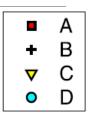


## **Spatial Colocation Patterns**

- Colocation pattern: A group of spatial features or events that are frequently co-located in the same region
  - Ex. West Nile Virus often occur in regions with poor mosquito control and the presence of birds
- Figure: Neighborhood instances are connected by edges <sup>1</sup>
  - **Ex.** {3, 6, 17}, {4, 7, 10, 16}, {2, 8, 11, 14, 15}, {2, 9}, ...
- Rowset(C) if every feature in patter C appears as a feature of an instance in the neighbor-set L, e.g.,

  - $\square$  rowset({A, B}) = {{5, 13}, {7, 10}, {2, 14}, {8, 14}}
- □ A colocation rule R: A → B, conditional probability cp(R) is defined as  $|\{L \in rowset(A) | \exists L' \text{ s.t. } (L \subseteq L') \land (L' \in rowset(A \cup B))\}|$

 $\rightarrow$  cp({A, B}  $\rightarrow$  {C, D}) = |rowset({A, B, C, D})|/|rowset({A,B})| =  $\frac{3}{4}$  = 75%





## **Mining Spatial Colocation Patterns**

Participation ratio pr(C, f): probability that C is observed in a neighbor-set wherever feature f is observed

$$pr(C, f) = \frac{|\{r | (r \in S) \land (r. f = f) \land (r \text{ is in a row instance of } C)\}|}{\{r | (r \in S) \land (r. f = f)\}|}$$

- $\square$  Ex.  $pr({A,B,C,D}, A) = 2/5, ..., <math>pr({A,B,C,D}, D) = 2/2 = 1$
- Monotonicity of participation ratio
  - Let C, C' be two co-location patterns such that  $C' \subset C$ 
    - □ Then, for each feature  $f \in C'$ ,  $pr(C', f) \ge pr(C, f)$



- $\Box$  Ex: Let min-feature-support = σ, min-pr = ρ
  - □ Start with a set of single feature pattern  $\{p_1\}$  with support  $\geq \sigma$ 
    - $\Box$  Grow to size k, in Apriori way (i.e., stop growing if the pattern is infrequent)
  - □ For each such p, mine its super-pattern P, s.t.,  $pr(P, p) \ge \rho$ , in Apriori way

