Building Boolean logic into biomaterials

SINGLET FISSION
It’s a trap

CATHODE MATERIALS
The merits of magnesium

SURFACE SELF-ASSEMBLY
Compile to tile
Engineered modular biomaterial logic gates for environmentally triggered therapeutic delivery

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The successful transport of drug- and cell-based therapeutics to diseased sites represents a major barrier in the development of clinical therapies. Targeted delivery can be mediated through degradable biomaterial vehicles that utilize disease biomarkers to trigger payload release. Here, we report a modular chemical framework for imparting hydrogels with precise degradative responsiveness by using multiple environmental cues to trigger reactions that operate user-programmable Boolean logic. By specifying the molecular architecture and connectivity of orthogonal stimuli-labile moieties within material cross-linkers, we show selective control over gel dissolution and therapeutic delivery. To illustrate the versatility of this methodology, we synthesized 17 distinct stimuli-responsive materials that collectively yielded all possible YES/OR/AND logic outputs from input combinations involving enzyme, reductant and light. Using these hydrogels we demonstrate the first sequential and environmentally stimulated release of multiple cell lines in well-defined combinations from a material. We expect these platforms will find utility in several diverse fields including drug delivery, diagnostics and regenerative medicine.

Recent innovations in therapeutic development and cell engineering have yielded powerful tools to combat an increasing number of debilitating and life-threatening diseases. Despite these advances, several barriers to clinical translation remain, including the significant challenge of limiting therapeutic deployment to sites of disease that can be widespread and unknown. Targeted delivery strategies that exploit disease-related biomarkers improve treatment efficiency and efficacy by reducing dosage requirements and adverse off-target effects. Most typically, these methods employ polymer-based vehicles to facilitate delivery and protect therapeutic cargo from immune recognition, clearance and non-specific cellular uptake. Cell-based therapies further necessitate that these vehicles recapitulate critical aspects of native tissue to ensure sustained cell viability and function. Hydrogels offer promise in each of these regards, as they are robust material platforms whose biochemical and biophysical properties can be tuned to preserve and promote specific cell fates, are readily formulated into a variety of shapes and stiffnesses to control transport to and within tissues, and can be engineered to degrade in response to locally presented cues to facilitate therapeutic release.

Smart materials have been engineered to leverage pathophysiology for targeted delivery by integrating functional groups that cleave or change conformation in response to an external stimulus (for example, enzyme, pH, temperature, redox conditions and small molecules), allowing them to sense and respond to disease-associated biochemical hallmarks. Although materials sensitive to single factors can enrich therapeutic delivery to sites of disease, individual biomarkers are rarely unique to these locations, leading to suboptimal selectivity. For example, cancer microenvironments have been targeted through their extensive matrix metalloproteinase (MMP) activity, reducing conditions and subphysiological pH. However, these characteristics are shared, respectively, by healthy joints, the intracellular milieu and the stomach. To improve the site specificity of payload release, materials that degrade only when presented with multiple cues have been developed. While previous approaches have enabled therapeutic delivery in response to two environmental factors, they lack a generalizable framework to exploit additional input stimuli to further refine release specificity. Moreover, the uniqueness of each previously reported responsive platform necessitates a complete material redesign—one that is generally not synthetically tractable due to inherent constraints on material composition and vehicle geometry—in order to alter the response profiles or utilize different biochemical triggers. Furthermore, the subset of degradable materials demonstrated for live cell release has been limited to single biological inputs, confining next-generation cellular therapeutics to simple delivery platforms.

To address these technological limitations and enable unprecedented specificity over controlled therapeutic release, we sought to develop a versatile chemistry-based approach to create multi-stimuli-responsive hydrogel platforms that are (1) able to perform biocomputation, (2) modular in design and (3) fully cytocompatible. Biocomputation represents the ability to simultaneously sense multiple biologically presented inputs and follow a user-programmed Boolean logic-based algorithm to provide a functional output, demonstrated here in the form of material degradation and therapeutic delivery. System modularity allows both the inputs and logic functions to be changed and combined to generate a theoretically limitless number of novel materials, each with unique and user-specified release characteristics. Furthermore, exploitation of cytocompatible bioorthogonal chemistries permits responsive material platforms to be formed and degraded on demand in the presence of live cells, representing a major improvement over existing cell delivery strategies.

In our rational design-based approach, stimuli-sensitive components are incorporated into discrete, monodisperse, synthetic
cross-linkers that, upon reaction with polymer macromers, form hydrogels of well-defined molecular architecture. Information governing the environmental responsiveness of the resulting material is embedded within the cross-linker domain; when the linker is covalently cleaved, the material degrades and simultaneously releases any encapsulated or tethered payload. The simplest Boolean logic function, the YES gate, is implemented when a single stimuli-labile moiety causes material dissolution, forming an OR gate (denoted with logic symbol ∨). When two degradable units are connected in parallel, the cleavage of both moieties is required for material dissolution, forming an AND gate (denoted by logic symbol ∧). These concepts can be expanded hierarchically, combining multiple gates into a logic circuit to engineer complex responses to additional dynamic stimuli (Fig. 1). Formalizing the relationship between cross-linker architecture and hydrogel degradability provides a template for creating materials that are structurally simple yet functionally complex.

Results

Synthesis of logic-based responsive cross-linkers. Implementation of the outlined biocomputational strategy requires precise control over cross-linker functionality and architecture. We used peptide-based cross-linkers due to the efficiency of solid-phase peptide synthesis in generating monodisperse macromolecules that contain a range of functional groups with sequence-defined order and connectivity. Peptides, which possess intrinsic biocompatibility, can be chemically modified to introduce non-canonical functionality, connectivity (for example, branching, cyclization and intramolecular stapling) and degradability. As a demonstration of this logic-based approach, three chemically orthogonal stimuli-labile moieties from different reaction classes were employed: (1) the enzymatically degradable oligopeptide sequence GPQG IWGQ (green) is enzymatically cleaved by MMP, and the oNB moiety (purple) undergoes photoscission in the presence of near-UV light (λ = 365 nm).

Figure 1 | Rationally designed cross-linker architecture enables logic-based material degradation. a. The YES-gate material cross-linker contains a single stimuli-labile moiety (red). Presence of the corresponding chemical input cleaves this moiety, breaking the covalent linkage between molecular entities and the linker (pink) to yield material degradation. Each region of the Venn diagram corresponds to a unique combination of inputs and indicates whether the material is expected to degrade (coloured) or remain intact (light grey). b. The OR-gate cross-linker contains two different stimuli-labile moieties (red and blue) connected in series. The presence of either relevant input cleaves the cross-linker, resulting in material degradation. c. The AND-gate cross-linker contains two different stimuli-labile moieties (red and blue) connected in parallel. The presence of a single programmed input cleaves one linker arm but does not fully sever the crosslink, leaving material crosslinking density and mechanical properties unchanged. d. Logic gates can be hierarchically combined to generate higher-order logic responses. Seventeen unique materials can be generated by combining three logic gates (YES, OR, AND) with three distinct inputs. e. Reactions depicting cleavage of the stimuli-labile groups: disulfide bonds (orange) are reduced into free thiols, the proteolytically sensitive peptide sequence GPQG IWGQ (green) is enzymatically cleaved by MMP, and the oNB moiety (purple) undergoes photoscission in the presence of near-UV light (λ = 365 nm).
Engineered cross-linkers respond to environmental input combinations on the molecular level. a, The chemical structure of the EaP cross-linker includes an MMP-degradable peptide sequence (green), a photolabile 6NB moiety (purple), and two flanking azides (pink) for SPAAC-based hydrogel crosslinking. b, MALDI-TOF spectra of the EaP cross-linker after treatment with all unique combinations of enzyme (E), reductive species (R) and light (P) demonstrate correct molecular responses following each input combination. Expected product masses are highlighted in green. c, In situ oscillatory rheological analysis of hydrogels crosslinked using treated EaP demonstrates that AND-gated materials require treatment by both relevant inputs to yield changes in bulk material properties.

Assessing solution-based cross-linker degradation in response to environmental stimuli. To demonstrate that cross-linkers degrade as engineered in response to environmental cues and that stimuli-responsive reactions are chemically orthogonal, we treated each of the one- and two-input linkers with every possible combination of MMP enzyme (E), reducing conditions (R) and light (P) (Supplementary Methods 23 and 24). Reaction products were investigated using matrix-assisted laser desorption/ionization time-of-flight mass spectrometry (MALDI-TOF). Detected masses were in excellent agreement with those of the expected reaction products (Fig. 2 and Supplementary Figs 1–9), indicating that the linkers respond as designed on a molecular level. To further investigate, the enzyme AND photolinker (EaP) was pretreated with different combinations of enzyme and light, added to a stoichiometrically defined amount of PEG-tetraBCN, and monitored for material dissolution.
characterized by \textit{in situ} oscillatory rheology to monitor evolution of material properties (Supplementary Methods 22 and 25). Untreated E^\land P yielded robust gels, demonstrating the first successful use of a cyclic or stapled peptide for material crosslinking. The final storage moduli of samples containing the untreated linker ($G' = 1,660 \pm 170$ Pa) were similar to those of the linkers subjected

**Figure 3 | Logic-gated biomaterials exhibit programmable degradation in response to environmentally presented input combinations.** a, The response profiles of the single-input YES-gated materials. b, c, Response profiles of the two-input OR-gated (b) and AND-gated (c) materials. d–g, Response profiles of the higher-order, three-input OR/(AND)- (d), AND/(OR)- (e), OR/OR- (f) and AND/AND- (g) gated materials. Plot titles correspond to cross-linker identity, with x-axis labels indicating material treatment conditions (\textit{N} indicates no treatment, \textit{E} is MMP enzyme, \textit{R} is a chemical reductant, \textit{P} is UV light). Green bars signify conditions expected to result in material degradation; red bars indicate conditions expected not to yield material degradation. Error bars correspond to ±1 standard deviation about the mean with propagated uncertainties for $n = 3$ experimental replicates.
to either enzyme or light ($G' = 1,580 \pm 130$ Pa and $1,540 \pm 110$ Pa, respectively), while the linker treated with both enzyme and light did not form a gel ($G' = 200 \pm 30$). All samples had a final loss modulus ($G''$) of $\sim 50$ Pa. Consistent with rubber elasticity theory where the shear modulus scales with crosslinking density and calculations showing that distances between network branch points increase $< 3\%$ upon cleavage of a single arm of AND-gated linkers (Supplementary Methods 26), these data suggest that the mechanical properties of these materials depend only on the final logic state of the Boolean linker.

Logic-based hydrogel degradation in response to environmental stimuli. After validating linker behaviour on the molecular level, we sought to characterize the logic-based stimuli-responsiveness of bulk materials. Each cross-linker was reacted independently with Alexa568-labelled PEG-tetraBCN to form 17 different types of fluorescent hydrogel. For each type, responsiveness to all eight input combinations involving reducing agents, light and enzyme was evaluated. Hydrogel degradation was quantified by measuring supernatant fluorescence at non-kinetically limited endpoints following treatment (Fig. 3, Supplementary Methods 27 and 28 and Supplementary Figs 10 and 11). Each of the YES-gated materials (E, R and P) behaved as expected, degrading only when the programmed cue was present. The high selectivity (more than tenfold over non-specific release) again demonstrates the orthogonality of the employed stimuli-labile chemistries. The OR-gated materials (R\(\lor\)E, EvP, RvP) also responded as expected, degrading fully when either of the relevant cues was present. The AND-gated materials (R\(\land\)E, EaP, R\(\land\)aP) also functioned properly, fully degrading only when both programmed cues were present. The observed release selectivity (more than sevenfold) is as or more specific than the most successful dual-input degradable materials previously reported. Of the three-input materials containing two logic gates, six of eight (that is, Ev(R\(\lor\)P), P\(\lor\)(R\(\land\)E), R\(\land\)(EvP), P\(\land\)(R\(\lor\)Ev), R\(\lor\)(EvP), R\(\lor\)(EaP)) behaved as designed, degrading with high selectivity only when the respective cues were present. The conditions (E\(\land\)(R\(\lor\)P))\_EP and (R\(\land\)(E\(\lor\)P))\_REP did not fully degrade, which we attribute to the known decreased proteolytic cleavage kinetics for strained MMP-degradable substrates\(^{24}\), in this case due to internal ring strain. These higher-order, three-input cross-linkers are the most complex logic operators ever used to control material degradation. This generalizable approach proves robust, as 132 of the 136 treatment conditions yielded engineered degradation (defined as either complete degradation or $< 30\%$ nonspecific release). The exhaustive synthesis and testing of each possible material demonstrates that complex biomaterial computation can be achieved with high fidelity through the hierarchical combination of simple YES/OR/AND logic gates. Given the initial success of this modular framework, we expect to be able to substitute the chosen stimuli-labile groups with any number of other chemically orthogonal moieties sensitive to pH, additional proteases, visible light, temperature or ultrasound.

Disease-associated delivery of doxorubicin to an in vitro cancer model. To demonstrate the ability to deliver functional therapeutics in response to precise combinations of pathophysiological stimuli, we tethered a BCN-tagged doxorubicin (DOX) chemotherapeutic into R\(\lor\)E gels that degrade with high specificity to cancer microenvironmental cues (Fig. 4a,b and Supplementary Methods 29). The extent of hydrogel functionalization was chosen such that the solution DOX concentration following full material degradation (44 $\mu$M) would yield population-wide apoptotic death of plated cervical cancer-derived HeLa cells (Fig. 4c). Following treatment by each relevant input combination (that is, $N\_E\_R\_RE$), cells were incubated in hydrogel supernatants for 48 h before quantitative analysis of double-stranded DNA (dsDNA) content, indicative of the total number of viable cells. In the absence of treatment, or that with just reductant or MMP, normal proliferation was observed (95 $\pm$ 3% and 97 $\pm$ 2% and 76 $\pm$ 5%, respectively, relative to non-treated controls lacking gels). The slight decrease in total dsDNA content following enzymatic treatment is attributed to secondary effects of the MMP treatment, rather than to non-specific DOX release (Supplementary Methods 29). In stark contrast to treatments with a single input, treatment with both inputs resulted in complete cell eradication (1.8 $\pm$ 0.2% dsDNA content relative to controls), as designed. These results highlight the unique capacity of this approach to control the release of functional small-molecule therapeutics through

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Figure 4 | Logic-based doxorubicin delivery enhances specificity of HeLa cell death in the presence of multiple disease-state hallmarks. a, Chemical structure of doxorubicin functionalized at the amino group with BCN. b, R\(\lor\)E hydrogel degradation is triggered in the presence of pathophysiological cues associated with tumour microenvironments: reducing conditions and MMPs. Liberated DOX induces apoptosis in cervical cancer-derived HeLa cells. c, Dose-response curve of HeLa cells following treatment with R\(\lor\)E-DOX conjugate. d, Normalized dsDNA content after culturing HeLa with released hydrogel components following varying treatments. $x$-axis label indicates material treatment conditions: $N$ is no treatment, $\lambda$ is a chemical reductant, $E$ is MMP enzyme. The green bar signifies conditions expected to result in DOX release though material degradation. Red bars indicate conditions expected not to yield material degradation. Error bars correspond to $\pm 1$ standard deviation about the mean for $n = 3$ experimental replicates.
logic-based gel degradation, enabling precise regulation of cell fate in response to disease-defined combinations of external cues.

**Logic-based delivery of live cells from stimuli-responsive hydrogels.** To illustrate the biocomputational response of these engineered materials to a combination of spatially defined as well as environmental cues, we formulated a multifunctional hydrogel composed of three distinct logic regions (R∧P, P, R∨P), each labelled with a different fluorophore (Fig. 5). These hydrogels were sequentially exposed to masked UV light and reducing conditions, and imaged using fluorescent confocal microscopy (Supplementary Methods 30). Each region responded to external cues as engineered, degrading only when the proper set of input conditions was presented. To demonstrate cytocompatible gelation and multi-stimuli-responsive degradation, an analogous experiment was performed with each region containing encapsulated hS5 bone marrow-derived stromal cells that constitutively express a different fluorescent protein. Cells were released from gels following sequential masked light exposure, reducing conditions and flood illumination, harvested after each treatment, and analysed by flow cytometry. Each treatment yielded a distinct cell collection matching the expected colour composition (Supplementary Methods 31). Encapsulated cells were also shown to be viable when released through each stimulus, demonstrating whole process cytocompatibility (Supplementary Fig. 12). This material system, which yields the sequential and environmentally triggered release of multiple cell lines in well-defined combinations, is the most advanced live-cell delivery platform realized so far.

**Discussion**

Although we have first implemented our logic-gated approach to control biomaterial degradation using SPAAC-based PEG hydrogels that respond to reductant, enzyme and light inputs, these general methodologies should be readily extendable to different stimuli-labile moieties, polymer compositions and gelation chemistries. We hypothesize that these logic-based strategies can be extended to covalently tether other small molecules, peptides, proteins, polysaccharides and nucleic acids to a non-degradable hydrogel via a stimuli-responsive linker, affording precise biochemical presentation through environmentally triggered controlled release of bioactive species.

Another potential benefit of our approach stems from the ability to tailor the ‘propagation delay’ (the time required to transduce...
input signals into the appropriate functional output) of the Boolean operator for different therapeutic applications. For these logic-based materials, gate delay is governed by the susceptibility of each labile group identity enables user-specific control over material response rates. Capitalizing on this platform’s unique capacity to govern material properties in response to combinations of both exogenous user-specific spatiotemporal cues (such as light) and endogenous cell-produced signals (such as enzymes and reductants) may enable new advances in three-dimensional (3D) cell culture and tissue engineering. In one envisioned application, user-specific material photodegradation can be performed within ExP gels to generate customizable vasculature within a synthetic environment that supports enzyme-mediated matrix remodelling and long-term cell survival. In another, cells encapsulated within a photopatterned ExP material will only undergo cell-mediated spreading within user-defined gel regions. We anticipate that such combined user and cellular control over the culture microenvironment will provide unique opportunities towards directing 4D stem cell differentiation.

Here we have introduced the first modular approach to engineer materials with tailored, user-specific, logic-based responsiveness to environmental cues. By controlling the molecular architecture and connectivity of multiple stimuli-labile moieties within discrete peptide-based cross-linkers, we have endowed biomaterials with unprecedented computational capacity through hierarchical combinations of Boolean YES/OR/AND gates. Having exhaustively synthesized cross-linkers that are each uniquely sensitive to combinations of three orthogonal inputs (enzyme, reductant and light), we have shown that constructs exhibit expected behaviour spanning molecular and macroscopic scales. We have utilized these platforms to demonstrate the first sequential and spatially varied delivery of multiple cell lines from a single gel, as well as the controlled release of a functional chemotherapeutic in response to disease-associated cues. We expect that these platforms will find great utility in targeted drug delivery, where release of therapeutics, proteins and cells can be confined to sites of disease with high selectivity, as well as in applications for diagnostics, tissue engineering and regenerative medicine.

Methods

Synthesis and characterization of logic cross-linkers. For complete details of all logic cross-linker syntheses and characterization, see Supplementary Methods 1–21. Briefly, peptides were generated by standard microwave-assisted Fmoc solid-phase liquid-liquid chromatography (RP-HPLC, Dionex Ultimate 3000, C18 column). Peptide-based cross-linkers were characterized by MALDI-TOF mass spectrometry (Bruker AutoFlex II).

Assessing solution-based cross-linker degradation in response to external stimuli. Each cross-linker species (40 nmol) was dissolved in MMP buffer (110 µM 200 mM sodium chloride, 50 mM tris, 15 mM calcium chloride, 1 mM zinc chloride, pH4 adjusted to 7.5 with hydrochloric acid) and exposed to each unique combination of enzyme, reductant and light. Reactions were initiated by mixing MMP buffer (170 µl) in a 96-well plate for 48 h and samples were incubated overnight at 37 °C. Peptide solutions were collected and diluted (1:1) with 2x Dulbecco’s modified Eagle’s medium. Cell cultures were cultured in this mixture (150 µl) in a 96-well plate for 48 h (beginning 24 h after HeLa seeding at 2 × 10⁶ cells per well) after which cell culture density was quantified with a PicoGreen Assay (ThermoFisher). Complete experimental details are provided in Supplementary Methods 29.

Hydrogel treatment and visualization. Hydrogels (130 µm thickness) were formulated with three distinct logically degradable regions, each labelled with a unique fluorophore: (1) R=E=G cross-linker with hS5-GFP (2 mM) and a logic peptide cross-linker (4 mM) in MMP buffer (reacted for 60 min, 25 °C). Hydrogels were washed in MMP buffer. Every logic material was treated with each unique input combination in experimental triplicate, as described above. The extent of gel degradation was assessed by supernatant fluorescence quantification (SpectraMax M5; excitation, 570 nm; emission, 610 nm; emission cutoff filter, 590 nm). Complete experimental details are provided in Supplementary Methods 27.

Data availability. The characterization data and experimental protocols for this work are available within this manuscript and its associated Supplementary Information, or from the corresponding author upon request.
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Author contributions

B.A.B. and C.A.D. conceived and designed the experiments. B.A.B., M.P.C., C.K.A. and J.A.S. performed the experiments. B.A.B. and C.A.D. analysed the data and prepared the figures. B.A.B. and C.A.D. wrote the paper.

Additional information

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Competing financial interests

The authors declare no competing financial interests.