# LING/C SC/PSYC 438/538

Lecture 17
Sandiway Fong

### Administrivia

### **Mathematical Theory of Computation**

- Regular Languages:
  - Finite State Automata (FSA)
    - = Mathematical Regular Expressions (regex just **not** Perl regex)
  - Basic FSA implementation
  - ε-transitions
  - Backreferences and FSA
- First, some remarks on Google Natural Language
  - (we discussed it in the homework review on Monday)

### Unnatural Google Natural Language

Google NL is unnatural from at least several different perspectives:

Large amounts of training data REQUIRED

Children learn from almost no evidence (Chomsky)

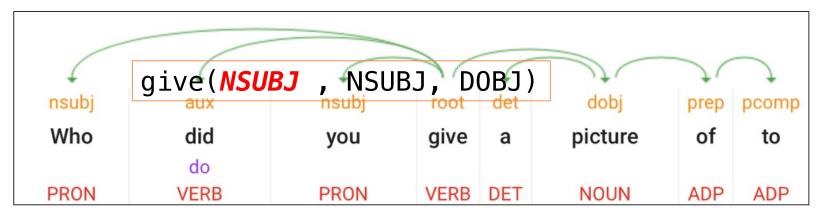
It invents analyses

- Not attested in Natural Language
- Not attested in its training data
- Verbs generally have just one subject (nsubj/csubj) and a max of three core arguments (e.g. nsubj + dobj + iobj)
- Google NL: can get four arguments (e.g. nsubj + iobj + iobj + ccomp)
- Google NL: can get two subjects with one predicate

#### **Fndowment**

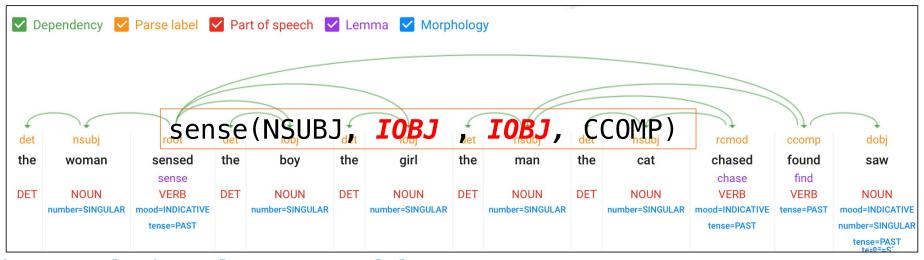
- · Random seeding: initial state
- no special design (general purpose): no modularity

## Natural Language: verb takes one subject



https://cloud.google.com/natural-language

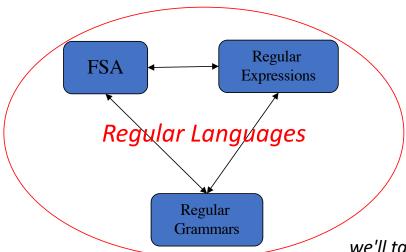
### Natural Language: verb takes 3 arguments max



https://cloud.google.com/natural-language

### Regular Languages

- Three formalisms:
  - All formally equivalent (no difference in expressive power)
  - i.e. if you can encode it using a RE, you can do it using a FSA or regular grammar, and so on ...



**Note**: Perl regexs are more powerful than the math characterization:

- backreferences \n,
- recursive regexs (?n),
- insertion of general code(?{...})

we'll talk about formal equivalence next time...

## Regular Languages

- A regular language is the set of strings
  - (including possibly the empty string)
  - (set itself could also be empty)
  - (set can be infinite)
  - generated by a regex/FSA/Regular Grammar

**Note**: in formal language theory: a language  $=_{def}$  set of strings (we don't specify how it's generated)

## Regular Languages

### • Example:

Language: L = { a+b+ }
 "one or more a's followed by one or more b's"

#### L is a regular language

• described by a regular expression (we'll define it formally next time)

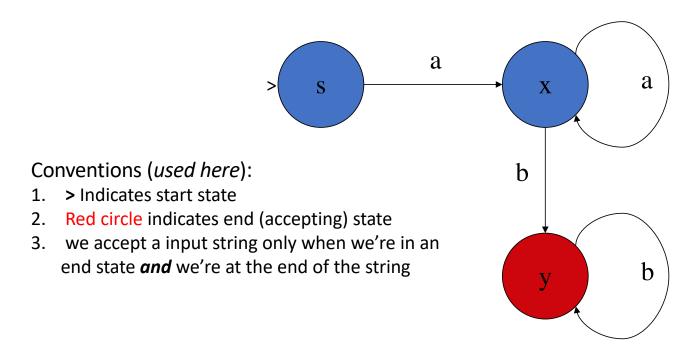
#### • Note:

- infinite set of strings belonging to language L
  - e.g. abbb, aaaab, aabb, \*abab, \*λ

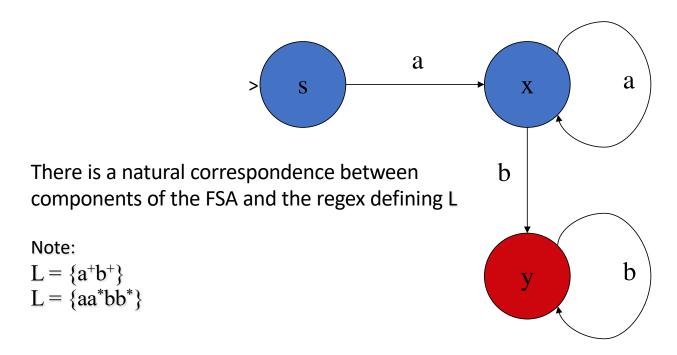
#### Notation:

- $\lambda$  is the empty string (or string with zero length), sometimes  $\varepsilon$  is used instead
- \* means string is not in the language

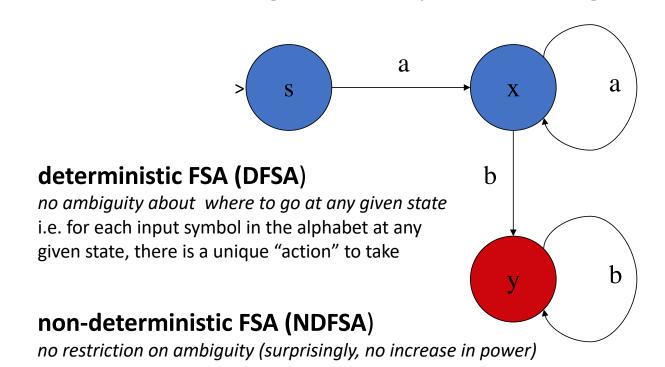
• L = { a+b+} can be also be generated by the following FSA



• L =  $\{a^+b^+\}$  can be also be generated by the following FSA



• L = { a+b+} can be also be generated by the following FSA

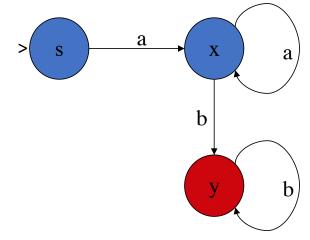


### more formally

- (Q,s,f, $\Sigma$ , $\delta$ )
- 1. set of states (Q): {s,x,y} must be a **finite** set
- 2. start state (s): s
- 3. end state(s) (f): y
- 4. alphabet (**Σ**): {a, b}
- 5. transition function  $\delta$ :

signature: character  $\times$  state  $\rightarrow$  state

- $\delta(a,s)=x$
- $\delta(a,x)=x$
- $\delta(b,x)=y$
- δ(b,y)=y



#### In Perl

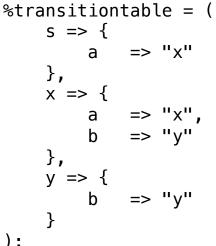
transition function  $\delta$ :

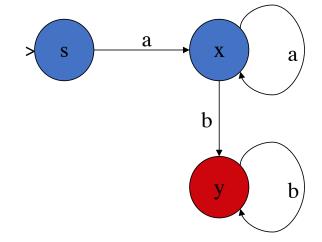
- $\delta(a,s)=x$
- $\delta(a,x)=x$
- $\delta(b,x)=y$
- δ(b,y)=y

```
Syntactic sugar for
%transitiontable = (
    "s", { "a", "x", },
    "x", { "a", "x", "b", "y" },
    "y", { "b", "y" },
);
```

We can simulate our 2D transition table using a hash table whose elements are themselves also hash tables

(anonymized; note: { . . } = hashes)





#### **Example:**

print "\$transitiontable{s}{a}\n";

- Given transition table encoded as a (nested) hash
- How to build a decider (Accept/Reject) in Perl?

### **Complications to think about:**

- How about ε-transitions?
- Multiple end states?
- Multiple start states?
- Non-deterministic FSA?

```
%transitiontable = (
    s => {a => "x"},
    x => {a => "x", b => "y"},
    y => {b => "y"}
);
$state = "s";
foreach $c (@ARGV) {
    $state = $transitiontable{$state}{$c};
}
if ($state eq "y") { print "Accept\n"; }
else { print "Reject\n" }
```

### • Example runs:

- perl fsm.prl a b a b
- Reject
- perl fsm.prl a a a b b
- Accept

• Perl one-liner:

```
perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"}); $s="s";
for $c (@ARGV) {$s=$h{$s}{$c}}; print "Accept" if $s eq "y"'
```

Perl one-liner examples:

```
• perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"});
$s="s"; for $c (@ARGV) {$s=$h{$s}{$c}}; print "Accept" if
$s eq "y" a
 perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"});
$s="s"; for $c (@ARGV) {$s=$h{$s}{$c}}; print "Accept" if
$s eq "y" a b
```

Accept

```
~$ perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"}); $s="s"; for $c (@ARGV) {$s=$h{$s}{$c}}; print "Accept" if $s eq "y"' a
<u>~$ perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"}); $s="s"; for $c (@ARGV)</u> {$s=$h{$s}{$c}}; print "Accept" if $s eq "y"' a b
Accept
~$ perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"}); $s="s"; for $c (@ARGV) {$s=$h{$s}{$c}}; print "Accept" if $s eq "y"' a b b
~$ perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"}); $s="s"; for $c (@ARGV) {$s=$h{$s}{$c}}; print "Accept" if $s eq "y"' a a b b
Accept
~$ perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"}); $s="s"; for $c (@ARGV) {$s=$h{$s}{$c}}; print "Accept" if $s eq "y"' a a b
Accept
~$ perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"}); $s="s"; for $c (@ARGV) {$s=$h{$s}{$c}}; print "Accept" if $s eq "y"' a b b a
~$ perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"}); $s="s"; for $c (@ARGV) {$s=$h{$s}{$c}}; print "Accept" if $s eq "y"' b a a b
\sim$ perl -le '%h=(s=>{a=>"x"},x=>{a=>"x",b=>"y"},y=>{b=>"y"}); $s="s"; for $c (@ARGV) {$s=$h{$s}{$c}}; print "Accept" if $s eq "y"'
```

```
function D-RECOGNIZE(tape, machine) returns accept or reject
                                                                  this is just pseudo-code
 index ← Beginning of tape
 current-state ← Initial state of machine
                                                                  not any real programming language
 loop
                                                                  but can be easily translated
  if End of input has been reached then
   if current-state is an accept state then
     return accept
    else
     return reject
  elsif transition-table[current-state,tape[index]] is empty then
     return reject
           610892 Sandiway Fong
     current-state \leftarrow transition-table[current-state, tape[index]]
     index \leftarrow index + 1
 end
```

Figure 2.12 An algorithm for deterministic recognition of FSAs. This algorithm returns accept if the entire string it is pointing at is in the language defined by the FSA, and reject if the string is not in the language.

## In Python

```
1# mimick Perl code T
 2import sys¶
 3tt = {'s': {'a':'x'}, 'x': {'a':'x', 'b':'y'}, 'y': {'b':'y'}}
 4state = 's'¶
 5for input in sys.argv[1:]:¶
     x = tt[state]
 6
     if input in x:¶
                                                 Python dictionary = Perl hash
          state = x[input]
                                                  1. key:value
   else:¶
          state = 'reject'¶
10
                                              2. sys.argv = @ARGV
          break¶
11
                                                  (but numbered from 1, not 0)
12if state == 'y':¶
      print "Accept"¶
13
                                              3. [1:] slices the command line
14else:¶
      print "Reject"¶
15
```

### In Python

```
1# using tuples (state,input) as keys¶
2import sys¶
3tt = \{ ('s', 'a'): 'x', ('x', 'a'): 'x', ('x', 'b'): 'y', ('y', 'b'): 'y' \} 
4state = 's'¶
5for input in sys.argv[1:]:¶
      if (state,input) in tt:¶
          state = tt[(state,input)]¶
      else:¶
          state = 'reject'¶
 9
10
          break¶
11if state == 'y':¶
12
      print "Accept"¶
13else:¶
      print "Reject"¶
14
```

- Python has a data structure called a tuple: (e<sub>1</sub>,..,e<sub>n</sub>)
- Note: Python lists use [..]
- In Python, crucially tuples (but not lists) can also be dictionary keys

**Note**: Many other ways of encoding FSA in Python, e.g. using object-oriented programming (classes)

https://wiki.python.org/moin/FiniteStateMachine#FSA - Finite State Automation in Python

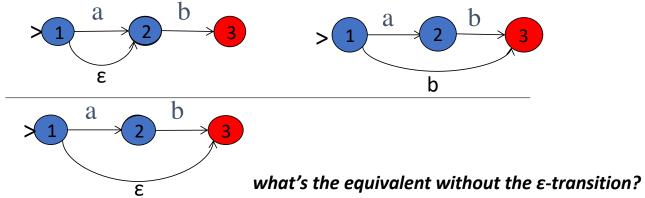
#### Practical applications

- can be encoded and run efficiently on a computer
- widely used
- encode regular expressions (e.g. Perl regex)
- morphological analyzers
  - Different word forms, e.g. want, wanted, unwanted (suffixation/prefixation)
  - see chapter 3 of textbook
- speech recognizers
  - Markov models
  - = FSA + probabilities
- and much more ...

### ε-transitions

- jump from state to another state with the empty character
  - ε-transition (textbook) or λ-transition
  - no increase in expressive power (meaning we could do without the ε-transition)

### • examples



### ε-transitions

- Can be used to help encode:
  - 1. Multiple start states
  - 2. Multiple end states
- Next time, we'll see:
  - Then we can get rid of the  $\varepsilon$ -transition (by construction)

### Backreferences and FSA

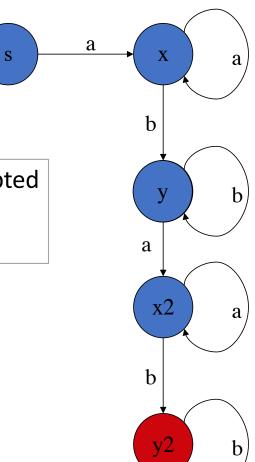
- Deep question:
  - why are backreferences impossible in FSA?

Example: Suppose you wanted a machine that accepted

/(a+b+)\1/

One idea: link two copies of the machine together

Doesn't work! Why?



### Backreferences and FSA

• fsa.perl

- Perl implementation: number of a's and b's in the two halves don't have to match:
- perl fsa.perl aabba
- Reject
- perl fsa.perl aabbaaaabbbb
- Accept
- perl fsa.perl aabbaaaab
- Accept