

## 1 Probability Model

$$\begin{aligned}
 P(w_{1,n}) &= \sum_{t_{1,n}} P(w_{1,n}, t_{1,n}) \\
 &= \sum_{t_{1,n}} P(t_{1,n}) P(w_{1,n} \mid t_{1,n}) \\
 &= \sum_{t_{1,n}} P(t_{1,n})
 \end{aligned}$$

A PCFG:

s → np vp	: .8
s → vp	: .2
np → noun	: .4
np → noun pp	: .4
np → noun np	: .4
vp → verb	: .3
vp → verb np	: .3
vp → verb pp	: .2
vp → verb np pp	: .2

The lexical part:

prep →like	: 1.0
verb →swat	: .2
verb →flies	: .4
verb →like	: .4
noun →swat	: .05
noun →flies	: .45
noun →ants	: .5

(1) Swat flies like ants.

1. [np swat flies ][vp like ants ]

2. [vp swat [np flies ][pp like ants ]]

3. Rules used in parse 1:

s  $\rightarrow$  np vp : .8 : swat flies like ants  
np  $\rightarrow$  noun np : .2 : swat flies  
np  $\rightarrow$  noun : .4 : flies, ants  
vp  $\rightarrow$  verb np : .3 :like ants

The lexical part:

verb  $\rightarrow$ like : .4  
noun  $\rightarrow$ swat : .05  
noun  $\rightarrow$ flies : .45  
noun  $\rightarrow$ ants : .5

4. Probability:

$$.8 \times .2 \times .4 \times .3 \times .4 \times .4 \times .05 \times .45 \times .5 = 3.5 \times 10^{-5}$$

5. Prob(Parse 1) = Prob( NP<sub>0,2</sub>, VP<sub>2,4</sub>, Noun<sub>0,1</sub>, swat<sub>0,1</sub>,  
NP<sub>1,2</sub>, Noun<sub>1,2</sub>, flies<sub>1,2</sub>, Verb<sub>2,3</sub>,  
likes<sub>2,3</sub>, NP<sub>3,4</sub>, Noun<sub>3,4</sub>, ants<sub>3,4</sub> | S<sub>0,4</sub>)

6. We can apply chain rule. The Prob(parse 1) must equal:

- (a) Prob(NP<sub>0,2</sub>,VP<sub>2,4</sub> | S<sub>0,4</sub>) X
- (b) Prob(Noun<sub>0,1</sub>,NP<sub>1,2</sub> | S<sub>0,4</sub>, NP<sub>0,2</sub>, VP<sub>2,4</sub>) X
- (c) Prob(swat<sub>0,1</sub> | S<sub>0,4</sub>, NP<sub>0,2</sub>,VP<sub>2,4</sub>, Noun<sub>0,1</sub>, NP<sub>1,2</sub>) X
- (d) Prob(Noun<sub>1,2</sub> | S<sub>0,4</sub>, NP<sub>0,2</sub>, VP<sub>2,4</sub>, NP<sub>1,2</sub>, Noun<sub>0,1</sub>, NP<sub>1,2</sub>,  
swat<sub>0,1</sub> ) X
- (e) Prob(flies<sub>1,2</sub> | S<sub>0,4</sub>, NP<sub>0,2</sub>, VP<sub>2,4</sub>, NP<sub>1,2</sub>, Noun<sub>0,1</sub>, NP<sub>1,2</sub>,  
swat<sub>0,1</sub>, Noun<sub>1,2</sub> ) X

- (f)  $\text{Prob}(\text{Verb}_{2,3}, \text{NP}_{3,4} \mid S_{0,4}, \text{NP}_{0,2}, \text{VP}_{2,4}, \text{NP}_{1,2}, \text{Noun}_{0,1}, \text{NP}_{1,2}, \text{swat}_{0,1}, \text{Noun}_{1,2}, \text{flies}_{1,2}) \times$
- (g)  $\text{Prob}(\text{like}_{2,3} \mid S_{0,4}, \text{NP}_{0,2}, \text{VP}_{2,4}, \text{NP}_{1,2}, \text{Noun}_{0,1}, \text{NP}_{1,2}, \text{swat}_{0,1}, \text{Noun}_{1,2}, \text{flies}_{1,2}, \text{Verb}_{2,3}, \text{NP}_{0,2}) \times$
- (h)  $\text{Prob}(\text{Noun}_{3,4} \mid S_{0,4}, \text{NP}_{0,2}, \text{VP}_{2,4}, \text{NP}_{1,2}, \text{Noun}_{0,1}, \text{NP}_{1,2}, \text{swat}_{0,1}, \text{Noun}_{1,2}, \text{flies}_{1,2}, \text{Verb}_{2,3}, \text{NP}_{0,2}, \text{like}_{2,3}) \times$
- (i)  $\text{Prob}(\text{ants}_{3,4} \mid S_{0,4}, \text{NP}_{0,2}, \text{VP}_{2,4}, \text{NP}_{1,2}, \text{Noun}_{0,1}, \text{NP}_{1,2}, \text{swat}_{0,1}, \text{Noun}_{1,2}, \text{flies}_{1,2}, \text{Verb}_{2,3}, \text{NP}_{3,4}, \text{like}_{2,3}, \text{Noun}_{3,4})$

7. We assume the probability that a constituent exists is independent of anything above it in the tree or the left or right of it. It is context free. For example:

- (a)  $\text{Prob}(\text{Noun}_{1,2} \mid S_{0,4}, \text{NP}_{0,2}, \text{VP}_{2,4}, \text{NP}_{1,2}, \text{Noun}_{0,1}, \text{NP}_{1,2}, \text{swat}_{0,1}) = \text{Prob}(\text{Noun}_{1,2} \mid \text{NP}_{1,2})$
- (b)  $\text{Prob}(\text{Verb}_{2,3}, \text{NP}_{3,4} \mid S_{0,4}, \text{NP}_{0,2}, \text{VP}_{2,4}, \text{NP}_{1,2}, \text{Noun}_{0,1}, \text{NP}_{1,2}, \text{swat}_{0,1}, \text{Noun}_{1,2}, \text{flies}_{1,2}) = \text{Prob}(\text{Verb}_{2,3}, \text{NP}_{3,4} \mid \text{VP}_{2,4})$

8. WE rewrite our parse probability as:

$$\begin{aligned} & \text{Prob}(\text{VPNP} \mid S) \times \text{Prob}(\text{NounNP} \mid \text{NP}) \times \text{Prob}(\text{swat} \mid \text{Noun}) \times \\ & \text{Prob}(\text{Noun} \mid \text{NP}) \times \text{Prob}(\text{flies} \mid \text{Noun}) \times \text{Prob}(\text{likeNP} \mid \text{Verb}) \times \\ & \text{Prob}(\text{Noun} \mid \text{NP}) \times \text{Prob}(\text{ants} \mid \text{Noun}) \end{aligned}$$

9. We define  $\text{Prob}(\text{Verb}_{2,3}, \text{NP}_{3,4} \mid \text{VP}_{2,4})$  as

$$\text{Prob}(\text{VP}_{2,4} \rightarrow \text{Verb}_{2,3}, \text{NP}_{3,4})$$

Think of this of the probability of THIS VP rule applying, given we've got a VP from 2 to 4.