

# Estimating the Probability of a Conjecture to be a Theorem in PLN for Inference Control

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Artificial Intelligence and Theorem Proving 2025 (AITP-25)

# Outline

- 1 Probability of Conjecture to be Theorem (in PLN)
- 2 Use such Estimates to Guide Reasoning

State of the Art (notable papers):

- *Logical Prior Probability*, Abram Demski (2016)
- *Uniform Coherence*, Scott Garrabrant et al (2016)
- *Logical Induction*, Scott Garrabrant et al (2016)

# Ternary predicate relating theories, proofs and propositions




$$\Theta : \text{Theory} \times \text{Proof} \times \text{Proposition} \rightarrow \text{Bool}$$

PLN



$\Theta$     - - ➤ Predictive Patterns    - - ➤ Estimate Conjectures

# PLN Recall

-  Non-Axiomatic Logic (NAL), *Pei Wang, 2013*
-  Probabilistic Logic Networks (PLN), *Ben Goertzel et al, 2008*
-  Subjective Logic, *Audun Jøsang, 2016*

# PLN Call

Traditional Logic:

$$\Gamma \vdash T$$

$\rightarrow$

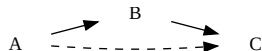
PLN:

$$\Gamma \vdash T$$

$\rightleftharpoons$

# PLN Recall

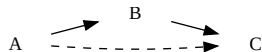
Deduction:



$$\frac{B \Rightarrow C \quad A \Rightarrow B}{A \Rightarrow C}$$

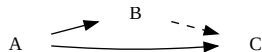
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Induction:

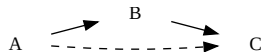


$$\frac{A \Rightarrow C \quad A \Rightarrow B}{B \Rightarrow C}$$



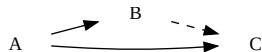
# PLN Recall

Deduction:



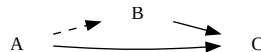
$$\frac{B \Rightarrow C \quad A \Rightarrow B}{A \Rightarrow C}$$

Induction:



$$\frac{A \Rightarrow C \quad A \Rightarrow B}{B \Rightarrow C}$$

Abduction:



$$\frac{A \Rightarrow C \quad B \Rightarrow C}{A \Rightarrow B}$$

# PLN Recall

Truth Value:

$$A \Rightarrow B \stackrel{m}{=} \text{TV}$$

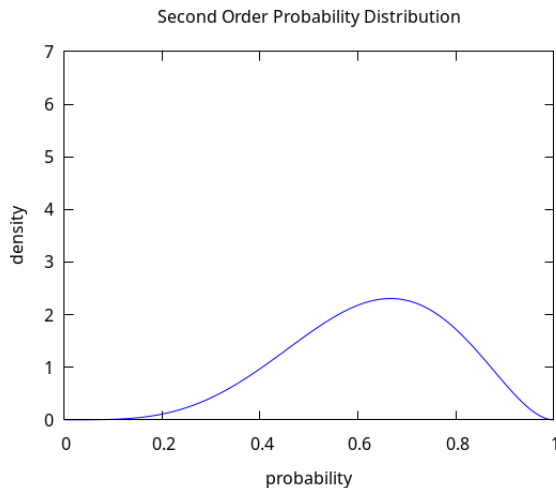
TV

=

*Second Order Probability  
Distribution*

$\approx$

$$P(B|A)$$

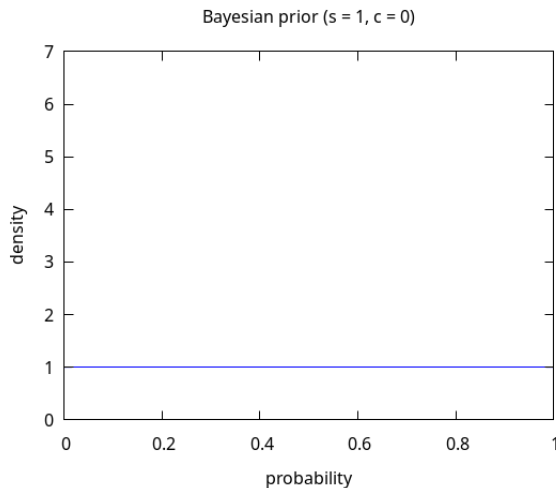


# PLN Recall

## Simple Truth Value:

$$A \Rightarrow B \stackrel{m}{=} \langle s, c \rangle$$

- $s = \text{strength}$
- $c = \text{confidence}$
- Beta Distribution

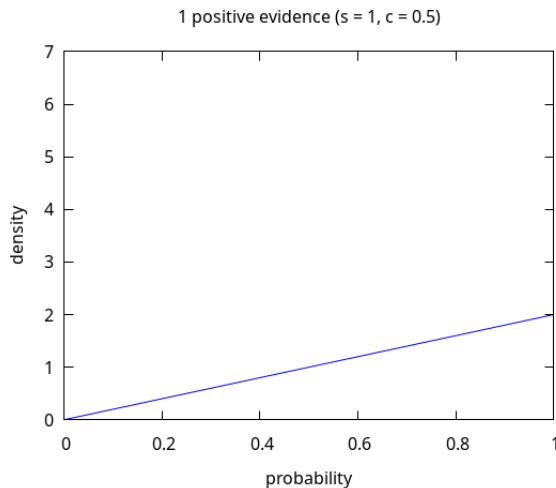


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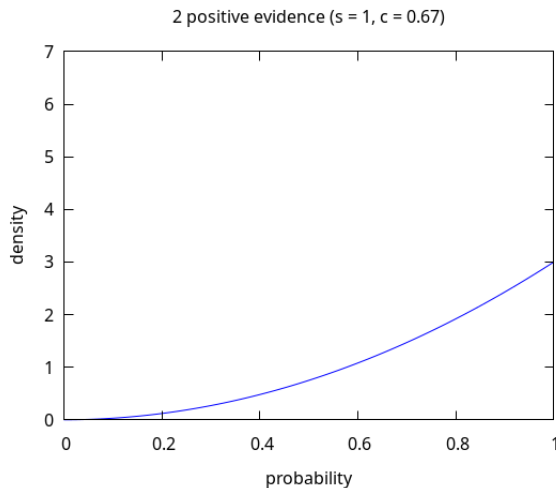


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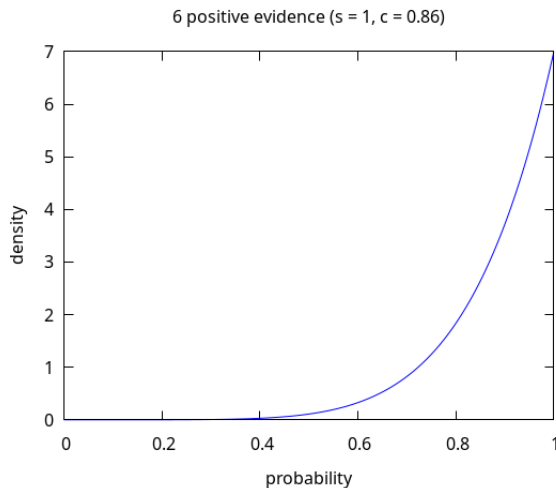


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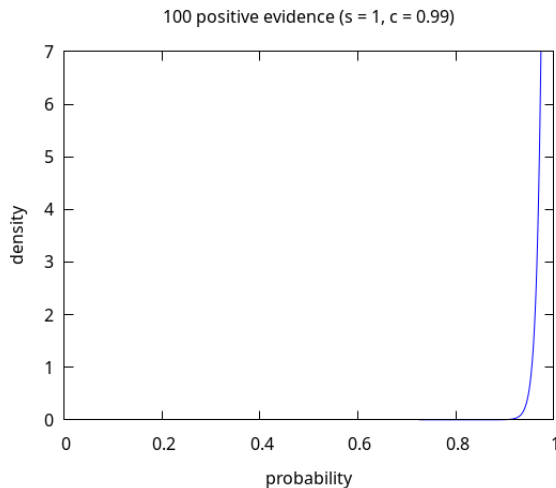


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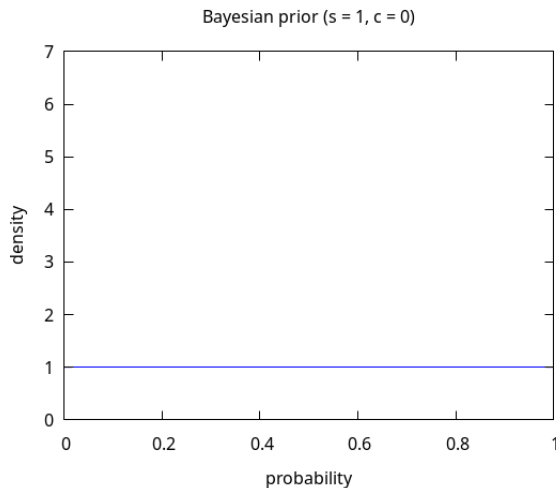


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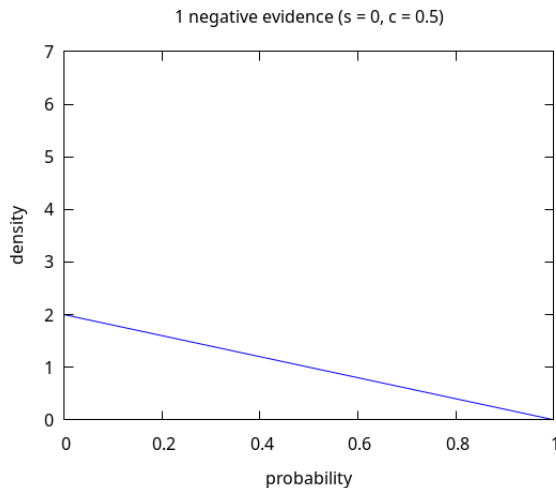


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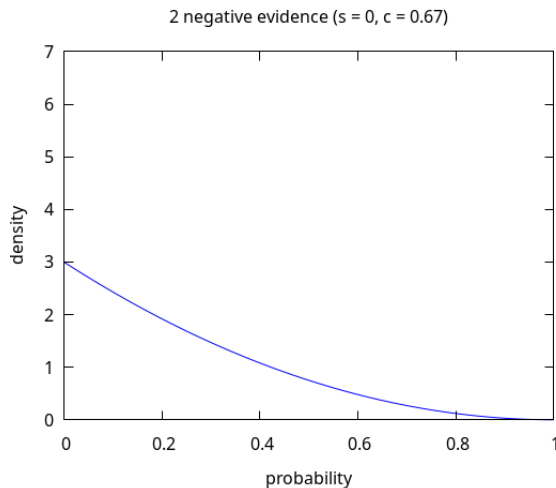


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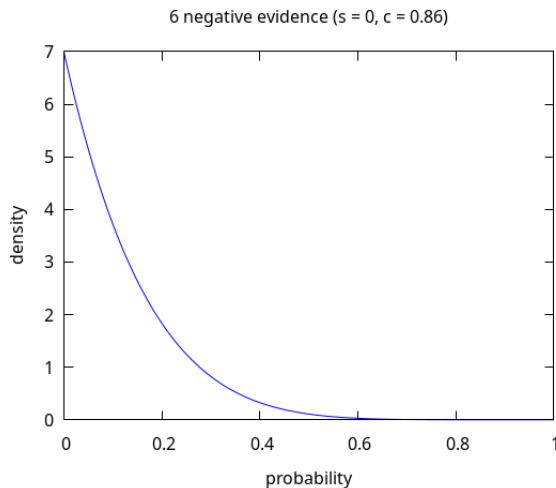


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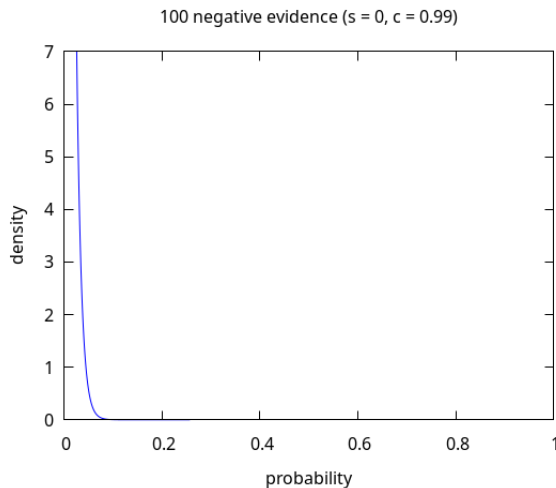


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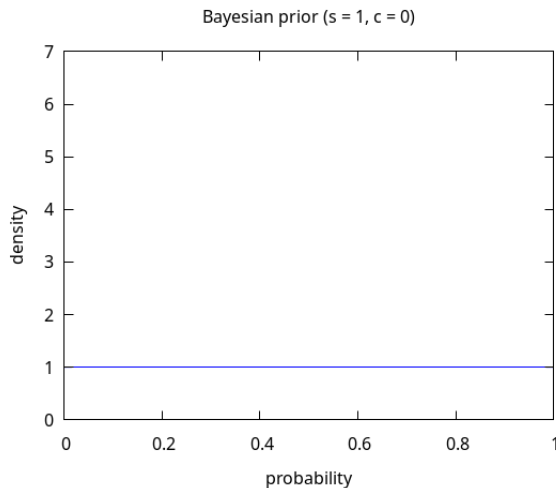


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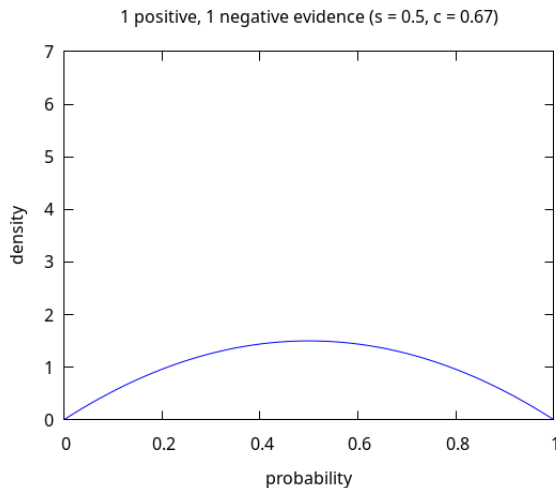


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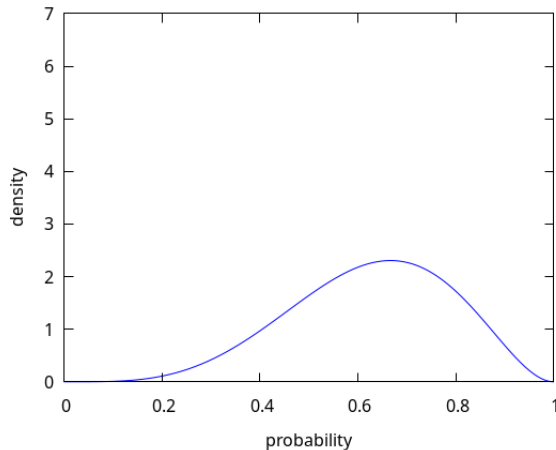
# PLN Recall

## Simple Truth Value:

$$A \Rightarrow B \stackrel{m}{=} \langle s, c \rangle$$

- $s = \text{strength}$
- $c = \text{confidence}$
- Beta Distribution

4 positive, 2 negative evidence ( $s = 0.67$ ,  $c = 0.86$ )



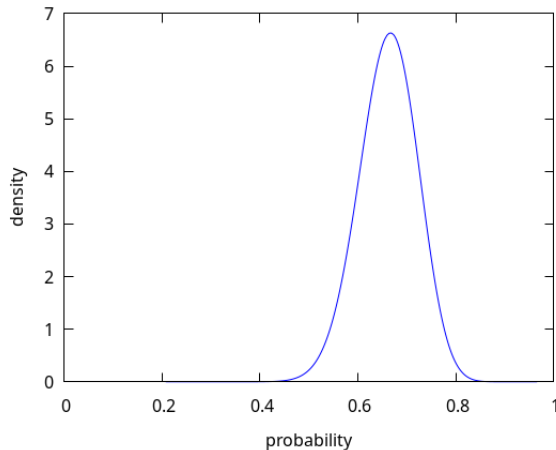
# PLN Recall

## Simple Truth Value:

$$A \Rightarrow B \stackrel{m}{=} \langle s, c \rangle$$

- $s = \text{strength}$
- $c = \text{confidence}$
- Beta Distribution

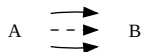
40 positive, 20 negative evidence ( $s = 0.67$ ,  $c = 0.98$ )



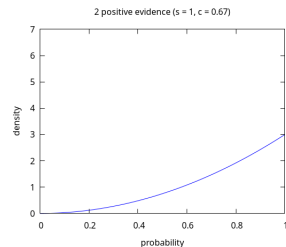
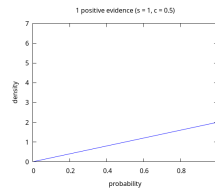
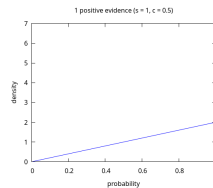


# PLN Recall

Revision:

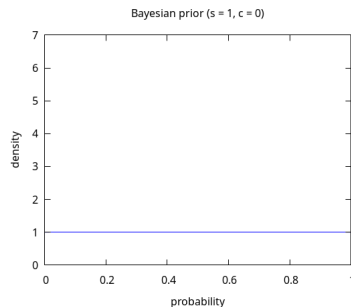
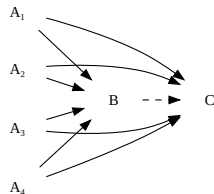


$$\frac{\overline{A \Rightarrow B} \ (e) \quad \overline{A \Rightarrow B} \ (f) \quad e \perp f}{A \Rightarrow B}$$



# PLN Recall

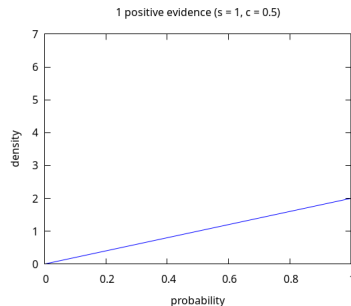
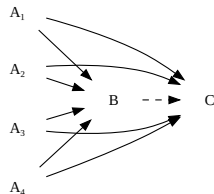
## Induction + Revision:



$$\begin{array}{c}
 \frac{A_1 \Rightarrow C \quad A_1 \Rightarrow B}{B \Rightarrow C} \text{ (Ind)} \quad \frac{A_2 \Rightarrow C \quad A_2 \Rightarrow B}{B \Rightarrow C} \text{ (Ind)} \quad \frac{A_3 \Rightarrow C \quad A_3 \Rightarrow B}{B \Rightarrow C} \text{ (Ind)} \quad \frac{A_4 \Rightarrow C \quad A_4 \Rightarrow B}{B \Rightarrow C} \text{ (Ind)} \\
 \frac{B \Rightarrow C \quad B \Rightarrow C}{B \Rightarrow C} \text{ (Rev)} \quad \frac{B \Rightarrow C \quad B \Rightarrow C}{B \Rightarrow C} \text{ (Rev)} \quad \frac{B \Rightarrow C \quad B \Rightarrow C}{B \Rightarrow C} \text{ (Rev)}
 \end{array}$$

# PLN Recall

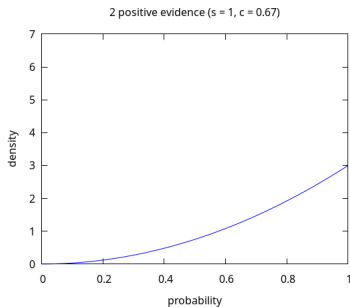
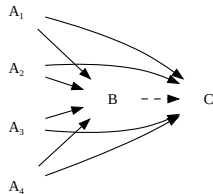
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# PLN Recall

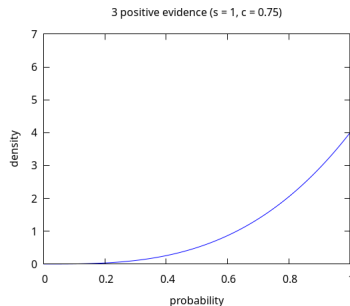
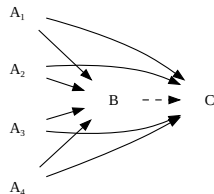
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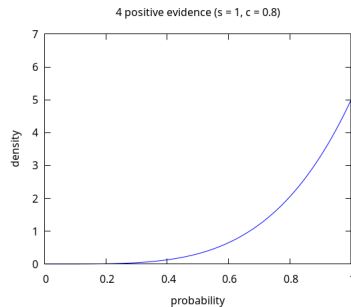
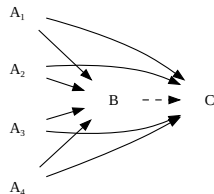
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 \frac{B \Rightarrow C}{B \Rightarrow C}
 \end{array}$$

# PLN Recall

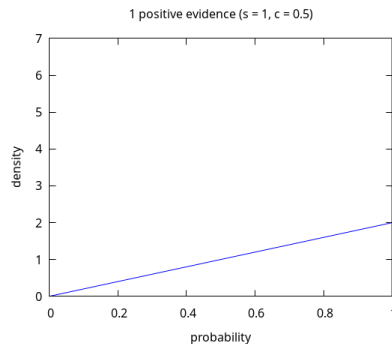
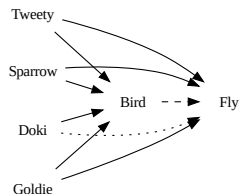
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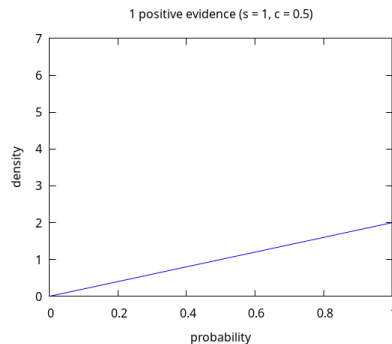
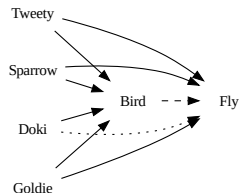
## Induction + Revision example:



$$\frac{\text{Tweety} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 1, 1 \rangle \quad \text{Tweety} \Rightarrow \text{Bird} \stackrel{m}{=} \langle 1, 1 \rangle}{\text{Bird} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 1, 0.5 \rangle} \quad (\text{Ind}, t)$$

# PLN Recall

## Induction + Revision example:

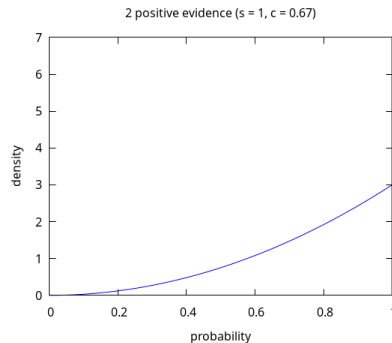
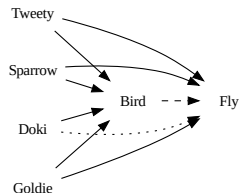


$$\frac{\text{Sparrow} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 1, 1 \rangle \quad \text{Sparrow} \Rightarrow \text{Bird} \stackrel{m}{=} \langle 1, 1 \rangle}{\text{Bird} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 1, 0.5 \rangle} \quad (\text{Ind}, s)$$



# PLN Recall

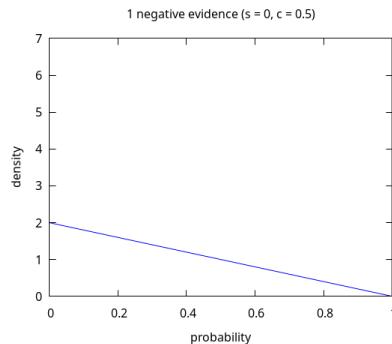
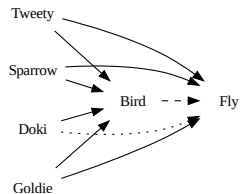
## Induction + Revision example:



$$\frac{\text{Bird} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 1, 0.5 \rangle \quad (t) \quad \text{Bird} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 1, 0.5 \rangle \quad (s)}{\text{Bird} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 1, 0.67 \rangle} \quad t \perp s \quad (\text{Rev}, t, s)$$

# PLN Recall

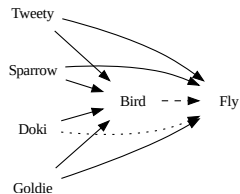
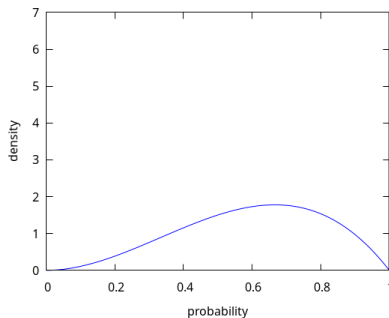
## Induction + Revision example:



$$\frac{\text{Doki} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 0, 1 \rangle \quad \text{Doki} \Rightarrow \text{Bird} \stackrel{m}{=} \langle 1, 1 \rangle}{\text{Bird} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 0, 0.5 \rangle} \quad (\text{Ind}, d)$$

# PLN Recall

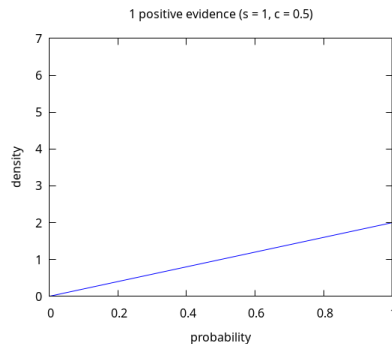
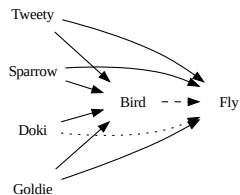
## Induction + Revision example:

2 positive, 1 negative evidence ( $s = 0.67$ ,  $c = 0.75$ )

$$\frac{\text{Bird} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 1, 0.67 \rangle \quad (t,s) \quad \text{Bird} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 0, 0.5 \rangle \quad (d)}{\text{Bird} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 0.67, 0.75 \rangle} \quad t, s \perp d \quad (\text{Rev}, t, s, d)$$

# PLN Recall

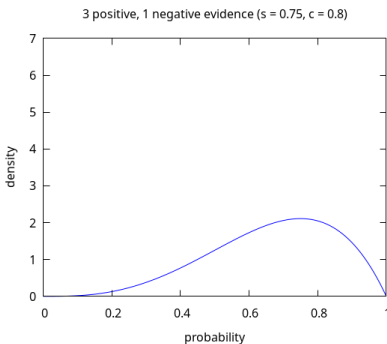
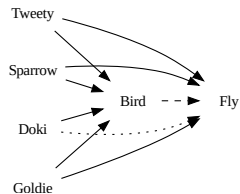
## Induction + Revision example:



$$\frac{\text{Goldie} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 1, 1 \rangle \quad \text{Goldie} \Rightarrow \text{Bird} \stackrel{m}{=} \langle 1, 1 \rangle}{\text{Bird} \Rightarrow \text{Fly} \stackrel{m}{=} \langle 1, 0.5 \rangle} \quad (\text{Ind}, g)$$

# PLN Recall

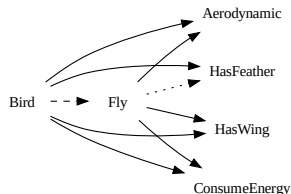
## Induction + Revision example:



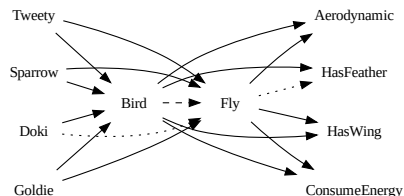
$$\frac{\text{Bird} \Rightarrow \text{Fly} \stackrel{\text{m}}{=} \langle 0.67, 0.75 \rangle \quad (t,s,d) \quad \text{Bird} \Rightarrow \text{Fly} \stackrel{\text{m}}{=} \langle 1, 0.5 \rangle \quad (g)}{\text{Bird} \Rightarrow \text{Fly} \stackrel{\text{m}}{=} \langle 0.75, 0.8 \rangle} \quad t, s, d \perp g \quad (\text{Rev}, t, s, d, g)$$

# PLN Recall

## Abduction + Revision:



## Induction + Abduction + Revision:



PLN also has:

- Quantifiers  $\exists, \forall$
- Traditional Connectors  $\wedge, \vee, \neg$
- Composite Predicates:  $\text{Bird} \wedge \neg\text{Penguin} \Rightarrow \text{Fly}$
- Probabilistic Computational Model

# PLN and Theorem Proving

Uncertain Reasoning:

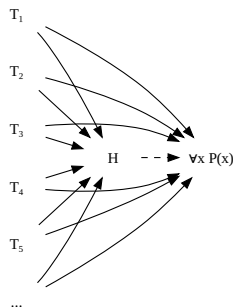
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Induction + Revision:



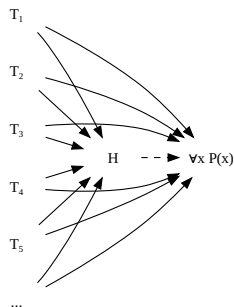


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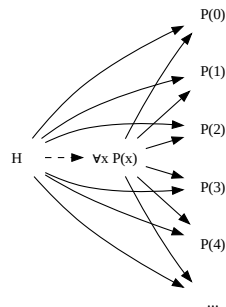
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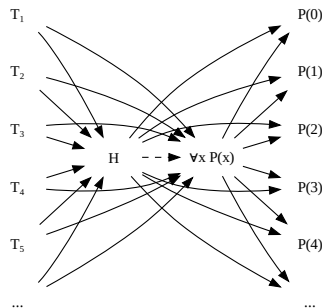


# PLN and Theorem Proving

Uncertain Reasoning:

$$H \Rightarrow \forall x P(x) \text{ ?}$$

Induction + Abduction + Revision:



Ternary predicate relating theories, proofs and propositions:

$$\Theta : \text{Theory} \times \text{Proof} \times \text{Proposition} \rightarrow \text{Bool}$$

- **Theory**: *Typing relationships* encoding axioms and inference rules.

$$\{Z : \text{Nat}, S : \text{Nat} \rightarrow \text{Nat}\}$$

- **Proof**: *Inhabitant* of a type.

$$(S \ (S \ (S \ Z)))$$

- **Proposition**: *Type*.

$$\text{Nat}$$

$$\Theta(\{Z : \text{Nat}, S : \text{Nat} \rightarrow \text{Nat}\}, (S \ (S \ (S \ Z))), \text{Nat}) \stackrel{m}{=} \langle 1, 1 \rangle$$

# Example (Propositional Calculus):

## Instances:

$\Theta \left( \left\{ \begin{array}{l} \text{ax-1} : (\phi \rightarrow (\psi \rightarrow \phi)), \\ \text{ax-2} : ((\phi \rightarrow (\psi \rightarrow \chi)) \rightarrow ((\phi \rightarrow \psi) \rightarrow (\phi \rightarrow \chi))), \\ \text{ax-3} : (((\neg \phi) \rightarrow (\neg \psi)) \rightarrow (\psi \rightarrow \phi)), \\ \text{ax-mp} : \phi \rightarrow (\phi \rightarrow \psi) \rightarrow \psi \end{array} \right\}, \right.$

$(\lambda \text{ mp2.1 mp2.3 } (\text{ax-mp mp2.1 mp2.3})),$   
 $\phi \rightarrow (\phi \rightarrow (\psi \rightarrow \chi)) \rightarrow (\psi \rightarrow \chi)$   
 $\left. \right) \stackrel{\text{m}}{=} \langle 1, 1 \rangle$

# Example (Propositional Calculus):

## Instances:

$\Theta \left( \left\{ \begin{array}{l} \text{ax-1} : (\phi \rightarrow (\psi \rightarrow \phi)), \\ \text{ax-2} : ((\phi \rightarrow (\psi \rightarrow \chi)) \rightarrow ((\phi \rightarrow \psi) \rightarrow (\phi \rightarrow \chi))), \\ \text{ax-3} : (((\neg \phi) \rightarrow (\neg \psi)) \rightarrow (\psi \rightarrow \phi)), \\ \text{ax-mp} : \phi \rightarrow (\phi \rightarrow \psi) \rightarrow \psi \end{array} \right\}, \right.$   
 $(\lambda \text{ mp2.1 mp2.3 } (\text{ax-mp mp2.3 mp2.1})),$   
 $\phi \rightarrow (\phi \rightarrow (\psi \rightarrow \chi)) \rightarrow (\psi \rightarrow \chi)$   
 $\left. \right) \stackrel{\text{m}}{=} \langle 0, 1 \rangle$

# PLN and Theorem Proving

## Crisp Patterns:

- Modus ponens:

$$\Theta(\Gamma, f, a \rightarrow b) \wedge \Theta(\Gamma, x, a) \Rightarrow \Theta(\Gamma, f(x), b)$$

$$\underline{\underline{m}}$$

$$\langle 1, 1 \rangle$$

- Existential Quantification Introduction:

$$\Theta(\Gamma, \Pi, T) \wedge (\text{cl } \Gamma) \wedge (\text{cl } \Pi) \wedge (\text{cl } T) \Rightarrow \exists \pi \Theta(\Gamma, \pi, T)$$

$$\underline{\underline{m}}$$

$$\langle 1, 1 \rangle$$

# PLN and Theorem Proving

## Uncertain Patterns:

- Marginal estimate:

$$\exists \pi \Theta(\text{PC}, \pi, \tau)$$

$$\underline{\underline{m}}$$

$$\langle 0.001, 0.8 \rangle$$

- Conditional estimate:

$$P(\tau) \Rightarrow \exists \pi \Theta(\text{PC}, \pi, \tau)$$

$$\underline{\underline{m}}$$

$$\langle 0.2, 0.7 \rangle$$

# $\Theta$ , Probabilistic Logic Networks (PLN)

- How likely is there a *proof* of  $T$  in  $\Gamma$ :

$$\exists \pi \Theta(\Gamma, \pi, T) \stackrel{m}{=} \$TV$$



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# $\Theta$ , Probabilistic Logic Networks (PLN)

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- How likely is there a *theory* in which  $\Pi$  proves  $T$ :

$$\exists \gamma \Theta(\gamma, \Pi, T) \stackrel{m}{=} \$TV$$

- How likely is there a *proof* of a *theorem* in a *theory* with certain *properties*:

$$\exists \gamma, \pi, \tau \Theta(\gamma, \pi, \tau) \wedge P(\gamma) \wedge Q(\pi) \wedge R(\tau) \wedge S(\gamma, \pi, \tau) \stackrel{m}{=} \$TV$$

# Estimate Probability of Conjecture to be Theorem in Practice

```
(bc PARAMS THEORY (: $proof PROP))
```

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$\downarrow$   $[\$proof] = z$

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(bc PLN_PARAMS PLN_THEORY (: $pln_proof ( $\stackrel{m}{=}$  ( $\exists$  z ( $\Theta$  [THEORY] z [PROP]))) $TV))
```

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↓

$\$TV = ?$

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$$\downarrow \quad [\$proof] = z$$

$$(\text{bc PLN_PARAMS PLN_THEORY } (: \$\text{pln\_proof } (\stackrel{\text{m}}{=} (\exists z \ (\Theta \text{ [THEORY]} z \text{ [PROP]}))) \ \$TV))$$

$$\downarrow$$

$$\$TV = ?$$

- Complete ignorance:  $\$TV = \langle 1, 0 \rangle$

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$$\$TV = ?$$

- Complete ignorance:  $\$TV = \langle 1, 0 \rangle$
- Complete certainty:  $\$TV = \langle 1, 1 \rangle$



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$$(\text{bc } \text{PARAMS } \text{THEORY } (: \$\text{proof } \text{PROP}))$$

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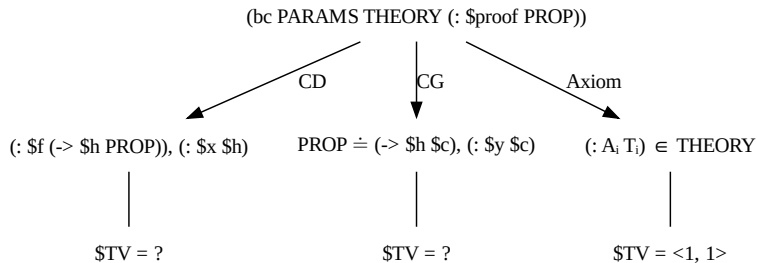
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$$\downarrow$$

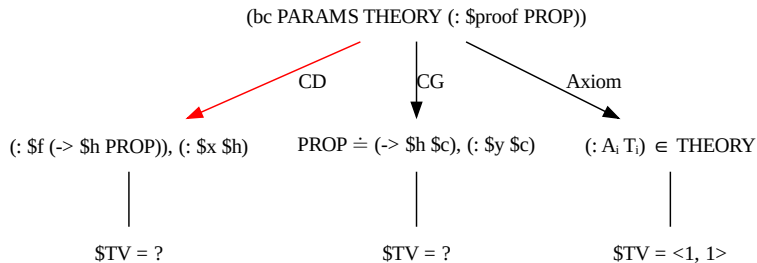
$$\$TV = ?$$

- Complete ignorance:  $\$TV = \langle 1, 0 \rangle$
- Complete certainty:  $\$TV = \langle 1, 1 \rangle$
- Partial certainty:  $\$TV = \langle 0.7, 0.8 \rangle$

# Estimate Probability of Conjecture to be Theorem as Guide



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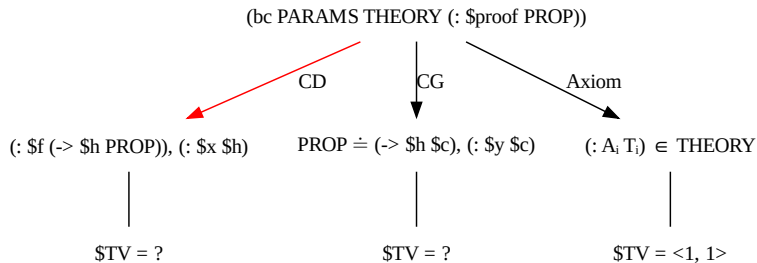
;; Backward Chainer
(: bc (-> $a                                ; Knowledge base space
      Nat                                    ; Maximum depth
      $b                                     ; Query
      $b))                                 ; Result

;; Base case
(= (bc $kb $ _ (: $prf $ccln)) (match $kb (: $prf $ccln) (: $prf $ccln)))

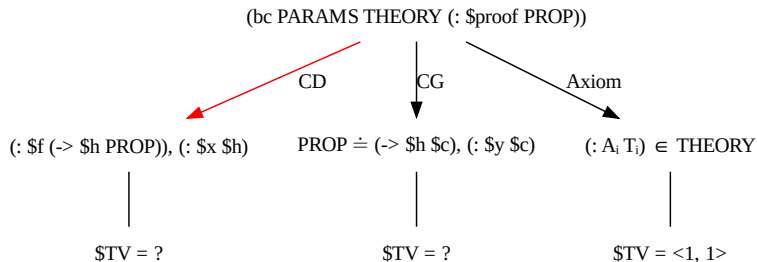
;; Recursive step (Condensed Detachment)
(= (bc $kb (S $k) (: ($prfabs $prfarg) $ccln))
   (let* (((: $prfabs (-> $prms $ccln)) (bc $kb $k (: $prfabs (-> $prms $ccln))))
          ((: $prfarg $prms) (bc $kb $k (: $prfarg $prms))))
    (: ($prfabs $prfarg) $ccln)))

```

# Estimate Probability of Conjecture to be Theorem as Guide

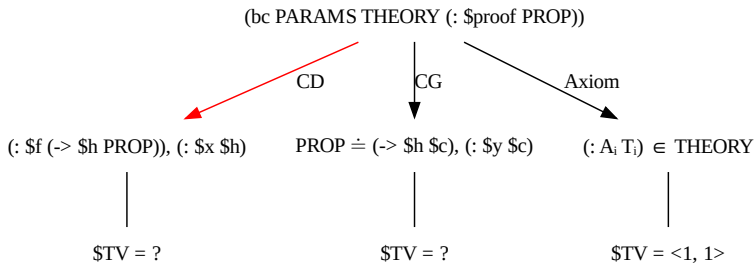


# Estimate Probability of Conjecture to be Theorem as Guide



```
(bc  PLN_PARAMS PLN_THEORY
  (: $pln_proof (≐ (∃ f h x (∧ (⊖ [THEORY] f (-> h [PROP]))
                                (⊖ [THEORY] x h)) $TV)))
```

# Estimate Probability of Conjecture to be Theorem as Guide



```
(bc PLN_PARAMS PLN_THEORY (: $pln_proof ( $\equiv$  ( $\exists x$  ( $\Theta$  [THEORY] x H)) $TV)))
```

# Conclusion

- Early experiment (<https://github.com/trueagi-io/chaining/tree/main/experimental/pln-inf-ctl>)

- Small MetaMath corpus
- 1<sup>th</sup> run: exhaustive search, *populate*  $\Theta$

```
(≡ (Θ (Cons ([:] [a1i.1] [φ]) [PC]) [a1i.1] [φ]) (STV 1 1))
(≡ (Θ [PC] [ax-3] ([→] ([→] ([¬] [φ]) ([¬] [ψ]))) ([→] [ψ] [φ]))) (TV 1 1))
(≡ (Θ (Cons ([:] [a1i.1] [φ]) [PC]) [ax-1] ([→] [φ] ([→] [ψ] [φ]))) (STV 1 1))
(≡ (Θ (Cons ([:] [a1i.1] [φ]) [PC]) ([ax-mp] [a1i.1] [ax-1]) ([→] [ψ] [φ]))) (STV 1 1))
...
```

- 2<sup>nd</sup> run: speed-up via *PLN existential reasoning*
- Glorified Memoizer
- Future work
  - Large MetaMath corpus
  - Induction, abduction and more