

Determining Placement of Intrusion Detectors for a Distributed Application through Bayesian Network Modeling

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Motivation

- Placement and choice of detectors are more an art than a science, relying on expert knowledge
- Impact of choice is significant on the accuracy and precision of overall detection function
- More (detectors) is not always better
 - Economic cost
 - Administration cost
 - Performance cost

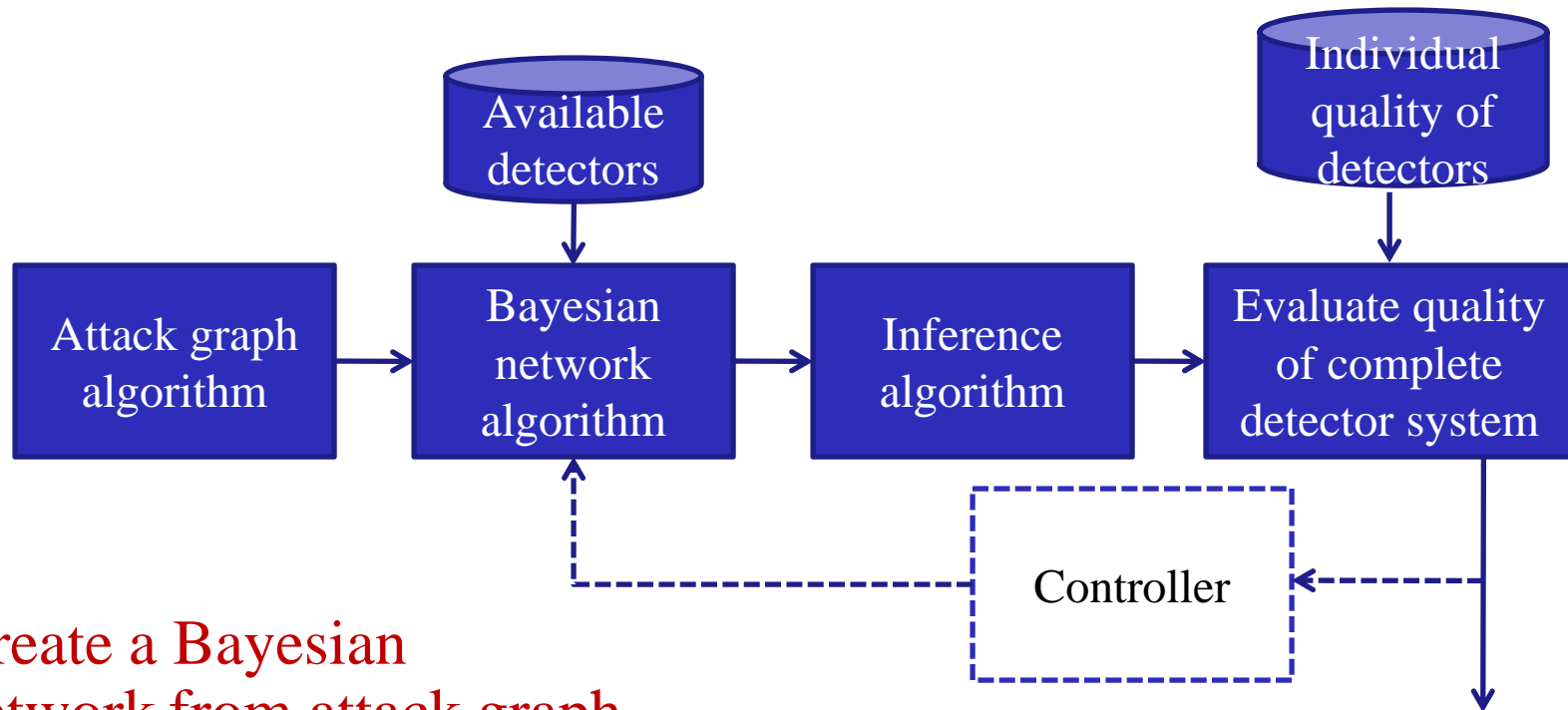


Contribution

- Method to evaluate the effect of detector configuration on system security
- Provide a greedy algorithm for determining detector settings in a distributed system

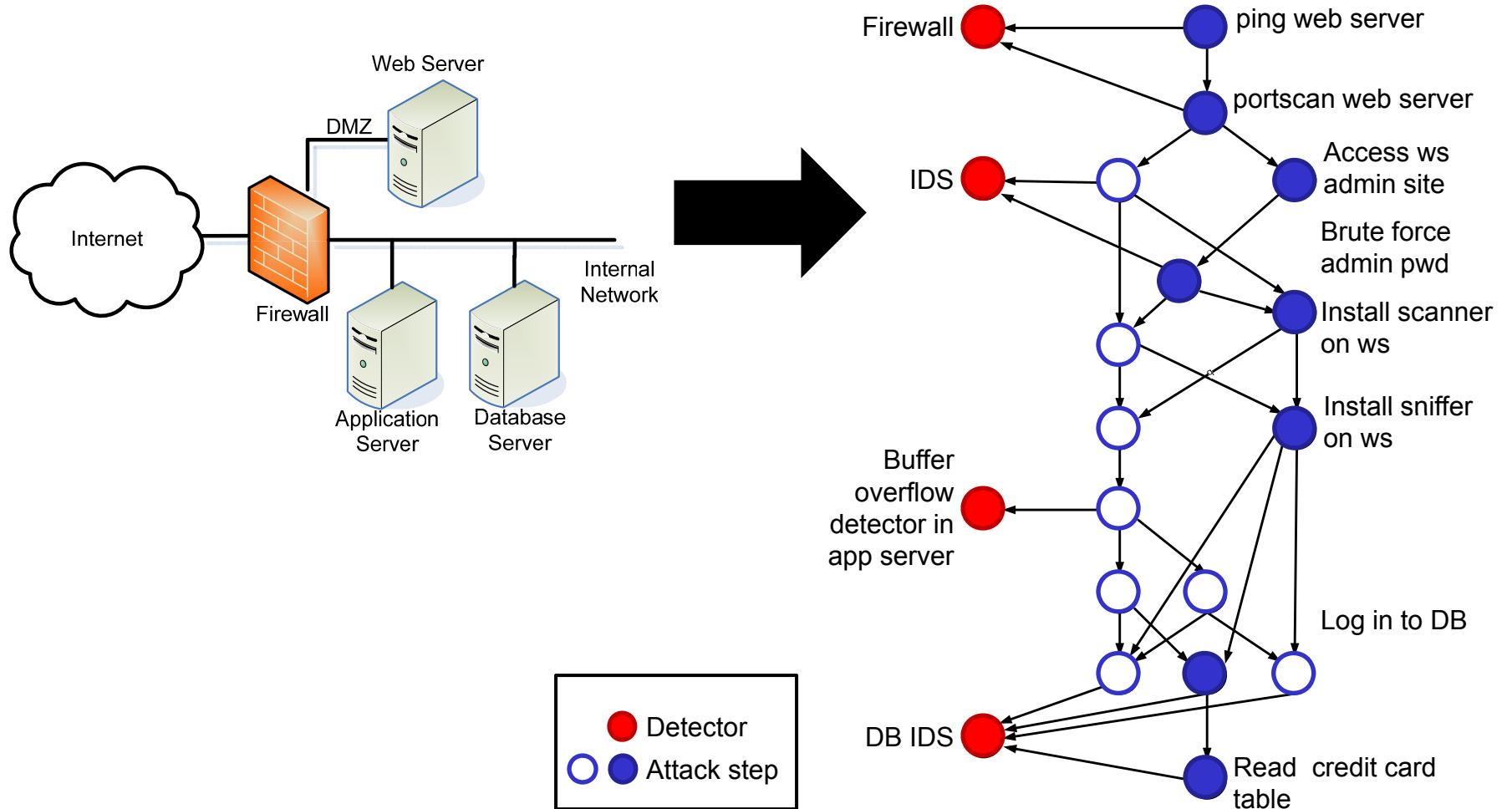


Overall Framework

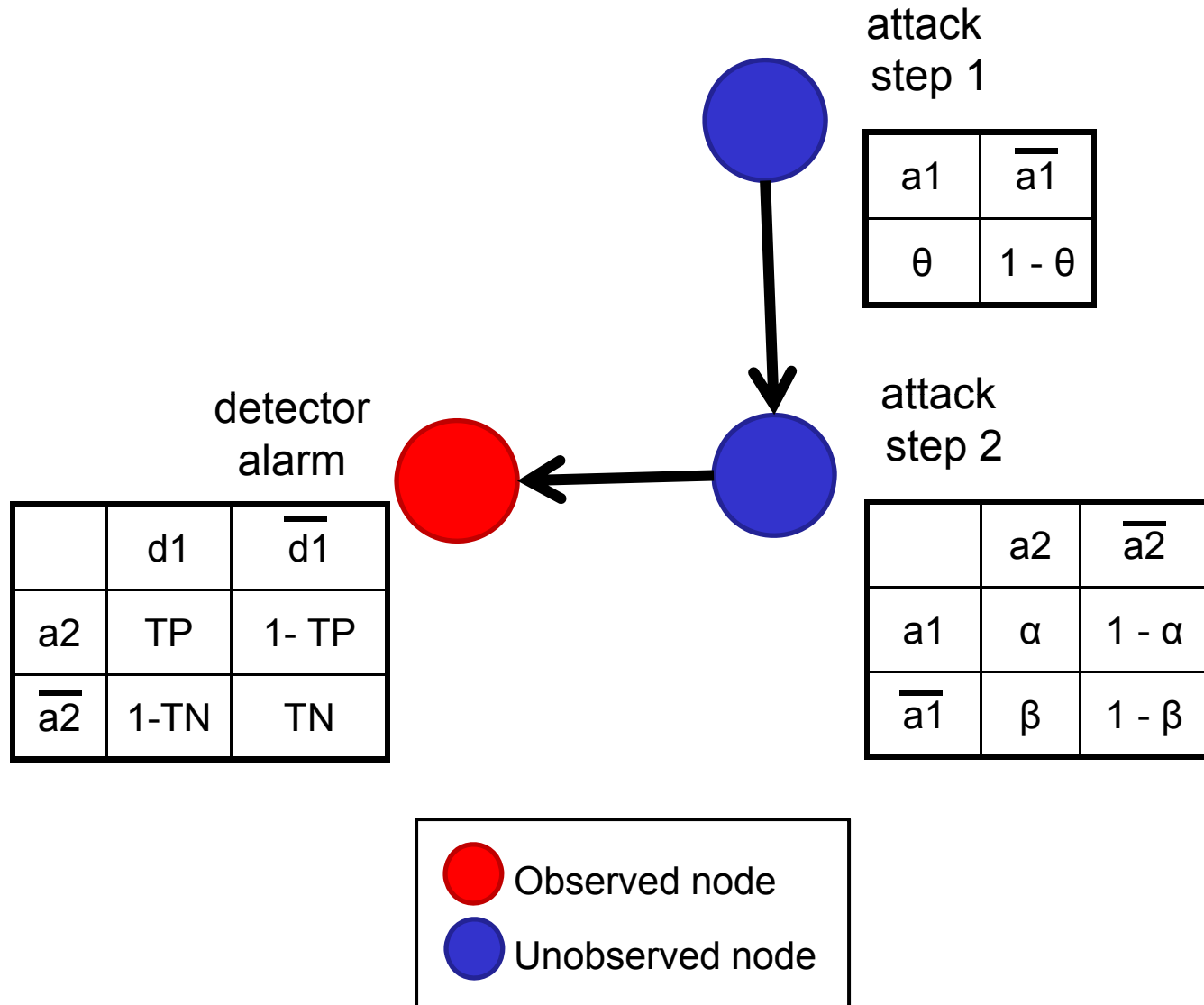


- Create a Bayesian network from attack graph, adding detectors and CPTs
- Run inference algorithm to compute possible combination of detectors, given an ultimate goal (from attacker perspective)
- Controller to adjust detector setting when network changes (not currently implemented)

Sample Network and Corresponding Bayesian Network

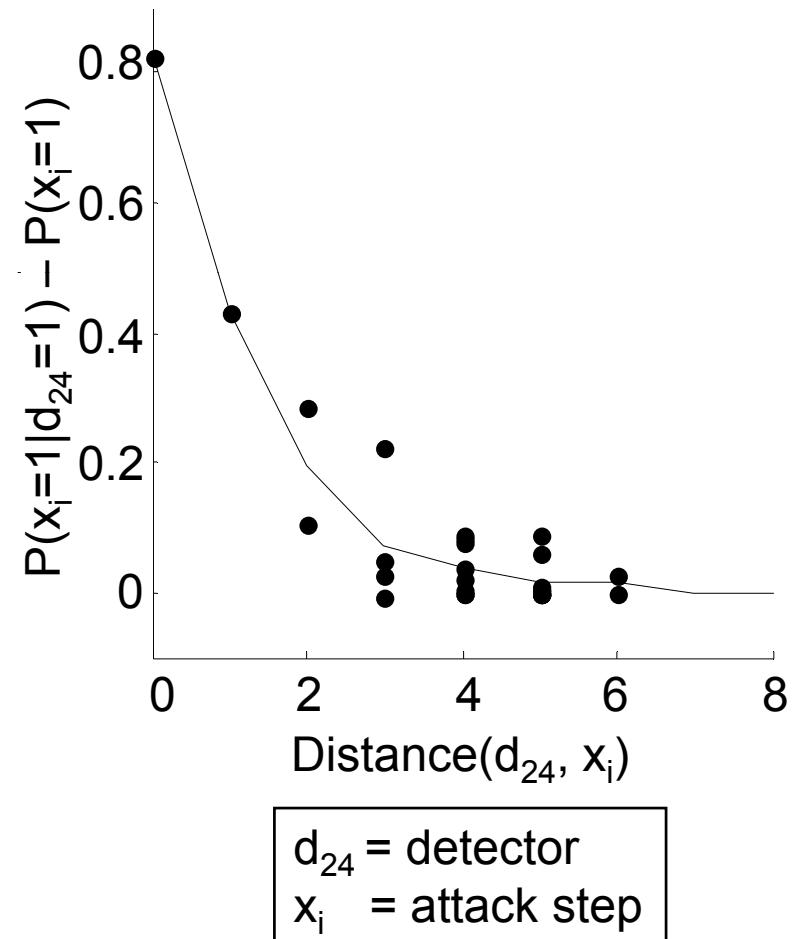


Probability Values on a Bayesian Network



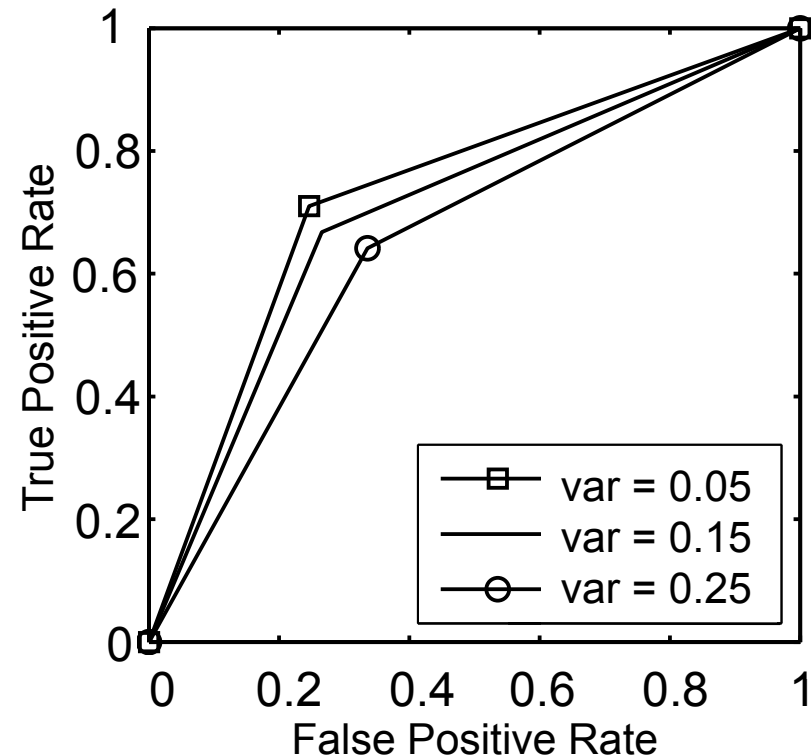
Exp. 1: Impact of Distance between Detectors and Attack Steps

- Objective: quantify gain in placing detector close to service where attack might occur
- Results show that a detector can affect nodes inside a “radius” of up to three edges



Exp. 2b: Impact of Imperfect Knowledge

- Objective: mimic different levels of expertise of system administrator
 - Expert, intermediate, naïve
- As variance increases, performance suffers
 - BN shows inherent resilience
 - Depends on location of attack steps and detectors



Algorithm

- **Input:**

- Bayesian network $BN = (V, CPT(V))$
- Set of detectors $D = (d_i, V(d_i), CPT[i][j])$
- Cost

- **Output:**

- Set of selected detectors and corresponding locations

- Greedy approach to select those detectors that provide greatest coverage (benefit) given a threshold (cost)

$$\text{System-Benefit} = \sum_{i=1}^M [\text{Benefit}_{f_i}(TN) \cdot \text{Precision}(f_i, d, a) + \text{Benefit}_{f_i}(TP) \cdot \text{Recall}(f_i, d, a)]$$

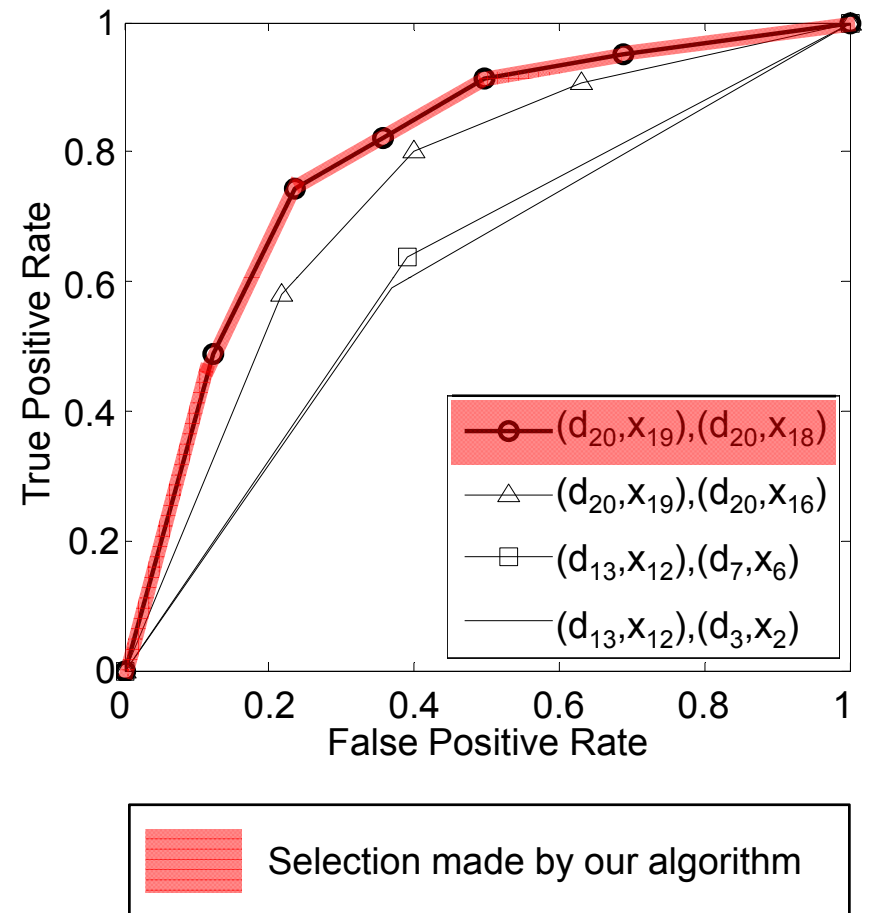
$$\text{Precision} = TP / (TP+FP) \quad \text{Recall} = TP / (TP+FN)$$

- Algorithm is not guaranteed to provide optimal solution since the exact problem is NP-hard



Exp. 3: Impact on Choice and Placement of Detectors

- Objective: determine impact of selecting detectors and corresponding locations
- Performance of detector pair (selected from algorithm) is compared against randomly selected pairs



Conclusions and Future Work

- Provide scientific basis for the choice and location of intrusion detectors
- Use of Bayesian networks allows to model relationships between attack steps and detectors in a distributed system
- Experiments validate that greedy choice of detectors gives good results when considering multiple detectors
- Future work:
 - Is the solution scalable to larger attack graphs and more detectors?
 - Is this the best polynomial time algorithm?
 - How can the algorithm be made incremental?



Sample Network and Corresponding Bayesian Network

