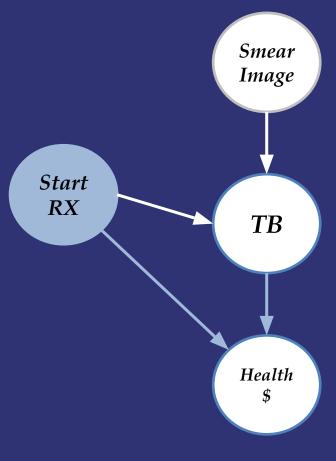


Prediction problem





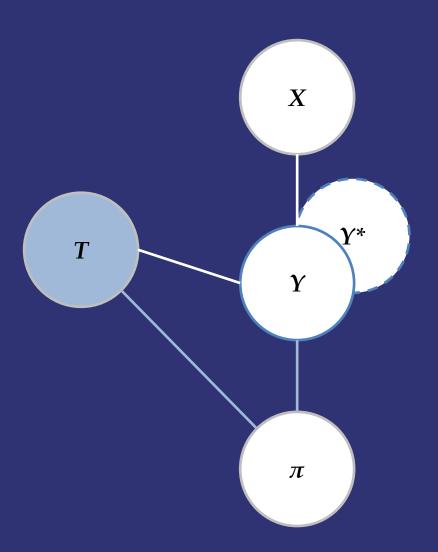
What is the decision?

- The decision T that the algorithm improves is whether to initiate Active Tuberculosis
 (TB) treatment, by using smear image data to detect TB in a patient's sputum
- The decision maker is the physician, who will decide whether to treat the patient given sputum analysis and algorithm results
- The final decision is made once the physician runs the algorithm and analyzes its conclusion

• What are we predicting?

- Based on the smear images, we can calculate probabilities that the patient has Active TB in their sputum
- This prediction benefits the physician since the sputum analysis process is automated, allowing them to bypass chest x-rays and expand TB screening access by keeping services mobile

Prediction pitfalls



Do we have exactly the variable we want?

 Yes, the measured Y is the visual identification of Active TB or other indications of TB on the smear images, which is a direct proxy for our true goal of identifying TB (Y*).

Is there a causal link between the decision and the variable?

- No, there exists no causal link between the decision and the variable, rendering the algorithm a pure prediction problem
- The algorithm utilizes the input variables X0 to directly predict the likelihood of a patient having TB, without modifying the underlying conditions that determine the presence or absence of TB in that patient.

Summary

 Our high-level goal is to help the physician detect active TB in a patient, in order to provide them life-saving treatment immediately

Our dataset includes key limitations:

- Of ~75,000 images in the Nightingale Open Science dataset, only 5.2% of them show positive TB smears. This can lead to a high accuracy algorithm by predicting negative for every sample
- The images come from smears taken in Asia; this regional uniformity could introduce confounding variables in the algorithm

These limitations have implications for how we would deploy our algorithm

- In terms of how we adjust our algorithm, we might have to use other metrics of measuring algorithm performance such as precision and/or recall, as maximizing accuracy might not be the right course of action.
- To enhance generalizability of the algorithm, we would also diversify the dataset by incorporating images from different geographical regions.