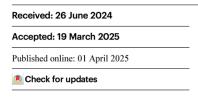


# A clinically accessible small multimodal radiology model and evaluation metric for chest X-ray findings



Juan Manuel Zambrano Chaves © 1,2,7, Shih-Cheng Huang © 2,7, Yanbo Xu1,7, Hanwen Xu<sup>3,7</sup>, Naoto Usuyama<sup>1,7</sup>, Sheng Zhang<sup>1,7</sup>, Fei Wang<sup>4</sup>, Yujia Xie<sup>1</sup>, Mahmoud Khademi<sup>1</sup>, Ziyi Yang<sup>1</sup>, Hany Awadalla<sup>1</sup>, Julia Gong <sup>1</sup>, Houdong Hu<sup>1</sup>, Jianwei Yang<sup>1</sup>, Chunyuan Li<sup>1</sup>, Jianfeng Gao<sup>1</sup>, Yu Gu<sup>1</sup>, Cliff Wong<sup>1</sup>, Mu Wei<sup>1</sup>, Tristan Naumann 1, Muhao Chen 5, Matthew P. Lungren 1,2,6, Akshay Chaudhari 62, Serena Yeung-Levy 62, Curtis P. Langlotz 62, 

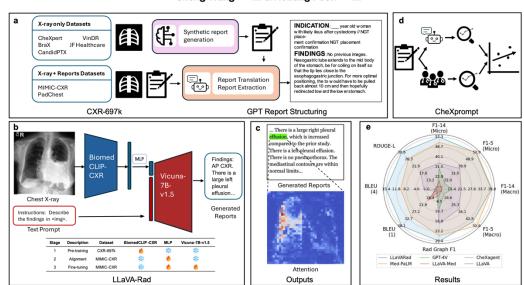


Fig. 1 | LLaVA-Rad overview, a To train LLaVA-Rad, we assemble a large dataset with over 697 thousand chest X-ray image-text pairs; GPT-4 is used to synthesize reports from labels, translate reports from Spanish, and process and structure the corresponding radiology reports. b We adopt a modular three-stage approach to train LLaVA-Rad, comprised of pre-training, alignment and fine-tuning. c A qualitative visualization of the model's attention during its generative process.  $\boldsymbol{d}$  For

evaluation, we also propose a novel factual error scoring approach using GPT-4 and demonstrate its parity with expert evaluation. e LLaVA-Rad outperforms much larger generalist and specialized models like GPT-4V and Med-PaLM M on prior standard report evaluation metrics. MLP multi-layer perceptron. The example chest X-ray image in b is obtained from ref. 27 with permission for reproduction from the

# Reference findings

AP upright and lateral views of the chest were provided. Left chest wall pacer pack is again seen with leads extending into the right heart. Abandoned pacing leads are also noted in the right chest wall extending into the right heart. The heart remains moderately enlarged. Lung volumes are low, with equivocal ground-glass opacity on the frontal view, which appears less conspicuous on the lateral view most likely attributable to underpenetrated No gross evidence for pneumonia or pulmonary edema. No large are seen. There is no pneumothorax. Bony structures are intact.

The image is a black and white radiology picture of a human chest, showing the lungs and the heart. The heart is located on the left side of the image, and the lungs are spread across the middle and right side of the image. The lungs are filled with air, indicating proper breathing. There are several wires visible in the image, which are likely related to medical equipment or monitoring the patient's condition. These wires are positioned around the chest are and are connected to the heart and lungs, suggesting that the patient might be undergoing some form of medical treatment or monitoring.

## LLaVA-Med

The chest X-ray image shows bilateral pleural effusion, which means there is an accumulation of fluid in the pleural space on both sides of the lungs. Additionally, there is a right-sided pneumothorax, which is the presence of air in the pleural space, causing the lung to collapse. The image also reveals a left-side pneumothorax with a chest tube in situ, meaning that a tube has been placed in the pleural space to help remove the air and allow the lung to re-expand.

## LLaVA-Rad

Dual-lead left-sided pacer device is again seen, unchanged in position. The cardiac silhouette remains enlarged. The aorta is calcified. There are low lung volumes. Prominence of the central pulmonary vasculature may be due to mild pulmonary vadema. No definite focal consolidation is seen. There is no large pleural effusion or pneumothorax.