

# Miller

a swiss-army  
chainsaw for  
CSV and more

csv,conf,v7

```
$ cat example.csv
color,shape,flag,index,quantity,rate
yellow,triangle,1,11,43.6498,9.8870
red,square,1,15,79.2778,0.0130
red,circle,1,16,13.8103,2.9010
red,square,0,48,77.5542,7.4670
purple,triangle,0,51,81.2290,8.5910
red,square,0,64,77.1991,9.5310
purple,triangle,0,65,80.1405,5.8240
yellow,circle,1,73,63.9785,4.2370
yellow,circle,1,87,63.5058,8.3350
purple,square,0,91,72.3735,8.2430
```

```
$ mlr --icsv --oprint sort -f color,shape example.csv
color  shape  flag index quantity rate
purple square  0   91   72.3735  8.2430
purple triangle 0   51   81.2290  8.5910
purple triangle 0   65   80.1405  5.8240
red    circle  1   16   13.8103  2.9010
red    square  1   15   79.2778  0.0130
red    square  0   48   77.5542  7.4670
red    square  0   64   77.1991  9.5310
yellow circle  1   73   63.9785  4.2370
yellow circle  1   87   63.5058  8.3350
yellow triangle 1   11   43.6498  9.8870
```

```
$ mlr --icsv --ojson filter '$color=="yellow"' example.csv
{
  "color": "yellow",
  "shape": "triangle",
  "flag": 1,
  "index": 11,
  "quantity": 43.6498,
  "rate": 9.8870
}
{
  "color": "yellow",
  "shape": "circle",
  "flag": 1,
  "index": 73,
  "quantity": 63.9785,
  "rate": 4.2370
}
{
  "color": "yellow",
  "shape": "circle",
  "flag": 1,
  "index": 87,
  "quantity": 63.5058,
  "rate": 8.3350
}
```

```
$ mlr --c2p --from example.csv put '$qr = $quantity * $rate'
color shape  flag k index quantity rate qr
yellow triangle true 1 11 43.6498 9.8870 431.5655726
red square true 2 15 79.2778 0.0130 1.0306114
red circle true 3 16 13.8103 2.9010 40.063680299999994
red square false 4 48 77.5542 7.4670 579.0972113999999
purple triangle false 5 51 81.2290 8.5910 697.8383389999999
red square false 6 64 77.1991 9.5310 735.7846221000001
purple triangle false 7 65 80.1405 5.8240 466.738272
yellow circle true 8 73 63.9785 4.2370 271.0769045
yellow circle true 9 87 63.5058 8.3350 529.3208430000001
purple square false 10 91 72.3735 8.2430 596.5747605000001
```

John Kerl

Day job: TileDB

Project: <https://tiledb.com/data-types/single-cell> -- joint work with CZI

We're hiring!

# Why? And, why Miller?

When you `grep` your `.csv`, I cry -- because **you deserve better**

- `grep`, `cut`, `sort` etc are line-aware and they're good for **lines** and integer column indices: `cut -d, -f 2,3`; `sort -k 7`
- Nacimiento, ~2015: I wanted a **record-aware** tool

```
$ grep purple example.csv
purple,triangle,false,5,51,81.2290,8.5910
purple,triangle,false,7,65,80.1405,5.8240
purple,square,false,10,91,72.3735,8.2430
```

```
$ mlr --csv grep purple example.csv
color,shape,flag,k,index,quantity,rate
purple,triangle,false,5,51,81.2290,8.5910
purple,triangle,false,7,65,80.1405,5.8240
purple,square,false,10,91,72.3735,8.2430
```

```
$ mlr --icsv --opprint filter '$color == "purple"' example.csv
color shape flag k index quantity rate
purple triangle false 5 51 81.2290 8.5910
purple triangle false 7 65 80.1405 5.8240
purple square false 10 91 72.3735 8.2430
```

# Many tools are out there

- **xsv** : custom indices, fast
- **zsv** : *really* fast
- **csvtk** : closer to **dplyr**
- **q** : supports SQL
- **jq** : *amazing* tool for JSON
- **nu** : a fully interactive data-aware shell, multiple file formats
- ... and more including (of course!) **pandas**, **datasette**, **frictionless**, ...

# Miller (**m**l**r**) is ...

- Multiple **file formats**: CSV, TSV, JSON, JSON Lines, PPRINT, XTAB, DKVP, integer-indexed (like the Unix toolkit)
- Mix of:
  - **sort/cut**/etc equivalents
  - and an **awk**-like programming language
- **Unix-toolkit/Unix-pipe** family tree with **record awareness**
- Streaming/out-of-core/bigger-than-RAM when it can
- Open source, free, single binary without runtime dependencies

# Installation

- MacOS, Windows, Linux, BSDs, ...
  - Older distros have older Miller versions
  - Latests: <https://miller.readthedocs.io/en/latest/installing-miller/>
- `brew install miller`
- `choco install miller`
- `yum install miller`
- `apt-get install miller`
- `conda install -c conda-forge miller`

# Verbs; functions

Like cut, sort, sed, grep; awk-like DSL

altkv  
bar  
bootstrap  
cat  
check  
clean-whitespace  
count  
count-distinct  
count-similar  
cut  
decimate  
fill-down  
fill-empty  
filter  
Features which filter shares with put  
flatten  
format-values  
fraction  
gap  
grep  
group-by  
group-like  
having-fields  
head  
histogram  
join

json-parse  
json-stringify  
label  
latin1-to-utf8  
utf8-to-latin1  
least-frequent  
merge-fields  
most-frequent  
nest  
nothing  
put  
Features which put shares with filter  
regularize  
remove-empty-columns  
rename  
reorder  
repeat  
reshape  
sample  
sec2gmt  
sec2gmtdate  
seqgen  
shuffle  
skip-trivial-records  
sort  
sort-within-records  
split

stats1  
stats2  
step  
summary  
tac  
tail  
tee  
template  
top  
unflatten  
uniq  
unspace  
unsparsify

## Functions by class

- **Arithmetic functions:** bitcount, madd, mexp, mmul, msub, pow, %, &, \*, \*\*, +, -, \*, .+, .-, ./, /, //, <<, >>, >>>, ^, |, ~.
- **Boolean functions:** !, !=, !=~, &&, <, <=, <=>, ==, =~, >, >=, ?:, ??, ???, ^^, ||.
- **Collections functions:** append, arrayify, concat, depth, flatten, get\_keys, get\_values, haskey, json\_parse, json\_stringify, leafcount, length, mapdiff, mapexcept, mapselect, mapsum, unflatten.
- **Conversion functions:** boolean, float, fmtifnum, fmtnum, hexfmt, int, joink, joinkv, joinv, splita, splitax, splitkv, splitkvx, splitnv, splitnvx, string.
- **Hashing functions:** md5, sha1, sha256, sha512.
- **Higher-order-functions functions:** any, apply, every, fold, reduce, select, sort.
- **Math functions:** abs, acos, acosh, asin, asinh, atan, atan2, atanh, cbrt, ceil, cos, cosh, erf, erfc, exp, expm1, floor, invqnorm, log, log10, log1p, logifit, max, min, qnorm, round, roundm, sgn, sin, sinh, sqrt, tan, tanh, urand, urand32, urandelement, urandint, urandrange.
- **String functions:** capitalize, clean\_whitespace, collapse\_whitespace, format, gssub, gsub, latin1\_to\_utf8, leftpad, lstrip, regextract, regextract\_or\_else, rightpad, rstrip, ssub, strip, strlen, sub, substr, substr0, substr1, tolower, toupper, truncate, unformat, unformatx, utf8\_to\_latin1, ..
- **System functions:** exec, hostname, os, system, version.
- **Time functions:** dhms2fsec, dhms2sec, fsec2dhms, fsec2hms, gmt2localtime, gmt2sec, hms2fsec, hms2sec, localtime2gmt, localtime2sec, sec2dhms, sec2gmt, sec2gmtdate, sec2hms, sec2localdate, sec2localtime, strftime, strftime\_local, strptime, strptime\_local, systime, systimeint, uptime.
- **Typing functions:** asserting\_absent, asserting\_array, asserting\_bool, asserting\_boolean, asserting\_empty, asserting\_empty\_map, asserting\_error, asserting\_float, asserting\_int, asserting\_map, asserting\_nonempty\_map, asserting\_not\_array, asserting\_not\_empty, asserting\_not\_map, asserting\_not\_null, asserting\_null, asserting\_numeric, asserting\_present, asserting\_string, is\_absent, is\_array, is\_bool, is\_boolean, is\_empty, is\_empty\_map, is\_error, is\_float, is\_int, is\_map, is\_nan, is\_nonempty\_map, is\_not\_array, is\_not\_empty, is\_not\_map, is\_not\_null, is\_null, is\_numeric, is\_present, is\_string, typeof.

# Exploring data

Data source: <https://github.com/datablist/sample-csv-files>

- What fields are in the data? (Use XTAB output for wide data)

```
$ mlr --csv head -n 1 organizations-1000000.csv
Index,Organization Id,Name,Website,Country,Description,Founded,Industry,Number of employees
1,74fc6fDadF400Dc,"Wilcox, Griffith and Hawkins",https://tanner.com/,Cape Verde,Horizontal bi-directional artificial intelligence,1971,Professional Training,1550
```

```
$ mlr --icsv --oxtab head -n 1 organizations-1000000.csv
Index          1
Organization Id 74fc6fDadF400Dc
Name           Wilcox, Griffith and Hawkins
Website        https://tanner.com/
Country        Cape Verde
Description     Horizontal bi-directional artificial intelligence
Founded        1971
Industry       Professional Training
Number of employees 1550
```

- How many countries?

```
$ mlr --csv --from organizations-1000000.csv \
> uniq -n -f Country
count
243
```

- How many organizations in Argentina?

- Miller processes *record streams*
- `--csv` or `--icsv --ojson`: same format, or format conversion
- `then` is the pipe between *verbs* (transformations): `mlr -l`
- The `filter` and `put` verbs support a domain-specific language (DSL)
- You can set a `~/ .mlrrc` file with defaults like `--csv`

```
$ mlr --csv --from organizations-1000000.csv \
> uniq -c -f Country \
> then sort -f Country \
> then head
Country,count
Afghanistan,4058
Albania,4001
Algeria,3996
American Samoa,4007
Andorra,4203
Angola,4113
Anguilla,4097
Antarctica (the territory South of 60 deg S),4009
Antigua and Barbuda,4194
Argentina,4070
```

# Exploring data

- Smallest Argentinian organizations?

```
$ mlr --icsv --oprint --from organizations-1000000.csv \  
> filter '$Country == "Argentina"' \  
> then cut -xf 'Index,Organization Id,Country' \  
> then sort -n 'Number of employees' \  
> then reorder -f 'Name,Number of employees' \  
> then head
```

Name	Number of employees	Website	Description	Founded	Industry
Bean Group	1	<a href="http://www.rocha-moon.com/">http://www.rocha-moon.com/</a>	Realigned dedicated encoding	2021	Online Publishing
Patton Ltd	4	<a href="http://knox-wood.org/">http://knox-wood.org/</a>	Customizable discrete knowledge user	1986	Veterinary
Hartman-Preston	6	<a href="http://dudley.net/">http://dudley.net/</a>	Organic reciprocal moratorium	1976	Capital Markets / Hedge F
Floyd PLC	6	<a href="http://www.russell.com/">http://www.russell.com/</a>	Optimized modular array	2017	Luxury Goods / Jewelry
Skinner, Mathews and Welch	7	<a href="https://www.dudley-malone.com/">https://www.dudley-malone.com/</a>	Down-sized 5thgeneration core	2008	Marketing / Advertising /
Gallagher, Combs and Acosta	8	<a href="https://www.harrell.com/">https://www.harrell.com/</a>	Sharable high-level solution	2016	Non - Profit / Volunteeri
Villegas and Sons	11	<a href="https://www.raymond-montoya.com/">https://www.raymond-montoya.com/</a>	Assimilated user-facing workforce	1995	Commercial Real Estate
Terrell, Malone and Larson	13	<a href="https://www.pearson.info/">https://www.pearson.info/</a>	Centralized didactic time-frame	2002	Health / Fitness
Mcbride PLC	15	<a href="https://www.mejia.org/">https://www.mejia.org/</a>	Total 24hour info-mediaries	2002	Design
Pham Inc	18	<a href="http://www.campos-dennis.com/">http://www.campos-dennis.com/</a>	Customer-focused multi-tasking analyzer	1974	Import / Export

- New fields, and JSON output

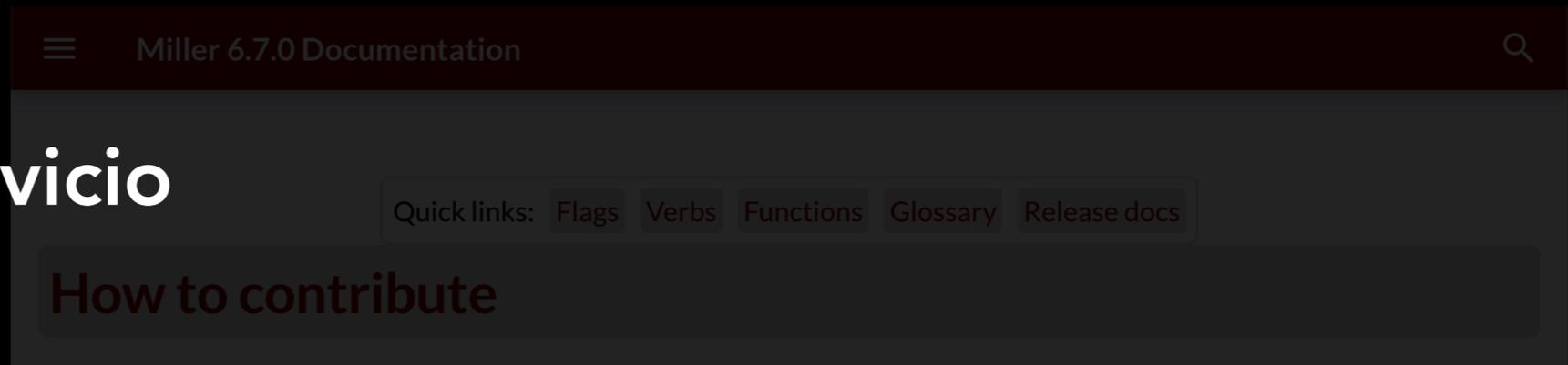
```
$ mlr --icsv --ojson --from organizations-1000000.csv \  
> filter '$Country == "Argentina"' \  
> then cut -xf 'Country' \  
> then put '$provenance = {  
>   "conference": "csv,conf,v7", "when":sec2gmt(systime()),  
> }' \  
> > output.json  
$  
$ ls -l output.json  
-rw-r--r--  1 johnkerl  staff  1485111 Apr 15 17:15 output.json
```

```
$ mlr --json head -n 2 output.json  
[  
{  
  "Index": 50,  
  "Organization Id": "C3eEfd5aAbBE5E7",  
  "Name": "Rush-Hurley",  
  "Website": "https://harris-koch.biz/",  
  "Description": "Customizable cohesive architecture",  
  "Founded": 1976,  
  "Industry": "Non - Profit / Volunteering",  
  "Number of employees": 9677,  
  "provenance": {  
    "conference": "csv,conf,v7",  
    "when": "2023-04-15T21:15:26Z"  
  }  
},  
{  
  "Index": 1275,  
  "Organization Id": "2566cf3BECC5F3f",  
  "Name": "Duarte-Berry",  
  "Website": "https://key-spence.com/",  
  "Description": "Triple-buffered intangible paradigm",  
  "Founded": 1987,  
  "Industry": "Market Research",  
  "Number of employees": 9323
```

# Community

## Ayuda / apoyo / servicio

- `man mlr` and `mlr help`
- <https://miller.readthedocs.io>
- <https://github.com/johnkerl/miller/issues>
- <https://github.com/johnkerl/miller/discussions>
- <https://github.com/johnkerl/miller/discussions/1268> -- this talk
- Se necesita ayuda: lots of open feature requests (Go language)
  - Miller is open source and development time is the most precious commodity



### Discuss

↑ 1

↑ 1

↑ 1

↑ 1

↑ 1

↑ 1

↑ 1

 **How to use environment variables for field name in DSL?**  
YokojimaSkewers started on Feb 25 in General

 **Can Miller remove records?**  
YokojimaSkewers asked on Feb 28 in Q&A · **Answered**

 **How can I right pad an integer with zeros?**  
derekmahar asked on Dec 19, 2022 in Q&A · **Answered**

 **strptime support for non zero-padded values?**  
archetyped asked on Feb 22 in Q&A · **Answered**

### NAME

  5  
Miller -- like awk, sed, cut, join, and sort for name-indexed data such as CSV and t

### SYNOPSIS

  1  
Usage: `mlr [flags] {verb} [verb-dependent options ...] {zero or more file names}`

If zero file names are provided, standard input is read, e.g.  
`mlr --csv sort -f shape example.csv`

Output of one verb may be chained as input to another using "then", e.g.  
`mlr --csv stats1 -a min,mean,max -f quantity then sort -f color example.csv`

Please see 'mlr help topics' for more information. Please also see <https://miller.r>

Questions?

# Bonus slide: Data cleaning

## Limpieza de datos

- (+) Miller has many verbs and functions for data cleaning
  - See also the [data-cleaning examples page](#)
- (-) It's a bit fussy about [RFC 4180](#)
  - Pro-tip: on parse failure, also try `--csvlite`
  - In the C implementation (Miller  $\leq 5$ ) I had a hand-written CSV parser
  - In the Go implementation I use the Go library's CSV parser -- better for me to revert to manual

# Bonus slide: JSON processing

## Ahorrando dinero con Miller

Here's one of a few shell aliases I use to manage my instances

Together with a starter and a stopper alias -- my boss likes this!

```
show-instance() {  
  aws ec2 describe-instances --query "Reservations[0].Instances[0]" --instance-ids "$1" \  
  | mlr --ijson --oxtab \  
  cut -o -f KeyName,InstanceType,InstanceId,Architecture,LaunchTime,Placement.AvailabilityZone,State  
}
```

```
$ show-instance i-00f220b2c18431cb8  
KeyName      kerl  
InstanceType m5.4xlarge  
InstanceId   i-00f220b2c18431cb8  
Architecture x86_64  
LaunchTime   2023-04-14T12:38:16+00:00  
State.Code   16  
State.Name   running
```

```
$ stop-instance i-00f220b2c18431cb8  
{  
  "StoppingInstances": [  
    {  
      "CurrentState": {  
        "Code": 64,  
        "Name": "stopping"  
      },  
      "InstanceId": "i-00f220b2c18431cb8",  
      "PreviousState": {  
        "Code": 16,  
        "Name": "running"  
      }  
    }  
  ]  
}
```