## Project for 276 2013. Focused on Probabilistic Programming

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Project reports requirements:

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In addition to project presentation you need to submit project reports due on our meeting on Tuesday 3-5 of the finals week, June 11. The report includes a summary of the paper/tutorial and more important any account of any original work that you did yourself. Your thought/critique of it, any additional work (modeling a problem, evaluating or any additional work you did). Depending on its nature it can be anywhere between 4-8 pages and if there is any additional material you wish to include it should be part of the appendix.

Summary of schedule presentations:

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Tuesday June 4: Team 3 and team 6

Thursday June 6, 11-12:30: Teams 4,5, and 2

Thursday June 6, 1-2: Teams 1 and 7 Tuesday (3:30-5): teams 8 and 9

List of Projects for CS 276 S13

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Team 1: Abdullah Abdulrahman Alamoudi

schedule: 6/6 Thursday (1-2 slot)

Effective Bayesian Inference for Stochastic Programs

Paper:

Daphne Koller, David McAllester, and Avi Pfeffer. "Effective Bayesian Inference for Stochastic

Programs." AAAI-97

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Team 2: Chris Van Wagenen

scheduled: Thursday

Tutorial on Church

Paper:

Noah D. Goodman, Vikash K. Mansinghka, Daniel M. Roy, Keith Bonawitz, and

Joshua B. Tenenbaum. "Church: a language for generative models." UAI-08 Team 3: Michael Stewart Scheduled: Tuesday 6/4 A tutorial or a project using the "PRL" language. Papers: [1] Nir Friedman, Lise Getoor, Daphne Koller, and Avi Pfeffer. "Learning Probabilistic Relational Models." IJCAI-99 [2] Lise Getoor, John Grant. "PRL: A Probabilistic Relational Language." Journal of Machine Learning 2006 Team 4: John Brock and Bryan Cutler A Blog tutorial. schedule: Thursday Team 5: Jianlin Shi and Geng Ji Scheduled: Thursday 6/6 Learning Relational Structure for Temporal Relation Extraction Paper: Tushar Khot, Siddharth Srivastava, Sriraam Natarajan and Jude Shavlik. "Learning Relational Structure for Temporal Relation Extraction." StaRAI-12 Team 6: Kevin Bache and Moshe Lichman Scheduled: Tuesday 6/4 A tutorial on Figaro \_\_\_\_\_ Team 7: Pramodh Prabhakar

Refining an Automatically Extracted Knowledge Base using Markov Logic

Schedule: Thursday

Description: Implementation of the algorithm presented in the paper [1] for refining a Knowledge Base using Markov Logic

## Papers:

[1] Lowd, Shangpu Jiang Daniel, and Dejing Dou. "Using Markov Logic to Refine an Automatically Extracted Knowledge Base." StaRAI-2012

[2] P. Domingos and D. Lowd. Markov logic: An interface layer for artificial intelligence. Synthesis Lectures on Artificial Intelligence and Machine Learning, 3(1):1–155, 2009

[3] A. Carlson, J. Betteridge, B. Kisiel, B. Settles, E. R. Hruschka, Jr., and T. M. Mitchell. Toward an architecture for never-ending language learning. In AAAI-2010, 2010

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Team 8: Junkyu Lee scheduled: 11th week

Study on the Lifted Inference Based on Stochastic Sampling (using MLN)

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Team 9: Rozita Rahimi, Negar Aref

Tutorial on The Markov Logic Language

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Updated information: We want to focus on languages from the group:

Figaro (IBAL)

Blog,

Markov Logic

Church-

Students are encouraged to select a focus on one of these languages and to provide tutorial and example.

Main sources of information:

1. <u>Probabilistic-Programming.org (a wiki)</u>: This website serves as a repository of links and information about probabilistic programming languages, including both academic research spanning theory, algorithms, modeling, and systems, as well as implementations, evaluations, and applications. If you would like to contribute to this site, please contact Daniel Roy. The site is still under construction: please help us link to relevant projects and research!

# NIPS 2012 Workshop: Probabilistic Decision Programming with Figaro

- 2. Markov Logic: An Interface Layer of Artificial Intelligence (Pedro Domingos and Daniel Lowd) (pdf) (print)
- 3. Statistical Relational Learning book: : <a href="http://www.cs.umd.edu/srl-book/">http://www.cs.umd.edu/srl-book/</a> (Edited by Lise Getoor and Ben Taskar)
- 4. 3rd Statistical Relational AI (StaRAI-13) workshop at AAAI '13

#### Software

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Alchemy: Learning and Inference in Markov Logic Networks (<a href="https://code.google.com/p/alchemy-2/">https://code.google.com/p/alchemy-2/</a>)

Church, a probabilistic programming language (http://projects.csail.mit.edu/church/wiki/Church)

## People

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- 1. Avi Pfeffer
- 2. Stuart Russell
- 3. Pedro Domingos
- 4. Vibhav Gogate
- 5. Lise Getoor
- 6. David Poole

For each we can seek: Language, Algorithms, Tutorials

#### **Papers**

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• Lifted First-Order Probabilistic Inference

Rodrigo de Salvo Braz and Eyal Amir and Dan Roth

• Lifted inference: normalizing loops by evaluation

Oleg Kiselyov, Chung-chieh Shan

<u>Figaro: An Object Oriented Probabilistic Programming Language</u> (<u>tutorial slides</u>)
 Avi Pfeffer

<u>Probabilistic Theorem Proving</u>

Vibhav Gogate and Pedro Domingos

• On Lifting the Gibbs Sampling Algorithm

Deepak Venugopal and Vibhav Gogate

Advances in Lifted Importance Sampling Vibhav Gogate et al.

• Effective Bayesian Inference for Stochastic Programs

Koller. Pfeffer. and McAllester

• Exploiting Uniform Assignments in First-Order MPE

Udi Apsel and Ronen I. Brafman, UAI 2012

Lifted Relational Variational Inference

Chois and Amir. UAI 2012

• Lifted Relax, Compensate and then Recover: From Approximate to Exact Lifted Probabilistic Inference

Darwiche, et. al, UAI 2012

Papers from StaRAI-2012 (workshop at UAI 2012)

From Lifted Inference to Lifted Models

Daan Fierens and Kristian Kersting.

• Generalized Counting for Lifted Variable Elimination

Nima Taghipour and Jesse Davis.

• Random Regression for Bayes Nets Applied to Relational Data

Oliver Schulte, Hassan Khosravi, Tianxiang Gao and Yuke Zhu.

• Nonparametric Relational Hybrid Models

Jaesik Choi and Eyal Amir.

• Probabilistic Soft Logic for Trust Analysis in Social Networks

Bert Huang, Angelika Kimmig, Lise Getoor and Jennifer Golbeck.

Using Markov Logic to Refine an Automatically Extracted Knowledge Base

Shangpu Jiang, Daniel Lowd and Dejing Dou.

 Accelarating Imitation Learning in Relational Domains via Transfer by Initialization Sriraam Natarajan, Phillip Odom, Saket Joshi, Tushar Khot, Kristian Kersting and Prasad Tadepalli.

• Slice Normalized Dynamic Markov Logic Networks

Tivadar Papai, Henry Kautz and Daniel Stefankovic.

Creating and Manipulating Probabilistic Programs with Figaro

Avi Pfeffer.

On Lifting the Gibbs Sampling Algorithm

Deepak Venugopal and Vibhav Gogate.

• Lifted Arbitrary Constraint Solving for Lifted Probabilistic Inference

Rodrigo de Salvo Braz, Shahin Saadati, Hung Bui and Ciaran O'Reilly.

• First-Order Models for POMDPs

Siddharth Srivastava, Stuart Russell and Avi Pfeffer.

• Initial Empirical Evaluation of Anytime Lifted Belief Propagation

Richard G. Freedman, Rodrigo de Salvo Braz, Hung Bui and Sriraam Natarajan.

• Learning Relational Structure for Temporal Relation Extraction

Tushar Khot, Siddharth Srivastava, Sriraam Natarajan and Jude Shavlik.

- <u>Evaluating Inference Algorithms for the Prolog Factor Language</u> Tiago Gomes and Vítor Santos Costa.
- <u>Liftability of Probabilistic Inference: Upper and Lower Bounds</u> Manfred Jaeger and Guy Van Den Broeck.
- Integrating Human Instructions and Reinforcement Learners: An SRL Approach
  Pradyot Korupolu V N, S S Manimaran, Balaraman Ravindran and Sriraam Natarajan.
- Aggregation and Population Growth: The Relational Logistic Regression and Markov Logic
   Cases
  - David Poole, David Buchman, Sriraam Natarajan and Kristian Kersting.
- <u>Combining Logic, Continuous Parameters and Markov Decision Processes Using Hybrid ASP</u> Alex Brik and Jeffrey Remmel.
- <u>Automorphism Groups of Graphical Models and Lifted Variational Inference</u> Hung Bui, Tuyen Huynh and Sebastian Riedel.
- Convex Adversarial Collective Classification Mohamadali Torkamani and Daniel Lowd.
- <u>A Dynamic Programming Algorithm for Inference in Recursive Probabilistic Programs</u> Andreas Stuhlmüller and Noah Goodman.
- <u>Lifted Probabilistic Inference: An MCMC Perspective</u> Mathias Niepert.
- <u>A Particle Filter for Probabilistic Dynamic Relational Domains</u>
   Davide Nitti, Tinne De Laet, McElory Hoffmann, Ingo Thon, Guy Van den Broeck and Luc De Raedt.

Here is a link to projects in 2007 that had a similar focus: <a href="http://www.ics.uci.edu/~dechter/courses/ics-275b/Fall-2007/projects.html">http://www.ics.uci.edu/~dechter/courses/ics-275b/Fall-2007/projects.html</a>
Papers from UAI 2012

<a href="http://www.auai.org/uai2012/schedule.shtml">http://www.auai.org/uai2012/schedule.shtml</a>