# **PrSAT: First Examples**

## Philosophy 148

January 31, 2008

#### ■ First, load in the Prsat package

See my Prsat website for instructions on downloading and installing Prsat (assuming you have Mathematica installed).

#### ■ Example #1

The first example of a probability model that we saw was the following:

$$\ln[2]:= \text{ MODEL1 } = \text{ PrSAT}\Big[\Big\{\text{Pr}\big[\textbf{X} \land \textbf{Y}\big] == \frac{1}{6}, \text{ Pr}\big[\textbf{X} \land \neg \textbf{Y}\big] == \frac{1}{4}, \text{ Pr}\big[\neg \textbf{X} \land \textbf{Y}\big] == \frac{1}{8}, \text{ Pr}\big[\neg \textbf{X} \land \neg \textbf{Y}\big] == \frac{11}{24}\Big\}\Big]$$

$$\text{Out}[2] = \left. \left\{ \left\{ X \to \left\{ \text{a}_2 \text{, a}_4 \right\} \text{, } Y \to \left\{ \text{a}_3 \text{, a}_4 \right\} \text{, } \Omega \to \left\{ \text{a}_1 \text{, a}_2 \text{, a}_3 \text{, a}_4 \right\} \right\} \text{, } \left\{ \text{a}_1 \to \frac{11}{24} \text{, a}_2 \to \frac{1}{4} \text{, a}_3 \to \frac{1}{8} \text{, a}_4 \to \frac{1}{6} \right\} \right\}$$

Prsat will show us an STT representation of MODEL1:

In[3]:= TruthTable[MODEL1]

Out[3]//DisplayForm=

X	Y	var	Pr
Т	Т	a14	$\frac{1}{6}$
Т	F	a <sub>2</sub>	$\frac{1}{4}$
F	Т	a13	1/8
F	F	$a_1$	$\frac{11}{24}$

We can use **Prsat** to calculate probability, using **MODEL1**:

Out[4]= 
$$\left\{ \frac{13}{24}, \frac{5}{12}, \frac{7}{24} \right\}$$

We can also check arbitrary claims to see if they are true on MODEL1:

In[5]:= EvaluateProbability[Pr[X | Y] > Pr[X], MODEL1]

Out[5]= True

The second example we saw was an algebraic proof of the following theorem:

```
ln[6]:= Pr(X \lor Y) = Pr(X) + Pr(Y) - Pr(X \land Y)
```

Prsat easily verifies this theorem (note: it does not present a readable proof).

This output means there are no probability models on which  $Pr[X \lor Y] \neq Pr[X] + Pr[Y] - Pr[X \land Y]$ . That "proves" that the above statement is a theorem of probability calculus.

### Example #3

The second example we saw was an algebraic proof of the following theorem:

```
ln[8]:= Pr(X) = Pr(X \land Y) + Pr(X \land \neg Y)
```

Prsat easily verifies this theorem (note: it does not present a readable proof).

```
\label{eq:linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_linear_line
```

This output means there are no probability models on which  $Pr[X] \neq Pr[X \land Y] + Pr[X \land \neg Y]$ . That "proves" that the above statement is a theorem of probability calculus.

#### Example #4

The next example involves the following theorem:

```
\ln[10]:= \mathbf{Pr}(X \to Y) \ge \mathbf{Pr}(Y \mid X)
```

**PrSAT** easily verifies this theorem (note: it does not present a readable proof). First, we need to define the conditional operator.

This output means there are no probability models on which  $Pr[X \rightarrow Y] \ge Pr[Y \mid X]$ . That "proves" that the above statement is a theorem of probability calculus.

#### Example #5

The next example involves the following theorem:

```
\ln[13] = d(X, Y) = d(X \lor Y, Y) + d(X \lor \neg Y, Y), \text{ where } d(X, Y) = \Pr(X | Y) - \Pr(X).
```

**Prsat** easily verifies this theorem (note: it does not present a readable proof). First, we need to define d(x, y).

$$\begin{array}{ll} & \text{In}[11] \coloneqq \ \mathbf{d}[\mathbf{X}_{-}, \ \mathbf{Y}_{-}] := \mathbf{Pr}[\mathbf{X} \mid \mathbf{Y}] - \mathbf{Pr}[\mathbf{X}]; \\ & \text{In}[12] \coloneqq \ \mathbf{PrSAT}[\{\mathbf{d}[\mathbf{X}, \ \mathbf{Y}] \neq \mathbf{d}[\mathbf{X} \lor \mathbf{Y}, \ \mathbf{Y}] + \mathbf{d}[\mathbf{X} \lor \neg \ \mathbf{Y}, \ \mathbf{Y}]\}] \\ & \text{PrSAT}:: srchfail : Search phase failed; attempting FindInstance} \\ & \text{Out}[12] = \ \{\} \end{array}$$

This output means there are no probability models on which  $\mathbf{d}[\mathbf{x}, \mathbf{Y}] \neq \mathbf{d}[\mathbf{x} \ \lor \ \mathbf{Y}, \ \mathbf{Y}] + \mathbf{d}[\mathbf{x} \ \lor \ \mathbf{Y}, \ \mathbf{Y}]$ . That "proves" that the above statement is a theorem of probability calculus.

#### Example #6

The next example involves the fact that the following is NOT a theorem:

$$ln[14]:= Pr(X | Y \lor Z) = Pr(X | Y \land Z)$$

**Prsat** easily finds a counter-model to this claim.

 $\label{eq:local_local_local} $$ \ln[14]:= $$ MODEL2 = PrSAT[{Pr[X \mid Y \lor Z] \neq Pr[X \mid Y \land Z]}, Probabilities \to Regular] $$$ 

The model **PrSAT** finds by defualt is *non*-regular. We can force it to find a *regular* counter-model, as follows:

$$\begin{aligned} \text{Out} [14] &= \left\{ \{ \textbf{X} \rightarrow \{ \textbf{a}_2 \text{, } \textbf{a}_5 \text{, } \textbf{a}_6 \text{, } \textbf{a}_8 \} \text{, } \textbf{Y} \rightarrow \{ \textbf{a}_3 \text{, } \textbf{a}_5 \text{, } \textbf{a}_7 \text{, } \textbf{a}_8 \} \text{, } \\ \textbf{Z} \rightarrow \{ \textbf{a}_4 \text{, } \textbf{a}_6 \text{, } \textbf{a}_7 \text{, } \textbf{a}_8 \} \text{, } \Omega \rightarrow \{ \textbf{a}_1 \text{, } \textbf{a}_2 \text{, } \textbf{a}_3 \text{, } \textbf{a}_4 \text{, } \textbf{a}_5 \text{, } \textbf{a}_6 \text{, } \textbf{a}_7 \text{, } \textbf{a}_8 \} \} \text{, } \\ \left\{ \textbf{a}_1 \rightarrow \frac{147181}{77577345} \text{, } \textbf{a}_2 \rightarrow \frac{1}{999} \text{, } \textbf{a}_3 \rightarrow \frac{46}{93} \text{, } \textbf{a}_4 \rightarrow \frac{1}{405} \text{, } \textbf{a}_5 \rightarrow \frac{1}{999} \text{, } \textbf{a}_6 \rightarrow \frac{1}{999} \text{, } \textbf{a}_7 \rightarrow \frac{1}{999} \text{, } \textbf{a}_8 \rightarrow \frac{83}{167} \right\} \right\} \end{aligned}$$

Here is an STT representation of **MODEL2**:

#### In[15]:= TruthTable[MODEL2]

Out[15]//DisplayForm=

X	Y	Z	var	Pr
Т	Т	Т	a <sub>8</sub>	83 167
Т	Т	F	a <sub>5</sub>	1 999
Т	F	Т	a <sub>6</sub>	1 999
Т	F	F	a <sub>2</sub>	1999
F	Т	Т	a <sub>7</sub>	<u>1</u> 999
F	Т	F	a <sub>3</sub>	$\frac{46}{93}$
F	F	Т	a14	1 405
F	F	F	a <sub>1</sub>	147 181 77 577 345

We can calculate the values of  $Pr[X \mid Y \land Z]$ ,  $Pr[X \mid Y \lor Z]$  on this model as follows:

$$\\ ln[16] := \textbf{EvaluateProbability}[\{\textbf{Pr}[\textbf{X} \mid \textbf{Y} \land \textbf{Z}], \, \textbf{Pr}[\textbf{X} \mid \textbf{Y} \lor \textbf{Z}]\}, \, \textbf{MODEL2}]$$

Out[16]= 
$$\left\{ \frac{82917}{83084}, \frac{38711715}{77352509} \right\}$$

We can look at decimal representations of these exact real numbers, as follows:

$$ln[17] = % // N$$
Out[17] = {0.99799, 0.500458}

We gave a different model in the lecture notes. We can enter that model in by hand, and then verify it has the desired properties, as follows:

$$\begin{aligned} & \text{In}[18] = \text{ MODEL3} = \text{PrSAT} \bigg[ \bigg\{ \text{Pr} \big[ \mathbb{X} \wedge \mathbb{Y} \wedge \mathbb{Z} \big] = \frac{1}{6}, \, \text{Pr} \big[ \mathbb{X} \wedge \mathbb{Y} \wedge \mathbb{Z} \big] = \frac{1}{6}, \, \text{Pr} \big[ \mathbb{X} \wedge \mathbb{Y} \wedge \mathbb{Z} \big] = \frac{1}{4}, \, \text{Pr} \big[ \mathbb{X} \wedge \mathbb{Y} \wedge \mathbb{Z} \big] = \frac{1}{16}, \\ & \text{Pr} \big[ \mathbb{X} \wedge \mathbb{Y} \wedge \mathbb{Z} \big] = \frac{1}{6}, \, \text{Pr} \big[ \mathbb{X} \wedge \mathbb{Y} \wedge \mathbb{Z} \big] = \frac{1}{12}, \, \text{Pr} \big[ \mathbb{X} \wedge \mathbb{Y} \wedge \mathbb{Y} \wedge \mathbb{Z} \big] = \frac{1}{24}, \, \text{Pr} \big[ \mathbb{X} \wedge \mathbb{Y} \wedge \mathbb{Y} \wedge \mathbb{Z} \big] = \frac{1}{16} \bigg\} \bigg] \\ & \text{Out}[18] = \, \bigg\{ \{ \mathbb{X} \to \{ \mathbb{A}_2, \, \mathbb{A}_5, \, \mathbb{A}_6, \, \mathbb{A}_8 \}, \, \mathbb{Y} \to \{ \mathbb{A}_3, \, \mathbb{A}_5, \, \mathbb{A}_7, \, \mathbb{A}_8 \}, \\ & \mathbb{Z} \to \{ \mathbb{A}_4, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \}, \, \mathbb{Y} \to \{ \mathbb{A}_1, \, \mathbb{A}_2, \, \mathbb{A}_3, \, \mathbb{A}_4, \, \mathbb{A}_5, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \} \bigg\}, \\ & \mathbb{Z} \to \{ \mathbb{A}_4, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \}, \, \mathbb{Y} \to \{ \mathbb{A}_1, \, \mathbb{A}_2, \, \mathbb{A}_3, \, \mathbb{A}_4, \, \mathbb{A}_5, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \} \bigg\}, \\ & \mathbb{Z} \to \{ \mathbb{A}_4, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \}, \, \mathbb{Y} \to \{ \mathbb{A}_1, \, \mathbb{A}_2, \, \mathbb{A}_3, \, \mathbb{A}_4, \, \mathbb{A}_5, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \} \bigg\}, \\ & \mathbb{Z} \to \{ \mathbb{A}_4, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \}, \, \mathbb{Y} \to \{ \mathbb{A}_1, \, \mathbb{A}_2, \, \mathbb{A}_3, \, \mathbb{A}_4, \, \mathbb{A}_5, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \} \bigg\}, \\ & \mathbb{Z} \to \{ \mathbb{A}_4, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \}, \, \mathbb{Y} \to \{ \mathbb{A}_1, \, \mathbb{A}_2, \, \mathbb{A}_3, \, \mathbb{A}_4, \, \mathbb{A}_5, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \} \bigg\}, \\ & \mathbb{Z} \to \{ \mathbb{A}_4, \, \mathbb{A}_6, \, \mathbb{A}_7, \, \mathbb{A}_8 \}, \, \mathbb{Z} \to \{ \mathbb{A}_1, \, \mathbb{A}_2, \, \mathbb{A}_3, \, \mathbb{A}_1, \, \mathbb{A}_1, \, \mathbb{A}_2, \, \mathbb{A}_1, \, \mathbb{$$

#### In[19]:= TruthTable[MODEL3]

Out[19]//DisplayForm=

X	Y	Z	var	Pr
Т	Т	Т	a <sub>8</sub>	1/6
Т	Т	F	a <sub>5</sub>	1/6
Т	F	Т	a <sub>6</sub>	1/4
Т	F	F	a <sub>2</sub>	1/16
F	Т	Т	a <sub>7</sub>	1/6
F	Т	F	a <sub>3</sub>	$\frac{1}{12}$
F	F	Т	a4	$\frac{1}{24}$
F	F	F	a <sub>1</sub>	$\frac{1}{16}$

$$\label{eq:ln20} \textbf{In} \textbf{[20]:=} \quad \textbf{EvaluateProbability} \textbf{[\{Pr[X \mid Y \land Z], Pr[X \mid Y \lor Z]\}, MODEL3]}$$

Out[20]= 
$$\left\{ \frac{1}{2}, \frac{2}{3} \right\}$$

We can also see the algebraic form of an expression, as follows:

$$\label{eq:ln[21]:=} \textbf{AlgebraicForm}[\texttt{Pr}[\texttt{X} \mid \texttt{Y} \land \texttt{Z}] == \texttt{Pr}[\texttt{X} \mid \texttt{Y} \lor \texttt{Z}] \text{, } \{\texttt{X}, \texttt{Y}, \texttt{Z}\}]$$

Out[21]= 
$$\frac{a_8}{a_7 + a_8} = \frac{a_5 + a_6 + a_8}{a_3 + a_4 + a_5 + a_6 + a_7 + a_8}$$

Note that **PrSAT** uses different conventions (i.e., a different ordering in the truth-table) for the  $a_i$  than I use in the lecture notes.