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Authors

Williams, Sierra J
Prescher, Jennifer A

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Building biological flashlights: Orthogonal luciferases and luciferins for in vivo imaging

Sierra J. Williams[†], Jennifer A. Prescher^{†,‡,§}

[†]Departments of Chemistry, University of California, Irvine, Irvine, CA, USA 92697

[‡]Molecular Biology & Biochemistry, University of California, Irvine, Irvine, CA, USA 92697

[§]Pharmaceutical Sciences, University of California, Irvine, Irvine, CA, USA 92697

Conspectus

Bioluminescence is widely used for real-time imaging in living organisms. This technology features a light-emitting reaction between enzymes (luciferases) and small molecule substrates (luciferins). Photons produced from luciferase-luciferin reactions can penetrate through heterogeneous tissue, enabling readouts of physiological processes. Dozens of bioluminescent probes are now available and many are routinely used to monitor cell proliferation, migration, and gene expression patterns *in vivo*.

Despite the ubiquity of bioluminescence, traditional applications have been largely limited to imaging one biological feature at a time. Only a handful of luciferase-luciferin pairs can be easily used in tandem, and most are poorly resolved in living animals. Efforts to develop spectrally distinct reporters have been successful, but multispectral imaging in large organisms remains a formidable challenge due to interference from surrounding tissue. Consequently, a lack of well-resolved probes has precluded multi-component tracking. An expanded collection of bioluminescent probes would provide insight into processes where multiple cell types drive physiological tasks, including immune function and organ development.

We aimed to expand the bioluminescent toolkit by developing *substrate*-resolved imaging agents. The goal was to generate multiple orthogonal (i.e., non-cross-reactive) luciferases that are responsive to unique scaffolds and could be used concurrently in living animals. We adopted a parallel engineering approach to genetically modify luciferases to accept chemically modified luciferins. When the mutants and analogs are combined, light is produced only when complementary enzyme-substrate partners interact. Thus, the pairs can be distinguished based on substrate selectivity, regardless of the color of light emitted. Sequential administration of the luciferins enables the unique luciferases to be illuminated (and thus resolved) within complex environments, including whole organisms.

This Account describes our efforts to develop orthogonal bioluminescent probes, crafting custom luciferases (or “biological flashlights”) that can selectively process luciferin analogs (or “batteries”) to produce light. In the first section, we describe synthetic methods that were key to

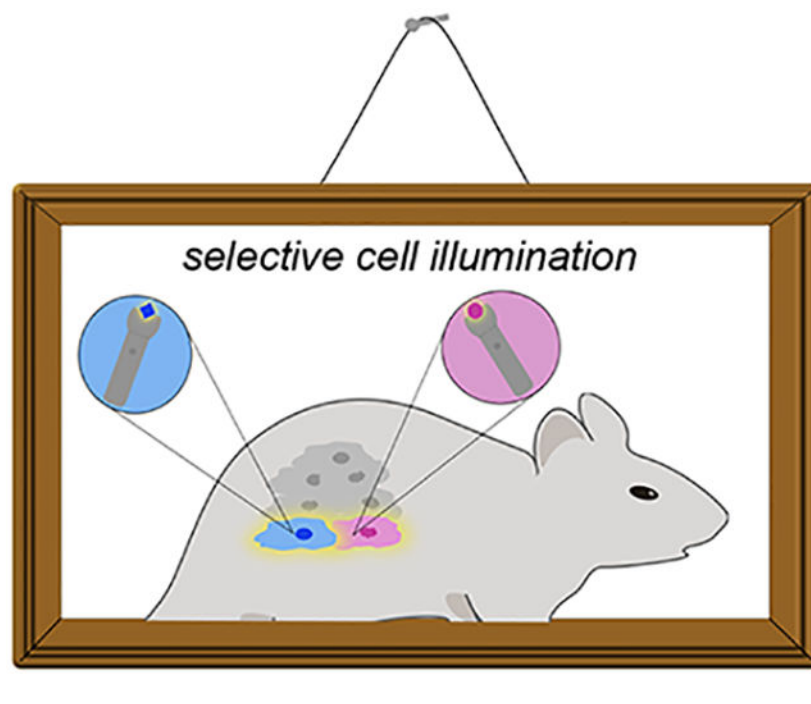
Corresponding Author: jpresche@uci.edu.

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accessing diverse luciferin architectures. The second section focuses on identifying complementary luciferase enzymes via a combination of mutagenesis and screening. To expedite the search for orthogonal enzymes and substrates, we developed a computational algorithm to sift through large data sets. The third section features examples of the parallel engineering approach. We identified orthogonal enzyme-substrate pairs comprising two different classes of luciferins. The probes were vetted both in cells and whole organisms. This expanded collection of imaging agents is applicable to studies of immune function and other multi-component processes. The final section of the Account highlights ongoing work toward building better bioluminescent tools. As ever-brighter and more selective probes are developed, the frontiers of what we can “see” *in vivo* will continue to expand.

Graphical Abstract



Introduction

Bioluminescence is a powerful imaging modality for monitoring molecular and cellular features in real time.¹⁻³ This technology relies on a chemical transformation: the luciferase-catalyzed oxidation of small molecule substrates (luciferins). Bioluminescent reactions release light that can penetrate skin and some tissues, enabling sensitive imaging *in vivo*.² Virtually no background signal exists, as mammals do not emit large numbers of detectable photons. Several luciferases have been co-opted as biological “flashlights”—powered by luciferin “batteries”—in whole organisms. The most popular pair originates from the firefly.⁴⁻⁶ Firefly luciferase (Fluc) catalyzes the oxidation of D-luciferin (D-luc), releasing primarily yellow-green light (Figure 1A). The reaction also generates a sufficient number of red (i.e., tissue-penetrant) photons, enabling physiological processes to be noninvasively

tracked.¹ Indeed, Fluc and D-luc have been used for decades to monitor gene expression, cell proliferation, and other activities in live rodents.^{2,7-8}

While both versatile and ubiquitous, bioluminescence has been largely restricted to monitoring one feature at a time in whole organisms.¹ Only a handful of luciferase-luciferin pairs have been optimized for imaging *in vivo*, and most cannot be easily distinguished in thick tissue.⁶ For example, dozens of unique luciferases have been characterized from the insect family alone.⁹ All use D-luciferin in the light-emitting reaction and exhibit broad emission spectra, though, making them difficult to resolve in heterogeneous environments.¹⁰ More spectrally discrete probes have been generated via enzyme engineering and modifications to the D-luciferin core.^{6,10} However, distinguishing these probes by wavelength alone remains challenging in small animals. Only a tiny fraction of the photons (>650 nm) can effectively escape tissue for detection, and the perceived color is dependent on the depth of the source.

Instead of color resolution, multi-component bioluminescence can be readily achieved via substrate resolution, using luciferases that respond to unique luciferins. For example, luciferases that process D-luciferin (e.g., Fluc) are easily distinguished from those (e.g., *Renilla* luciferase or *Gaussia* luciferase) that use coelenterazine, the bioluminescent substrate found in marine species (Figure 1B). In fact, Fluc and *Renilla* luciferase (Rluc) have been used in tandem for decades and remain a popular pair for two-component imaging.¹¹⁻¹² Rluc emits primarily blue light, further enabling it to be spectrally distinguished from Fluc *in vitro*.¹³ Blue light is poorly tissue penetrant, though, so Rluc and related marine luciferases have historically been less employed *in vivo*. Red-shifted variants of these enzymes are available for cellular imaging,¹⁴⁻¹⁷ and some of these reporters can enable more sensitive imaging in rodents and other organisms.¹⁸⁻²⁰ The requisite small molecules still have liabilities, though, owing to poor pharmacokinetic properties.²¹⁻²² While efforts to develop more soluble and bioavailable analogs have been fruitful,^{20,23} multi-component bioluminescence imaging *in vivo* with these and other probes is far from routine.

We were inspired to expand the set of biological flashlights and batteries for multicellular imaging, building on the platform of orthogonal substrate usage. Hundreds of unique luciferase-luciferin pairs exist among diverse phyla.^{9,24-26} In theory, these pairs could be co-opted for multiplexed imaging, using distinct luciferins to selectively illuminate the cognate luciferases. Many naturally occurring bioluminescent probes are ill suited for use *in vivo*, though, owing to poor substrate accessibilities, non-optimal photon outputs, or other factors. Instead of re-purposing these native biomolecules, we focused on crafting artificial enzymes and substrates. The most tractable and tissue-penetrant bioluminescent pair—Fluc and D-luciferin—provided an initial blueprint. We aimed to reengineer Fluc to accept chemically unique luciferins (Figure 2). Robust signal would only be observed when complementary (i.e., “orthogonal”) enzyme-substrate partners interact. This approach would more rapidly expand the collection of bioluminescent probes and enable multi-component imaging in small animals.

This Account highlights our efforts to produce orthogonal luciferase-luciferin pairs. We used a parallel engineering strategy, modifying Fluc and D-luc in tandem. Key to the success of the approach was accessing an array of structurally diverse luciferin analogs. From this pool, luciferases that were uniquely responsive to individual luciferins could be identified via iterative screening and computational analysis. The first part of the Account outlines our approach to rapidly access luciferin analogs. The second part describes our enzyme engineering efforts, including methods to produce and screen mutant libraries. We also discuss computing methods to efficiently identify substrate-selective luciferases. We showcase how concurrent enzyme and substrate engineering was used to generate different classes of orthogonal bioluminescent probes. Finally, we discuss ongoing challenges in building designer flashlights and batteries. The continued refinement of existing probes—and the development of new ones—will enable multi-component studies. Such expanded imaging capabilities are likely to spur new discoveries in a variety of disciplines.

Designing and synthesizing luciferin “batteries”

Generating orthogonal bioluminescent probes requires facile access to unique luciferin scaffolds. High levels of structural diversity were envisioned to expedite the production of orthogonal pairs. The more differentiated the substrates, the easier the search for exquisitely selective enzymes. Gram-scale quantities of analog were also desired, as enzyme screens and directed evolution methods typically require large quantities of substrate. At the outset of our work, traditional methods to produce D-luciferin were lengthy, low yielding, and refractory to late-stage modification.²⁷ Most syntheses relied on the formation of a key cyanobenzothiazole intermediate, followed by condensation with D-cysteine (Figure 3A). This latter step enabled efficient installation of the requisite stereocenter, but accessing the benzothiazole itself required multiple steps and harsh conditions.^{28–29} Many of the steps were also incompatible with functional groups that we intended to append to the luciferin core.

To circumvent the limitations of traditional luciferin synthesis, we devised an alternative method to access the cyanobenzothiazole intermediate. The route features a dithiazolium chloride reagent, known as Appel's salt (Figure 3B).³⁰ This material has been used to produce a wide variety of substituted heterocycles, including quinazolines and benzothiazoles, from aromatic amines.^{31–34} We reasoned that Appel's salt could similarly provide rapid access to cyanobenzothiazoles, key precursors en route to luciferin scaffolds. Indeed, many substituted anilines could be readily condensed with Appel's salt and subsequently fragmented with DBU, phosphines, or other nucleophiles, to provide cyanothioformamides in high yield.^{35–36} These intermediates were readily cyclized via C-H activation to provide cyanobenzothiazoles. The fragmentation and cyclization steps could also be performed in a single pot,³⁷ further simplifying the process. Condensation of the cyanobenzothiazole intermediate en route to D-luc provided the desired substrate in 40–60% overall yield. In addition to improving the yield, the streamlined route was scalable. We have routinely synthesized the cyanobenzothiazole intermediate in >10 g quantities.

The Appel's salt methodology not only enabled facile access to D-luc, but also several analogs for orthogonal probe development. We and others have used the chemistry to

produce a variety of heterocyclic probes (Figure 4A).^{35,37–39} Some examples include benzimidazole and benzoxazole luciferins. These scaffolds were easily accessed from the corresponding ortho-substituted anilines via Appel's salt condensation and cyclization.^{35,38} Alkyl-substituted luciferins were also readily synthesized from commercially available starting materials (Figure 4B).³⁵ Moreover, a large number of analogs could be prepared via late-state functionalization of the cyanobenzothiazole intermediates.^{40–41} Being able to rapidly access a diverse array of luciferin architectures was critical to the development of substrate-selective bioluminescent tools.

To determine which luciferin analogs would be most useful for orthogonal imaging, we benchmarked their activities using standard light emission assays. All of the substrates exhibited reduced photon outputs with Fluc compared to the native substrate, D-luc.^{35,40} Low levels of light emission were encouraging, as they suggested that the analogs were occluded from the active site or poorly turned over. However, it was also possible that the luciferins were simply weak light emitters and thus not good candidates for imaging *in vivo*. To discriminate among these possibilities, we used a traditional chemiluminescence assay.^{40–41} The assay mimics the Fluc reaction (but in the absence of enzyme), providing a readout on the inherent light-emitting ability of a luciferin. While most of the molecules were only weakly bioluminescent, chemiluminescence measurements revealed that they were capable of robust emission. The analogs were thus good candidates for orthogonal probe development. We just needed to identify mutant luciferases capable of tapping into their light-emitting potential.

Identifying luciferase “flashlights”

We envisioned that substrate-selective luciferases could be found by iteratively screening large pools of mutant enzymes. Similar methods have been used to engineer luciferases with improved thermostability, altered wavelengths of emission, and other properties. Altered substrate specificity has been achieved for some marine luciferases, using screens of mutants with designer coelenterazine analogs.^{18,23,42–44} Changing the substrate bias of Fluc is perhaps less straightforward, as the enzyme carries out a multi-step reaction and few crystal structures exist to guide engineering efforts.^{45–47} Docking analyses and other biochemical studies suggested that certain amino acids were prime targets for mutagenesis, although none were “gatekeeper” residues *per se*.^{48–49} Fluc can also tolerate a variety of modified substrates in the light-emitting reaction, suggesting that exquisite selectivity might be difficult to achieve.

While identifying *multiple* orthogonal enzymes and substrates would require a larger number of screens, the process seemed straightforward: generate large collections of mutant luciferases, screen for functional enzymes via light emission, and check for luciferin specificity among the “hits”.⁴⁰ Further refinements in light output or substrate selectivity could then be achieved via additional rounds of mutagenesis and screening (i.e., directed evolution). Indeed, we have employed this general workflow to generate dozens of orthogonal bioluminescent probes. The paragraphs that follow provide additional details on the screens, and the next two sections showcase its application toward identifying substrate-selective luciferases with different classes of luciferins.

Luciferase screening required access to unique, yet functional, mutant enzymes. Toward this end, we employed site-saturation mutagenesis and other techniques to introduce diversity within the enzyme framework. Residues were initially targeted based on sequence homology within the insect luciferase family, previous biochemical assays, and proximity to bound luciferins (Figure 5).^{50–52} Mutations at these sites could potentially modulate analog binding or turnover. Libraries were produced using standard cloning methods and codon compression techniques.^{53–55} Library sizes were purposefully kept small (19–6,860) to enable complete coverage in screening.

The mutant libraries were subjected to a two-tier screen to identify orthogonal pairs. Mutants were initially examined on-plate following transformation of library DNA into *E. coli*. In some cases, the bacteria were grown on luciferin-embedded agar. In other cases, the analog was directly sprayed onto the cells. Both approaches consumed large amounts of luciferin, so having access to multi-gram quantities of analog was critical. Light-emitting colonies were ultimately detected using a cooled CCD camera. Glowing cells were collected and expanded in 96-well plates. The mutant “hits” were then treated with various luciferins in a secondary assay to identify substrate-selective luciferases.⁴⁰ This two-tiered approach enabled efficient identification of orthogonal probes as the on-plate analyses rapidly eliminated the vast majority of non-functional enzymes. The initial screen also weeded out luciferins that were cell impermeable, toxic, or otherwise poorly suited for biological imaging. The key parameter—substrate orthogonality—could then be assayed in a more controlled secondary screen, normalizing for differences in expression levels and compound transport. Head-to-head comparisons of analog utilization by mutant enzymes could also be performed.

Finding flashlights for electronically modified batteries

Our initial efforts to craft orthogonal bioluminescent tools focused on D-luciferin analogs comprising different heteroatoms. We were attracted to these compounds as they were easily accessible and likely to be competent light emitters. Indeed, Branchini and others previously demonstrated that quinoline and other heterocyclic variants could function as bioluminescent substrates with Fluc.^{56–57} Inspired by this work, we explored whether simple heteroatom replacements to the D-luciferin core could elicit orthogonality. Benzimidazole and imidazoline scaffolds were first targeted. These molecules comprised nitrogen atoms in place of sulfurs. We hypothesized that such swaps would sufficiently perturb Fluc processing, but that proper binding and light emission could be restored with a mutant. When the nitrogenous luciferins were incubated with Fluc, reduced photon outputs were observed. The analogs also emitted distinct colors (Figure 6A), similar to other heterocyclic luciferins.^{56–57}

To determine if complementary luciferases could be identified for these scaffolds, we screened the analogs against a small library of mutant enzymes (where mutations were confined to the luciferin binding site of Fluc). Unique patterns of light emission were observed (Figure 6B), suggesting that some luciferases could differentially process the substrates.⁵⁸ The experiment also indicated that even *subtle* structural modifications would be sufficient to elicit orthogonality. Further efforts to characterize and optimize the

orthogonal enzymes were complicated, though, owing to the suboptimal permeability and weak light output of the benzimidazole analogs.

In a quest to find not only orthogonal, but also robust light emitters, we turned our attention to pyridone scaffolds. These motifs are commonly found in natural products and drug-like molecules, suggesting that they are sufficiently biocompatible and cell permeable.^{59–60} We also reasoned that pyridone analogs could function as canonical luciferins. D-Luc and related molecules undergo proton transfer reactions in the excited state.^{61–62} In the case of the pyridone, deprotonation would provide a fully aromatic luminophore (Figure 7A). We synthesized two pyridone analogs (5'-PyrLuc and 7'-PyrLuc) using the Appel's salt methodology.⁶³ Both isomers were found to be competent light emitters with Fluc. Importantly, the analogs were significantly more robust than the benzimidazole probes. The pyridones were also sufficiently bright and cell permeable to image Fluc-expressing cells. While suitable for biological imaging, the pyridone luciferins were surprisingly poor binders of Fluc (>100-fold higher apparent K_M values than D-luc). We aimed to identify luciferases that could better process the analogs, and library screens revealed two mutants that exhibited 10–80 fold improved photon outputs (Figure 7B).⁶³ The K_M values measured for both enzymes, though, were similar to that of Fluc, suggesting that the mutated residues improved substrate turnover rather than binding.

We further attempted to identify orthogonal luciferases capable of selectively processing the pyridone analogs. No such enzymes were found in our initial screens. However, mutants were identified that could readily discriminate the 7'-pyridone analog from more structurally divergent luciferins. When the pyridone scaffold was screened alongside 10 other luciferins, two mutants were identified that could distinguish 7'-PyrLuc from a brominated luciferin, 4'-BrLuc.⁶⁴ Subsequent mutagenesis studies revealed that residues N229, S239, G246, and F250 were responsible for substrate discrimination. Mutants comprising G246A, in particular, were found to be selective for 4'-BrLuc. Other mutations that conferred selectivity for the brominated analog (N229T and F250A/C/G) were also identified. Interestingly, mutations at N229 and F250 alone did not result in substantially altered substrate preference. The combination exhibited a significant change in luciferin use. This example highlights the power of functional screens, as the key mutations at N229 and F250 would have been unlikely predictions from purely structure-guided approaches.

Finding flashlights for sterically modified batteries

Perhaps a more fruitful and conceptually straightforward approach to developing orthogonal pairs involves placing “bumps” on substrates, and identifying mutant enzymes (with “holes”) to accommodate the modifications. While the bump-hole analogy does not perfectly apply to luciferases and luciferins (see above), steric modifications to D-luc were envisioned to perturb Fluc processing. Mutants that tolerate the extra bulk could restore light production. When contemplating which sites to modify on D-luciferin, we shied away from C6'. Fluc is known to tolerate many appendages at this site,^{65–66} so adding diversity here was less likely to result in selective enzymes. We instead focused on C4' and C7'. These positions lie in close proximity to enzyme residues (based on docking studies, Figure 8B).

Thus, steric modifications at these sites could potentially engender a clash with the native enzyme, but be tolerated by a more promiscuous mutant.

Similar to earlier examples, identifying orthogonal pairs with sterically modified analogs required large quantities of candidate substrates. Both C4'- and C7'-modified luciferins were readily accessed from common cyanobenzothiazole intermediates (prepared via Appel's salt, Figure 8A). C4'-modified substrates were ultimately accessed via a benzylic bromination/S_N2 displacement sequence. C7'-modified substrates were prepared using Mannich chemistry. Both routes enabled halogens and a variety of other modifications to be efficiently installed.⁴⁰ Nearly all of the C4' and C7' analogs emitted light with Fluc, although signals from bulkier compounds were quite dim (Figure 8C). Even these weak-emitting compounds were good candidates for orthogonal probe development, though, based on chemiluminescence assays.⁴⁰

To search for enzymes that could process the steric analogs, we again screened mutant libraries using a two-tiered approach. Functional mutants were first identified on agar plates, and then secondary assays were used to analyze the substrate preference of the "hits". After an initial screen of ~140 mutants with 6 compounds (Figure 5), we could already identify enzyme pairs with unique substrate preference.⁴⁰ In most cases, mutants that could process C4'-modified analogs were dim with C7'-modified compounds (and vice versa). The differential between "matched" and "unmatched" partners was typically >10-fold. This result was encouraging, as further rounds of mutagenesis could only improve the selectivity.

The most resolved pair identified from the initial screen comprised 4'-MorphoLuc and 7'-DMAMELuc. These substrates were preferentially processed by mutants 81 and 37, respectively (Figure 9A). Selective light emission was verified *in vitro*, using purified enzymes. Orthogonal light emission was also observed *in cellulo*. Cell populations expressing either mutant 81 or 37 were treated with the individual luciferins.⁴⁰ Light emission was observed only from cells expressing the complementary luciferase. The utility of the engineered pair was further assessed *in vivo*. Two different cell populations, each expressing either mutant 81 or 37, were implanted in opposing flanks of a mouse (Figure 9B). Upon injection of 4'-MorphoLuc, cells expressing mutant 81 were visible. Once the signal dissipated, 7'-DMAMELuc was administered, and cells expressing mutant 37 were illuminated.⁶⁷

While the initial orthogonal pairs could be differentiated in a variety of environments, they exhibited weaker photon outputs compared to native bioluminescent systems. We have since identified "brighter" orthogonal imaging tools from library screens. One pair comprises 4'-BrLuc and D-luc, two compounds that are selectively processed by mutants 51 and 93, respectively. Both substrates are robust light emitters, cell permeable, and stable *in vivo*. Indeed, this combination of analogs enabled more facile two-component imaging in rodents. Cells expressing either mutant 51 or 93 were implanted in mice.⁶⁷ Sequential administration of the complementary luciferins resulted in selective illumination of each "matched" pair. The light emission intensities were markedly higher than other orthogonal probes, and within the same order of magnitude as Fluc/D-luc. Further improvements in light output can likely be achieved via directed evolution.

While our screening studies have revealed a number of orthogonal pairs, the origins of selectivity remain a mystery in most cases. Structural analyses are underway, but insect luciferases are notoriously difficult to crystallize. Sequencing analyses revealed that certain mutations were hotspots for specific substrates. For example, F250M mutations typically favored 4'-MorphoLuc.^{40,64} This result could suggest that structural changes create more room for steric appendages. Our data set also revealed that the “best” orthogonal pairs comprise structurally divergent compounds (i.e., C4'-modified luciferins with C7'-modified luciferins).⁶⁷ These substrates likely interact differently with the enzyme, making it easier to achieve orthogonality. Selectivity is thus achieved by destroying light emission with “unmatched” partners, versus making the complementary pair brighter. This trend suggests that the fastest way to expand the collection of orthogonal probes is to screen among more and more structurally diverse luciferins and luciferases.

Expediting the search for viable orthogonal flashlights

The orthogonal probes described thus far were handpicked from a large compilation of screening data. Such manual searches could potentially miss key enzyme-substrate pairs, and they become unwieldy as the data set expands. For example, screening a relatively small collection of mutants (~150) and analogs (~10) generated >800,000 possible combinations; a data set of this size was impractical to analyze manually.⁶⁷ To expedite the search, we turned to a data-mining approach. We first defined substrate specificity as a numerical quantity (e.g., “orthogonality”) using a simple mathematical relationship (Figure 2A).⁶⁷ This equation formed the basis of a computer script to cross-compare light emission values within the data set and rank pairs based on “orthogonality scores”. Higher numbers correlated with more substrate-specific pairs. This fast and simple algorithm rank-ordered 1,000 combinations in fewer than 30 minutes. Over 300 pairs exhibiting >25-fold substrate selectivity were identified, and 175 were validated in lysate, confirming the success of the approach.⁶⁷ Importantly, the algorithm provides a method to rapidly hone in on promising orthogonal probes and continuously mine an ever-expanding data set. As new candidate pairs are generated from future screens, they can be assayed against previous hits.

The search for additional orthogonal probes is also benefitting from access to more functional luciferase variants. Active-site targeted libraries comprise a high number of non-functional variants, as many mutations have a deleterious impact on enzyme catalysis.⁶⁸ Eliminating such mutants from candidate libraries enables more rapid identification of desirable enzymes. The Leconte laboratory recently applied a statistical coupling analysis (SCA) method to produce luciferase pools enriched with functional mutants.⁶⁴ SCA identifies amino acids that are functionally important and likely possess synergistic interactions, which are desirable for library design.⁶⁹ Residues for mutagenesis were identified from sequence alignments of luciferase homologues. In total, 14 residues located in and around the Fluc active site were targeted. Intriguingly, many of these residues had been previously identified as “hot spots” for orthogonal enzyme development.^{40,67} The SCA-focused libraries were screened with a panel of luciferin analogs, and luciferases were identified that were not only substrate specific, but that also exhibited other desirable features, including red-shifted emission and thermostability.⁶⁴

Expanding the number of viable flashlights

Multi-component imaging requires more than two orthogonal enzymes and substrates. When we attempted to mine our screening data for a triplet set of luciferases and luciferins, we exceeded the computing capacity of standard processors. Searching for an orthogonal triplet alone (via orthogonality score) required more than one billion comparisons. To simplify the search, we turned to a matrix algebra approach.⁶⁷ Enzyme-substrate combinations were represented as vectors in n dimensions (Figure 9C). Perfect orthogonality was then defined as the identity matrix. Triplet combinations that were closest to perfection (as assessed by root-mean-square distance) ranked highest. Using this approach, the algorithm predicted 6,171 potential triplet sets that were mutually orthogonal. The top triplet set comprised two C4'-modified luciferins, both with unique steric perturbations, and a C7'-modified analog (Figure 10). When the luciferins were incubated with their "matched" luciferases, selective light emission was observed. The matrix-mining algorithm is further applicable to searching for quadruplet, quintet, and other higher order sets, and work along these lines is ongoing.

Towards building better and bri flashlights

Although we were able to identify luciferase mutants that confer substrate bias, the gains often came at the expense of other enzymatic parameters, including thermostability and turnover.^{40,64} An ongoing challenge is to improve the fitness of the engineered enzymes. Directed evolution approaches will be useful in this regard,⁷⁰ and many of the orthogonal pairs are currently being optimized for enhanced brightness and stability. Machine learning approaches and deep mutational scanning analyses will also provide insight into how mutations affect the fitness landscape of luciferases and thus guide probe development.

Designing bioluminescent tools that are "brighter" and emit more red-shifted light will be advantageous for *in vivo* imaging. The Fluc-catalyzed oxidation of D-luc and most other analogs emits only a fraction for tissue-penetrant light. More deep tissue targets could be visualized if the orthogonal probes produced substantially more red photons.¹⁰ Several groups have addressed this issue by expanding the π -conjugation of D-luc.⁷¹⁻⁷⁴ Many of these analogs are poorly processed by Fluc, though, such that the gains in red color are offset by low photon counts. In some cases, the intensities can be recovered using mutant enzymes.^{72,75} Such optimized bioluminescent probes have recently enabled noninvasive imaging of brain tissue in marmosets, highlighting the power of parallel engineering.⁷⁵ Ongoing efforts to enhance substrate turnover rates will further enhance the brightness and sensitivity of the designer probes.

Additional gains in orthogonal probe development will come from screening more drug-like luciferins. Relatively high concentrations of D-luc and related analogs are typically required for bioluminescence imaging. More bioavailable luciferins would thus be advantageous. Brominated luciferins are attractive probes for this purpose, as they are "bright" and quite cell permeant.⁴¹ Swapping the hydroxyl group on D-luc for an amino or alkylamino group is also attractive. Miller and coworkers have shown that cyclic aminoluciferin analogs are robust emitters with favorable biodistribution properties.⁷⁶⁻⁷⁷ Small modifications to the aminoluciferin cores were also readily discriminated by mutant luciferase enzymes, enabling

further orthogonal probe development.^{78–79} These and other structurally diverse luciferases²⁰ will accelerate the search for larger collections of substrate-resolved luciferins.

Multiplexed bioluminescence will also benefit from improved imaging protocols. Our initial approach involves sequential administration of substrates, with a long delay between each delivery. Images are typically acquired with open filters (to capture all photons), such that the second compound cannot be administered until signal from the first substrate clears. In small animal models, the time delay is typically >8 hours. Methods to speed the delivery are necessary, and work along these lines is ongoing in our laboratory and others. We anticipate that modern machine learning algorithms can be used to deconvolute patterns of bioluminescent signal in a streamlined fashion. Such approaches could shorten imaging times from days to minutes, and eliminate the need for perfect orthogonality.

Summary and outlook

Bioluminescence is a cornerstone technology for noninvasive imaging *in vivo*. This technique has been widely employed to track cell proliferation, gene expression, and enzymatic activities, among other features. The list of imaging targets will continue to grow as new and improved bioluminescent probes are developed. The past decade alone has witnessed a surge in engineered luciferases and luciferins for numerous applications.

Despite recent advances, bioluminescence has been difficult to employ for multi-component imaging. A lack of suitable probes has largely relegated the technique to visualizing one cell or feature at a time. To expand the number of probes, we have adopted a parallel engineering approach. This strategy involves crafting Fluc mutants that can selectively process structurally diverse luciferins (i.e., orthogonal pairs). As a starting point, we focused on electronically and sterically modified luciferins. We developed scalable and divergent methods to access a variety of luciferin analogs. Most were poor bioluminescent light emitters, but inherently capable of robust emission. Enzymes to selectively process the analogs were identified by screening mutant luciferase libraries. The search for such biological “flashlights” and “batteries” was enhanced using computational algorithms, and the pairs characterized to date are functional in a wide range of environments.

Identifying expanded sets of orthogonal bioluminescent tools will benefit from advances on several fronts. Robust and scalable syntheses are necessary to access an even greater number of diverse luciferin architectures. More functional libraries and screening strategies are also required to expedite the search for bright, unique probes. A larger collection of optimized luciferase-luciferin pairs will enable multiple cell types and biological features to be visualized in tandem. Such studies promise to illuminate more complex facets of biology. Moreover, lessons learned from bioluminescent probe development should be broadly applicable to other families of enzymes, where access to unique substrates and orthogonal functions is desired.

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BIOGRAPHICAL INFORMATION

Sierra J. Williams obtained her Bachelor's of Science in Chemistry from Temple University in 2016. She is currently a Ph.D. candidate in the Prescher laboratory at UC Irvine. Her thesis research involves engineering novel bioluminescent probes for multi-component imaging.

Jennifer A. Prescher is a Professor of Chemistry, Molecular Biology and Biochemistry, and Pharmaceutical Sciences at UC Irvine. She earned her Bachelor's of Science in Chemistry at the University of Wisconsin—La Crosse. She obtained her Ph.D. in Chemistry at UC Berkeley in 2006. At Berkeley, Prescher worked with Prof. Carolyn Bertozzi to designing and employ bioorthogonal chemistries to monitor changes in cell surface glycosylation. Prescher conducted postdoctoral research in molecular imaging with Prof. Christopher Contag at Stanford University. In 2010, she joined the faculty at UC Irvine. Her current research focuses on developing chemical tools and noninvasive imaging strategies to interrogate biological processes.

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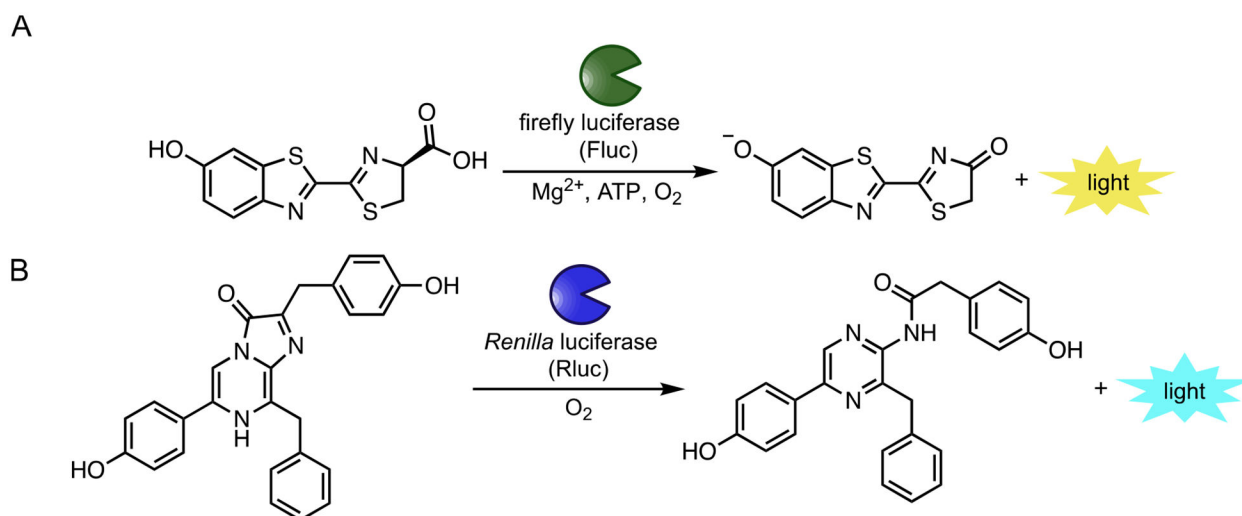


Figure 1. Popular bioluminescent enzymes and substrates. (A) Insect luciferases (including Fluc) catalyze the oxidation of D-luciferin (D-luc), resulting in photon production. (B) Marine luciferases (including Rluc) produce blue light via oxidation of coelenterazine substrates

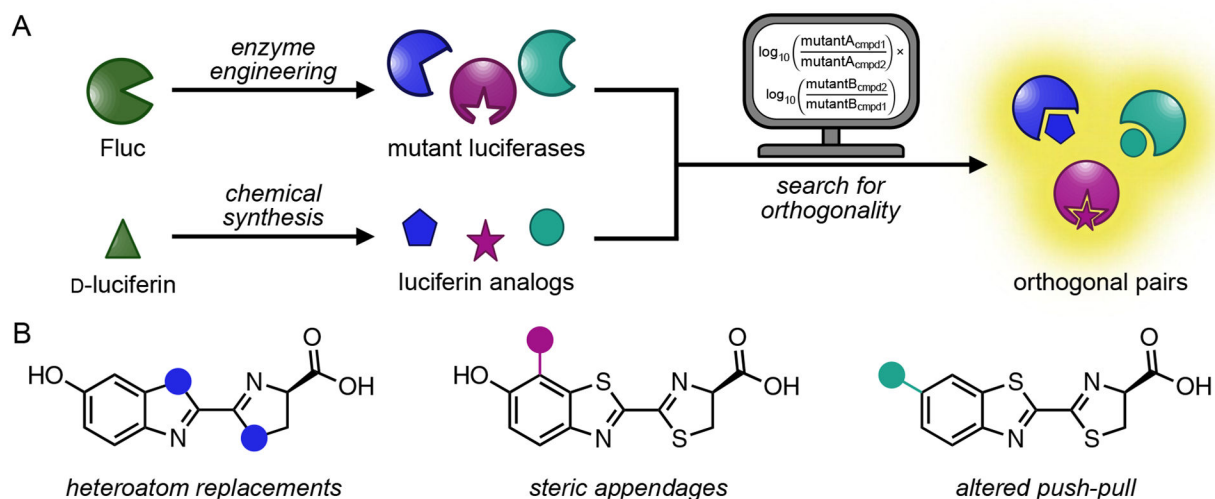


Figure 2. Bioluminescent probes for multi-component imaging. (A) Parallel engineering of luciferase enzymes and luciferin analogs to generate orthogonal pairs. A computational algorithm assists in the search for compatible imaging probes. (B) Sample classes of luciferin analogs targeted for orthogonal probe development. Blue, magenta, and teal dots represent unique modifications to the luciferin core. Part (A) was adapted with permission from ref. 67. Copyright 2017 American Chemical Society.

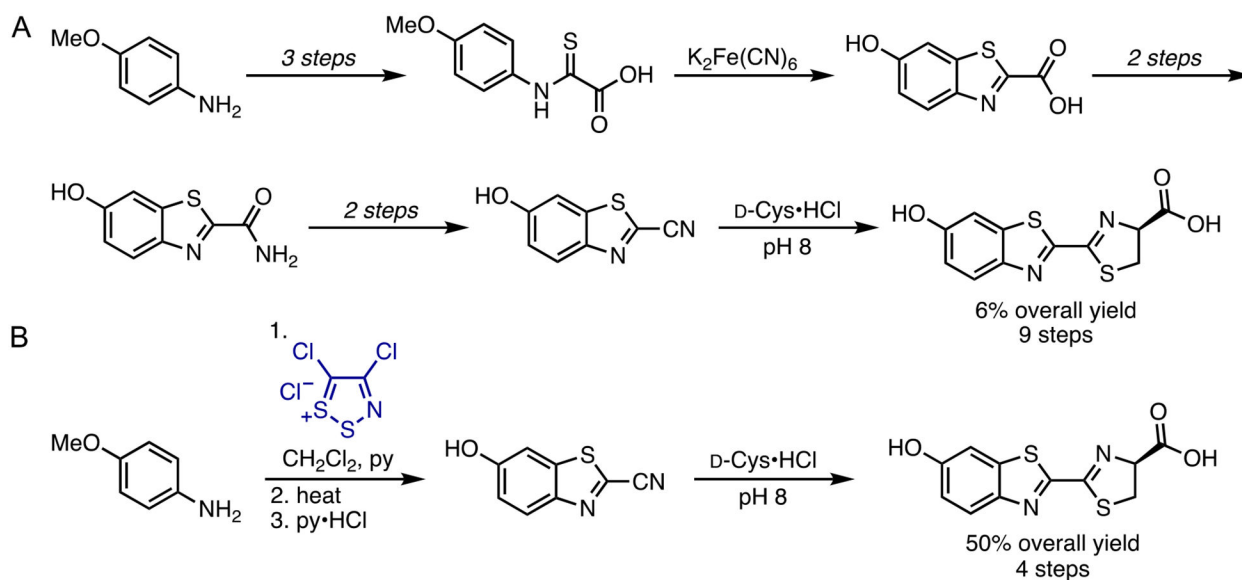
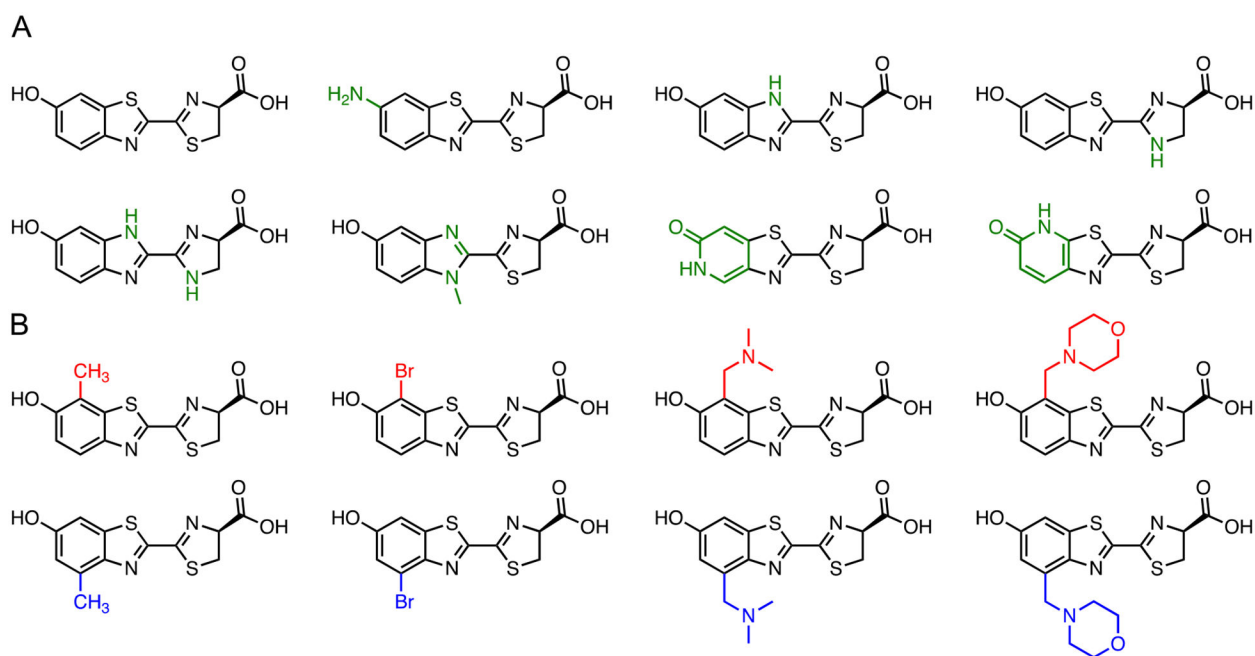


Figure 3. Methods to produce D-luc. (A) Traditional syntheses to form the key benzothiazole core. (B) A streamlined method to produce D-luc using Appel's salt (blue). Both routes comprise a condensation reaction with D-cysteine as the final step.

**Figure 4.**

Diverse luciferin architectures synthesized with Appel's salt. Representative scaffolds with (A) unique heteroaromatic cores (green) and (B) steric modifications are pictured. Unique C7' modifications are shown in red and C4' modifications are shown in blue

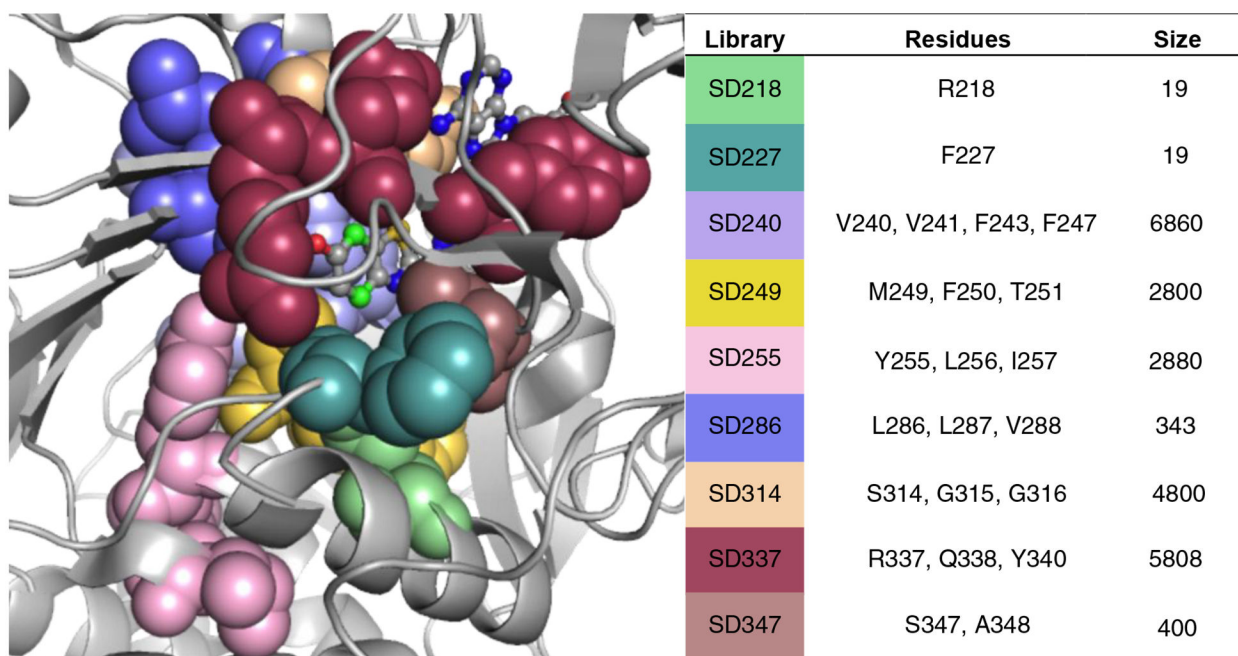


Figure 5. Luciferases screened to identify orthogonal probes. Mutant libraries were prepared using site-saturation mutagenesis. Library sizes varied based on the degree of saturation enforced at each residue. Such determinations were made based on sequence conservation among the insect luciferase family and residue location. Targeted residues are colored, and most lie in close proximity to the bound luciferin (PDB: 4G36).

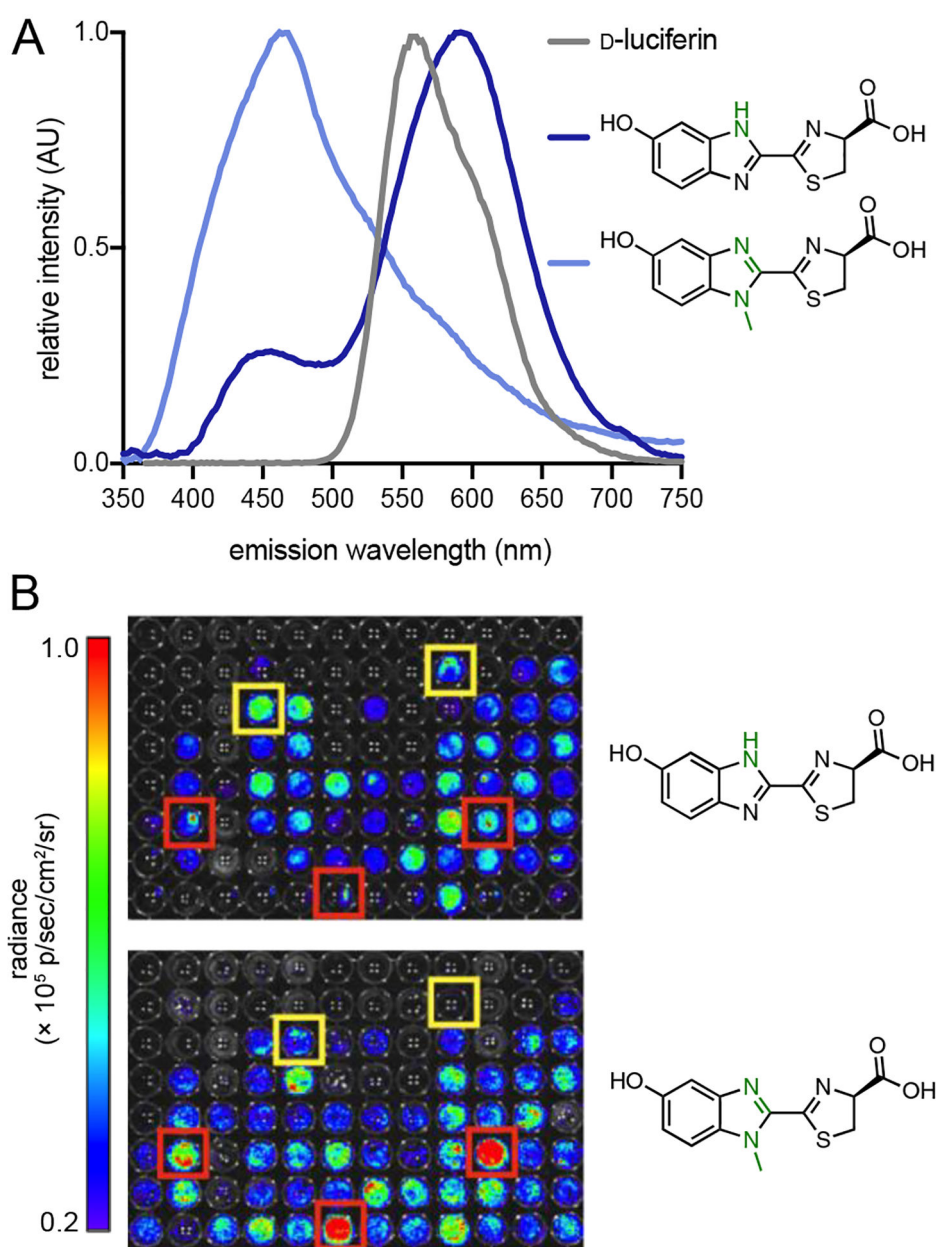


Figure 6. Benzimidazole luciferins exhibit unique patterns of light emission with Fluc and mutant luciferases. (A) Bioluminescent spectra of the analogs (blue) and D-luciferin (gray). (B) Unique patterns of light emission were observed. Mutants were arrayed across 96-well plates and treated with either the benzimidazole (top) or N-methylated (bottom) variant. Sample bioluminescence images are shown. Yellow and red boxes indicate enzymes that preferentially process the benzimidazole and N-methylated analogs, respectively. Part (A) was adapted with permission from ref. 35. Copyright 2012 American Chemical Society.

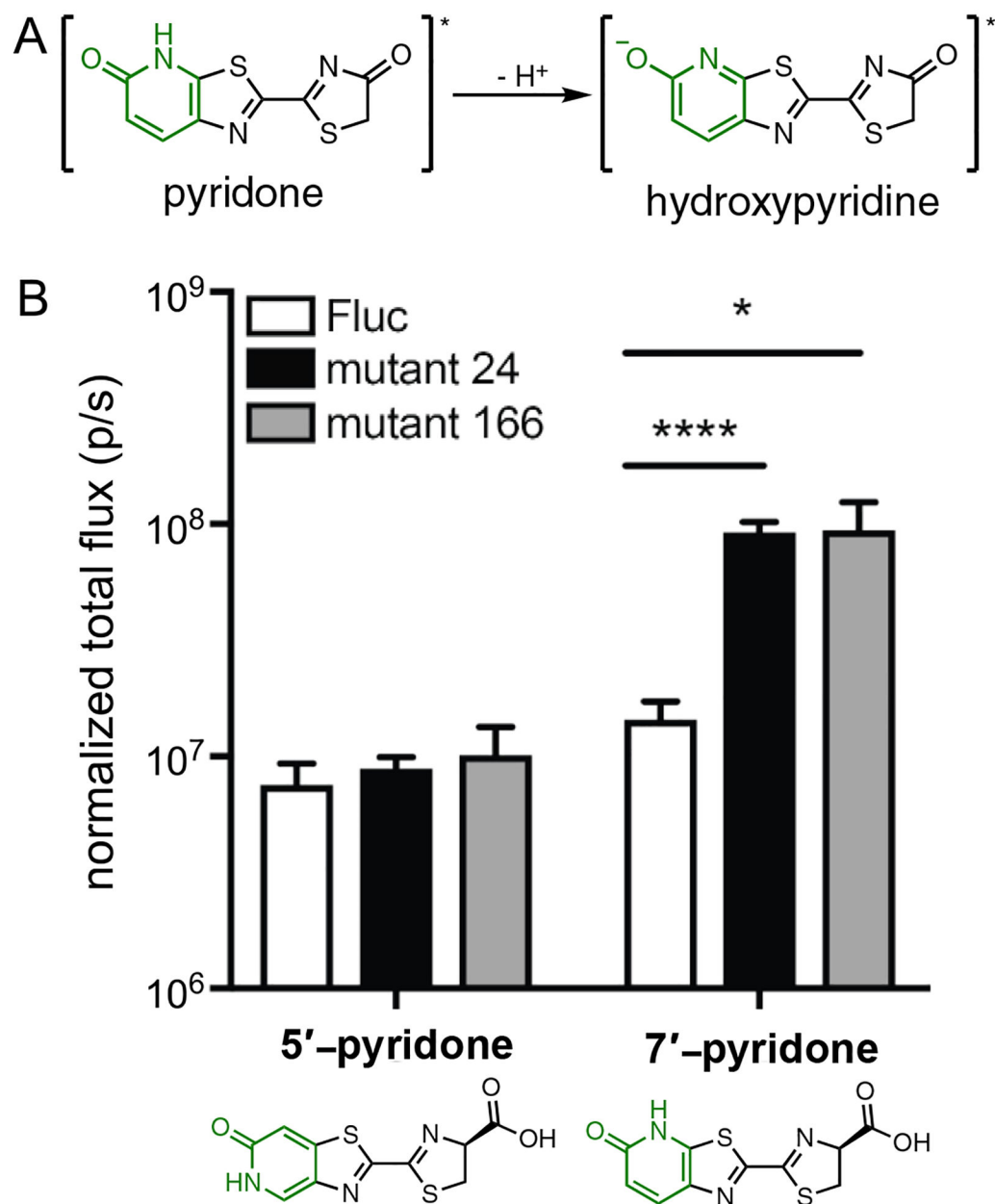


Figure 7.

Pyridone luciferins exhibit unique patterns of light emission with Fluc and mutant luciferases. (A) Excited state deprotonation of a pyridone analog to provide a functional light emitter. (B) HEK293 cells expressing mutant luciferases or Fluc were incubated with pyridone analogs (1 mM) and photon outputs were measured. Luciferase expression was normalized to a GFP reporter. Asterisks denote values from one-tailed unpaired t-tests (* $p < 0.05$, **** $p < 0.0001$). Adapted with permission from ref. 63. Copyright 2018 Wiley-VCH Verlag GmbH & Co. KGaA, Weinheim.

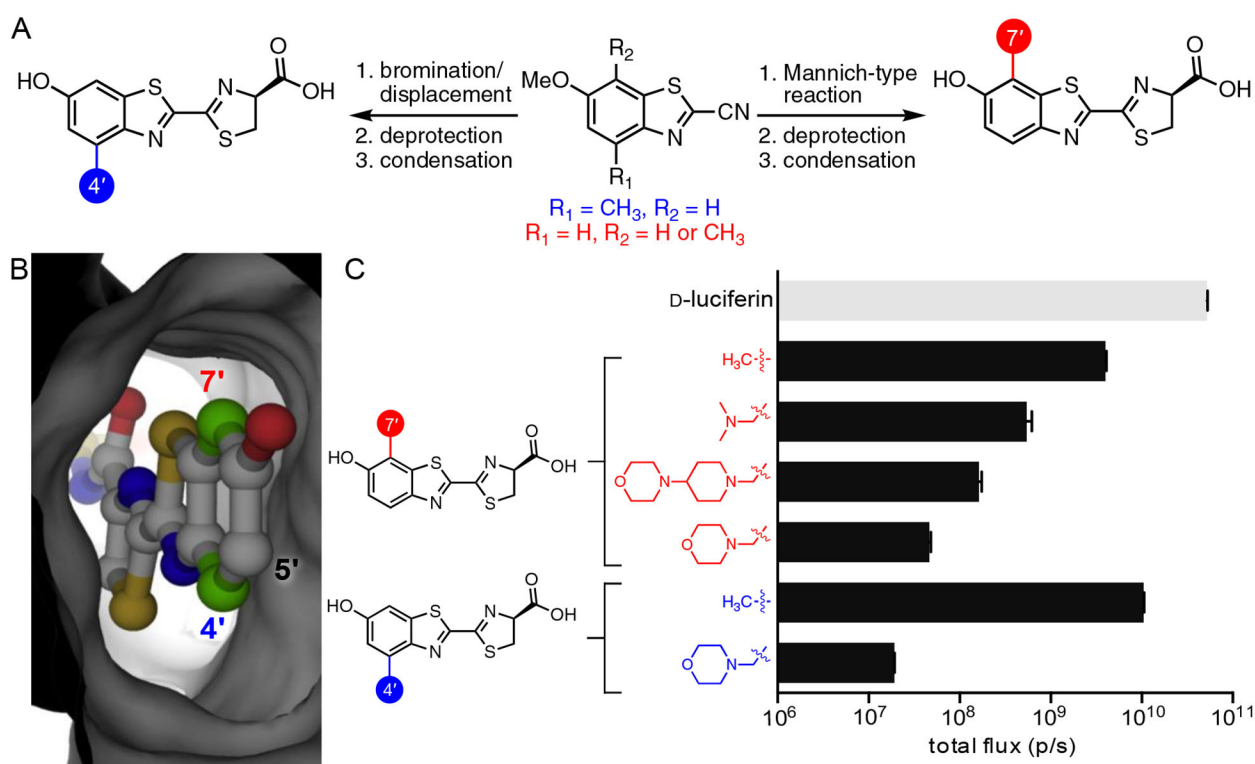


Figure 8. Sterically modified luciferins as orthogonal probes. (A) Divergent synthesis of luciferin analogs. Common benzothiazole intermediates were used to access an array of C4'- and C7'- modified luciferins. (B) Modeling studies suggested that C4' and C7' are prime targets for modification. These positions lie in close proximity to the Fluc backbone (PDB: 4G36). (C) Luciferin analogs exhibit varying levels of light output with Fluc. Analogs (100 μM) were incubated with Fluc (1 μg) and photon outputs were measured. Emission intensities are plotted as total photon flux values on a log scale. Adapted with permission from ref. 40. Copyright 2017 American Chemical Society.

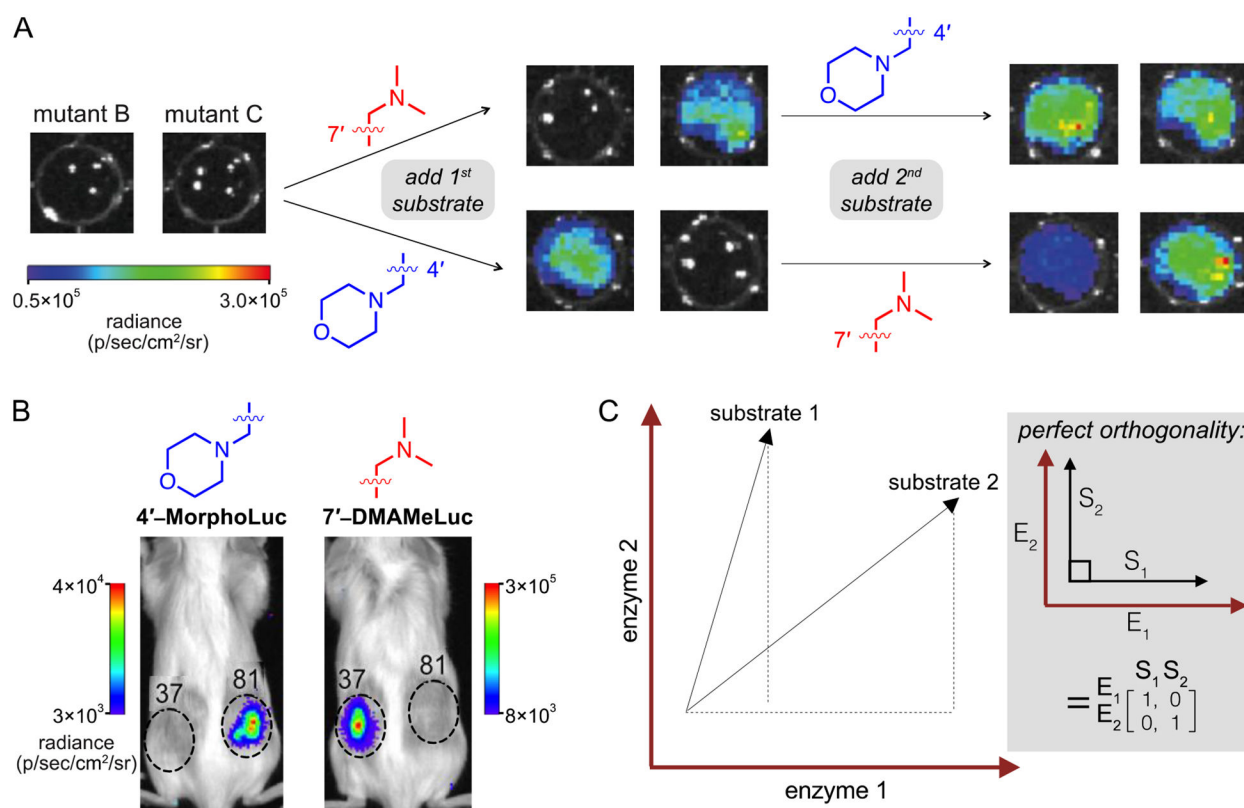


Figure 9. Multi-component imaging with orthogonal bioluminescent tools. (A) Orthogonal imaging *in vitro*. DB7 cells expressing mutant luciferases were placed in 96-well plates (1.5×10^5 cells/well) and imaged upon serial addition of luciferin analogs ($750 \mu\text{M}$). Representative bioluminescence images are shown. (B) Orthogonal imaging *in vivo*. FVB/NJ mice were injected with DB7 cells stably expressing luciferase mutants (37 and 81, which prefer 7'-DMAMeLuc and 4'-MorphoLuc, respectively). Inoculation sites are indicated with dashed circles. Luciferins were administered intraperitoneal and light emission was measured. (C) Matrix analysis of light emission data. The photon output from each enzyme (E)-substrate (S) pair can be represented as a vector. Perfect orthogonality is defined as the identity matrix. Matrices can be readily expanded to search for orthogonal triplets and other higher order sets. Part (A) was adapted with permission from ref. 40. Copyright 2017 American Chemical Society. Parts (B) and (C) were adapted with permission from ref. 67. Copyright 2017 American Chemical Society.

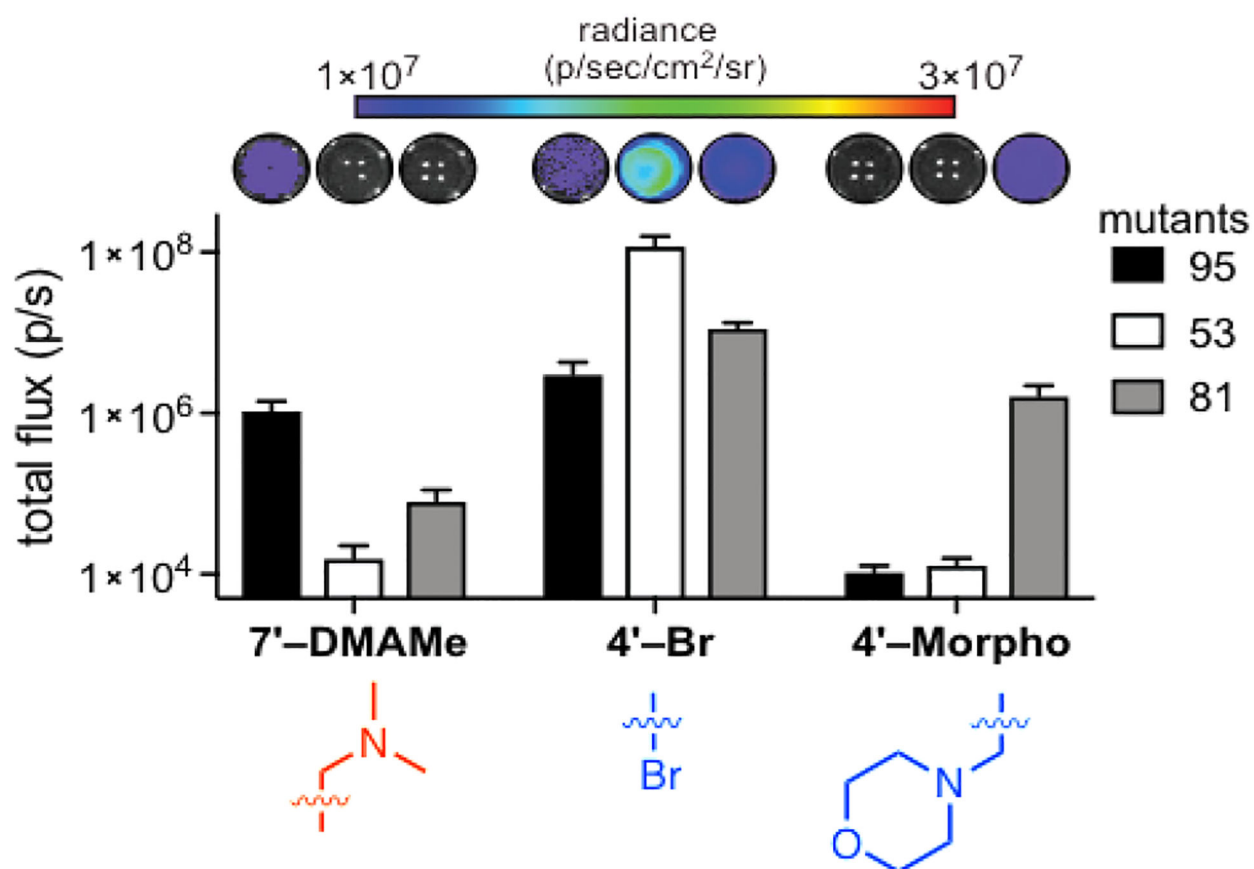


Figure 10. Orthogonal triplet set identified from computational analyses. Sterically modified luciferins (250 μ M) were incubated with mutant luciferases 95, 53, and 81 (in bacterial lysate). Photon outputs were measured and the error bars represent the standard error of the mean for $n = 3$ experiments. Adapted with permission from ref. 67. Copyright 2017 American Chemical Society.