### Demos

- Recognizing entities and relations
- Dependency parsing

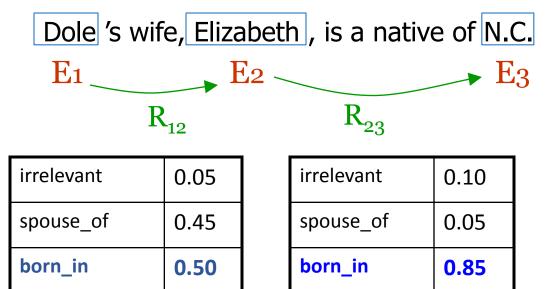
## Recognizing Entities and Relations

[Roth&Yih'04,07]

other	0.05
per	0.85
loc	0.10

other	0.10
per	0.60
loc	0.30

other	0.05
per	0.40
Loc	0.45



• Features: bag of words, part of speech tags

## Recognizing Entities and Relations

&Yih'04,07]

other	0.05
per	0.85
loc	0.10

spouse of

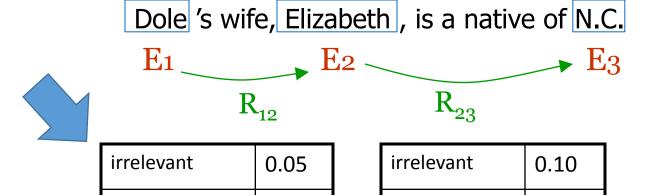
born in

other	0.10
per	0.60
loc	0.30

other	0.05
per	0.40
Loc	0.45

0.05

0.85



0.45

0.50

• Features: bag of words, part of speech tags

spouse of

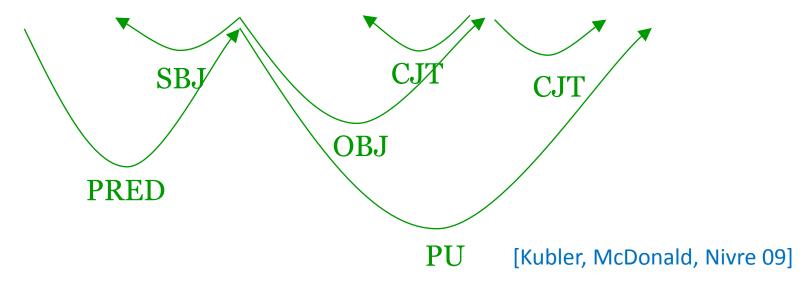
born\_in

### Results

% cd demo/entityrelation % make er.perf

Method	Entity F1	Relation F1	Training Time
VW	92.2	45.8	5 sec
VW (+constraints)	92.6	53.7	5 sec
SSVM (+constraints)	88.0	50.0	300 sec

# Dependency Parsing



## Search Space

Shift



Root They operate ships and banks .

Shift Reduce-left Reduce-right

Shift Reduce-left Reduce-right

Reduce-left

• Shift:



Root They operate ships and banks.

• Reduce-Left

• Shift:



Root They operate ships and banks.

• Reduce-Left

• Shift:



Root They operate ships and banks.

• Reduce-Left



Root They operate ships and banks.

• Shift:



Root They operate ships and banks.

• Reduce-Left



Root They operate ships and banks.

• Shift:



Root They operate ships and banks.

• Reduce-Left



Root They operate ships and banks.

Reduce-Right



• Shift:



Root They operate ships and banks.

• Reduce-Left



Root They operate ships and banks.

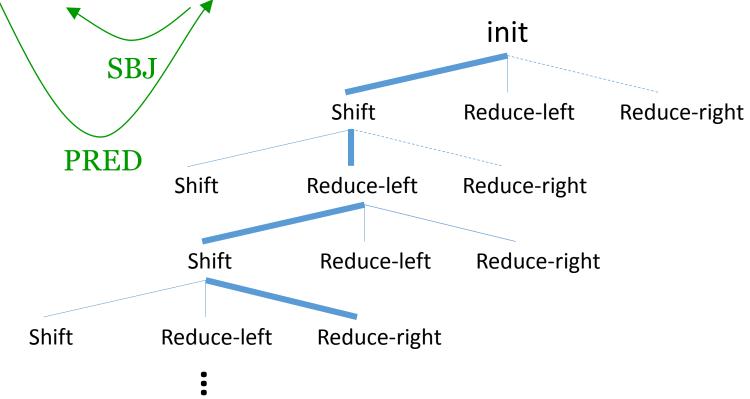
Reduce-Right





## Search Space





## VW Implementation

```
Loop until reaching the end of the sentence {
    extract_features(...);
    get_valid_actions(...);
    get_gold_actions(...);
    pred_action = Search::predictor(...).predict();
    transition_hybrid(..., pred_action);
}
```

./vw -k -c -d test/train-sets/wsj\_small.dparser.vw.gz --search\_task dep\_parser --search 3 --search\_alpha 1e-4 --search\_rollout oracle --passes 2 --holdout\_off