## A Novel Approach to Integrating Artificial Intelligence Into Routine Practice

Madelyn Lew, MD  $\bigcirc$  <sup>1</sup>; and David C. Wilbur, MD<sup>2</sup>

Clinical utility, accuracy, and efficiency are the keys to cost-effective medical procedures. The Papanicolaou test, while highly useful, is plagued by problems in accuracy and work intensity. This combination of need and difficulty led to intense investigation in the 1950s and 1960s into computerization to enhance the diagnostic accuracy of gynecologic cytology and to enhance workflow efficiency. Since these initial investigations, computer-based technology has advanced such that morphologic features in cells can be translated into data points for algorithmic analysis and subsequent identification of squamous abnormalities, leading to the popularization of technology-based platforms such as Hologic's ThinPrep Imaging System. Continued research in the past decade has further enhanced image analysis algorithms to improve performance of artificial intelligence (AI) in cytology screening.<sup>1</sup> The benefits of integrating AI into clinical practice include its capacity to increase detection sensitivity and decrease subjectivity and diagnostic gray zones by providing quantitative data and analysis in real time during the morphologic assessment of specimens. Despite these documented improvements, AI has not been widely implemented into clinical practice. The most significant obstacles to its popularization include higher upfront costs of investment, disruption of historical workflows, a perceived negative impact on job security, and the regulatory burden (and hence cost) of bringing such products to market. However, as technology and AI algorithms further develop, more avenues are being explored to minimize these and other concerns.

In the corresponding article, Tang et al<sup>2</sup> beautifully highlight a practical example of how innovative AI applications can be implemented to leverage the advantages of technology in resource-limited regions while bypassing the need for large, expensive hardware or an overhaul of workflow. Addressing the lack of experienced practitioners for optimal manual review of cervical cytology specimens and for training, the authors introduce a novel AI microscope that combines the conventional features of microscopy with augmented reality and an AI-empowered computer unit. The results yield a real-time visualization of the AI analysis in the optical path of evaluated slides for immediate user feedback. This application pivots from the foundation of previous AI systems, which have largely focused on whole slide imaging with subsequent postevaluation guidance to selected fields/cells of interest or whole slide classification/scoring. Instead, the authors have created an opportunity for real-time AI assistance. The utility of the authors' AI algorithm was demonstrated in the 2-round reader study of the publication, in which 4 masked cytopathologists looked at a total of 486 Papanicolaou specimens twice: the first time without AI assistance and the second time with AI assistance 15 days later. Use of the AI microscope enhanced the sensitivity of detection of squamous abnormalities designated as low-grade squamous intraepithelial lesion and higher and also increased diagnostic agreement among the cytopathologists. These promising results showcase how AI not only can enhance workflow efficiency but also can enhance

Corresponding Author: Madelyn Lew, MD, Department of Pathology, University of Michigan, 2800 Plymouth Rd, NCRC Bldg 35, Ann Arbor, MI 48109 (lewm@med.umich.edu).

<sup>&</sup>lt;sup>1</sup>Department of Pathology, University of Michigan, Ann Arbor, Michigan; <sup>2</sup>Department of Pathology, Harvard Medical School, Boston, Massachusetts See referenced original article on pages 693-700, this issue.

Received: February 23, 2021; Accepted: February 25, 2021

Received. February 23, 2021, Accepted. February 23, 2021

Published online April 7, 2021 in Wiley Online Library (wileyonlinelibrary.com)

DOI: 10.1002/cncy.22424, wileyonlinelibrary.com

quality improvement by reducing interobserver variability. Additionally, this work highlights how in areas lacking experts in cytology, AI can take the form of a trainer or educator by marking abnormalities that may otherwise be overlooked or by confirming concerns of less experienced evaluators. However, an unanswered question in the study is the effect, with less experienced practitioners, of the AI result influencing a practitioner toward an incorrect, but reproducible, final diagnosis. Because precision measures not the accuracy but the reproducibility of the result, further investigation should focus on matching the clinical result with a ground-truth assessment. Despite this methodologic issue, the results of the AI-assisted approach are very promising for the intended uses of the device.

While this article explores an AI system's capacity to enhance health care delivery to populations with limited resources, it also challenges us to think about how AI can be implemented into other existing workflows to provide quality improvement and educational tools at all levels of health care delivery in pathology. In light of the projected future shortages of pathologists, AI can contribute to mitigating the increased work demands of growing case volumes while maintaining standards for consistent and accurate diagnoses. This principle of AI can extend beyond the article's focus on cervical cytology screening to include applications in quality assurance measures, such as the 5-year lookback requirement for newly diagnosed high-grade squamous intraepithelial lesion cases in gynecologic cytology, or extensions to other cytologic specimens, such as urine and effusion fluids, or to other subspecialties of surgical pathology. Such applications can expand laboratory capabilities in high-volume institutions and resource-limited regions alike. An early focus has been the evaluation of AI algorithms and neural networks in prostate cancer detection and Gleason scoring. In this example, AI can help provide more consistent diagnoses and, through the integration of molecular and morphologic data points, can lead to predictive personalized reports.<sup>3,4</sup> Although these developments may spark pathologists' concerns about being deskilled or even

replaced, AI is better viewed as a tool that augments diagnostic accuracy and efficiency in the pathologists' toolkit and is no different than the previous emergence of other ancillary studies such as immunohistochemistry and molecular testing. Such advances all require pathologist oversight to ensure that they are applied, interpreted, and managed in appropriate systems that serve to enhance diagnostic pathology as we shift further into the realm of personalized medicine.

As this article highlights, technology can be leveraged in ways that do not require a massive disruption of the current-state workflow. However, studies implementing new technology models will need to be tested on large and diverse data sets to optimize their use cases and explore their utility across the wide variety of practices and specimen preparation techniques. Additionally, a systematized approach to regulatory approval and costbenefit analyses must be developed to promote more widespread acceptance of AI-enhanced practice. Once all these pieces are in place, the developing story of technological advancement that AI brings to practice will have the potential to enhance patient care and workflow efficiency and to assist in the training of future practitioners.

## FUNDING SUPPORT

No specific funding was disclosed.

## CONFLICT OF INTEREST DISCLOSURES

David C. Wilbur reports other from Corista LLC outside the submitted work. The other author made no disclosures.

## REFERENCES

- Bengtsson E, Malm P. Screening for cervical cancer using automated analysis of PAP-smears. *Comput Math Methods Med.* 2014;2014:842037.
- Tang HP, Cai D, Kong YQ, et al. Cervical cytology screening facilitated by an artificial intelligence microscope: a preliminary study. *Cancer*. 2021;127:693-700.
- Saidi O, Cardon-Cardo C, Costa J. Technology insight: will systems pathology replace the pathologist? *Nat Clin Pract Urol.* 2007;4:39-45.
- Doyle S, Feldman M, Tomaszewski J, Madabushi A. A boosted Bayesian multi-resolution classifier for prostate cancer detection from digitized needle biopsies. *IEEE Trans Biomed Eng.* 2012;59:1205-1218.