



**Cover image:** Pictured is a leopard. Mohammad Sadegh Norouzzadeh et al. used deep learning, a form of artificial intelligence, to automatically identify, count, and describe the behaviors of animals in a set of 3.2 million images from motion-sensor cameras in the Serengeti. Deep learning identified animals with the same accuracy as crowdsourced teams of human volunteers but in a shorter period of time. The results suggest that using deep learning to automatically extract information from motion-sensor camera images could enable inexpensive and unobtrusive data collection on large numbers of animals in the wild. See the article by Norouzzadeh et al. on pages E5716–E5725. Image courtesy of Sarah Benson-Amram (University of Wyoming, Laramie, WY). This caption appeared incorrectly in the original publication. The caption here has been updated to indicate that the cover image pictures a leopard.

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