

**Research Focus:** Deep representation learning Rare event prediction Long-tailed learning User-friendly multiple clustering

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## **Rare Event Prediction**

#### **Events of interest are often very very infrequent**

<0.9% patients developed Septic Shock on a daily basis [data collected 2012-2019]

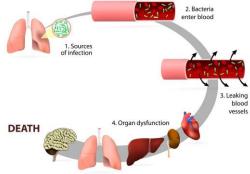


Figure 1. Sepsis process. Adapted from 'Disease profile: Sepsis' by Nicholas Parry, 2019, healthissuesindia.com.

### Multi-modal Representation Learning

Vital Signs	Static Profile	Cumulative Exposures	Laboratory Results
<b>\</b> /		iiii	<u>5</u>
Crucial medical signs that indicate vital functions, e.g., heart rate, temperature, diastolic blood pressure etc.	Initial physiology from first 48 hours and patient factors, e.g., age, mechanism of injury, first systolic blood pressure etc.	Summary of events, e.g., surgeries, cumulative sum of fluid bolus volume, etc.	Data from laboratory, e.g., blood urea nitrogen, white blood cell count, bicarbonate, etc.
rauma Patients. In: Proceedings of the IE i2. tewart, K. Stern, G. O'Keefe, A. Teredesai 2023 Congress in Computer Science, Cor erence on Health Informatics and Medica	RL: Nightly Profile Representation Learnir EE International Conference on Big Data ( is and J. Hu. Multi-Subset Approach to Ear myuter Engineering, & Applied Computin il Systems (HIMS'23), Las Vegas, NV, 2023 or, and G. O'Xeefe. Sub-Sequence Graph R Grae, In: Proceedings of the IEEE Internat	BigData'23), Sorrento, Italy, ly Sepsis Prediction. In: g (CSCE'23) - The 9th ; pp.1335-1341. epresentation Learning on	

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T. Stewart, K. Stern,

Prediction in ICU Tra

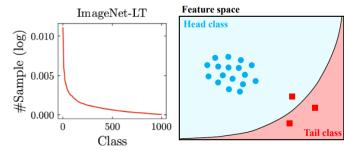
2023, pp.1843-1852

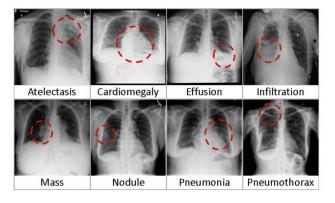
K. Ewig, X. Lin, T. Ste Proceedings of the 2 International Confer A. Teredesai, S. Hua

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B. Yu, G. Graciani, A. Nascimento, and J. Hu. Cost-adaptive Neural Networks for Peak Volume Prediction with EMM Filtering. In: Proceedings of the IEEE International Conference on Big Data (BigData'19), Los Angeles, CA, 2019, pp.4208-4213.



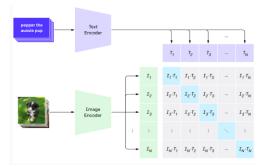






- > Limited data for medical images
- > Severely limited data for tail classes

#### Language-Supervision



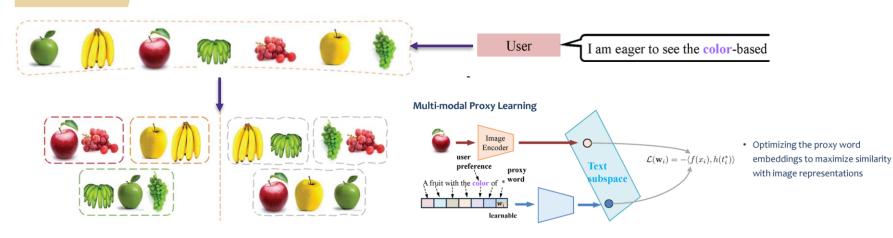
https://openai.com/index/clip/

Figure 1: Text-guided mixup allows semantically similar classes to be mixed more frequently (e.g., 'tiger' as a tail class is stretched to the directions of 'leopard' and 'cat', where 'cat' as a head class can help).

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# **User-friendly Multiple Clustering**



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