

# Deep Learning (CS 470, CS 570)

**Module 2, Lecture 4: Semi-supervised Learning**

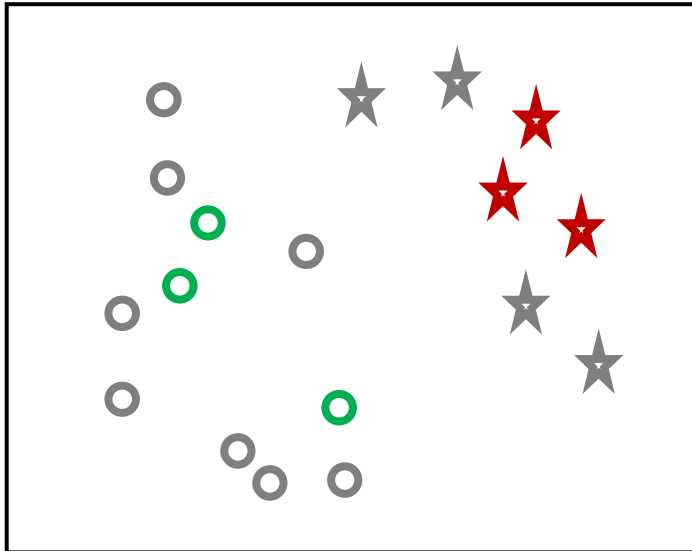
# Semi-supervised Learning

Some data points are labeled, while most of them are unlabeled

**Why:** Annotated data is costly  
Needs human expertise  
Unlabeled data: easily available

Data:  $(\mathbf{x}^1, y^1), (\mathbf{x}^2, y^2), \dots, (\mathbf{x}^M, y^M), \mathbf{x}^{M+1}, \mathbf{x}^{M+2}, \dots, \mathbf{x}^N$  where,  $M \ll N$

Learn a function  $h$  such that,  $h: \mathbf{x} \rightarrow y$



**Algorithm:**

Labeled and unlabeled data

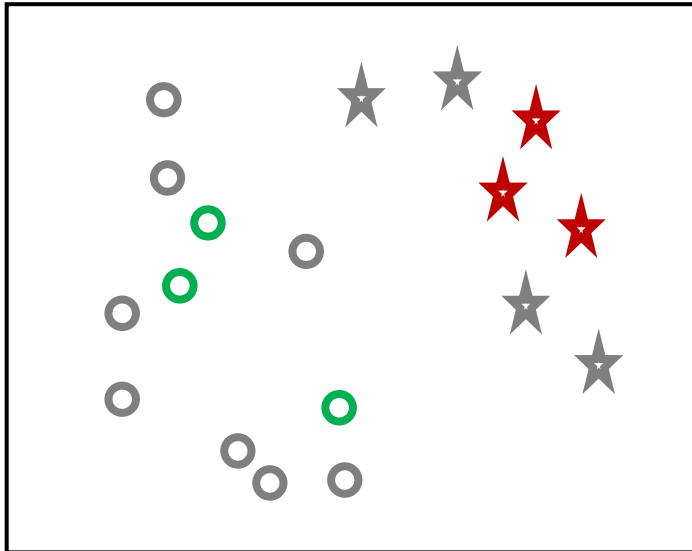
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## Algorithm:

Labeled and unlabeled data

Predict the label of unlabeled data

Include the data predicted with higher probability in the labeled set

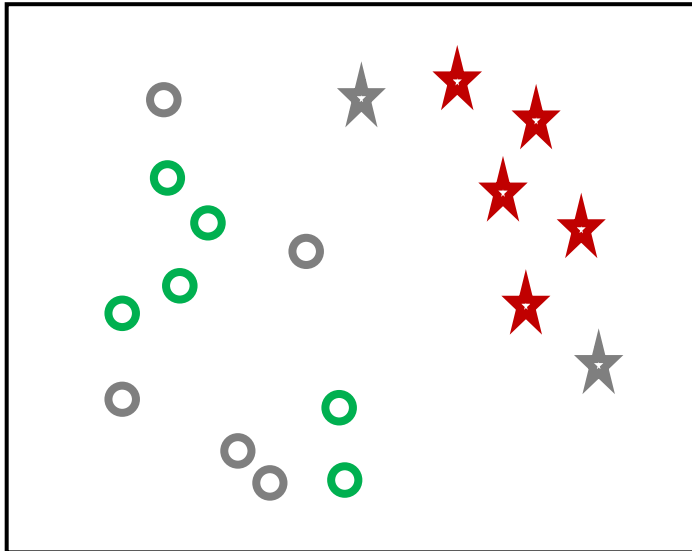
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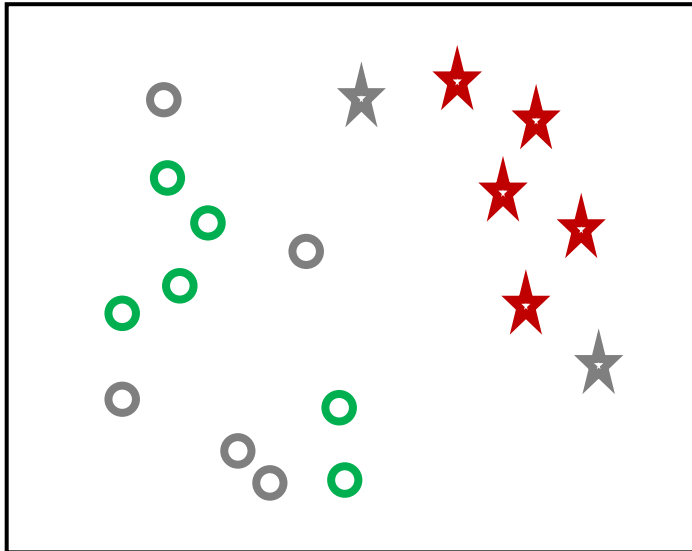
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Repeat it until all data points are labeled

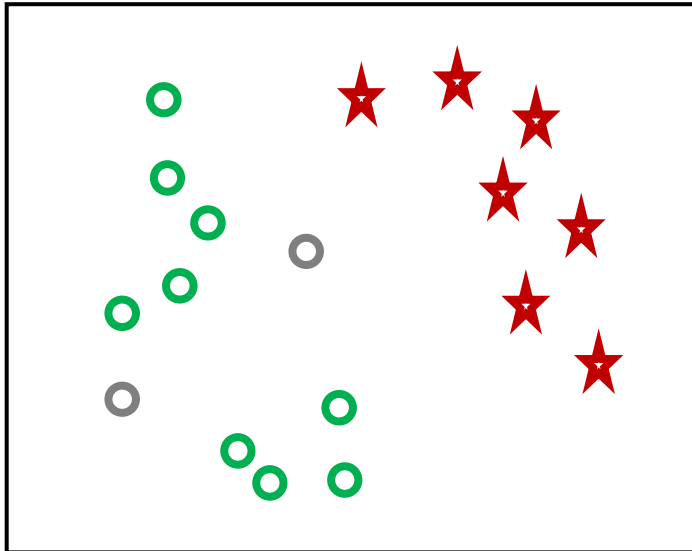
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## Algorithm:

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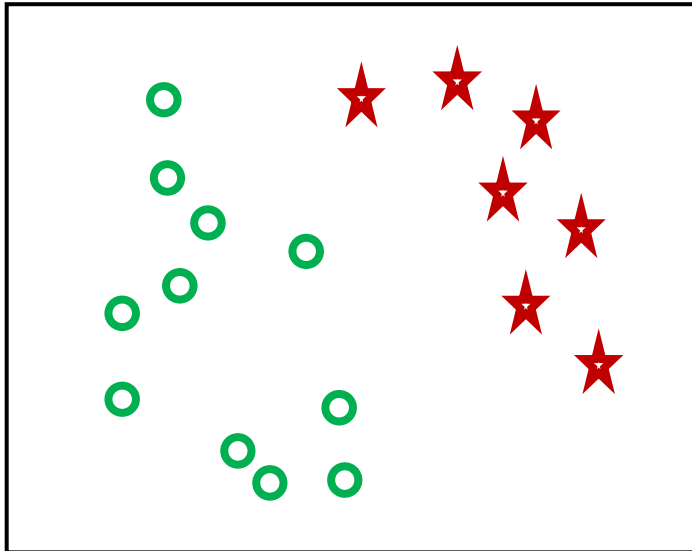
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# Additional Reading

[Semi-supervised learning](#) description