# STATS 701 Data Analysis using Python

Lecture 26: Advanced Command Line

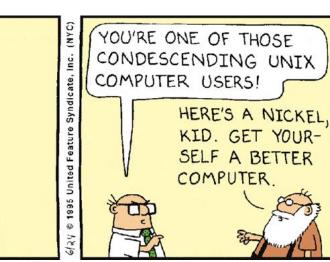
#### Why UNIX/Linux?

As a data scientist, you will spend **most** of your time dealing with data Data sets never arrive "ready to analyze"

Cleaning data, fixing formatting, etc is 80% of the process

These "data wrangling" tasks are (often) best done on the command line

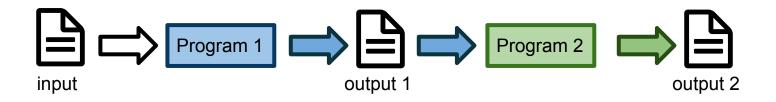




## The Unix philosophy: do one thing well

- 1. Write programs that do one thing and do it well.
- 2. Write programs to work together.
- 3. Write programs to handle text streams, because that is a universal interface.

https://en.wikipedia.org/wiki/Unix\_philosophy



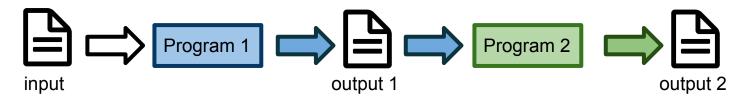
#### Reminder: Basic concepts

**Shell**: the program through which you interact with the computer.

provides the command line and facilitates typing commands and reading outputs.

Popular shells: bash (Bourne Again Shell), csh (C Shell), ksh (Korn Shell)

**Redirect**: take the output of one program and make it the input of another. we'll see some simple examples in a few slides



stdin, stdout, stderr: three special "file handles"

for reading inputs from the shell (stdin) and writing output to the shell (stderr for error messages, stdout other information).

#### Special file handles: stdin, stdout, stderr

File handles are pointers to files

Familiar if you've programmed in C/C++

Similar: object returned by python open ()

```
>>> f = open('workfile', 'w')
>>> print f
<open file 'workfile', mode 'w' at 80a0960>
```

By default, most command line programs

- take input from stdin
- Write output to stdout
- Write errors and status information to stderr

#### Special file handles: stdin, stdout, stderr



echo encounters an error, so it writes an error message to stderr. Both stdout and stderr are printed to the screen, but behave differently in other contexts.

#### Special file handles: stdin, stdout, stderr



echo encounters an error, so it writes an error message to stderr. Both stdout and stderr are printed to the screen, but behave differently in other contexts.

We haven't learned any programs that use stdin, yet, but we will in a few slides.

#### Reminder: redirections using >

Redirect sends output to a file instead of stdout

```
keith@Steinhaus:~$ echo -e "hello\tworld." > myfile.txt
keith@Steinhaus:~$
```

Redirect tells the shell to send the output of the program on the "greater than" side to the file on the "lesser than" side. This creates the file on the RHS, and overwrites the old file, if it already exists!

# Command line regexes: grep

Command line regex tool

Searches for the string hello in the file myfile.txt, prints all matching lines to stdout.

keith@Steinhaus:~\$ grep 'hello' myfile.txt
hello world.
keith@Steinhaus:~\$ grep 'goat' myfile.txt
keith@Steinhaus:~\$
keith@Steinhaus:~\$ cat myfile.txt | grep 'hello'
hello world.
keith@Steinhaus:~\$

String goat does not occur in myfile.txt, so no lines to print.

grep can also be made to search for a pattern in its stdin. This is our first example of a pipe.

This writes the contents of myfile.txt to the stdin of grep, which searches its stdin for the string hello

# Command line regexes: grep

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keith@Steinhaus:~\$
keith@Steinhaus:~\$ cat myfile.txt | grep 'hello'
hello world.
keith@Steinhaus:~\$

String goat does not occur in myfile.txt, so no lines to print.

grep can also be made to search for a pattern in its stdin. This is our first example of a **pipe**.

**Note:** the grep pattern can also be a regular expression. Use grep -E to tell grep to use "extended regular expressions", which are (mostly) identical to those in Python re. See man re format for more information.

# Pipe (|) vs Redirect (>)

Pipe (|) reads the stdout from its left, and writes to stdin on its right.

Redirect (>) reads the stdout from its left and writes to a file on its right.

This is an important difference!

Warning: the example below is INCORRECT. It is an example of what NOT to do!

keith@Steinhaus:~\$ cat myfile.txt > grep 'hello'

This writes the contents of myfile.txt to a file called grep and then cats the file 'hello' to stdout, which is not what was intended.

#### Running example: Fisher's Iris data set

Widely-used data set in machine learning

Collected by E. Anderson, made famous by R. A. Fisher

Three different species: Iris setosa, Iris virginica and Iris versicolor

Each observation is a set of measurements of a flower:

Petal and sepal width and height (cm)

Along with species label

Common tasks:

clustering, classification



Available at UCI ML Repository: <a href="https://archive.ics.uci.edu/ml/datasets/lris">https://archive.ics.uci.edu/ml/datasets/lris</a>

#### Downloading the data

Following the download link on UCI ML repo leads to this index page

#### Index of /ml/machine-learning-databases/iris

| <u>Name</u>      | Last modified          | Size Description   |                               |
|------------------|------------------------|--|-------------------------------|
| Parent Directory | <u>.</u>               | -  |                               |
| <u>Index</u>     | 03-Dec-1996 04:01      | 105  |                               |
| bezdekIris.data  | 14-Dec-1999 12:12 4.4K |  | What's the difference between |
| iris.data        | 08-Mar-1993 16:27      | these two files? The documentation actually doesn't say. |                               |
| iris.names       | 11-Jul-2000 21:30      | 2.9K   | dotadily docorr tody.         |
|                  |                        |  |                               |

Apache/2.2.15 (CentOS) Server at archive.ics.uci.edu Port 443

#### Downloading the data

Create a project directory and cd into it.

```
Move the data files from downloads
keith@Steinhaus:~$ mkdir demodir
                                                     folder to project directory. Not
                                                     mandatory, just convenient!
keith@Steinhaus:~$ cd demodir
keith@Steinhaus:~/demodir$ mv ~/Downloads/iris.data .
keith@Steinhaus:~/demodir$ mv ~/Downloads/bezdekIris.data .
keith@Steinhaus:~/demodir$ ls
                                                     Files are there, now.
bezdekIris.data iris.data
                               myfile.txt
keith@Steinhaus:~/demodir$ ls -1
total 40
-rw-r--r-@ 1 keith staff 4551 Nov 15 13:47 bezdekIris.data
-rw-r--r--@ 1 keith staff
                             4551 Nov 15 13:47 iris.data
-rw-r--r--@ 1 keith staff
                                        2 12:56 myfile.txt
                               13 Nov
keith@Steinhaus:~/demodir$
```

#### From man ls:

-I (The lowercase letter "ell".) List in long format. (See below.) If the output is to a terminal, a total sum for all the file sizes is output on a line before the long listing.

diff takes two files and compares them line by line

By default, prints only the lines that differ:

XCY means Xth line in FILE1 was replaced by Yth line in FILE2

```
keith@Steinhaus:~/demodir$ diff iris.data bezdekIris.data
35c35
< 4.9,3.1,1.5,0.1,Iris-setosa
                                            < : lines from FILE1</pre>
> 4.9,3.1,1.5,0.2,Iris-setosa
38c38
< 4.9,3.1,1.5,0.1,Iris-setosa
                                            >: lines from FILE2
> 4.9,3.6,1.4,0.1, Iris-setosa
keith@Steinhaus:~/demodir$
```

So, the two files differ in precisely two lines...

#### What's up with that?

```
keith@Steinhaus:~/demodir$ diff iris.data bezdekIris.data
35c35
< 4.9,3.1,1.5,0.1,Iris-setosa
                                           From UCI Documentation:
> 4.9,3.1,1.5,0.2,Iris-setosa
                                            This data differs from the data presented in Fisher's
38c38
                                            article (identified by Steve Chadwick, spchadwick '@'
< 4.9,3.1,1.5,0.1,Iris-setosa
                                            espeedaz.net). The 35th sample should be:
                                           4.9,3.1,1.5,0.2,"Iris-setosa" where the error is in the
> 4.9,3.6,1.4,0.1,Iris-setosa
                                            fourth feature. The 38th sample:
keith@Steinhaus:~/demodir$
                                           4.9,3.6,1.4,0.1,"Iris-setosa" where the errors are in the
                                            second and third features.
```

So bezdekIris.data is a corrected version of iris.data. That's nice of them!

So, the two files differ in precisely two lines...

#### What's up with that?

```
keith@Steinhaus:~/demodir$ diff iris.data bezdekIris.data
35c35
< 4.9, 3.1, 1.5, 0.1, Iris-setosa
                                            From UCI Documentation:
> 4.9,3.1,1.5,0.2,Iris-setosa
                                            This data differs from the data presented in Fisher's
38c38
                                            article (identified by Steve Chadwick, spchadwick '@'
< 4.9,3.1,1.5,0.1,Iris-setosa
                                            espeedaz.net). The 35th sample should be:
                                            4.9,3.1,1.5,0.2,"Iris-setosa" where the error is in the
> 4.9,3.6,1.4,0.1,Iris-setosa
                                            fourth feature. The 38th sample:
keith@Steinhaus:~/demodir$
                                            4.9,3.6,1.4,0.1,"Iris-setosa" where the errors are in the
                                            second and third features.
```

Often useful: get the diff of two files and save it to another file

```
keith@Steinhaus:~/demodir$ diff iris.data bezdekIris.data > diff.txt
keith@Steinhaus:~/demodir$ cat diff.txt
35c35
< 4.9,3.1,1.5,0.1,Iris-setosa
> 4.9,3.1,1.5,0.2,Iris-setosa
38c38
< 4.9,3.1,1.5,0.1,Iris-setosa
> 4.9,3.6,1.4,0.1, Iris-setosa
keith@Steinhaus:~/demodir$
```

#### Before we go on...

It's a good habit to always look at the data. Go exploring!

```
keith@Steinhaus:~/demodir$ head bezdekIris.data
5.1,3.5,1.4,0.2, Iris-setosa
4.9,3.0,1.4,0.2, Iris-setosa
4.7,3.2,1.3,0.2, Iris-setosa
4.6,3.1,1.5,0.2, Iris-setosa
5.0, 3.6, 1.4, 0.2, Iris-setosa
5.4,3.9,1.7,0.4, Iris-setosa
4.6,3.4,1.4,0.3, Iris-setosa
5.0, 3.4, 1.5, 0.2, Iris-setosa
4.4,2.9,1.4,0.2, Iris-setosa
4.9,3.1,1.5,0.1, Iris-setosa
keith@Steinhaus:~/demodir$
```

#### Before we go on...

It's a good habit to always look at the data. Go exploring!

```
keith@Steinhaus:~/demodir$ head -n 70 bezdekIris.data | tail
5.0,2.0,3.5,1.0, Iris-versicolor
5.9,3.0,4.2,1.5, Iris-versicolor
6.0,2.2,4.0,1.0, Iris-versicolor
6.1, 2.9, 4.7, 1.4, Iris-versicolor
5.6,2.9,3.6,1.3, Iris-versicolor
6.7,3.1,4.4,1.4, Iris-versicolor
5.6,3.0,4.5,1.5, Iris-versicolor
5.8,2.7,4.1,1.0, Iris-versicolor
6.2,2.2,4.5,1.5, Iris-versicolor
5.6,2.5,3.9,1.1, Iris-versicolor
keith@Steinhaus:~/demodir$
```

#### Before we go on...

It's a good habit to always look at the data. Go exploring!

```
keith@Steinhaus:~/demodir$ tail bezdekIris.data
6.9,3.1,5.1,2.3, Iris-virginica
5.8,2.7,5.1,1.9, Iris-virginica
                                          Species types are contiguous in the file. That
6.8,3.2,5.9,2.3, Iris-virginica
                                          means if we are going to, for example, make
6.7,3.3,5.7,2.5, Iris-virginica
                                          a train/dev/test split, we can't just take the
6.7,3.0,5.2,2.3, Iris-virginica
                                          first and second halves of the file!
6.3,2.5,5.0,1.9, Iris-virginica
6.5, 3.0, 5.2, 2.0, Iris-virginica
6.2,3.4,5.4,2.3, Iris-virginica
5.9,3.0,5.1,1.8, Iris-virginica
                                            File contains a trailing newline. We'll
                                            probably want to remove that!
keith@Steinhaus:~/demodir$
```

## Counting: wc

wc counts the number of lines, words, and bytes in a file or in stdin Prints result to stdout

```
keith@Steinhaus:~/demodir$ wc bezdekIris.data
    151 150 4551 bezdekTris.data
keith@Steinhaus:~/demodir$ cat bezdekIris.data | wc
    151 150 4551
keith@Steinhaus:~/demodir$ cat bezdekIris.data | wc -l
    151
keith@Steinhaus:~/demodir$ cat bezdekIris.data | wc -w
keith@Steinhaus:~/demodir$ cat bezdekIris.data | wc -c
    4551
keith@Steinhaus:~/demodir$
```

**Note:** a word is a group of one or more non-whitespace characters.

## Counting: wc

wc counts the number of lines, wo Prints result to account.

**Test your understanding:** we saw using head and tail that each line is a single word (group of non-whitespace characters), so number of words should be same as number of lines. Why isn't that the case?

```
keith@Strinhard:~/demodir$ wc bezdekIris.data
    151 150 4551 bezdekTris.data
keith@Steinhaus:~/demodir$ cat bezdekIris.data | wc
    151 150 4551
keith@Steinhaus:~/demodir$ cat bezdekIris.data | wc -l
    151
keith@Steinhaus:~/demodir$ cat bezdekIris.data | wc -w
keith@Steinhaus:~/demodir$ cat bezdekIris.data | wc -c
    4551
keith@Steinhaus:~/demodir$
```

**Note:** a word is a group of one or more non-whitespace characters.

#### Making small changes: tr

Right now, bezdekIris.data is comma-separated.

What if I want to make it tab-separated, instead?

tr is a good tool for the job

From the man page: The tr utility copies the standard input to the standard output with substitution or deletion of selected characters.

```
keith@Steinhaus:~/demodir$ cat bezdekIris.data | tr ',' '\t' > iris.tsv
keith@Steinhaus:~/demodir$ head -n 5 iris.tsv
5.1     3.5     1.4     0.2     Iris-setosa
4.9     3.0     1.4     0.2     Iris-setosa
4.7     3.2     1.3     0.2     Iris-setosa
4.6     3.1     1.5     0.2     Iris-setosa
5.0     3.6     1.4     0.2     Iris-setosa
keith@Steinhaus:~/demodir$
Replace commas with tabs. So we turn a comma-separated (.csv) file into a tab-separated (.tsv) file.
```

#### Making small changes: tr

From the man page: The tr utility copies the standard input to the standard output with substitution or deletion of selected characters.

```
keith@Steinhaus:~/demodir$ cat bezdekIris.data
keith@Steinhaus:~/demodir$ head iris euro.tsv
     13,5 1,4 0,2 Iris-setosa
5,1
4,9
     3,0 1,4 0,2 Iris-setosa
4,7
     3,2 1,3 0,2 Iris-setosa
4,6
     3,1 1,5
                  0,2
                       Iris-setosa
5,0
     3,6 1,4
                  0,2
                        Tris-setosa
5,4
     3,9 1,7
                  0,4
                        Iris-setosa
      3,4 1,4
                  0,3
4,6
                        Iris-setosa
5,0
      3,4
           1,5
                  0,2
                        Iris-setosa
4,4
     2,9 1,4
                  0,2
                        Iris-setosa
4,9
     3,1
            1,5
                  0,1
                        Iris-setosa
keith@Steinhaus:~/demodir$
```

Turn decimal points into decimal commas, change from comma-separated to tab-separated.

tr '.,' ',\t' > iris euro.tsv

Note: tr 'abc' 'xyz' turns all a into x, b into y, c into z. Importantly, tr 'ab' 'bc' turns a to b and b to c, but no a turns into c. tr doesn't "apply the transformation twice"

## Picking out columns: cut

I want to make a new data set: only petal lengths and species

Could load everything into spreadsheet and edit there, or...

#### Attribute Information:

- 1. sepal length in cm
- 2. sepal width in cm
- 3. petal length in cm
- 4. petal width in cm
- 5. class:
- -- Iris Setosa
- -- Iris Versicolour
- -- Iris Virginica

```
keith:~/demodir$ cat bezdekIris.data | cut -d ',' -f 3,4,5 > petal.data
keith:~/demodir$ head -n 3 petal.data
1.4,0.2, Iris-setosa
                                                            Columns delimited by \','
1.4,0.2, Iris-setosa
                                                            Pick out fields 3,4 and 5.
1.3,0.2, Iris-setosa
                                                            Equivalent command:
keith:~/demodir$ head -n 3 bezdekIris.data
                                                                 cut -d ',' -f 3-5
5.1,3.5,1.4,0.2,Iris-setosa
4.9,3.0,1.4,0.2, Iris-setosa
4.7,3.2,1.3,0.2, Iris-setosa
keith:~/demodir$
```

#### Picking out columns: cut

What if I want to split the attributes into their own files?

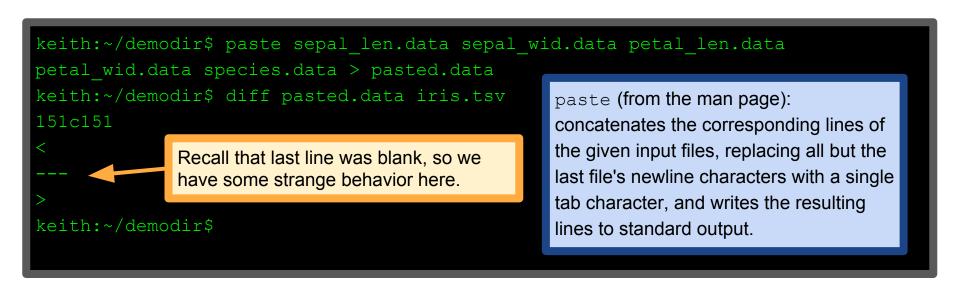
#### **Attribute Information:**

- 1. sepal length in cm
- 2. sepal width in cm
- 3. petal length in cm
- 4. petal width in cm
- 5. class:
- -- Iris Setosa
- -- Iris Versicolour
- -- Iris Virginica

```
keith:~/demodir$ cat bezdekIris.data | cut -d ',' -f 1 > sepal_len.data
keith:~/demodir$ cat bezdekIris.data | cut -d ',' -f 2 > sepal_wid.data
keith:~/demodir$ cat bezdekIris.data | cut -d ',' -f 3 > petal_len.data
keith:~/demodir$ cat bezdekIris.data | cut -d ',' -f 4 > petal_wid.data
keith:~/demodir$ cat bezdekIris.data | cut -d ',' -f 5 > species.data
keith:~/demodir$
```

#### Aggregation: paste and lam

Okay, I changed my mind. I want to put the five separate files back together!



#### Aggregation: paste and lam

lam (from the man page): copies the named files side by side onto the standard output.

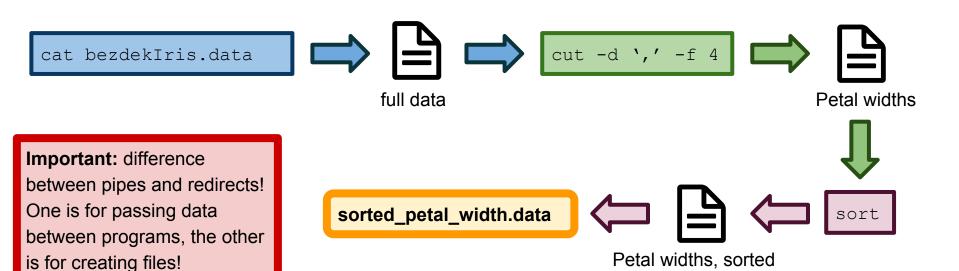
Okay, I changed my mind. I want to put the five separate files back together!

```
keith:~/demodir$ lam sepal len.data -s ',' sepal wid.data -s ','
petal len.data -s ',' petal wid.data -s ',' species.data | head -n 3
5.1,3.5,1.4,0.2,Iris-set<u>osa</u>
                                                       Have to specify a separator character
4.9,3.0,1.4,0.2,Iris-setosa
                                                       with -s everywhere I want one.
4.7,3.2,1.3,0.2,Iris-set<u>osa</u>
keith:~/demodir$ lam sepal len.data -s ',' sepal wid.data -s ','
petal len.data -s ',' petal wid.data -s ',' species.data | tail -n 3
6.2,3.4,5.4,2.3, Iris-virginica
5.9,3.0,5.1,1.8,Iris-virginica
                                        Recall that the last line is blank, which lam
                                        handles as required, but here's a good reason to
                                       have removed that blank line sooner.
keith:~/demodir$
```

## Sorting: sort

sort reads from stdin, sorts the lines, and sends the result to stdout.

```
keith:~$ cat bezdekIris.data | cut -d ',' -f 4 | sort > sorted_petal_width.data
keith:~$
```



## Sorting: sort

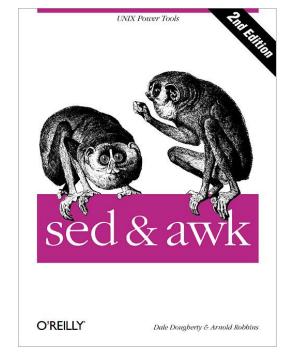
```
keith:~$ cat bezdekIris.data | cut -d ',' -f 4 | sort > sorted petal width.data
keith:~$ head -n 8 sorted petal width.data
                                Blank line is still giving us trouble!
keith:~$ tail -n 2 sorted petal width.data
keith:~$
```

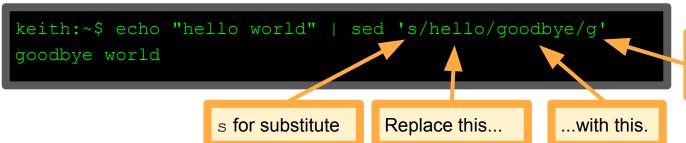
sed is short for stream editor

One of the most powerful and versatile UNIX tools

Commonly paired with awk small command line language for string processing

Has lots of features, so we'll focus on one: **substitutions** 



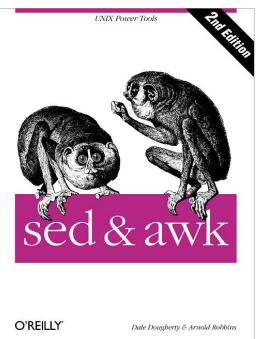


g for globally, meaning everywhere in the input.

sed commands can include regular expressions

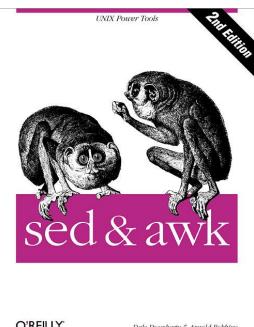
```
keith:~$ echo "a aa aaa" | sed 's/a*/b/g'
b b b

'*' Works like in Python re
```



sed commands can include regular expressions

```
keith:~$ echo "a aa aaa" | sed 's/a*/b/g'
b b b
                                           Works like in Python re
     Test your understanding: is
     the sed regex matcher greedy?
```

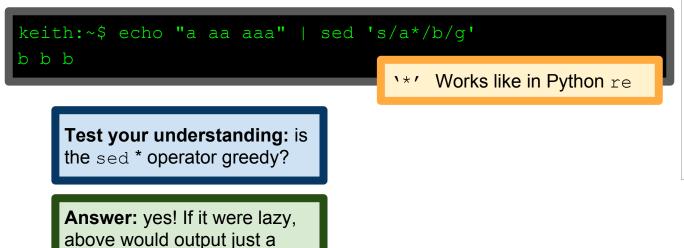


O'REILLY'

Dale Dougherty & Arnold Robbins

mess of 'b's

sed commands can include regular expressions





sed commands can include regular expressions

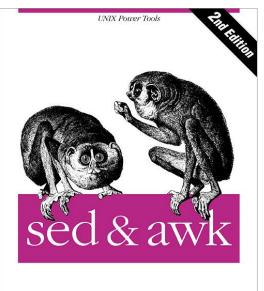
keith:~\$ echo "a aa aaa" | sed 's/a\*/b/g'
b b b

'\*' Works like in Python re

**Test your understanding:** is the sed \* operator greedy?

Answer: yes! If it were lazy, above would output just a mess of 'b's

As promised, most of your knowledge of regexes in Python re package will transfer directly to sed, as well as other tools (e.g., grep and perl)

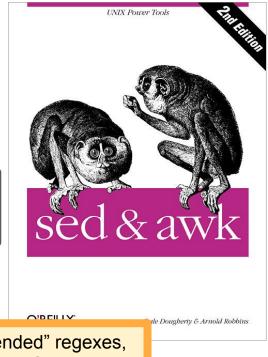


O'REILLY'

Dale Dougherty & Arnold Robbins

sed commands can include regular expressions

```
keith:~$ echo "a aa aaa" | sed 's/a*/b/g'
b b b
                                          Works like in Python re
          Basic syntax of sed s commands:
          sed 's/regexp/replacement/flags'
                                                       To use "extended" regexes,
                                                        need to give -E flag.
keith:~$ echo "a aa aaa" | sed -E 's/a+/b/g'
b b b
keith:~$
```



Basic syntax of sed s commands:

sed 's/regexp/replacement/flags'

```
keith:~$ echo "a aa aaa" | sed -E 's/a+/b/g'
b b b
keith:~$ echo "a aa aaa" | sed -E 's|a+|b|g'
Can us charact
b b b
keith:~$ echo "a| aa| aaa| aaaa" | sed -E 's/a+\|/b/g'
b b b aaaa
keith:~$

All the power of Python regexes, but with the convenience of the command line! And we're only barely scratching the surface:
https://www.gnu.org/software/sed/manual/html_node/index.html#Top
```

UNIX Power Tools

ale Dougherty & Arnold Robbins

Can use any single character in place of /.

Special characters have to be escaped.

Bash (and other shells) support scripting

Useful for automating repetitive tasks:

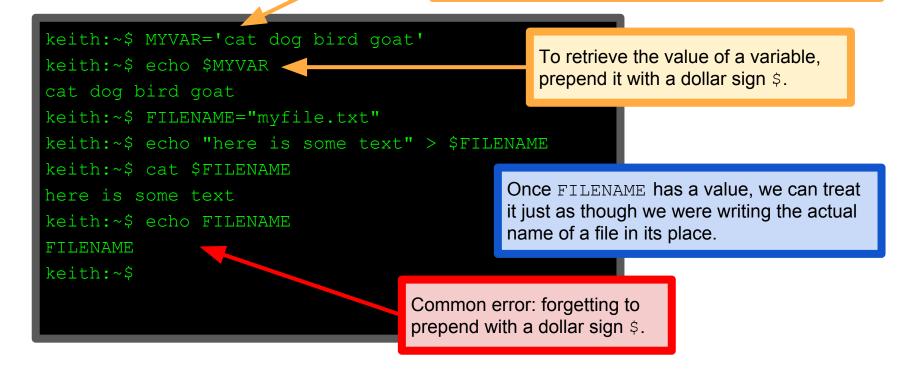
E.g., Renaming files; processing files in batches

The Bash command line supports its own programming language Has variables, conditionals, for-loops, etc.

We'll only scratch the surface of this, here. See, for example, the Linux Documentation Project (TLDP, <a href="www.tldp.org">www.tldp.org</a>) or Learning the Bash Shelll by C. Newham for more.

Variable assignment in bash is of the form VARIABLE=[value]

Note that there should be NO spaces between the variable name and the assignment operator and between the assignment operator and the value.



```
For loops take the form
```

for vname in <set>; do <expr>; done

```
keith:~$ MYVAR='cat dog bird goat'
keith:~$ for s in $MYVAR; do echo $s; done
cat
                                         Enclosing in backticks (`) turns the output of the
dog
                                         expression to a string-like expression that can be
bird
                                         assigned to a variable or iterated over.
goat
keith:~\$ for x in `echo "1 2 3 4 5"`; do echo "\$x" > \${x}.txt; done
keith:~$ ls
1.txt 2.txt 3.txt 4.txt 5.txt myfile.txt
keith:~$
                                                   Enclosing a variable in curly braces is a good
                                                   habit when putting a variable in a longer
                                                   string. Prevents ambiguity of $x.txt or
                                                   $xfile.txt VS ${x}file.txt.
```

```
keith:~\$ for x in `echo "1 2 3 4 5"`; do echo "\$x" > \${x}.txt; done
keith:~$ ls
1.txt 2.txt 3.txt 4.txt 5.txt myfile.txt
keith:~$ for f in `ls .`; do echo -n "${f} : "; cat $f; done
1.txt : 1
2.txt : 2
                                                This line lists each file in the current
3.txt : 3
                                                directory along with its contents.
4.txt : 4
5.txt : 5
myfile.txt : here is some text
keith:~$
```

```
keith:~$ for x in `echo "1 2 3 4 5"`; do echo "$x" > ${x}.txt; done
keith:~$ ls
         2.txt 3.txt 4.txt 5.txt myfile.txt
1.txt
keith:~$ for f in `ls .`; do echo -n "${f} : "; cat $f; done
1.txt : 1
2.txt : 2
                                                   This line lists each file in the current
3.txt : 3
                                                   directory along with its contents.
4.txt : 4
5.txt : 5
                                            Lots more tools available (not in this lecture):
myfile.txt : here is some text
                                            More syntax: conditionals, while-loops, etc.
keith:~$
                                            Scripts: put a sequence of commands into a file
```

and run it from the command line.

## Readings (this lecture)

#### Required:

None

#### Recommended:

J. Janssens *Data Science at the Command Line* <a href="http://shop.oreilly.com/product/0636920032823.do">http://shop.oreilly.com/product/0636920032823.do</a>

S. Das (2005,2012). Your UNIX: the Ultimate Guide. McGraw-Hill.

Sed manual:

https://www.gnu.org/software/sed/manual/html\_node/index.html#Top

GNU awk user's guide:

https://www.gnu.org/software/gawk/manual/gawk.html