

Devising novel near-infrared aggregation-induced-emission luminogen labeling for point-of-care diagnosis of *Mycobacterium tuberculosis*

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SUMMARY Detecting and appropriately diagnosing a *Mycobacterium tuberculosis* infection remains technologically difficult because the pathogen commonly hides in macrophages in a dormant state. Described here is novel near-infrared aggregation-induced-emission luminogen (AIEgen) labeling developed by the current authors' laboratory for point-of-care (POC) diagnosis of an *M. tuberculosis* infection. The selectivity of AIEgen labeling, the labeling of intracellular *M. tuberculosis* by AIEgen, and the labeling of *M. tuberculosis* in sputum samples by AIEgen, along with its accuracy, sensitivity, and specificity, were preliminarily evaluated. Results indicated that this near-infrared AIEgen labeling had satisfactory selectivity and it labeled intracellular *M. tuberculosis* and *M. tuberculosis* in sputum samples. It had a satisfactory accuracy (95.7%), sensitivity (95.5%), and specificity (100%) for diagnosis of an *M. tuberculosis* infection in sputum samples. The current results indicated that near-infrared AIEgen labeling might be a promising novel diagnostic tool for POC diagnosis of *M. tuberculosis* infection, though further rigorous verification of these findings is required.

Keywords *Mycobacterium tuberculosis*, near-infrared aggregation-induced emission luminogen, point-of-care diagnosis, metabolic labeling, high-throughput screening

Tuberculosis (TB) is a common infectious disease caused by infection with *Mycobacterium tuberculosis* that may spread *via* aerosol and involve various organs (1). More than 10 million cases are confirmed per year. Other than COVID-19, TB is the second leading cause of death due to infectious disease (2,3). TB remains a major public health concern, particularly in developing countries, and indeed it cannot be ignored or underestimated. Earlier appropriate diagnosis and timely anti-TB therapy may result in better clinical outcomes. However, many conventional diagnostic methods, such as biomedical imaging, bacteriological diagnosis, molecular diagnosis, and immunologic testing, suffer from several methodological flaws, resulting in a low specificity, low sensitivity, and demanding conditions for pathogen detection (4-6).

The main technological difficulty lies in the fact that *M. tuberculosis* might be shielded by host macrophages, so latent and dormant intracellular *M. tuberculosis* is extremely difficult to detect or eradicate (7,8). An ideal method of diagnosing TB in clinical practice should have several characteristics: *i*) satisfactory sensitivity and specificity; *ii*) rapid *M. tuberculosis* detection achieved with minimal sample processing; and *iii*) a high sensitivity so that it can be used to screen patients with TB from patients with a suspected *M. tuberculosis* infection (9,10). Since conventional methods are far from satisfactory, development of rapid, sensitive, and accurate tools for diagnosis of intracellular *M. tuberculosis* is an urgent task for global TB researchers.

Unlike other bacteria, *M. tuberculosis* has a special cellular structure. The cytoderm of *M. tuberculosis*

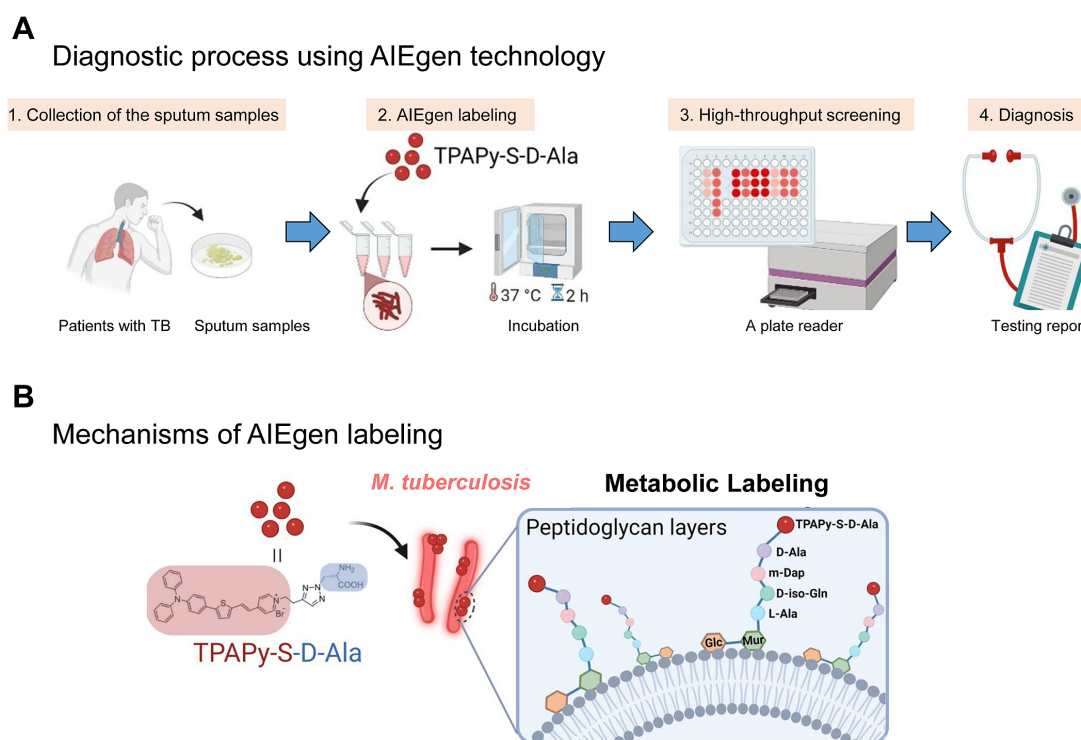


Figure 1. Introduction of a newly developed AIEgen for POC diagnosis of a *Mycobacterium tuberculosis* infection. (A) Process for diagnosis of an *M. tuberculosis* infection using TPAPy-S-D-Ala, an AIEgen with near-infrared fluorescence developed by the current authors' laboratory. Sputum samples were collected and labeled with TPAPy-S-D-Ala at 37°C for 2 h. Then, a plate reader was used to conduct high-throughput tuberculosis screening. **(B)** Underlying mechanisms of TPAPy-S-D-Ala in the metabolic labeling of *M. tuberculosis*. TPAPy-S-D-Ala molecules are integrated into the peptidoglycan layer of the cytoderm and "turn on" the fluorescence of *M. tuberculosis* after incubation for 2 h.

is reported to consist of a cytoplasmic lipid bilayer, peptidoglycan (PG) layer, arabinogalactan layer, mycomembrane, and capsule that contribute to building a solid barrier that facilitates the survival and virulence of *M. tuberculosis* (11). However, the complicated structure of the *M. tuberculosis* cytoderm enables the exploration of novel targets for detecting *M. tuberculosis*, such as targets in the PG layer. Specific pentapeptides (L-Ala-D-iso-Gln-m-DAP-D-Ala-D-Ala) are cross-linked with N-acetylmuramic acid (MurNAc) in the PG layer via L, D-transpeptidases catalysis (12). Studies have reported that D-Ala-linked fluorescent probes have marked potential to label the PG layer of the *M. tuberculosis* cytoderm by serving as an external D-Ala substrate, enabling visualization of *M. tuberculosis* replication, thereby distinguishing living *M. tuberculosis* from dead cells (13,14). However, many of the commercially available fluorophores have a low emission efficiency and low sensitivity in an aggregate state due to the phenomenon of aggregation-caused quenching (ACQ) (15). Accordingly, aggregation-induced emission luminogens (AIEgens), which are molecules that are highly emissive in an aggregate state (limited intramolecular motion), had to be developed to address this problem (16,17). Thus, development of a metabolic-labeling AIEgen is a potential good solution for accurate point-of-care (POC) diagnosis of an *M. tuberculosis* infection. A previous study by the current

authors described an *M. tuberculosis* cytoderm-labeling AIEgen for rapid detection and intracellular ablation of *M. tuberculosis* that had better detection sensitivity compared to conventional acid-fast staining (17). AIEgen with near-infrared fluorescence was urgently needed in order to better penetrate so as to facilitate *in vivo* labeling of *M. tuberculosis* in subjects (18). Thus, the current authors developed a near-infrared AIEgen (TPAPy-S-D-Ala) for metabolic labeling of PG to enable high-throughput diagnosis of *M. tuberculosis* (Figure 1). The AIE functional motif (TPAPy-S) and the metabolic motif (D-Ala, with PG-layer-specific metabolic labeling) are linked using click chemistry to yield TPAPy-S-D-Ala. The entire diagnostic process involving TPAPy-S-D-Ala is shown in Figure 1A and it includes collection of the sputum sample, obtaining of TPAPy-S-D-Ala, incubation of samples with TPAPy-S-D-Ala, high-throughput screening, and finally readout of the diagnostic results (Figure 1A). The mechanisms of incubation are clear but extremely important (Figure 1B), namely, the external D-Ala molecules of the AIEgen are efficiently integrated into PG and are solidly aggregated on the cytoplasmic membrane, resulting "turning on" fluorescence so that the *M. tuberculosis* cells can be labeled. The fluorescence intensity of labeled *M. tuberculosis* can be quantified with a microplate reader to enable the diagnosis of TB (Figure 1).

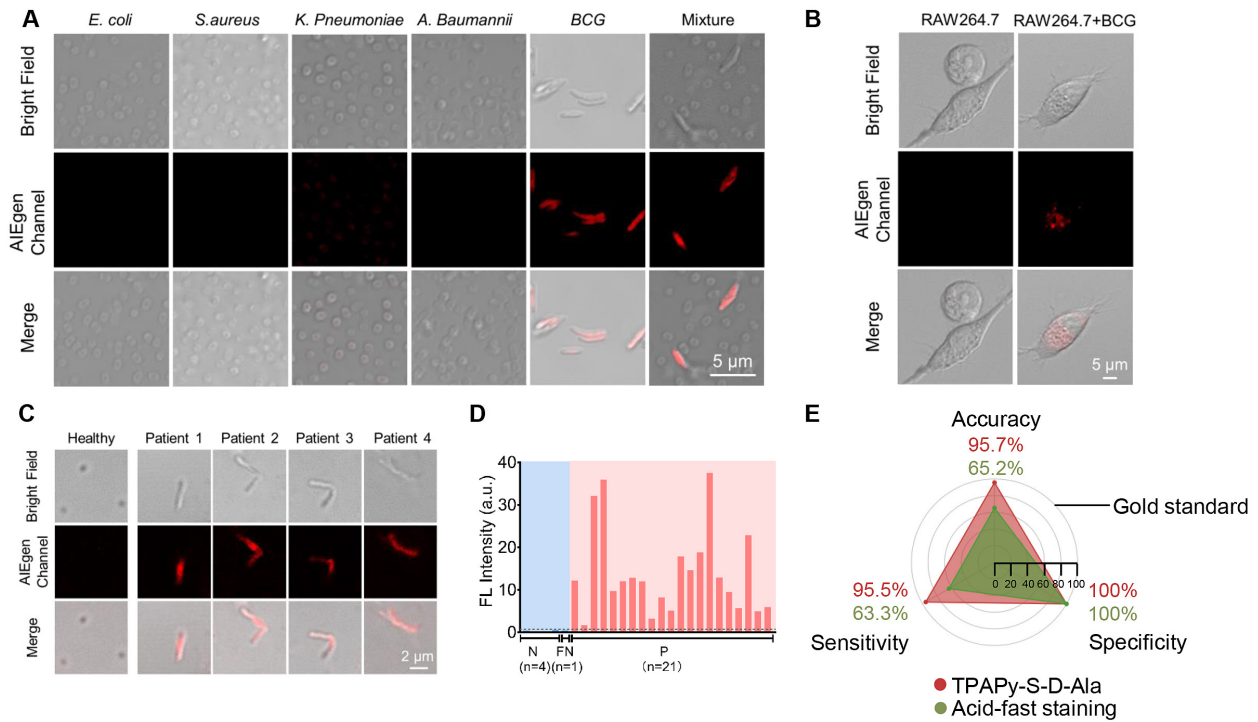


Figure 2. Verification of the labeling of *M. tuberculosis* by AIEgen. (A) Verification of the selective labeling of *M. tuberculosis* by TPAPy-S-D-Ala. Obviously, only samples infected with *M. tuberculosis* (BCG and a mixed infection) were labeled. Microbes were labeled in red by AIEgen. (B) Verification of the intracellular effects of TPAPy-S-D-Ala on *M. tuberculosis*. Only cells infected with *M. tuberculosis* were labeled. Microbes were labeled in red by AIEgen. (C) Verification of the labeling of *M. tuberculosis* in sputum samples by TPAPy-S-D-Ala. Only *M. tuberculosis* in sputum samples from infected patients was labeled. Microbes were labeled in red by AIEgen. (D) Outcomes of *M. tuberculosis* identification by TPAPy-S-D-Ala labeling. A total of 26 sputum samples (22 samples from patients infected with *M. tuberculosis* and 4 samples from healthy controls) were observed. N means negative, FN means false negative, and P means positive. (E) Evaluation of the accuracy, sensitivity, and specificity of TPAPy-S-D-Ala labeling in comparison to conventional acid-fast staining of sputum samples.

The metabolic labeling efficiency of TPAPy-S-D-Ala was preliminarily verified in terms of the following aspects: *i*) Selectivity of TPAPy-S-D-Ala The specificity with which TPAPy-S-D-Ala identified *M. tuberculosis* was investigated *via* clinical digestion and incubation with various bacteria. The species used included *Escherichia coli*, *Staphylococcus aureus*, *Klebsiella pneumoniae*, *Acinetobacter baumannii*, and Bacillus Calmette-Guerin (BCG, a model for *M. tuberculosis*). As shown in Figure 2A, only the panels that included *M. tuberculosis* (BCG and a mixed infection) were found to be labeled by TPAPy-S-D-Ala, indicating that TPAPy-S-D-Ala was highly selective at labeling an *M. tuberculosis* infection. *ii*) Evaluation of the labeling efficiency for intracellular bacteria TPAPy-S-D-Ala was co-incubated with RAW264.7 cells infected with BCG and intact RAW264.7 cells (control) for 2 h. The results were observed using a laser scanning confocal microscope (Zeiss 700, Germany; excitation, 488 nm). Results indicated that the fluorescence intensity of intracellular BCG labeled by TPAPy-S-D-Ala was markedly greater than that of the control (Figure 2B). These results indicated that the AIEgen was effective at labeling intracellular *M. tuberculosis*, so it might be able to serve as a promising tool for diagnosis of latent TB (Figure 2A,

B). *iii*) Evaluation of the labeling of *M. tuberculosis* in sputum samples by AIEgen Sputum samples from *M. tuberculosis*-positive patients and healthy controls were collected and exposed to TPAPy-S-D-Ala. As shown in Figure 2C, *M. tuberculosis*-positive sputum samples exhibited a clear "turning on" of fluorescence after TPAPy-S-D-Ala labeling, whereas no fluorescence was observed in *M. tuberculosis*-negative sputum samples from the healthy controls (Figure 2C). The fluorescence intensity of the *M. tuberculosis*-positive sputum samples was significantly greater than that of the sputum samples from the healthy controls (Figure 2D). *iv*) Evaluation of the accuracy, sensitivity, and specificity of the AIEgen A comprehensive gold standard was established to definitively diagnose TB by comprehensively considering clinical manifestations, radiological findings, and laboratory results from a given patient. Conventional acid-fast staining was performed in parallel. Based on the index of fluorescence intensity, TPAPy-S-D-Ala labeling had an accuracy of 95.7%, a sensitivity of 95.5%, and a specificity of 100% in diagnosing an *M. tuberculosis* infection in sputum samples (vs. an accuracy of 65.2%, a sensitivity of 63.3%, and a specificity of 100% for acid-fast staining) (Figure 2E). Hence, the selective labeling of intracellular *M. tuberculosis* and *M.*

tuberculosis in sputum samples by this near-infrared AIEgen (TPAPy-S-D-Ala), along with its accuracy, sensitivity, and specificity, were preliminarily verified. This near-infrared AIEgen was therefore considered to have great potential for use in the clinical diagnosis of TB due to its rapid, sensitive, and precise nature. However, well-designed randomized controlled trials (RCTs) with a large sample are needed to obtain robust evidence for clinical use of this AIEgen, and these RCTs are now being planned.

In conclusion, a near-infrared AIEgen (TPAPy-S-D-Ala) was developed for POC diagnosis of an *M. tuberculosis* infection. TPAPy-S-D-Ala can efficiently aggregate in the PG layer of the bacterial cytoderm by acting as an exogenous substrate of D-amino acid during PG biosynthesis, and this may facilitate the rapid and sensitive detection of living *M. tuberculosis* in macrophages. Preliminary data indicated that this near-infrared AIEgen selectively labels intracellular *M. tuberculosis* and *M. tuberculosis* in sputum samples, with satisfactory accuracy, sensitivity, and specificity in comparison to conventional acid-fast staining. Hence, TPAPy-S-D-Ala is a promising diagnostic tool for rapid and accurate detection of *M. tuberculosis* and it might be a good tool to mass screen for an *M. tuberculosis* infection, particularly in people in developing countries. The efficiency and safety of TPAPy-S-D-Ala should be further verified in large-scale RCTs before this labeling is widely used in clinical practice.

Funding: This work was supported by the National Natural Science Foundation of China (grant nos. 62005176, 82172286, 82070420), the Shenzhen Science and Technology Program (grant nos. JCYJ20210324115611032, JCYJ20220530163005012, and JCYJ20210324131603008), Projects in Key Areas for Universities in Guangdong Province (2022DZX2022), the Shenzhen Scientific and Technological Foundation (grant no. JSGG20220301090005007), and the Third People's Hospital of Shenzhen Foundation (grant nos. G2021027 and G2022062).

Conflict of Interest: The authors have no conflicts of interest to disclose.

Ethical issues: This study was approved and supervised by the Ethics Committee of the Third People's Hospital of Shenzhen (approval number 2021-030). The study protocol was explained to all of the participants, who then provided written informed consent to participation in this study.

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Received April 18, 2023; Revised May 18, 2023; Accepted May 24, 2023.

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Released online in J-STAGE as advance publication May 27, 2023.