



Regular Expressions

Rule-based vs Statistical Approaches



Rule-based = linguistic



Statistical = “learn” from a large corpus that has been marked up with the phenomena you are studying (Machine Learning)



For what problems is rule-based better suited and when is statistical better?

Depends on the problem: classification/categorization problem?

Depends on your resources: how much good training data is available?



Even when using statistical – many tasks easily done with rules: tokenization, sentence breaking, morphology



Some PARTS of a task may be done with rules: e.g., rules may be used to extract features, and then statistical learning methods might combine those features to perform a task.

Today we
are going
to ...

- Review Regular Expressions

- Allows one to capture patterns in text to develop rule-based methods or use to collect features for stochastic methods (machine learning; statistical methods)

- There is an old joke:

Some people, when confronted with a problem, think

"I know, I'll use regular expressions."

*Now they have two problems. –
Jamie Zawinski*

- Regular Expressions are handy and allow us to create complex rules to capture patterns in text

Regular Expressions

- Can be viewed as a way to specify:
 - Search patterns over text string
 - Design of a particular kind of machine, called a Finite State Automaton (FSA)
- These are really equivalent

Uses of Regular Expressions in NLP

- As grep, perl: Simple but powerful tools for large corpus analysis and ‘shallow’ processing
 - What word is most likely to begin a sentence?
 - What word is most likely to begin a question?
 - In your own email, are you more or less polite than the people you correspond with?
- With other unix tools, allow us to
 - Obtain word frequency and co-occurrence statistics
 - Build simple interactive applications
- Regular expressions define regular languages or sets

Some definitions

- **Regular Expression:** Formula in algebraic notation for specifying a set of strings
- **String:** Any sequence of alphanumeric characters
 - Letters, numbers, spaces, tabs, punctuation marks
- **Regular Expression Search**
 - Pattern: specifying the set of strings we want to search for
 - Corpus: the texts we want to search through

Simple Example

RE	DESCRIPTION	USES
/This/	Matches the string “This”	Finding the word “this” starting a sentence
/this/	Matches the string “this”	Finding the word “this” internal to a sentence.
/[Tt]his/	Matches either “This” or “this” -- disjunction	Finding the word “this” anywhere in a sentence.

Some regexes

Regex	Description
<code>/./</code>	Wild card; any character
<code>/\./</code>	Period
<code>/a/</code>	Any 'a'
<code>/[ab]/</code>	Any a or b (choice)
<code>/(ab)/</code>	The string ab
<code>/[a-z]/</code>	Any lowercase character (range)
<code>/[A-Z]/</code>	Any upper case character (range)
<code>/[^?.!]/</code>	Any non ?, . or ! (negation of set)
<code>/\s/</code>	White space

More regexes

Regex	Example	Description
*	/a*/	Zero or more a's
+	/a+/	One or more a's
?	/a?/	Zero or one a
	/cat dog/	The strings cat or dog
\b	/\bthe\b/	The word 'the'
\B	\bun\b	Words prefixed by 'un'; Beginning of a longer string
\1	\(again) and \1/	Using string captured by () in regex
\$	/end of the line.\$/	Denotes end of a string
^	/^First word/	Denotes beginning of a string

Question

What is the regex to identify the word dog and its plural form?

Regex	Description
/./	Wild card; any character
/\./	Period
/a/	Any 'a'
/[ab]/	Any a or b (choice)
/(ab)/	The string ab
/[a-z]/	Any lowercase character (range)
/[A-Z]/	Any upper case character (range)
/[^?.!]/	Any non ?, . or ! (negation of set)
/s/	White space

0

Regex	Example	Description
*	/a*/	Zero or more a's
+	/a+/'	One or more a's
?	/a?/'	Zero or one a
	/cat dog/'	The strings cat or dog
\b	/\bthe\b/'	The word 'the'
\B	\bun\b	Words prefixed by 'un'; Beginning of a longer string
\1	\(again) and \1/'	Using string captured by () in regex
\$	/end of the line.\$/'	Denotes end of a string
^	/^First word/'	Denotes beginning of a string

Answer

`/\bdogs?\b/`

Regex	Description
<code>/./</code>	Wild card; any character
<code>/\./</code>	Period
<code>/a/</code>	Any 'a'
<code>/[ab]/</code>	Any a or b (choice)
<code>/(ab)/</code>	The string ab
<code>/[a-z]/</code>	Any lowercase character (range)
<code>/[A-Z]/</code>	Any upper case character (range)
<code>/[^?.!]/</code>	Any non ?, . or ! (negation of set)
<code>/s/</code>	White space

0

Regex	Example	Description
<code>*</code>	<code>/a*/</code>	Zero or more a's
<code>+</code>	<code>/a+/</code>	One or more a's
<code>?</code>	<code>/a?/</code>	Zero or one a
<code> </code>	<code>/cat dog/</code>	The strings cat or dog
<code>\b</code>	<code>/\bthe\b/</code>	The word 'the'
<code>\B</code>	<code>\bun\B</code>	Words prefixed by 'un'; Beginning of a longer string
<code>\1</code>	<code>\(again) and \1/</code>	Using string captured by () in regex
<code>\$</code>	<code>/end of the line.\$/</code>	Denotes end of a string
<code>^</code>	<code>/^First word/</code>	Denotes beginning of a string

Question

What is the regex to identify the word puppy and its plural form?

Regex	Description
/./	Wild card; any character
/\./	Period
/a/	Any 'a'
/[ab]/	Any a or b (choice)
/(ab)/	The string ab
/[a-z]/	Any lowercase character (range)
/[A-Z]/	Any upper case character (range)
/[^?.!]/	Any non ?, . or ! (negation of set)
/s/	White space

0

Regex	Example	Description
*	/a*/	Zero or more a's
+	/a+/,	One or more a's
?	/a?/,	Zero or one a
	/cat dog/,	The strings cat or dog
\b	/\bthe\b/,	The word 'the'
\B	\bun\b	Words prefixed by 'un'; Beginning of a longer string
\1	\(again) and \1/	Using string captured by () in regex
\$	/end of the line.\$/	Denotes end of a string
^	/^First word/	Denotes beginning of a string

Answer

`/\bpupp(y|ies)\b/`

Regex	Description
/./	Wild card; any character
/\./	Period
/a/	Any 'a'
/[ab]/	Any a or b (choice)
/(ab)/	The string ab
/[a-z]/	Any lowercase character (range)
/[A-Z]/	Any upper case character (range)
/[^?.!]/	Any non ?, . or ! (negation of set)
/s/	White space

0

Regex	Example	Description
*	/a*/	Zero or more a's
+	/a+ /	One or more a's
?	/a? /	Zero or one a
	<u>/cat dog/</u>	The strings cat or dog
\b	<u>/\bthe\b/</u>	The word 'the'
\B	\bun\b	Words prefixed by 'un'; Beginning of a longer string
\1	\(again) and \1/	Using string captured by () in regex
\$	/end of the line.\$/	Denotes end of a string
^	/^First word/	Denotes beginning of a string

Question?

Regex	Description
/./	Wild card; any character
/\./	Period
/a/	Any 'a'
/[ab]/	Any a or b (choice)
/(ab)/	The string ab
/[a-z]/	Any lowercase character (range)
/[A-Z]/	Any upper case character (range)
/[^?.!]/	Any non ?, . or ! (negation of set)
/s/	White space

- What would my regular expression look like if I wanted to only match:

O

Temperature
and
TeMPerature

Regex	Example	Description
*	/a*/	Zero or more a's
+	/a+ /	One or more a's
?	/a? /	Zero or one a
	/cat dog/	The strings cat or dog
\b	/\bthe\b/	The word 'the'
\B	\bun\b	Words prefixed by 'un'; Beginning of a longer string
\1	\(again) and \1/	Using string captured by () in regex
\$	/end of the line.\$/	Denotes end of a string
^	/^First word/	Denotes beginning of a string

Answer

Te(MP|mp)erature

Regex	Description
/./	Wild card; any character
/\./	Period
/a/	Any 'a'
/[ab]/	Any a or b (choice)
/(ab)/	The string ab
/[a-z]/	Any lowercase character (range)
/[A-Z]/	Any upper case character (range)
/[^?.!]/	Any non ?, . or ! (negation of set)
/s/	White space

O

Regex	Example	Description
*	/a*/	Zero or more a's
+	/a+ /	One or more a's
?	/a? /	Zero or one a
	<u>/cat dog/</u>	The strings cat or dog
\b	<u>/\bthe\b/</u>	The word 'the'
\B	\bun\b	Words prefixed by 'un'; Beginning of a longer string
\1	\(again) and \1/	Using string captured by () in regex
\$	/end of the line.\$/	Denotes end of a string
^	/^First word/	Denotes beginning of a string

Question

Regex	Description
/./	Wild card; any character
/\./	Period
/a/	Any 'a'
/[ab]/	Any a or b (choice)
/(ab)/	The string ab
/[a-z]/	Any lowercase character (range)
/[A-Z]/	Any upper case character (range)
/[^?.!]/	Any non ?, . or ! (negation of set)
/s/	White space

What is the regex to identify all words that begin with no, or non, nonn, nonnn, etc. regardless of the n's?

O

Regex	Example	Description
*	/a*/	Zero or more a's
+	/a+ /	One or more a's
?	/a? /	Zero or one a
	/cat dog/	The strings cat or dog
\b	/\bthe\b/	The word 'the'
\B	\bun\b	Words prefixed by 'un'; Beginning of a longer string
\1	\(again) and \1/	Using string captured by () in regex
\$	/end of the line.\$/	Denotes end of a string
^	/^First word/	Denotes beginning of a string

Answer

`\bnon*\B/`

Regex	Description
<code>/./</code>	Wild card; any character
<code>/\./</code>	Period
<code>/a/</code>	Any 'a'
<code>/[ab]/</code>	Any a or b (choice)
<code>/(ab)/</code>	The string ab
<code>/[a-z]/</code>	Any lowercase character (range)
<code>/[A-Z]/</code>	Any upper case character (range)
<code>/[^?.!]/</code>	Any non ?, . or ! (negation of set)
<code>/s/</code>	White space

0

Regex	Example	Description
<code>*</code>	<code>/a*/</code>	Zero or more a's
<code>+</code>	<code>/a+/</code>	One or more a's
<code>?</code>	<code>/a?/</code>	Zero or one a
<code> </code>	<code>/cat dog/</code>	The strings cat or dog
<code>\b</code>	<code>/\bthe\b/</code>	The word 'the'
<code>\B</code>	<code>\bun\B</code>	Words prefixed by 'un'; Beginning of a longer string
<code>\1</code>	<code>\(again) and \1/</code>	Using string captured by () in regex
<code>\$</code>	<code>/end of the line.\$/</code>	Denotes end of a string
<code>^</code>	<code>/^First word/</code>	Denotes beginning of a string

Question

Regex	Description
/./	Wild card; any character
/\./	Period
/a/	Any 'a'
/[ab]/	Any a or b (choice)
/(ab)/	The string ab
/[a-z]/	Any lowercase character (range)
/[A-Z]/	Any upper case character (range)
/[^?.!]/	Any non ?, . or ! (negation of set)
/s/	White space

O

What is the regular expression to identify happier and happier phrases such as:

happier and happier
or
fuzzier and fuzzier

Regex	Example	Description
*	/a*/	Zero or more a's
+	/a+/,	One or more a's
?	/a?/,	Zero or one a
	/cat dog/,	The strings cat or dog
\b	/\bthe\b/,	The word 'the'
\B	\bun\b	Words prefixed by 'un'; Beginning of a longer string
\1	\(again) and \1/	Using string captured by () in regex
\$	/end of the line.\$/,	Denotes end of a string
^	/^First word/,	Denotes beginning of a string

Answer

`/(.+)ier` and `\1ier`

the \1 here is what ever was identified in the (.+)

0

Regex	Description
/./	Wild card; any character
/\./	Period
/a/	Any 'a'
/[ab]/	Any a or b (choice)
/(ab)/	The string ab
/[a-z]/	Any lowercase character (range)
/[A-Z]/	Any upper case character (range)
/[^?.!]/	Any non ?, . or ! (negation of set)
/s/	White space

Regex	Example	Description
*	/a*/	Zero or more a's
+	/a+/	One or more a's
?	/a?/	Zero or one a
	/cat dog/	The strings cat or dog
\b	/\bthe\b/	The word 'the'
\B	\bun\b	Words prefixed by 'un'; Beginning of a longer string
\1	\(again) and \1/	Using string captured by () in regex
\$	/end of the line.\$/	Denotes end of a string
^	/^First word/	Denotes beginning of a string

Optionality and Repetition

- `/[Ww]oodchucks?/` matches woodchucks, Woodchucks, woodchuck, Woodchuck
- `/colou?r/` matches color or colour
- `/he{3}/` matches heee
- `/ (he){3}/` matches hehehe
- `/ (he){3,}/` matches a sequence of at least 3 he's

+

•

0

Operator Precedence Hierarchy

1. Parentheses `()`
2. Counters `* + ? {}`
3. Sequence of Anchors `^$`
4. Disjunction `|`

`/tr(y|ies)/`

-> what is `\1`?



Operator Precedence Hierarchy

1. Parentheses `()`
2. Counters `* + ? {}`
3. Sequence of Anchors `^$`
4. Disjunction `|`

`/tr(y|ies)/`

-> what is `\1`?

`/^\s*$/`

-> what is this finding?

A Simple Exercise

- Write a regular expression to find all instances of the determiner “the”:

The recent attempt by the police to retain their current rates of pay has not gathered much favor with the southern factions.

A Simple Exercise

- Write a regular expression to find all instances of the determiner “the”:

`/the/`

The recent attempt by the police to retain their current rates of pay has not gathered much favor with the southern factions.

A Simple Exercise

- Write a regular expression to find all instances of the determiner “the”:

`/the/`

The recent attempt by the police to retain their current rates of pay has not gathered much favor with the southern factions.

A Simple Exercise

- Write a regular expression to find all instances of the determiner “the”:

`/the/`

`\bthe\b/`

The recent attempt by the police to retain their current rates of pay has not gathered much favor with the southern factions.

A Simple Exercise

- Write a regular expression to find all instances of the determiner “the”:

`/the/`

`\bthe\b/`

The recent attempt by the police to retain their current rates of pay has not gathered much favor with the southern factions.

A Simple Exercise

- Write a regular expression to find all instances of the determiner “the”:

`/the/`

`/[tT]he/`

`\b[tT]he\b/`

The recent attempt by the police to retain their current rates of pay has not gathered much favor with the southern factions.

A Simple Exercise

- Write a regular expression to find all instances of the determiner “the”:

`/the/`

`/[tT]he/`

`/\b[tT]he\b/`

The recent attempt by the police to retain their current rates of pay has not gathered much favor with the southern factions.

Substitutions (Transductions)

- Sed or 's' operator in Perl
 - `s/regexp1/pattern/`
 - `s/I am feeling (.+)/You are feeling \1?/`
 - I am feeling hungry -> You are feeling hungry?
 - `s/I gave the (.+) to (.+)/Why would you give \2 \1?/`
 - I gave the money to Brad -> Why would you give Brad money?

+

o

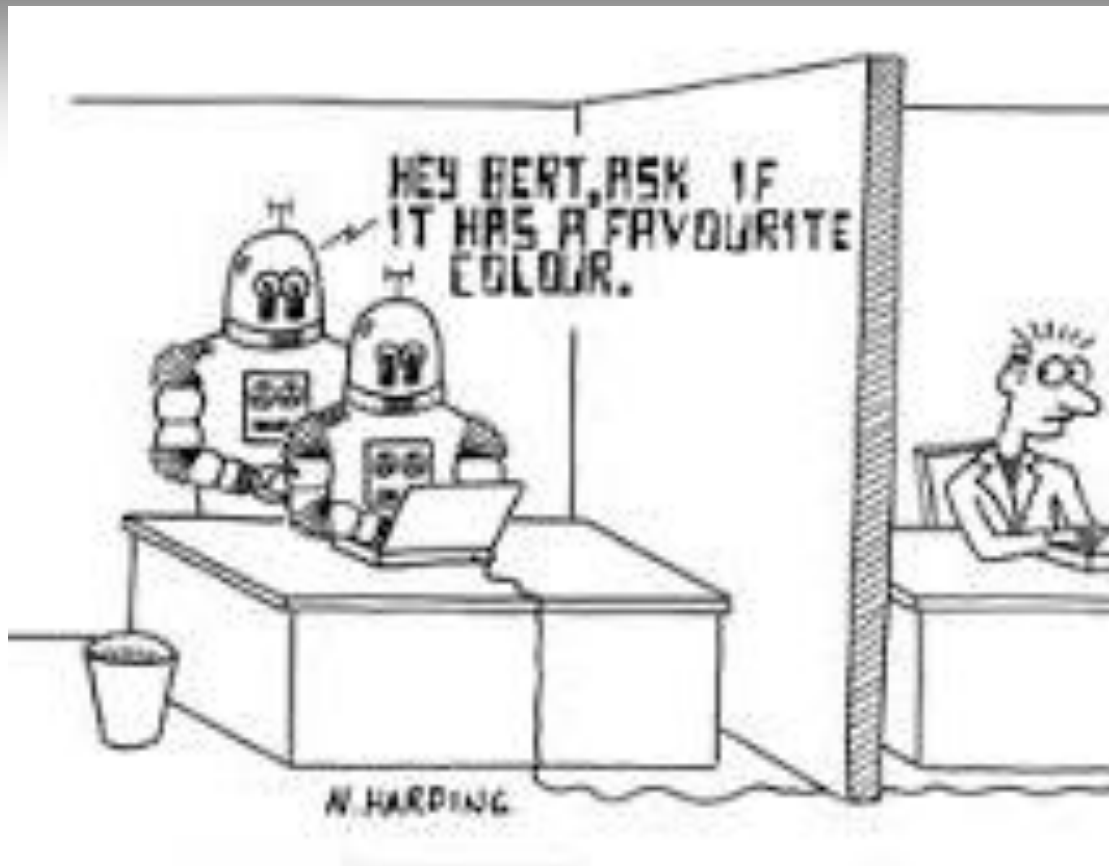
+

•

0

How does
this all
relate to
language
processing?

- aka why are regexes useful?
 - What do you do when you want to process each sentence in a paragraph individually and want it done quickly because you are receiving a new paragraph every second?
 - What happens if you want to obtain the number of times *immunosuppression* occurred in the text?



Computing Machinery and Intelligence

- Alan Turing
 - 1950:
 - published Computing Machinery and Intelligence
 - Asked the question:
 - how do we determine if a computer is intelligent
 - Proposed solution:
 - develop a computer program to impersonate a human in a real-time written conversation

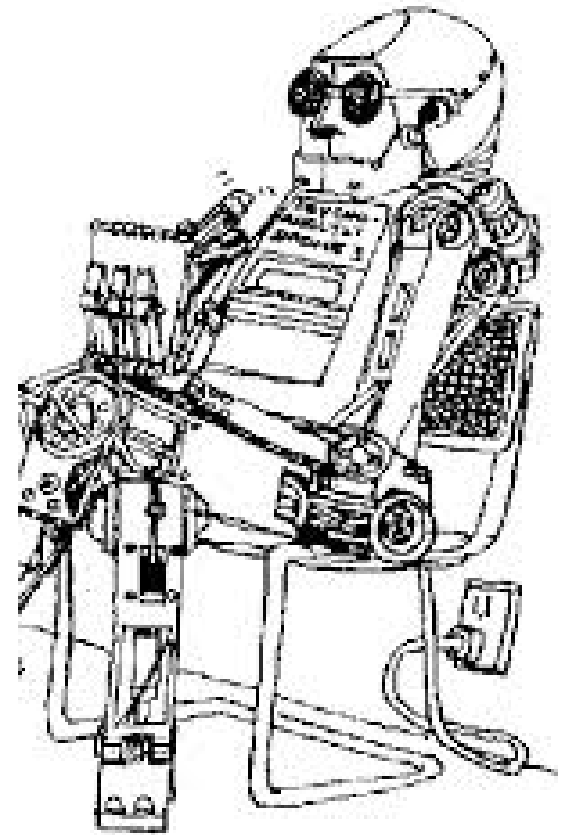
Towards this end

1966: Joseph Weizenbaum developed Eliza
a Rogerian psychotherapist

```
=====
EEEEEEEE L      IIIIII ZZZZZZZ      AAA
E        L      I      Z      A      A
E        L      I      Z      A      A
EEEEEE   L      I      Z      A      A
E        L      I      Z      AAAAAA
E        L      I      Z      A      A
EEEEEEEE LLLLLLL IIIIII ZZZZZZ      A      A
=====
ELIZA > (PLEASE TYPE IN ALL CAPS) WHAT'S YOUR NAME DEAR ?
AMIT
ELIZA > HI, I'M ELIZA. WHAT DO YOU WANT TO TALK ABOUT ?
AMIT > CAN I TALK ABOUT MY PROBLEM ?
ELIZA > SURE... !
AMIT > DUE TO ON GOING EXAMS IN COLLEGE, I HAVE A LOT OF STRESS.
ELIZA > PLEASE RELAX A LITTLE. SLEEP WELL.
AMIT > THANKS FOR YOUR ADVICE.
ELIZA > NO MENTION.
AMIT > BYE
ELIZA > BYE AND KEEP IN TOUCH...
=====
```

Eliza

- Simple program that uses pattern matching to process the input and translate it into suitable outputs.
- Succeeded because Eliza didn't need to *know* anything in order to simulate a Rogerian psychotherapist.
 - Rogerian psychotherapy is a form of talk-psychotherapy that is person centered.
 - Weizenbaum notes: this is one of the few dialogue genres where listeners can act as if they know nothing of the world.
- Amazing thing: people believed that ELIZA understood them and their problems



Eliza (Weizenbaum)

- ▶ Men are all alike.
- ▶ IN WHAT WAY?
- ▶ They're always bugging us about something or other.
- ▶ CAN YOU THINK OF A SPECIFIC EXAMPLE?
- ▶ Well, my boyfriend made me come here.
- ▶ YOUR BOYFRIEND MADE YOU COME HERE
- ▶ He says I'm depressed much of the time.
- ▶ I AM SORRY TO HEAR YOU ARE DEPRESSED
- ▶ It's true. I am unhappy
- ▶ DO YOU THINK COMING HERE WILL HELP YOU NOT TO BE UNHAPPY
- ▶ I need some help, that much seems certain.
- ▶ WHAT WOULD IT MEAN TO YOU IF YOU GOT SOME HELP
- ▶ Perhaps I could learn to get along with my mother.
- ▶ TELL ME MORE ABOUT YOUR FAMILY
- ▶ My mother takes care of me.
- ▶ WHO ELSE IN YOUR FAMILY TAKES CARE OF YOU
- ▶ My father.
- ▶ YOUR FATHER
- ▶ You are like my father in some ways.

Step 1: replace first person with second person references

```
s/\bI('m| am) \b /YOU ARE/g
```

```
s/\bmy\b /YOUR/g
```

```
S/\bmine\b /YOURS/g
```

Step 2: use additional regular expressions to generate replies

```
s/.* YOU ARE (depressed|sad) .*/I AM SORRY TO HEAR YOU ARE \
```

```
s/.* YOU ARE (depressed|sad) .*/WHY DO YOU THINK YOU ARE \1/
```

```
s/.* all .*/IN WHAT WAY/
```

```
s/.* always .*/CAN YOU THINK OF A SPECIFIC EXAMPLE/
```

Step 3: use scores to rank possible transformations

Eliza style regular expressions

And then ...

37

- Kenneth Colby developed PARRY in 1972
- PARRY
 - A computer Model of Paranoia developed for teaching psychology students
 - Simulated a paranoid schizophrenic
 - The first program to pass the Turing Test
 - Ignited a debate in the community on what was machine intelligence

H: Good afternoon. My name is Doctor Jones.

P: Pleased to meet you.

H: How are you?

P: All right I guess.

H: Could you tell me your name?

P: Pat Smith.

H: I thought you might have some problems.

P: I've been upset lately.

H: By what?

P: People get on my nerves sometimes.

H: Tell me more.

P: Do you know anything about bookies?

...

Conversation between ELIZA and PARRY

ELIZA: Good Evening. Tell me your problems. Please terminate input with a period or a question mark.

PARRY: People get on my nerves sometimes.

ELIZA: I am not sure I understand you fully.

PARRY: You should pay more attention.

ELIZA: Suppose you should pay more attention.

PARRY: You're entitled to your own opinion.

ELIZA: What makes you think I am entitled to my own opinion?

PARRY: It bothers me just to be around people in general.

ELIZA: Please go on.

PARRY: I went to the track at Bay Meadows a while back.

ELIZA: What does that suggest to you?

PARRY: I went to the races.

ELIZA: Would you like to discuss your nerves?

PARRY: I guess so.

ELIZA: What does that suggest to you?

PARRY: What are you getting at?

ELIZA: What answer would please you most?

PARRY: It's not a matter of like or dislike.

ELIZA: What else would you like to discuss?

PARRY: I am getting tired of answering the same questions over and over.

ELIZA: What resemblance do you see?

PARRY: Why do you need to know that?

ELIZA: What do you think?

PARRY: I don't understand your motives.

ELIZA: Why don't you understand my motives?

Programming Assignment

Eliza: F# Psycho Bot

Eliza: Hello, I'm Eliza, your automatic psychotherapist. How do are you feeling today?

You: I'm at F# tutorials

Eliza: Do you enjoy being at f# tutorials ?

You: yes

Eliza: You seem quite sure.

Your reply...

