

Probabilistic
Graphical
Models



Representation

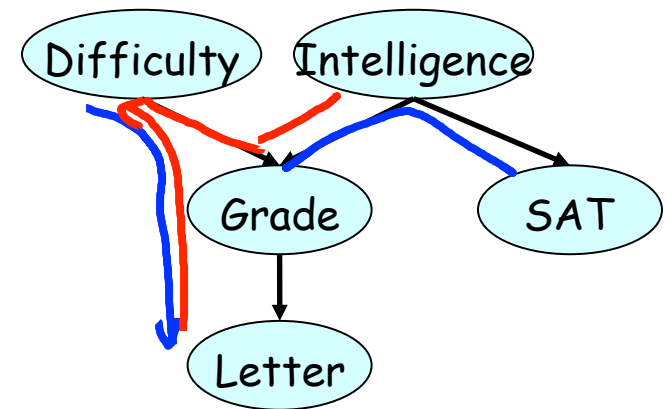
Bayesian Networks

Flow of
Probabilistic
Influence

When can X influence Y?

condition on X changes beliefs about Y

- $X \rightarrow Y$ ✓
- $X \leftarrow Y$ ✓
- $X \rightarrow W \rightarrow Y$ ✓
- $X \leftarrow W \leftarrow Y$ ✓
- $X \leftarrow \underline{W} \rightarrow Y$ ✓
- $X \rightarrow \underline{W} \leftarrow Y$ ✗
v-structure

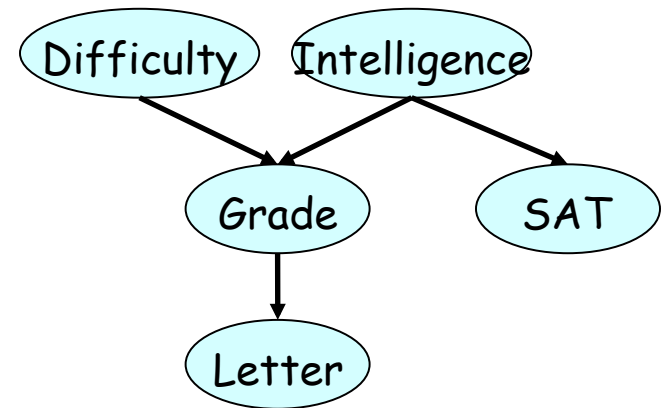


Active Trails

- A trail $X_1 - \dots - X_n$ is active if:
it has no v-structures $X_{i-1} \rightarrow X_i \leftarrow X_{i+1}$

When can X influence Y Given evidence about Z

- | | | |
|-----------------------------------|--------------|-----------|
| • $X \rightarrow Y$ | | |
| • $X \leftarrow Y$ | | |
| | $W \notin Z$ | $W \in Z$ |
| • $X \rightarrow W \rightarrow Y$ | ✓ | ✗ |
| • $X \leftarrow W \leftarrow Y$ | ✓ | ✗ |
| • $X \leftarrow W \rightarrow Y$ | ✓ | ✗ |
| • $X \rightarrow W \leftarrow Y$ | ✗ | ✓ |



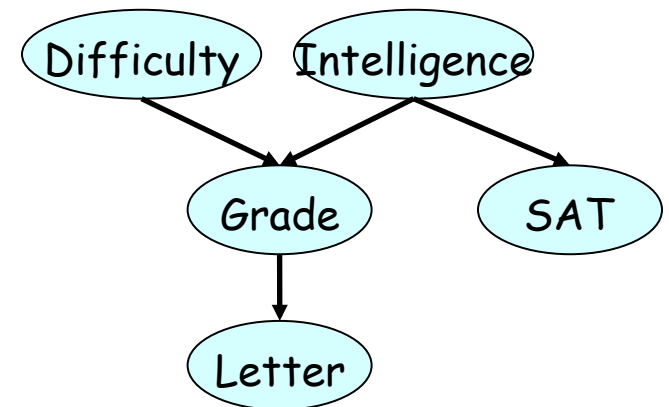
When can X influence Y given evidence about Z

- $S - I - G - D$ allows influence to flow when:

I is observed X

I not observed, nothing else X

I not observed & G is observed



Active Trails

- A trail $X_1 - \dots - X_n$ is active given Z if:
 - for any v-structure $X_{i-1} \rightarrow X_i \leftarrow X_{i+1}$ we have that X_i or one of its descendants $\in Z$
 - no other X_i is in Z
not in v-structure