**Figure 4.** Cytotoxicity assessment of Batch 1 CAR-T cells without consideration of EH1 labelling. (a) Overall cytotoxicity of Batch 1 CAR-T cells under different fluid conditions. Mean Nalm6 droplet cell viability was plotted against LoVis and HiVis, respectively; the error bars denoted standard deviation of the mean. (b) Comparison of well ratio and cell ratio with and without consideration of EH1 labelling under different fluid conditions. The well ratio and cell ratio of different cell categories obtained with and without consideration of EH1 labelling in LoVis and HiVis was summarized.

### Application on quality control of different batches of CAR-T cells

Given that label-free assessment is feasible, we tested the cytotoxicity of Batch 2 CAR-T cells without EH1 addition. First, although Batch 2 CAR-T cells were reasonably active in luciferase assay as compared to Batch 1 CAR-T cells (Fig. S1 available at ABT Online), they showed significantly lower cytotoxicity (Fig. 5a) as compared to Batch 1 CAR-T cells on chip (Fig. 3a). Similarly, CAR-T cytotoxicity became insignificant in all cell categories under both fluid conditions (Fig. 5b and c), reminiscent of the poor cytotoxic activity of Batch 2 CAR-T cells. Second, Batch 2 CAR-T cells demonstrated similar cytotoxic patterns in different cell categories (Fig. 5d–g) as compared to Batch 1 CAR-T cells (Fig. 3d–g), suggesting that the mechanism of action is unaffected by cytotoxic activity. Third, Nalm6 occupancy was also evenly distributed along all wells on chip (Fig. 5h and i). Taken together, the well ratio and cell ratio reflected the variant cytotoxic activity and conserved mechanism of action between Batch 1 and Batch 2 CAR-T cells in this study. Hence, we interpreted the discrepancy of cytotoxic activity of Batch 2 CAR-T cells as a result of artefactual potency in the luciferase assay. Our results suggested that our microfluidic chip assay can be applied to quality control between different batches of CAR-T cells.

### Assessment of CAR-T cell expansion

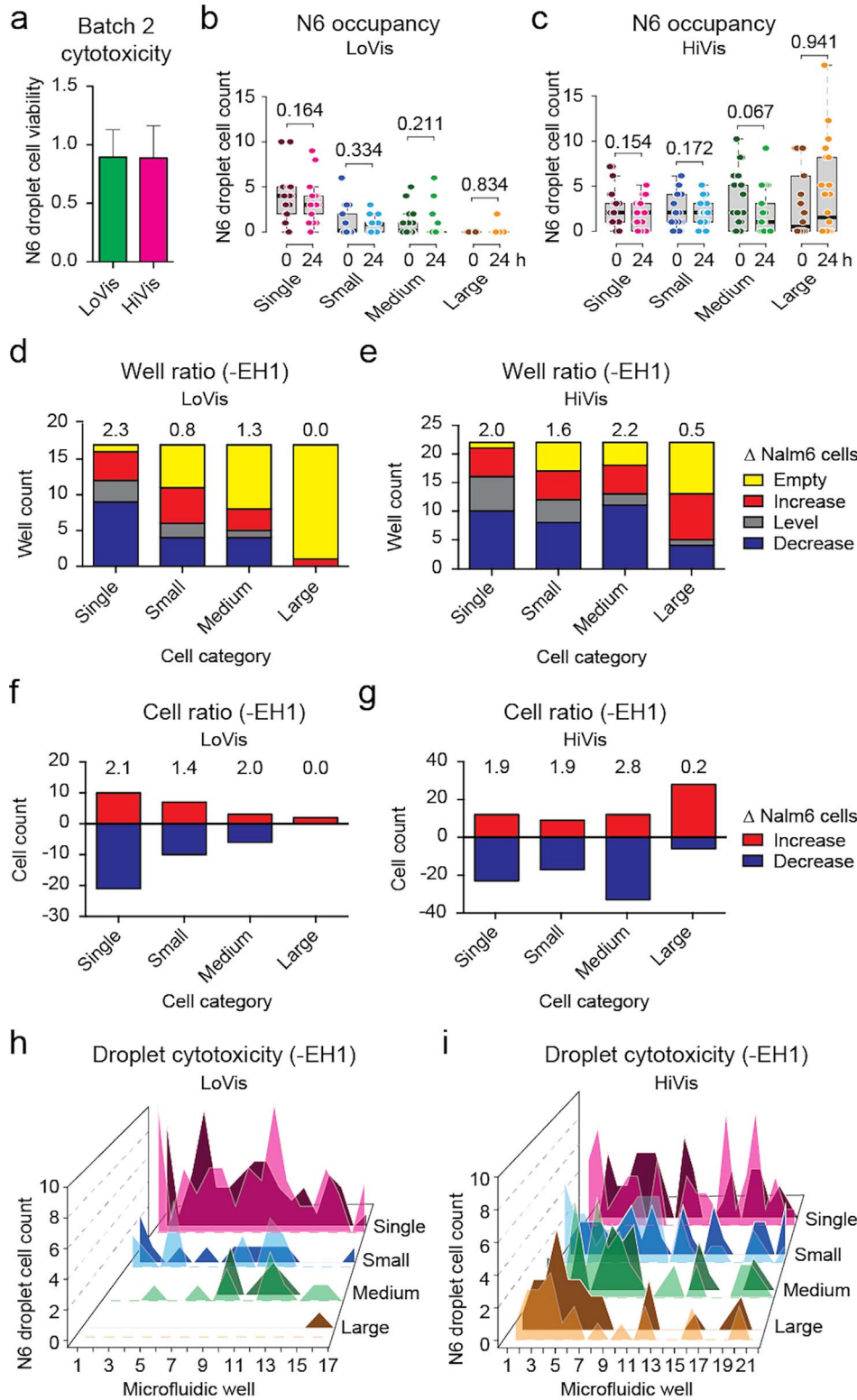
CAR-T cell expansion is an important feature of efficient CAR-T cytotoxicity [15, 16], but cannot be achieved in one assay using current protocols [17, 18]. For instance, Batch 1 CAR-T cells expanded in LoVis (mean = 24.1, median = 18.5) and diminished in HiVis (mean = -73.6, median = -73.5) with significant difference between fluid

conditions ( $P < 0.0001$ ) (Table S6 available at ABT Online). However, Batch 2 CAR-T cells diminished in LoVis (mean = -3.2, median = -2.0) and HiVis (mean = -6.8, median = -4.5) without significant difference between fluid conditions ( $P = 0.400$ ) (Table S7 available at ABT Online). Hence, expansion of Batch 1 CAR-T cells was significant in LoVis ( $P = 2.24e-6$ ) but not in HiVis ( $P = 1.00$ ) (Fig. 6a), in accordance to the measurement of Nalm6 cell reduction that reflected CAR-T cytotoxicity under these fluid conditions (Fig. 3a). Consistently, Batch 2 CAR-T cell expansion (Fig. 6b) was also reflective of its cytotoxic activity (Fig. 5a). Therefore, our method not only enabled assessment of CAR-T cytotoxicity by Nalm6 cell reduction, but also illustrated CAR-T cell expansion as supporting evidence. Although in vitro CAR-T cell expansion could not guarantee expansion in vivo, this method discriminates CAR-T cytotoxicity into the facets of cancer cell reduction and CAR-T cell expansion, which potentially facilitates in-depth investigation of CAR-T cytotoxic activity by the reductionist approach.

### Bioimaging study of CAR-T cells in action

Lastly, time-lapse imaging of CAR-T cells in action was conducted to dissect the paradigm of CAR-T cell killing in order to understand our observed mechanism of action. CAR-T and Nalm6 cells were mixed and loaded in a small hole in polydimethylsiloxane (PDMS) fabricated on a 35-mm petri dish (Fig. S3a available at ABT Online) to reduce sample input and cope with microscope settings. Culture medium on top of the PDMS maintained the volume to avoid drying out from evaporation. Cell movement caused by natural heat convection in the 37°C humidified incubator and wetting between the unbound surfaces of PDMS

different fluid conditions. Well ratio was plotted against cell categories; each column indicated the number of wells containing no, increasing, same or decreasing number of Nalm6 cells; the numbers indicated the well ratio of the specified dataset. (f and g) Cell ratio analysis of CAR-T cytotoxicity under different fluid conditions. Cell ratio was plotted against cell categories; each column indicated the number of Nalm6 cells that increased or decreased in sum; the numbers indicated the cell ratio of the specified dataset. (h and i) Hill plot of Nalm6 occupancy along all wells on chip. Nalm6 droplet cell count was plotted against consecutive wells on chip; each peak indicated the number of Nalm6 cells in the specified droplet; dark-colored shade indicated the cell number before treatment, whereas light-colored shade indicated the cell number after treatment.



**Figure 5.** Cytotoxicity assessment of Batch 2 CAR-T cells. (a) Overall cytotoxicity of Batch 2 CAR-T cells under different fluid conditions. Mean Nalm6 droplet cell viability was plotted against LoVis and HiVis, respectively; the error bars denoted standard deviation of all replicate wells. (b and c) Analysis of Nalm6 occupancy before and after treatment on chip. Analysis of Nalm6 occupancy in different cell categories before and after treatment on chip was performed. Nalm6 droplet cell count was plotted against cell category and treatment time; each dot represented one well; the thick black line, grey box and dotted error bars of the box plot indicated median Nalm6 droplet cell count, interquartile range between  $-1\sigma$  and  $1\sigma$ , and range of all wells, respectively; the numbers indicated *P*-values of two-tailed *t* test. (d and e) Well ratio analysis of CAR-T cytotoxicity under different fluid conditions.

and culture dish was amplified in the small volume, resulting in a mean flow rate of  $1.4 \mu\text{m}/\text{min}$  (Fig. S3b), which was much slower than naive T cells moving at an average speed of  $10\text{--}15 \mu\text{m}/\text{min}$  on dish [19] or at a peak velocity of  $40 \mu\text{m}/\text{min}$  in lymph nodes [20]. Although the cell movement in our assay was much slower than the minimum blood flow of  $90 \text{ cm}/\text{min}$  in human fingers [21] or  $60 \mu\text{m}/\text{min}$  in lymph vessels [22], this flow rate was sufficient to help us distinguish whether CAR-T cells were hunters or gatherers. Unlike cytotoxic T cells [19, 20] and CAR-T cells [23] that moved on solid substrates, CAR-T cells suspended in fluid medium was carried by bulk flow and caught their prey using cellular protrusions that constantly emerged in active cells (Movies S1 and S2 available at ABT Online). Alternatively, active cell migration on dish by amoeboid locomotion was also observed (Movie S2 available at ABT Online), suggesting that CAR-T cells are predominantly gatherers in fluid, but also act as hunters on solid substrate. Regardless of the predation mode, the catches were swift and active cell–cell interaction continued along the bulk flow (Movies S1 and S2 available at ABT Online).

#### Image montages were extracted from the movies for detailed analysis of the process of CAR-T killing

Scanning referred to the process of CAR-T cells searching for their targets. Active CAR-T cells constantly triggered cellular protrusions in all directions (Fig. 7a), hinting of T cell resetting [24] and serial triggering [25]. Bypassing cells were scanned randomly and rapidly, whereas the suspect was caught swiftly (Movies S1 and S2 available at ABT Online). The swift catch suggested of the involvement of high-affinity ligand–receptor interaction, which was assumed to involve the antigen–antibody pair of CD19-FMC63-scFv in our case, with a reported  $\text{IC}_{50}$  of  $15.6 \text{ nM}$  [26]. Once a prey was caught, the CAR-T cell would attach to its prey via its cellular protrusion(s) (Fig. 7a). If the prey was considered a non-target, the CAR-T cell would release it (Fig. 7a), suggesting that proofreading also took place in vitro.

Processing of a prey to distinguish between target and non-target cell is critical for immune homeostasis. During processing, spinning of the prey around the CAR-T cell was observed (Fig. 7b). However, this phenomenon could be interpreted in two ways: (a) attachment of the CAR-T cell to its prey induced a momentum that made the two cells spun together or (b) the CAR-T cell remained stationary, and pulled its prey to rotate around itself by alternating surface adhesion (Fig. S3c available at ABT Online), which might involve cytoskeletal rearrangement [27]. In scenario (a), spinning was simply a consequence of physical momentum and had no biological implication. On the contrary, scenario (b) suggested of surface receptor

scanning during predator–prey interplay, which might involve autoimmunity prevention and/or co-stimulatory signal activation. A similar processing phenomenon was observed in Jurkat cells on chip (data not shown) and in CAR-T cells in vivo [23], but not in other cell types that we investigated (data not shown). Hence, we are prone to believe that surface receptor scanning occurred, forming immunological synapses that developed into kinapses [19] to activate CAR-T cells. Nevertheless, identification of the underlying mechanism requires ultra-fast high-resolution imaging of actin dynamics, which had not been successful. Contrariwise, direct killing without spinning was also observed (Fig. S3d available at ABT Online). Nevertheless, processing with or without spinning consumed more than 1 h, and in both batches of CAR-T cells in this study, suggesting that the lengthy processing was not correlated to cytotoxic activity. In stark contrast, CAR-T cells took approximately 25 min to kill its target in bone marrow [23], whereas antigen presentation by B cells in vitro [28] or dendritic cells in vivo [20] consumed less than 1 h. Thus, it remained elusive if incorporation of three co-stimulatory receptors CD28, CD3 $\zeta$  and TLR2 (Fig. 1a) in our CAR-T cells extended the processing time.

After confirming the target, killing would take place where the prey would burst in necrosis-like cell death within 2 h (Fig. 7c). However, the dead cell would not be released until a new prey was caught (Fig. 7d). Nevertheless, cell release completed within 30 min (Fig. 7d). The stringent adhesion of CAR-T cells to its victim until encountering a new prey and the short release time afterwards suggested that the turnover time of CAR-T cells relied on the frequency of predator–prey interaction, at least in vitro. This observation supports our quantitative on-chip analysis that CAR-T cytotoxicity dropped in large clusters and in HiVis, which conferred to micro- and macroscale cellular immobility, respectively. Additionally, our observation of active CAR-T killing in large clusters in LoVis suggested that cell motility overcame microscale cellular immobility in extended cell aggregates. In support of our observation, CAR modification to reduce off-rates was shown to increase cytotoxicity [29].

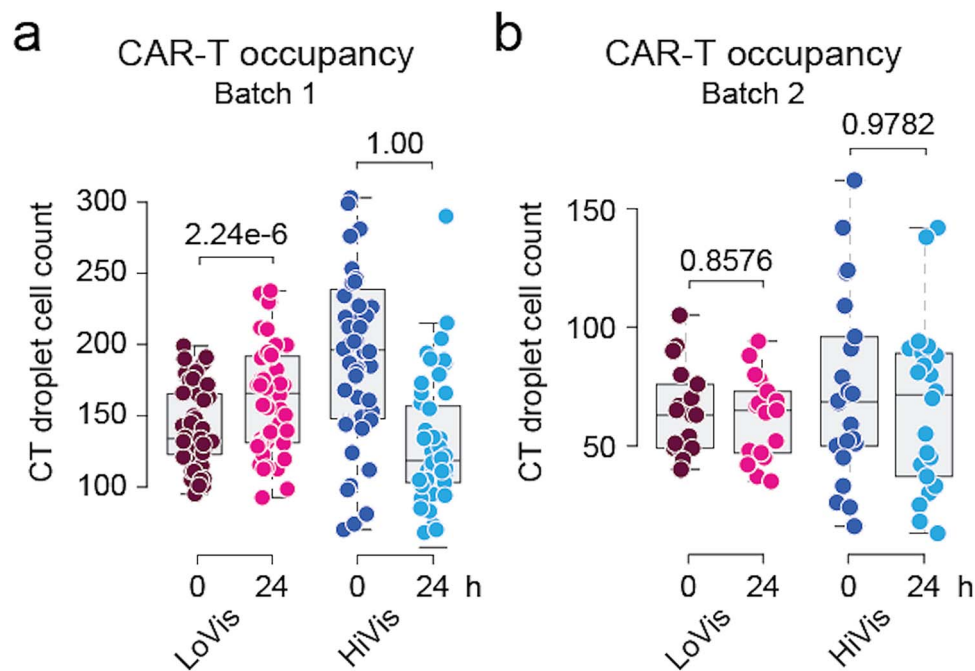
To summarize, the procedures of CAR-T cytotoxicity involved four steps: (1) scanning of prey to identify its target, followed by release of prey if mistaken; (2) processing of prey to activate cytotoxic program of CAR-T cells; (3) killing the prey by necrosis-like cell death and (4) release of the dead cell after a new prey was caught (Fig. 7e).

#### CT:N6 ratio and CAR-T cytotoxicity

Another interesting observation in this study is the dilemma between CAR-T cytotoxicity and CT:N6 ratio on plate and on chip. Although luciferase assay depicted positive correlation between CT:N6 ratio and CAR-T cytotoxicity

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Well ratio was plotted against cell categories; each column indicated the number of wells containing no, increasing, same or decreasing number of Nalm6 cells; the numbers indicated the well ratio of the specified dataset. (f and g) Cell ratio analysis of CAR-T cytotoxicity under different fluid conditions. Cell ratio was plotted against cell categories; each column indicated the number of Nalm6 cells that increased or decreased in sum; the numbers indicated the cell ratio of the specified dataset. (h and i) Hill plot of Nalm6 occupancy along all wells on chip. Nalm6 droplet cell count was plotted against consecutive wells on chip; each peak indicated the number of Nalm6 cells in the specified droplet; dark-colored shade indicated the cell number before treatment, whereas light-colored shade indicated the cell number after treatment.



**Figure 6.** CAR-T cell expansion analysis. (a and b) Analysis of CAR-T occupancy before and after treatment on chip. Analysis of CAR-T occupancy before and after treatment on chip was performed. CAR-T droplet cell count was plotted against treatment time; each dot represented one well; the thick black line, grey box and dotted error bars of the box plot indicated median CAR-T droplet cell count, interquartile range between  $-1\sigma$  and  $1\sigma$ , and range of all wells, respectively; the numbers indicated *P*-values of one-tailed *t* test.

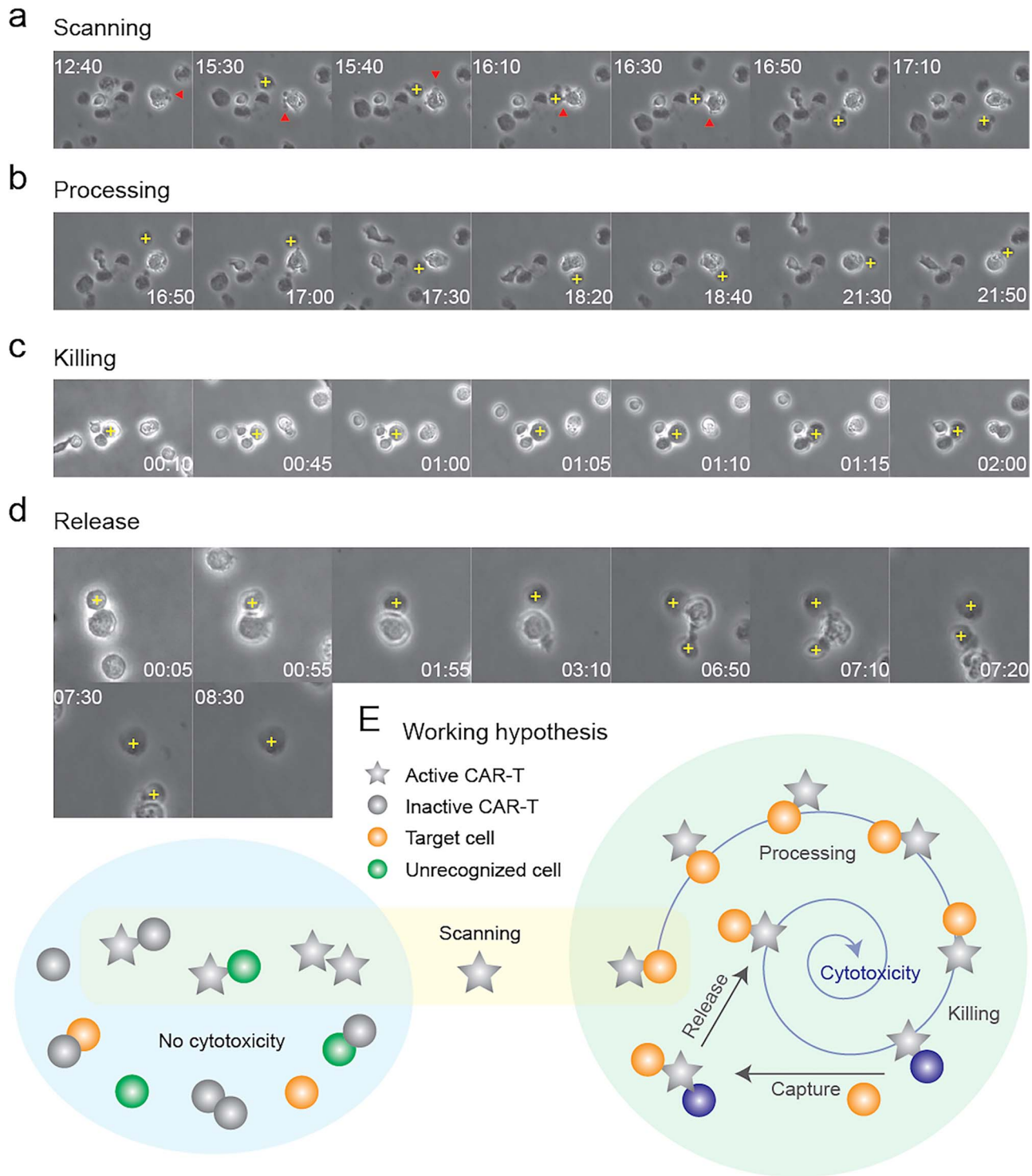
on plate (Fig. S1 available at ABT Online), on-chip screening showed negative correlation in Batch 1 ( $R = 0.3541$ ,  $P = 0.0136$ ) and Batch 2 ( $R = 0.2435$ ,  $P = 0.0441$ ) CAR-T cells in LoVis (Fig. S4a and c available at ABT Online). No correlation between CT:N6 ratio and CAR-T cytotoxicity was observed in HiVis in Batch 1 ( $R = -0.1250$ ,  $P = 0.3973$ ) and Batch 2 ( $R = 0.0392$ ,  $P = 0.3374$ ) CAR-T cells in HiVis (Fig. S4b and d available at ABT Online), in concordance to the observed poor cytotoxic activity under this fluid condition. Initially, we postulated that exponential decay of bioluminescence exaggerated the number of dying cells on plate. After that, comparison between label-free analysis and analysis considering EH1-labelled cells in the same dataset showed that absolute cell number counting was less susceptible to signal fluctuation as compared to labelled cells. Lastly, our observation of intensive bypassing cell scanning by CAR-T cells as gatherers suggested that increasing CT:N6 ratio in a confined volume of the droplet will reduce the probability of Nalm6 cell encounters. Taken together, we hypothesized that these three factors constituted to the discrepancy of the correlation between CT:N6 ratio and CAR-T cytotoxicity using different assessment methods. Nonetheless, the bulk droplet CT:N6 ratio becomes less meaningful on chip when the mechanism of action could be evaluated via phenotype analysis.

## DISCUSSION

In this study, we introduced a novel analytic method to assess CAR-T cytotoxicity *in vitro*. Significant improvements were made to our previous assay [5]. Specifically, we replaced the parameters of mean droplet

cell viability and range of droplet cell viability with two ratiometric parameters, namely the cell ratio and well ratio, respectively. The virtue of using ratiometric parameters is to eliminate the impact of different sample size across replicate wells to robustly evaluate CAR-T cytotoxicity as a population and in a population. This also unifies the scale to dissect the mechanism of action among different phenotypes, e.g. CAR-T cytotoxicity in different cell categories. Phenotype analysis provides unique insight into biological studies. Mechanistically, our results showed that high fluid viscosity and formation of larger clusters impedes CAR-T cytotoxicity, which confer to cellular immobility on the macro- and microscale, respectively. However, given the fact that CAR-T cells were still actively killing Nalm6 cells in large clusters in LoVis, we deduced that cell motility could overcome microscale cellular immobility. Notably, Nalm6 cluster shuffling between categories was anticipated but could not be quantified under current circumstances. For instance, the Nalm6 cells increased in large clusters at 24 h post-treatment in LoVis in Batch 2 CAR-T cells probably came from other cell categories because cells could not appear from none. However, the overall unchanged distribution of Nalm6 occupancy among categories at 24 h post-treatment ruled out massive, unidirectional cluster shuffling, if any had occurred.

On the other hand, Nalm6 occupancy among different cell categories was more evenly distributed in Batch 1 CAR-T cells as compared to Batch 2 CAR-T cells in LoVis upon chip loading. This observation raised the discrepancy that active CAR-T cells are prone to aggregates whereas large clusters impede CAR-T cytotoxicity. To explain this



**Figure 7.** CAR-T killing paradigm. (a–d) Bioimaging study of CAR-T killing. CAR-T cells were mixed with Nalm6 cells for phase contrast imaging under 20× objective on Nikon Biostation. Sequential images of CAR-T cells undergoing the processes of scanning, processing, killing and release was composed as a montage by ImageJ. A cross indicated target cell; arrows indicated filopodia. (e) Working hypothesis of CAR-T killing. Active CAR-T cells scan for prey randomly, followed by processing, killing, capturing of a new prey and releasing the victim.

phenomenon, the possibility of cell aggregation in ambience due to experimental timing was first ruled out. Next, we sought to solve this issue by studying CAR-T cells in action. Time-lapse imaging showed that active cells rapidly

scanned prey, which confers to higher probability of cell cluster formation in the more active Batch 1 CAR-T cells. Furthermore, the rigorous catch-and-release of prey by CAR-T cells posits a higher chance of cluster formation

in the more active Batch 1 CAR-T cells, provided that the frequency of target cell encounters is conserved between batches due to similar loading cell densities.

Lastly, label-free cytotoxicity analysis is achieved in this assay by acquiring images before and after treatment. Additionally, dual time point acquisition accomplished discrimination of CAR-T cytotoxicity into two processes: (1) CAR-T killing of cancer cells and (2) CAR-T cell expansion. This feature will be enhanced by the virtue of defined solvent composition in *in vitro* assays, that is, to dissect CAR-T cytotoxic activity by varying cytokines and chemokines, etc. Moreover, generalization of our two-cell type model into multi-cell type model by diversification of fluorescence labeling of each cell type will facilitate the study of complex cell–cell interactions at ease. In addition, the frequency of data acquisition can be increased up to every 4 h under current circumstances, suggesting that phenotype-based outcomes other than cell death can be assessed using this method. Choice of appropriate reporter(s) not only enables phenomenal observations, but also provides mechanistic insight into the biological pathways under investigation. Nevertheless, the current assay is technically restricted to genetically engineered cells, unless novel cell labeling methods or cellular monitoring methods are applied. Another drawback of this method is the restriction to cells that are adaptable to suspension culture. A better understanding of the physical properties of tumor and biogels will be needed to establish *in vitro* assays for adherent cells [30, 31].

#### Improvements for future clinical application

The motive of developing this assay was to enable evidence-based clinical decision-making. However, we have not accomplished cell type identification to enable cytotoxicity test on primary cancer cells, unless CAR-T cells are clinically approved to contain a fluorescence label. Staining of CAR-T cells could potentially solve this problem, especially with the introduction of off-the-shelf CAR-T cells, which would potentially be more uniform than T cells extracted from human subjects. Alternatively, staining of primary cancer cells for cell type identification purposes may be feasible too, but the heterogeneous nature of primary cancers gives rise to uncertainty on the staining efficiency and cell viability of the cells. Other solutions include investigations of different imaging techniques together with assistance by artificial intelligence (AI).

Our chip assay possesses the virtues of small sample input, strong statistical power, cost-effectiveness, and flexible experimental setup that multi-well live cell imaging platforms do not possess. However, the small footprint of the chip and micrometer-sized wells simultaneously posits mechanical challenges to automatic image acquisition. This feature is further downplayed by the high throughput analysis of flow cytometers. Nevertheless, our chip assay outdoes flow cytometry by multi-timepoint analysis of the same cells. Indeed, automatic image acquisition is a realm awaiting improvement. In this regard, image stitching, mechanical stage improvement, AI-assisted boundary determination, droplet imaging by hydrodynamic focusing are being explored.

Last but not least, chip fabrication that enables both mass production of the microfluidic chips and automatic liquid handling will be another breakthrough needed for clinical application of this assay. Even though PDMS chips production by soft photolithography is relatively simple, high-quality mass production of PDMS chips is challenging. 3D printing of polymethyl methacrylate (PMMA) chips is an attractive alternative, but the architectural resolution will be compromised so that the chip design might be revised. Alternatively, etching of pre-fabricated indium–titanium oxide (ITO) chips on glass substrates is a relatively mature technique in the electronics field; these chips also provide more precise liquid handling by digital microfluidics. Consequently, advancement in material science and microfabrication might bring insight into novel design of microfluidic chips for this assay.

Hence, while the assay seems relatively simple to impose on a small lab scale, more research is needed to accomplish full automation of the entire process for clinical application.

#### CONCLUSION

We presented a novel droplet microfluidic assay for analyzing CAR-T cytotoxicity on the aspects of cancer cell reduction and CAR-T cell expansion, and provided insight into the mechanism of action via phenotype analysis. This method provided unprecedented opportunity to understand cell–cell interaction quantitatively on the single cell level. Consequently, this method can be generalized to apply to any cytotoxicity experiment provided that all cells are empirically distinguishable.

#### SUPPLEMENTARY DATA

Supplementary data are available at ABT Online.

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#### AUTHOR CONTRIBUTIONS

This project was conceived by A.H.W. through collaboration with P.L. A.H.W. designed the study and supervised J.K.W. and H.W. on experiments and bioinformatics analysis, respectively; P.L. supervised J.S. preparation and FACS characterization of CAR-T cells were performed by J.S.; the luciferase and chip assays were performed by J.K.W.; the bioinformatics analyses and data visualization were performed by H.W.; the bioimaging study was performed by A.H.W.; statistical analysis was performed by H.W. and A.H.W.; Y.J. provided the chip design; L.J. shared perspectives on the findings. Infrastructure for microfluidic chip fabrication and cell culture was provided by Y.J.

and C.D., respectively. J.K.W. was partially financially supported by C.D. All authors prepared and approved this manuscript.

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## CONFLICT OF INTEREST STATEMENT

A.H.W. received incubation funds from the University of Macau Development Foundation to setup the startup company AW Medical Company Limited.

## DATA AND MATERIALS AVAILABILITY

All data is available upon request from the corresponding authors.

## ETHICS AND CONSENT STATEMENT

Usage of primary human T cells in this study was approved by the Institutional Review Board of Guangzhou Institute of Biomedicine and Health, Chinese Academy of Sciences, under ethics approval no. GIBH-IRB07-2018024.

## ANIMAL RESEARCH STATEMENT

No animal was used in this study.

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