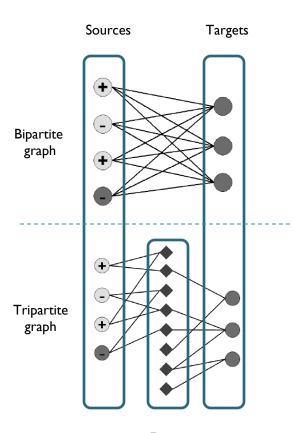
# Graph-Based Transfer Learning

Jingrui He, Yan Liu & Richard Lawrence CIKM 2009

Presentation by Mingzhen Mo

#### **Motivation**

- Additional Relationship through features
- Features are sensitive to domain knowledge
  - Movie Review



**Features** 

#### Model: Basic

Basic Graph Model

$$Q_{1} = \frac{1}{2} \left( \sum_{i,j=1}^{n} A_{i,j} \left( \frac{F_{i}}{\sqrt{D_{ii}}} - \frac{F_{j}}{\sqrt{D_{jj}}} \right)^{2} + \mu \sum_{i=1}^{n} (F_{i} - Y_{i})^{2} \right)$$

- A: affinity matrix, D: diagonal matrix  $D_{ii} = \sum_{j=1}^{n} A_{i,j}$
- F: predict result, Y: real result

• Let 
$$S = D^{-1/2}AD^{-1/2}$$
  
 $Q_1 = F^T(I-S)F + \mu \|F-Y\|^2$ 

#### Model: Framework

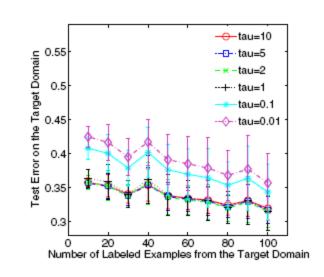
Combine Tripartite & Bipartite Graph

$$Q_{2} = \gamma F^{T} (I - S^{(3)}) F + \tau F^{T} (I - S^{(2)}) F + \mu ||F - Y||^{2}$$

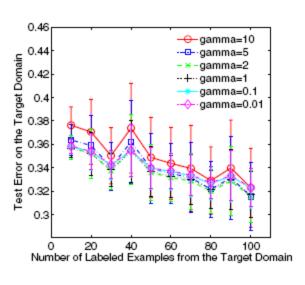
- Closed Form
- Iterative Algorithm (for large-scale)

- Parameters Tuning
- Methods Comparison

#### Parameters Tuning



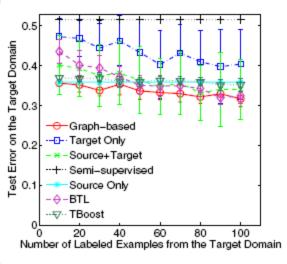
(a) 
$$\gamma = 1$$

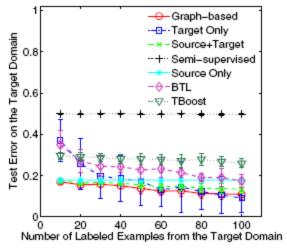


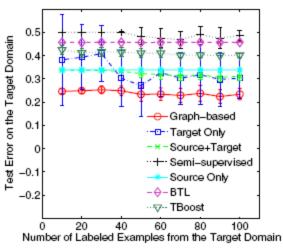
(b) 
$$\tau = 5$$

- Methods Comparison
  - 3 Tasks:
    - Sentiment classification (SC)
    - Document classification (DC)
    - Intrusion detection (ID)
  - 6 Methods:
    - BLT
    - TBoost
    - SSL
    - New Method (source, target, source+target)

Some Results of SC, DC & ID







# My Comment

- Graph-based Framework (GF) is not new
  - But it is firstly applied on transfer learning
- GF can also be applied on ranking (label ranking), recommender system & QA (Baichuan's doing) etc.