Robust and Repeatable Biofabrication of Bacteria-Mediated Drug Delivery Systems: Effect of Conjugation Chemistry, Assembly Process Parameters, and Nanoparticle Size

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October 25, 2021

Abstract

Bacteria-mediated drug delivery systems comprising nanotherapeutics conjugated onto bacteria synergistically augment the efficacy of both therapeutic modalities in cancer therapy. Nanocarriers preserve therapeutics’ bioavailability and reduce systemic toxicity, while bacteria selectively colonize the cancerous tissue, impart intrinsic and immune-mediated antitumor effects, and propel nanotherapeutics interstitially. The optimal bacteria-nanoparticle (NP) conjugates would carry the maximal NP load with minimal motility speed hindrance for effective interstitial distribution. Furthermore, a well-defined and repeatable NP attachment density distribution is crucial to determining these biohybrid systems’ efficacious dosage and robust performance. Herein, we utilized our Nanoscale Bacteria-Enabled Autonomous Delivery System (NanoBEADS) platform to investigate the effects of assembly process parameters of mixing method, volume, and duration on NP attachment density and repeatability. We also evaluated the effect of linkage chemistry and NP size on NP attachment density, viability, growth rate, and motility of NanoBEADS. We show that the linkage chemistry impacts NP attachment density while the self-assembly process parameters affect the repeatability and, to a lesser extent, attachment density. Lastly, the attachment density affects NanoBEADS’ growth rate and motility in an NP size-dependent manner. These findings will contribute to the development of scalable and repeatable bacteria-nanoparticle biohybrids for applications in drug delivery and beyond.

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ToC Figure
Bacteria-nanoparticle biohybrids enhance interstitial transport of nanomedicine via self-propulsion. Herein, we show the significant effect of linkage chemistry and assembly process parameters of mixing method, duration, and volume on the density and repeatability of nanoparticle attachment. We further report the effect of nanoparticle size and attachment density on the growth rate and motility of bacteria-nanoparticle conjugates.

Introduction

Biohybrid or cell-mediated drug delivery systems, also referred to as biohybrid microrobots, consist of nanocarriers conjugated with host cells, (Stephan et al., 2010) (Mooney et al., 2014) (Huang et al., 2015) (Villa et al., 2016) (Choi et al., 2007) (Roger et al., 2010) attenuated pathogens, (Akin et al., 2007) (Traore et al., 2014) (Suh et al., 2018b) or generally regarded as safe (GRAS) microorganisms, (Xie et al., 2017) which are harnessed as living machines for transport of therapeutic loads (for a recent comprehensive review, see ref (Bastos-Arrieta et al., 2018) (Schmidt et al., 2020)). In contrast to the traditional systemically administered therapeutics, bio-hybrid microrobotic systems for drug delivery are capable of active and targeted delivery using a variety of motility mechanisms (i.e., actuation for self-propulsion) and receptors (i.e., sensors) that enable the cells to process and respond to external signals from their environment, including other cells. The innate actuation and sensing mechanisms powered by chemical energy harvested from the environment provide a distinct advantage to biohybrid microrobots, compared to fully synthetic microrobotic systems that typically rely on external electrical, magnetic, optical, or acoustic sources of energy for controlled actuation. Thus, biohybrid microrobots have considerable potential for targeted delivery of drugs, genes, mRNA, proteins, imaging contrast agents, and radioactive seeds to specific target locations accessible vascularity, orally, or even interstitially. In particular, bacteria possess unique properties of high speed (up to ~50 body lengths per second) self-propulsion through blood, (Gekle, 2016) mucus, (Celli et al., 2009) and tissue, (Toley and Forbes, 2012) biased migration or taxis in response to a variety of stimuli (e.g., chemotaxis, (Adler, 1966)
aerotaxis, (Taylor et al., 1999) magnetotaxis, (Faivre and Schüler, 2008) phototaxis, (Bhya, 2004) (Taylor and Koshland, 1975) and pH-taxis (Kihara and Macnab, 1981), and can be genetically manipulated to produce attenuated or auxotrophic strains, (Clairmont et al., 2000) (Low et al., 1999) (Zhao et al., 2005) which support safe and selective colonization of bacteria in vivo. (Toso, 2002) (Heimann and Rosenberg, 2003) (Nemunaitis et al., 2003) (Le et al., 2012) (Roberts et al., 2014) (Schmitz-Winnenthal et al., 2018) (Le et al., 2015) (Basu et al., 2018) Altogether, the advantages of targeted accumulation, deep penetration through self-propulsion, and straightforward genetic manipulation, make bacteria an ideal candidate for targeted therapeutic delivery.

Bacteria-based bio-hybrid drug delivery systems are comprised of live bacteria, for sensing and controlled transport, and abiotic micro- or nano-particles as cargo. Construction of an effective bio-hybrid drug delivery system requires an attachment mechanism that is stable in vivo and is amenable to interstitial transport, yields sufficient and repeatable cargo attachment density for a predictable therapeutic outcome, and does not render the bacteria non-motile. Electrostatic interactions, (Behkam and Sitti, 2008) (van Loosdrecht et al., 1990) hydrophobic interactions, (van Loosdrecht et al., 1990) covalent binding, (Xie et al., 2017) (Felfoul et al., 2016) (Taherkhani et al., 2014) bioaffinity interactions, (Traore et al., 2014) (Kazmierczak et al., 2014) (Nguyen et al., 2016) (Alapan et al., 2018) antibody-antigen interactions, (Xu et al., 2012) or a combination thereof, (Akin et al., 2007) (Traore et al., 2014) (Alapan et al., 2018) (Kojima et al., 2012) have been used to attach nanoparticles (NP) to bacteria. Although various attachment methodologies have been explored, a systematic investigation of the effect of the conjugation chemistry and the assembly process parameters on the NP attachment density and repeatability has not been attempted before. Furthermore, the effect of NP load size and quantity on bacterial motility and growth is rarely explored. In this work, we used our previously developed bacteria-based bio-hybrid platform, known as Nanoscale Bacteria-Enabled Autonomous Drug Delivery System (NanoBEADS), (Traore et al., 2014) to investigate the aforementioned questions. Two linkage chemistries were separately utilized to attach poly(lactic-co-glycolic acid) (PLGA) NPs to the tumor-targeting S. Typhimurium VNP20009 cheY+ bacteria, as shown in Figure 2. The effect of assembly process parameters of mixing method, volume, and duration on the NP attachment density and repeatability was investigated. Subsequently, for the two best performing sets of assembly parameters, the effect of linkage chemistry and NP size on NP attachment density, viability, growth rate, and motility of NanoBEADS was studied. We found the linkage chemistry most significantly affected the NP attachment density. For each of the two binding mechanisms tested, the assembly process parameters also influenced NP attachment’s areal density and repeatability. Furthermore, the increase in the NP load-carrying capacity led to an increase in doubling time and a reduction in NanoBEADS motility speed in an NP size-dependent manner.
Figure 2: Construction of the Nanoscale Bacteria-Enabled Drug Delivery System (NanoBEADS). Schematic of the self-assembly process of two NanoBEADS variants- Antibody-Biotin-Streptavidin NanoBEADS (ABS NanoBEADS) and Biotin-Streptavidin NanoBEADS (BS NanoBEADS). The conjugation chemistry and assembly process parameters of mixing method, volume, and duration affect the density and repeatability of the nanoparticle attachment outcomes.

**Experimental Section/Methods**

*Bacteria preparation:* *Salmonella* Typhimurium VNP20009 cheY+ (Broadway et al., 2017) from a single colony was cultured overnight in MSB medium (10 g/L tryptone, and 5 g/L yeast extract, 2 mM MgSO4, 2mM CaCl2, pH 7.0) at 37°C and 100 rpm (Excella E24 Incubator Shaker Series, New Brunswick Scientific). The overnight bacterial culture was diluted in MSB to 1% (v/v) and incubated at 37°C and 100 rpm until an optical density at 600 nm (OD600) of 1.0 was reached. The bacterial culture was centrifuged at 1,700 x g for 5 minutes twice and re-suspended in motility buffer (6.4 mM K2HPO4, 3.5 mM KH2PO4, 1 μM L-methionine, 10 mM Sodium DL-lactate, 2 mM MgSO4, 2 mM CaCl2, pH 7.0) to a final OD600 of 1.0.

*PLGA Nanoparticle Synthesis:* 100 mg of Pluronic® F127 and 20 mL of deionized water were added to a glass vial. The vial was placed in a water bath sonicator (Branson 2510 Ultrasonic Cleaner, 100 W) for 30 minutes to dissolve the Pluronic. Then, a magnetic stir bar was added, and the solution was stirred at 600 rpm. Acid-terminated PLGA (Mw: 25,000 g mol⁻¹, 50:50 lactic acid:glycolic acid, acid end-capped, Akina Inc. PolySciTech, West Lafayette, IN) was dissolved with dimethylformamide (DMF, Sigma-Aldrich, St. Louis, MO) to a final concentration of 22.22 mg/mL; the solution was sonicated for 30 minutes to ensure molecular dissolution. While the PLGA solution was sonicking, 6,13-bis(triisopropylsilyl)ethynyl pentacene (TIPS, Sigma-Aldrich, St. Louis, MO) was dissolved in tetrahydrofuran (THF, anhydrous and uninhibited,
>99.9%, Sigma-Aldrich, St. Louis, MO) to a final concentration of 3.05 mg/mL. After the PLGA solution was fully dissolved, TIPS solution was added to the PLGA solution to achieve a 1:10 THF:DMF volume ratio. The mixture was vortexed for ~5 seconds before it was loaded into a 5 mL glass syringe with a 21-gauge needle attached. Care was taken to remove all macroscopic air bubbles from the syringe. The TIPS:PLGA mixture (1 mL) was added dropwise (0.5 mL/min, NE-1000, New Era Pump Systems Inc.) to the stirring (600 rpm) Pluronic F127 solution. The resulting nanoparticle suspension was allowed to stir for 5 hours at 600 rpm. The suspension was protected from light to prevent degradation of the fluorophore. After 5 hours, the suspension was centrifuged at 22,789 xg for 30 minutes at 4°C (Sorvall Legend X1R, Thermofisher Scientific). The supernatant was discarded. The pellet was resuspended in 20 mL of 1x PBS by vortex mixing for 2 minutes and sonicating the suspension for 30 minutes. The final dispersed suspension was passed through a nitrocellulose syringe filter (0.45 μm pore size) to remove any remaining aggregates. The filtrate was stored in a foil-wrapped vial at room temperature.

Streptavidin Functionalization of PLGA Nanoparticles: Microcentrifuge tubes were filled with 700 μL of PLGA NP suspension. The tubes were centrifuged at 16,060 × g for 10 minutes at room temperature (accuSpin Micro, Fisher Scientific). The pellets were resuspended in 800 μL of EDAC coupling solution (20 mg/mL EDAC, 5 μg/mL streptavidin-Cy3, pH 5.2 50 mM MES buffer). The streptavidin coupling reaction took place on a vortex mixer (500 rpm, Fisher Digital Vortex 120V, Fisher Scientific) for 3 hours. Following streptavidin coupling, the microcentrifuge tubes were centrifuged at 16,060 × g for 10 minutes at room temperature. The pellets were resuspended in 100 μL of motility buffer.

Dynamic Light Scattering (DLS) Measurements: DLS measurements were performed using a Zetasizer Nano ZS (Malvern Instruments) operating with Zetasizer Software v7.12. Disposable polystyrene cuvettes were filled with 1 mL of the final aqueous nanoparticle suspensions. Measurements were performed at room temperature, and the results are shown in Figure S6 and Table S1.

Zeta Potential Measurements: The final aqueous nanoparticle suspensions were loaded into disposable polystyrene capillary cells. Zeta potential measurements were performed using a Zetasizer Nano ZS at room temperature. The results are shown in Figure S6 and Table S1.

Nanoparticle Tracking Analysis (NTA): Dilutions (10× and 100×) of the functionalized nanoparticle suspensions were analyzed via nanoparticle tracking analysis using a NanoSight NS500 (Malvern Instruments) operating with NanoSight NTA v3.4. All measurements were performed at room temperature. Five 1-minute videos were taken for each sample, and the nanoparticle scattering cones were tracked to determine the number concentrations of the nanoparticle suspensions before incubating the nanoparticles with bacteria to form NanoBEADS.

PLGA NanoBEADS assembly: To prepare the ABS NanoBEADS, the prepared bacterial suspension in motility buffer was incubated with 10 μg/mL biotinylated Salmonella polyclonal antibody (Thermo Scientific, Waltham, MA, USA) on a vortex mixer at 500 rpm at room temperature for 1 hr. The antibody-coated bacteria suspension was then centrifuged at 1,700 × g for 5 minutes to remove free antibody and suspended in motility buffer to an OD of 2.0 (Cary 60 UV-Vis, Agilent Technologies). Next, the suspension of biotinylated antibody-coated bacteria was mixed with the streptavidin-coated nanoparticle at a bacteria to particles ratio of 1:100 in a volume of 100 μL or 800 μL (as described in Table 1) and incubated on a vortex mixer at 500 rpm, a Belly Dancer® mixer (IBI Scientific) at 100 rpm, or an end over end mixer (Fisher Scientific) at 15 rpm for 30 minutes, 60 minutes or 90 minutes to facilitate the assembly of nanoparticles onto the bacteria. For BS NanoBEADS, the bacterial suspension in the motility buffer was incubated with 0.4 mg/mL biotin (Fisher BioReagents, Fair Lawn, NJ) on a vortex mixer at 500 rpm at room temperature for 30 minutes to physisorb biotin onto bacteria. Subsequently, the suspension was centrifuged at 1,700 × g for 5 minutes to remove free biotin and resuspended the biotin-coated bacteria in motility buffer to an OD of 2.0. Next, the suspension of bacteria coated with biotin was mixed with the streptavidin-coated nanoparticles at a bacteria to particles ratio of 1:100 in a volume of 800 μL and incubated on a belly dancer mixer at 100 rpm or an end over end mixer at 15 rpm for 60 minutes. After the assembly process, the suspension of NanoBEADS was transferred to a centrifugal filter unit with a 0.8 μm pore size high-flux polyethersulphone
membrane (Sartorius Vivaclear, Elk Grove, IL) and centrifuged at 1,700 \times g for 30 seconds to remove free nanoparticles. The NanoBEADS were suspended in motility buffer to an OD_{600} of 1.0 for NP areal density characterization experiments or in McCoy’s 5A for the growth and motility assays.

*NanoBEADS samples preparation for field emission scanning electron microscope (FE-SEM):* To quantify the number of nanoparticles attached to the outer membrane of bacteria, SEM images of NanoBEADS were taken using FE-SEM. A 10 \mu L aliquot of the NanoBEADS suspension was deposited on 0.005% (w/v) poly-L-lysine (PLL) treated glass slides and incubated at room temperature for 5 minutes to allow for attachment. Afterward, the slide was rinsed in DI water to remove the loosely attached nanoparticles and NanoBEADS. Then, the slide was covered with 4% glutaraldehyde for 2 hours at 4°C to fix the attached NanoBEADS. Next, the slide was soaked in 0.1 M Phosphate-buffered saline (PBS) for 20 minutes twice. Finally, the same soaking process was repeated with deionized water. After air-drying overnight, the slide was sputter-coated with 7 nm Pt/Pd prior to imaging (Leica ACE600 sputter). High-resolution images were obtained utilizing a LEO (Zeiss) 1550 FE-SEM at an accelerating voltage of 5 kV and working distances of <8.6 mm. To determine the average number of attached nanoparticles for each NanoBEADS experiment, the particle numbers on \sim 50 bacteria were counted for each replicate. A minimum of two independent experiments were carried out for each case.

*Viability assay:* The filtered NanoBEADS were diluted in motility buffer to an OD_{600} of 0.05. To this 1 mL diluted NanoBEADS solution, 1.5 \mu L aliquots of the 3.34 mM SYTO 9 nucleic acid stain and 20 mM propidium iodide (LIVE/DEAD® BacLight Bacterial Viability Kit, Thermo Fisher, Eugene, Oregon, USA) were added, followed by incubation in the dark at room temperature for 15 minutes as per the manufacturer’s instructions. The fluorescence microscopy images of NanoBEADS were taken using a Zeiss AxioObserver Z1 inverted microscope equipped with an AxioCam mRM camera at 40x objective. Live cells with an intact membrane stained green only, where cells with a damaged membrane or dead cells also stained red.

*Growth rate measurement:* The NanoBEADS suspensions were diluted in 3 mL of McCoy’s 5A medium supplemented with 10% FBS to a final OD_{600} of 0.001. The diluted NanoBEADS suspension was incubated at 37°C with shaking at 100 rpm for 10 hours. A 100 \mu L sample was taken every hour, diluted, and plated on triplicate 1.5% LB agar plates. Following overnight incubation at 37°C, the bacteria colonies on the agar plates were counted to determine the NanoBEADS growth rate. A minimum of two independent experiments were carried out for each case.

*Swimming speed measurement:* The bacterial and NanoBEADS suspensions were diluted in 3 mL of McCoy’s 5A medium supplemented with 10% FBS to a final OD_{600} of 0.001. The diluted suspensions were incubated at 37°C with shaking at 100 rpm for 2 hours. A 10 \mu L sample was taken, diluted, and placed on the glass coverslip. The videos of the bacteria movement were taken with a Zeiss AxioObserver Z1 inverted microscope equipped with an AxioCam Hsm camera and 63× oil immersion objective. The videos were analyzed in ImageJ using the MTrackJ plug-in tool. The average swimming speed was calculated by averaging the instantaneous speed, which is the traveled distance in each unit of time divided by the time unit. For each experiment, about 50 bacteria or NanoBEADS were tracked in the 15 s videos acquired at 32.8 fps. A minimum of two independent experiments were carried out for each case.

**Results and Discussion**

**The Effect of the assembly process parameters on NP attachment density**

The NP attachment density is critical to the efficacy of bacteria-based drug delivery systems, as it determines the amount of therapeutic load carried by each NanoBEADS agent. We first investigated the effect of mixing method (i.e., the type of mechanical mixer employed when mixing the streptavidin-coated NPs and
the biotinylated bacterial suspensions, Video S1), assembly volume (i.e., total suspension volume during mixing), and assembly period, as depicted in Table 1, on the formation of Antibody-Biotin-Streptavidin NanoBEADS (ABS NanoBEADS) using 165±11 nm diameter NPs. Informed by our prior work,(Suh et al., 2018b) all NanoBEADS assembly experiments were conducted at the bacteria to NPs ratio 1:100 and biotinylated antibody concentration of 10 μg/mL (see Methods for detail). The number of attached NPs on each bacterium was quantified using Scanning Electron Microscopy (SEM) and reported as the number of attached NPs per projected unit area of the cell surface (#NPs/μm²).

We first evaluated the effect of assembly volume and duration using a vortex mixer (V) for two different assembly volumes of 100 μL (V-100) and 800 μL (V-800) and three different assembly periods of 30, 60, and 90 min. As shown in Figure 3a, assembly volume had no statistically significant effect on the average NP attachment density of ABS NanoBEADS constructed using a vortex mixer, except for the significantly decreased NPs attachment density in the 60 min assembly period, when the volume increased from 100 μL to 800 μL (p<0.01). In the case of 100 μL assembly volume, the NPs attachment density significantly increased by increasing duration from 30 min to 60 min (p<0.01). In contrast, there was no significant difference in the NPs attachment density for V-800-60 comparing to the other two durations of V-800, as shown in Figure 3a, b. Keeping the high throughput biofabrication needs for in vivo experiments and future translational applications in mind, we examined other mixing methods at the higher 800 μL volume and compared the results from V-800 with those of the Belly Dancer® mixer (B-800) and the end-over-end mixer (E-800) for each of the three assembly durations. For all the assembly periods tested, the Belly Dancer® and the end-over-end mixer resulted in similar or higher average NPs areal density, compared to the vortex mixer (Figure 3a). For the former two mixing methods, as the assembly period increased from 30 min to 60 min, the count of NanoBEADS with attachment numbers higher than 10 NPs/μm² cell area showed an appreciable increase while the number of bacteria without any NP attached (0 NPs/μm²) decreased (Figure 3c,d). Upon increasing the assembly time to 90 min, more NanoBEADS with attachment density lower than 10 NPs/μm² were observed (Figure 3c,d), resulting in an overall decrease in average attachment density (Figure 3a). This reduction in attachment density can be attributable to the presence of residual culture media in the assembly volume, which led to some bacteria growth during the more extended assembly period. Therefore, 60 min was identified as the optimal assembly duration. B-800-60 and E-800-60 cases had significantly higher NPs attachment density than V-800-60 case (p<0.05). Additionally, there was a significant difference in the NPs attachment density in E-800-60 comparing to the other two durations (p<0.01). Moreover, the E-800-60 case had a statistically significant higher average NP attachment density than the NanoBEADS constructed using a vortex mixer, except for the V-100-60 case, where the difference was not statistically significant. Altogether, our results suggest that the Belly Dancer® mixer used with 800 μL assembly volume for 60 min (B-800-60), and the end-over-end mixer used with 800 μL assembly volume for 60 mins (E-800-60) were the optimal sets of assembly parameters, among the combinations tested.

| Mixing Method            | Speed (rpm) | Assembly Volume (μL) | Assembly Period (min) |
|--------------------------|-------------|----------------------|-----------------------|
| Vortex mixer (V)         | 500         | 100                  | 30, 60, 90            |
| Vortex mixer (V)         | 500         | 800                  | 30, 60, 90            |
| Belly Dancer® mixer (B)  | 100         | 800                  | 30, 60, 90            |
| End-over-end mixer (E)   | 15          | 800                  | 30, 60, 90            |

Table 1: Table of assembly process parameters (see Methods for details).

Effect of the linkage chemistry on areal density and repeatability of NP attachment

Due to the stochastic nature of the assembly process, a distribution of the particle attachment density is expected for each individual experiment, as shown in Figure 3. However, minimizing the variance in NP
Figure 3: Effect of assembly process parameters on 165 nm diameter nanoparticle (NP) attachment density in Antibody-Biotin-Streptavidin NanoBEADS (ABS NanoBEADS). (a) Effect of mixing method, assembly volume, and assembly duration on the attached NP areal density. The black bars indicate means and 95% confidence intervals (i.e., nonoverlapping bars between any two cases indicate a significant difference with a p-value < 0.05). Effect of assembly period on the distribution of the attached NP areal density for (b) V-800, (c) B-800, and (d) E-800. In all plot legends, X-000-00 denote the mixing method (X), assembly volume (000), and assembly period (00), as described in Table 1. All areal densities are calculated based on projected cell area.

cargo attachment density distribution across replicate experiments is crucial to determining the efficacious dosage of biolhybrid systems towards robust and predictable therapeutic outcomes. Thus, we next examined the repeatability in NP attachment density outcomes for two linkage chemistries using the optimal assembly parameters of B-800-60 and E-800-60. In both NanoBEADS variants, streptavidin-coated nanoparticles were attached to the bacteria using the high affinity biotin-streptavidin interactions; however, in the ABS NanoBEADS variant, biotin was conjugated with anti-Salmonella antibody and covalently bonded to the antigen on bacteria, whereas in the Biotin-Streptavidin NanoBEADS (BS NanoBEADS) variant, biotin was adsorbed onto the bacteria via electrostatic interactions. A minimum of four independent replicate assembly experiments for each of the two NanoBEADS variants were conducted (Figure 4). For the ABS NanoBEADS, both B-800-60 and E-800-60 yielded similar results (Figures 3a, b), with E-800-60 producing a higher fraction of high NP density NanoBEADS (>20 #NPs/μm²) (Figure 4c) and a more repeatable attachment density distribution with a smaller variance (Figure 4d). Thus, we identify E-800-60 as the
optimal set of assembly parameters for producing the ABS NanoBEADS. For the BS NanoBEADS, no significant difference between the B-800-60 and E-800-60 outcomes was observed (Figure 4e, f). Comparing the distribution of the attached NP areal density between the two variants (Figures 4c, g), it is evident that the ABS NanoBEADS had a significantly higher number of bacteria with greater attachment density than the BS NanoBEADS. Furthermore, only ~7% of the bacteria did not have any nanoparticle attached when the ABS linkage is used, whereas an average of ~27% did not have any NP attached when the BS linkage is used. Consistent with our observation for ABS NanoBEADS, E-800-60 produced a more repeatable attachment density distribution (Figure 4h). The viability of the bacteria was not affected by the attached NPs in either of the two variants (Figure S1).

**Effect of NP size on attachment density and growth rate**

Next, we investigated the effect of particle size on the attachment density outcome in the ABS and BS NanoBEADS variants constructed using the optimal assembly parameters of E-800-60 and 165±11 nm or 121±6 nm particles. Representative scanning electron microscopy (SEM) images of both NanoBEADS variants are shown in Figure 5a-d. As shown in Figure 5e, NPs with a smaller diameter of 121±6 nm had significantly increased attachment density (p<0.0001) for ABS NanoBEADS, but the slightly increased attachment density for BS NanoBEADS was not statistically significant. Consistent with our observation of NanoBEADS constructed with large NPs, there was an average of 70% decrease in the NP areal density upon changing from the ABS linkage chemistry to the antibody-free BS linkage chemistry (Figure 5e). Our results suggest that irrespective of NP size, the linkage chemistry (i.e., the method used to present biotin on the bacteria outer membrane) significantly affects the NP attachment outcome. When the biotinylated antibody is used, more particles per bacteria are attached compared to using physisorbed biotin. The observed trends in the effect of NP size on the NP attachment density were conserved when the closely comparable B-800-60 assembly parameters were used (Figure S3a).

We next examined the effect of NP size and attachment density on the growth of NanoBEADS. While NanoBEADS can be stored in media that do not support growth in vitro, they are expected to operate in vivo for days (Suh et al., 2019) and are observed to grow in the nutrient-rich tumor microenvironment. (Suh et al., 2018a) As NanoBEADS grow, the attached NP load is divided amongst the daughter cells, leading to a more effective distribution of the NPs within the tumor. (Suh et al., 2019) Furthermore, many tumor-targeting bacteria, including S. Typhimurium VNP20009 used in this study, have instinct and immune-mediated antitumor effects (Song et al., 2018) (Zhou et al., 2018) in addition to serving as a delivery vector for the nanomedicine attached to their outer membrane. Thus, intratumoral bacterial growth augments the therapeutic effect of fixed nanomedicine payload. The doubling times of both NanoBEADS variants at both NP sizes were measured and compared to the doubling time of the bacteria (control). All experiments were performed in a mammalian cell culture medium, given the ultimate application of the NanoBEADS platform as a cancer drug delivery system. For the optimal assembly parameters, i.e., E-800-60, we first investigated if coating of the outer membrane or the mechanical agitation of the assembly process affects the growth rate. We found no statistically significant difference in the average doubling time of unmodified bacteria, biotinylated antibody-coated bacteria, and biotin-coated (physisorbed) bacteria, suggesting that surface modification did not affect the bacterial growth rate (Figure S2). However, bacteria subjected to mechanical agitation experienced during the E-800-60 assembly process (in the absence of NPs) resulted in a statistically significant (p<0.05) increase in the average doubling time of the bacteria from 49±3 min to 59±4 min, which may be attributable to the mechanical stress. Next, we measured the doubling time of the NanoBEADS constructs and compared them to the doubling time of the mechanically-treated (E-800-60) bacteria as the baseline control (Figure 5f). The average doubling time of the 165 nm and 121 nm ABS NanoBEADS were 95±8 min and 104±2 min, both of which were significantly longer (p<0.05) than the control doubling time. The average doubling time of the 165 nm and 121 nm BS NanoBEADS were significantly shorter (p<0.05) than their ABS NanoBEADS counterparts at 64±0.2 min and 54±5 min. Interestingly, no significant difference between the doubling time of BS NanoBEADS and control bacteria was observed. We attribute the significantly longer doubling time of the ABS NanoBEADS (p<0.05) to the higher
NP attachment areal density, as shown in Figure 5a. NP size did not significantly affect the NanoBEADS doubling time within each variant type (p > 0.05). Altogether, our results suggest that NP attachment density and not the NP size affects the NanoBEADS doubling time for the range of NP size tested. The observed trend in the effect of NP size on growth rate was conserved when the closely comparable B-800-60 assembly parameters were used (Figure S3b). Lastly, we note that the dependency of doubling time on NP attachment density may become less significant with particle size reduction. We observed that the doubling time of the ABS NanoBEADS constructed with significantly smaller 40 nm gold particles at comparable NP attachment density to 165 nm PLGA particles was comparable to that of control (Figure S4, S5).

Effect of NP size and attachment density on NanoBEADS motility

We next assessed the effect of NP size and attachment density on motility by measuring each NanoBEADS variant’s swimming speeds with small or large NP attached and compared the speeds with that of bacteria as the baseline (control). Before characterizing NanoBEADS motile behavior, we first evaluated how chemical and mechanical processes that comprise the NanoBEADS construction process affect the bacteria motility in the absence of NPs. The average speeds of the bacteria cultured under standard microbiological conditions (control), mechanically-treated bacteria without antibody coating or nanoparticle attachment (control, E-800-60), antibody-coated bacteria, and mechanically-treated (E-800-60) antibody-coated bacteria without particles are shown in Figure 6a. Mechanical agitation decreased the average speed of bacteria from 9.2±5.6 μm/s to 4.8±3.9 μm/s (p < 0.05). However, the choice of mixing method did not have a statistically significant effect on the bacteria motility speed (Figure S3c). Antibody coating of bacteria had a similar statistically significant reducing effect on the bacteria motility speed to 4.5±1.5 μm/s (p < 0.05). The combination of mechanical agitation and antibody coating did not result in any further statistically significant degradation in speed (4.7±2.1 μm/s). We attribute the reduction in swimming speed to the fragile structure of the flagella in S. Typhimurium VNP20009 cheY+, which can be disrupted through mechanical agitation. (Broadway et al., 2017)

We next examined the motility speed of both NanoBEADS variants constructed using the E-800-60 assembly parameters and attached with 165 nm or 121 nm NPs, as shown in Figure 6b and S3d. To assess the effect of NP size, we compared the motility speed within each variant category. We did not observe a statistically significant difference between the 121 nm ABS NanoBEADS average swimming speed (4.4±1.0 μm/s) and the 165 nm ABS NanoBEADS (4.0±1.2 μm/s). It appears that the contribution of the larger 165 nm NPs to the drag force is comparable to the contribution of the larger quantity of the smaller 121 nm particles (Figure 5e). In the case of BS NanoBEADS, the NanoBEADS with the smaller 121 nm NPs have a lower average speed (4.2±0.5 μm/s) than NanoBEADS with 165 nm NPs (4.5±1.4 μm/s), but the difference is not statistically significant. To assess the effect of linkage chemistry on motility speed, we compared the motility speed of the two NanoBEADS variants at each particle size. In the case of NanoBEADS with 165 nm NPs, BS NanoBEADS have a significantly higher average speed than ABS NanoBEADS (p < 0.01), presumably due to the lower NP attachment density. Whereas, for the NanoBEADS with the smaller 121 nm NPs, both NanoBEADS variants have similar average speed, which was not significantly different from the average speed of antibody-coated E-800-60 control bacteria.
Figure 4: Effect of mixing method and linkage chemistry on the areal density and repeatability of nanoparticle (NP) attachment. Repeatability of NP attachment areal density distribution for Antibody-Biotin-Streptavidin NanoBEADS (ABS NanoBEADS) constructed using the process parameters of (a) B-800-60 and (b) E-800-60, and for Biotin-Streptavidin NanoBEADS (BS NanoBEADS) constructed using process parameters of (e) B-800-60 and (f) E-800-60. Average NP attachment areal density distribution for (c) ABS NanoBEADS and (g) BS NanoBEADS constructed using the process parameters of B-800-60 and E-800-60. Cumulative percentage of NanoBEADS and standard deviation as a function of NP areal density (inset) for (d) ABS NanoBEADS and (h) BS NanoBEADS constructed using the process parameters of B-800-60 and E-800-60.
Figure 5: Effect of nanoparticle (NP) size and linkage chemistry on attachment density and growth rate. Representative scanning electron microscopy (SEM) images of (a) ABS NanoBEADS (E-800-60) with 165 nm NPs, (b) ABS NanoBEADS (E-800-60) with 121 nm NPs, (c) BS NanoBEADS (E-800-60) with 165 nm NPs, (d) BS NanoBEADS (E-800-60) with 121 nm NPs. All scale bars are 500 nm. (e) The NP areal attachment density as a function of NP size for the ABS NanoBEADS and BS NanoBEADS variants. The black bars indicate means and 95% confidence intervals. ****p-value < 0.0001. (f) The comparison of doubling time of the variants of NanoBEADS and mechanically-treated (E-800-60) bacteria with no particles attached as the control. Each data point represents the mean ± standard deviation. *p-value < 0.05.
Figure 6: Effect of nanoparticle (NP) size, quantity, and linkage chemistry on NanoBEADS motility speed. (a) The effect of mixing-induced shear and antibody coating on the average speed of bacteria (without NPs) at 2 hr incubation time. (b) The average speed of the ABS and BS NanoBEADS constructed using small or large NPs at 2 hr incubation time. In both plots, the black bars indicated means and 95% confidence intervals. *p-value < 0.05; **p-value < 0.01.
Conclusion

The NanoBEADS is a bacteria-based bio-hybrid drug delivery system designed to utilize self-propelling motile bacteria to enhance the interstitial delivery of nanomedicine. As is the case for all biohybrid delivery systems, the effectiveness of NanoBEADS hinges upon maximizing its NP load without affecting its viability and minimal effect on its motility. It is also imperative that the NanoBEADS construction process produces a repeatable distribution of NP load densities (i.e., therapeutic load) to facilitate the use of such a system in translational applications. Thus, a systematic investigation of the effects of the assembly process parameters, linkage chemistry, and NP size on NanoBEADS properties (i.e., NP attachment density and repeatability, growth rate, and swimming speed) was carried out. We selected biotin-streptavidin linkage chemistry for this study due to its prevalence in constructing bacteria-based biohybrid microrobots (Akin et al., 2007)(Traore et al., 2014)(Kazmierczak et al., 2014)(Nguyen et al., 2016)(Alapan et al., 2018)(Kojima et al., 2012)(Huter et al., 1999)(Buss et al., 2020)(Hiratsuka et al., 2005)(Singh et al., 2017)(Carlsen et al., 2014). Furthermore, the peritrichously flagellated S. Typhimurium was selected due to the common use of Gram-negative bacteria (E. coli, S. marcescens, etc.) as well as other flagellated bacteria in the construction of bacteria-based microrobots. The selected PLGA nanoparticles of two different sizes represent a good model for the polymeric nanoparticles used in constructing biohybrid microrobots. For the ABS NanoBEADS, using an end-over-end mixer with a total mixing volume of 800 μL for 60 min assembly period (E-800-60) produced the highest and most repeatable NP attachment density without affecting the viability of the bacteria. In the case of BS NanoBEADS, where streptavidin-functionalized nanoparticles were attached to the bacteria using biotin that was physisorbed to the bacteria, the attachment density decreased by more than 70%, compared to the ABS NanoBEADS case. The optimal NanoBEADS construction strategy reported herein is extensible to other NP materials and sizes (Figure S4). The motility speed is adversely affected with the attachment of larger particles at high density, but the attachment of NPs smaller than 120 nm did not affect the motility speed even at high attachment density (Figure S4). Irrespective of NP size, reduction in attachment density restored the growth rate to the control bacteria levels. However, growth was unaffected for the smaller 40 nm gold NPs even at the high NP attachment density of 21 gold NPs/μm² (Figure S5).

Altogether, we posit that the new knowledge in the effect of assembly parameters and linkage chemistry on bacteria-nanoparticle assembly outcomes and the effect of NP size on key bacterial behaviors of motility and growth in bacteria-based biohybrid systems will facilitate the design and development of more efficacious bacteria-mediated delivery systems for a variety of applications. The exact quantitative values for attachment density or changes in motility speed and growth rate are likely to depend on the choice of bacteria, nanoparticle, and linkage chemistry. Nonetheless, the observed trends, such as the effect of assembly parameters on nanoparticle attachment density and repeatability, are expected to be generalizable (Figure S5). Similarly, the reported trends for the effect of linkage chemistry on nanoparticle attachment density or the effect of nanoparticle size and density on motility speed and growth rate can inform the design of process parameters and nanoparticle selection in other bacteria-based biohybrid systems.

Acknowledgements

This project was partially supported by the National Science Foundation (CAREER award, CBET-1454226) and the Institute for Critical Technology and Applied Science (ICTAS) at Virginia Tech.
Supporting Information

Supporting Information is available from the Wiley Online Library.

Figure 7: Schematic of the Antibody-Biotin-Streptavidin NanoBEADS (ABS NanoBEADS).

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