# **Probabilistic Graphical Models**

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#### **Syllabus**

## Organization

- $16 \times 1h15$ : courses + tutorial
- final exam

#### Content

- Bayesian networks : definition and inference (PhL)
- Bayesian networks : learning (PhL)
- Probabilistic relational models (PhL)
- Markov logic networks (HLC)

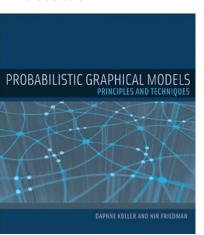


Philippe Leray



Hoel Le Capitaine

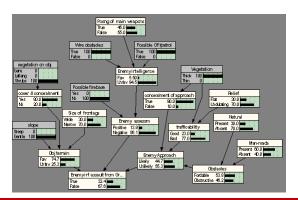
#### Introduction



## **Probabilistic Graphical Models**

- Marriage between Graph theory and Probability theory
- Powerful framework for representing complex domains using probability distributions
- Numerous applications in machine learning, computer vision, natural language processing, computational biology, ...

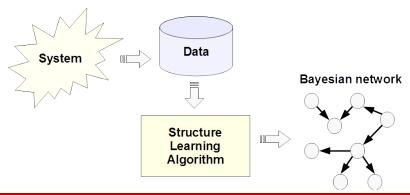
## Bayesian networks for knowledge modeling and reasoning



#### **Advantages**

- Modeling uncertain relationships
- Reasoning from incomplete observations

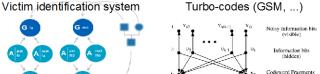
## Bayesian networks for knowledge discovery



## **Advantages**

- Structure learning from data
- Graphical interpretation

#### Bayesian networks applications



#### Anti Spam

Mail	Junk E-mail
Parior to Poldera	Amergraf Sir Date
Tent Hers	3 LestHooth
All Nel Politics	A Marco Rast
Personal Poiders	RecONDING god
Medical Desire (20)	Regine Concree
Courts Courts	14 Home Security
on Bank transfer and	Home Security System
Tank 1-mail (201)	Operflood led

## Assistant iPhone SIRI



# After-sale services

G ta: Genotype tather G mo: Genotype mother G child: Genotype child



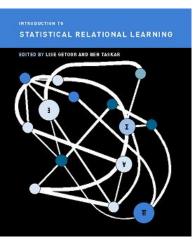
#### MS Office assistant



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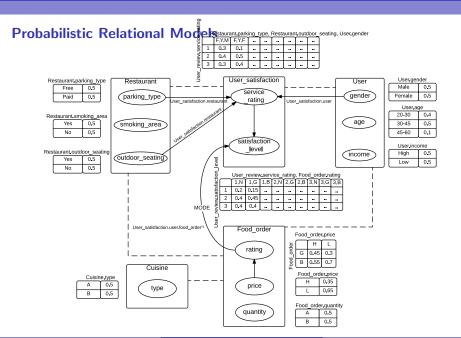
Noisy codeword
Fragments
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#### Some other PGMs



#### **Extensions to relational domains**

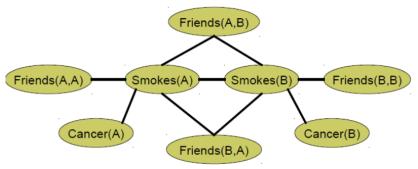
- Adding relations to probabilistic models: Probabilistic relational models
- Adding probability to logical/relational models : Markov logic networks



## **Markov Logic Networks**

1.5 
$$\forall x \ Smokes(x) \Rightarrow Cancer(x)$$
  
1.1  $\forall x, y \ Friends(x, y) \Rightarrow (Smokes(x) \Leftrightarrow Smokes(y))$ 

Two constants: **Anna** (A) and **Bob** (B)



Ph. Leray PGM & SRL 9 / 9