Dr. Steffi LaZerte

weathercan

An R package for accessing Environment and Climate Change Canada weather data











Dr. Steffi LaZerte

Biologist (Animal Behaviour)

- BSc University of Toronto
- MSc McGill University
- PhD University of Northern BC





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Working with R since 2007

• Analysis requires a lot of data prep!





Dr. Steffi LaZerte

Independent biological consultant and R programmer

- Data cleaning, summarizing, and analysis
- Custom R packages and scripts
- R tutoring and workshops





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Solving data problems



Analysis and Data Tools for Science



Historical weather data

- Available from Environment and Climate Change Canada (ECCC)
- 1840 to Present
- Hourly, daily, monthly intervals
- > 8,000 stations (past and present)



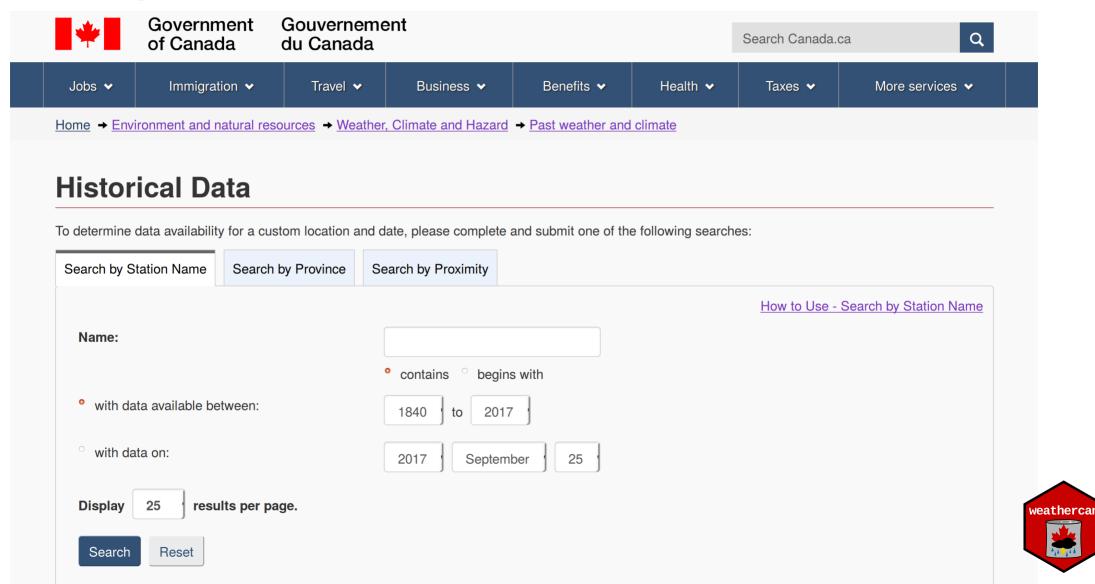
Historical weather data

- Available from Environment and Climate Change Canada (ECCC)
- 1840 to Present
- Hourly, daily, monthly intervals
- > 8,000 stations (past and present)

Lots of Data!



Accessing data from ECCC website





Government of Canada

Gouvernement du Canada

Search Canada.ca



Jobs ♥ Immigration ♥ Travel ♥ Business ♥ Benefits ♥ Health ♥ Taxes ♥ More services ♥

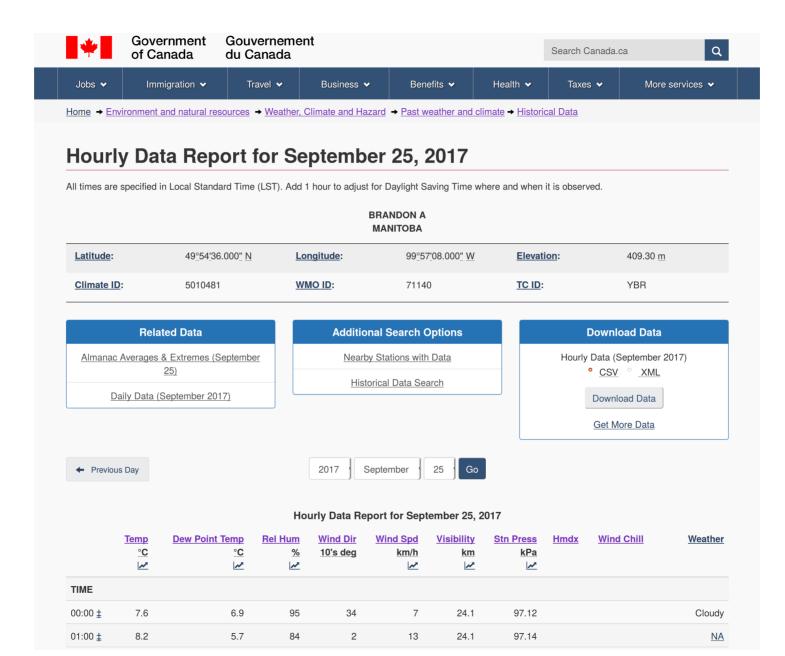
Home → Environment and natural resources → Weather, Climate and Hazard → Past weather and climate → Historical Data

Station Results - Historical Data

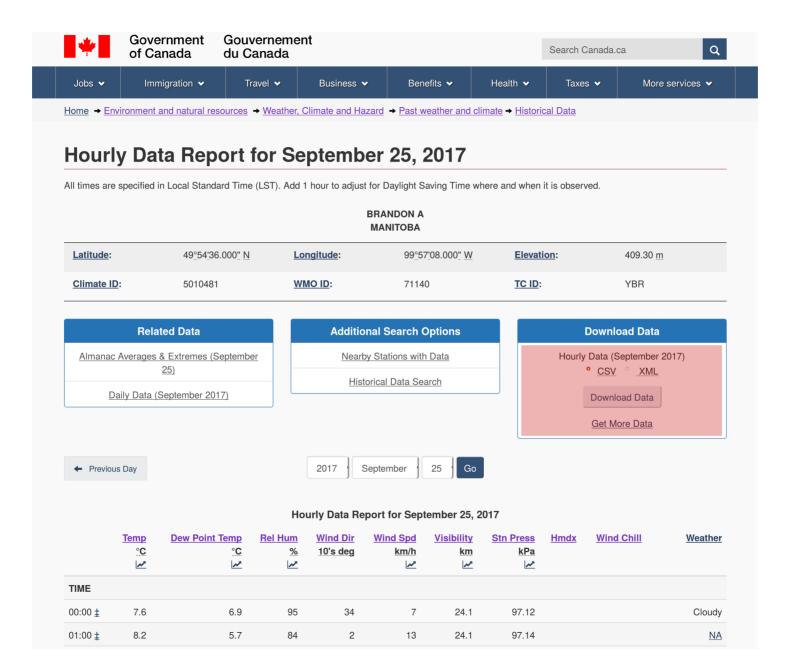
7 stations found with name containing "Brandon", with data available between 1840 and 2017. Stations are listed in alphabetical order. Confirm the <u>Data Interval</u> and the date for one of the stations listed and click "GO" to display the historical data.

Station	Prov.	Data Interval	Year	Month	Day	
BRANDON #1 WINTER BAY	MB	Daily	2002	Apr	30	Go
BRANDON A	MB	Hourly	2012	Dec	6	Go
BRANDON A	MB	Hourly	2017	Sep	25	Go
BRANDON CDA	MB	Daily	2010	Mar	10	Go
BRANDON RCS	MB	Hourly	2017	Sep	25	Go
BRANDON SOUTH	MB	Daily	1975	Sep	30	Go











Data good but not ready

```
"Station Name". "BRANDON A"
"Province", "MANITOBA"
"Latitude", "49.91"
"Longitude", "-99.95"
"Elevation", "409,30"
"Climate Identifier", "5010481"
"WMO Identifier"."71140"
"TC Identifier"."YBR"
"All times are specified in Local Standard Time (LST). Add 1 hour to adjust for Davlight Saving Time where and when it is observed."
"Legend"
"E"."Estimated"
"M", "Missing"
"NA". "Not Available"
"‡", "Partner data that is not subject to review by the National Climate Archives"
"Date/Time","Year","Month","Day","Time","Data Quality","Temp (°C)","Temp Flag","Dew Point Temp (°C)","Dew Point Temp Flag","Rel Hum (%)","Rel Hum
Flag", "Wind Dir (10s deg)", "Wind Dir Flag", "Wind Spd (km/h)", "Wind Spd Flag", "Visibility (km)", "Visibility Flag", "Stn Press (kPa)", "Stn Press
Flag", "Hmdx", "Hmdx Flag", "Wind Chill", "Wind Chill Flag", "Weather"
"2017-09-01 00:00","2017","09","01","00:00","‡","20.8","","17.3","","80","","18","","18","","24.1","","96.21","","26",""
"2017-09-01 01:00","2017","09","01","01:00","‡","20.8","","17.2","","80","","17","","27","","24.1","","96.15","","26","","","","NA"
"2017-09-01 08:00","2017","09","01","08:00","‡","19.9","","17.8","","88","","20","","18","","24.1","","96.01","","","","","","",
```

weathercan: An R package



What's R?



What's R?

An open source, programming language, and software environment

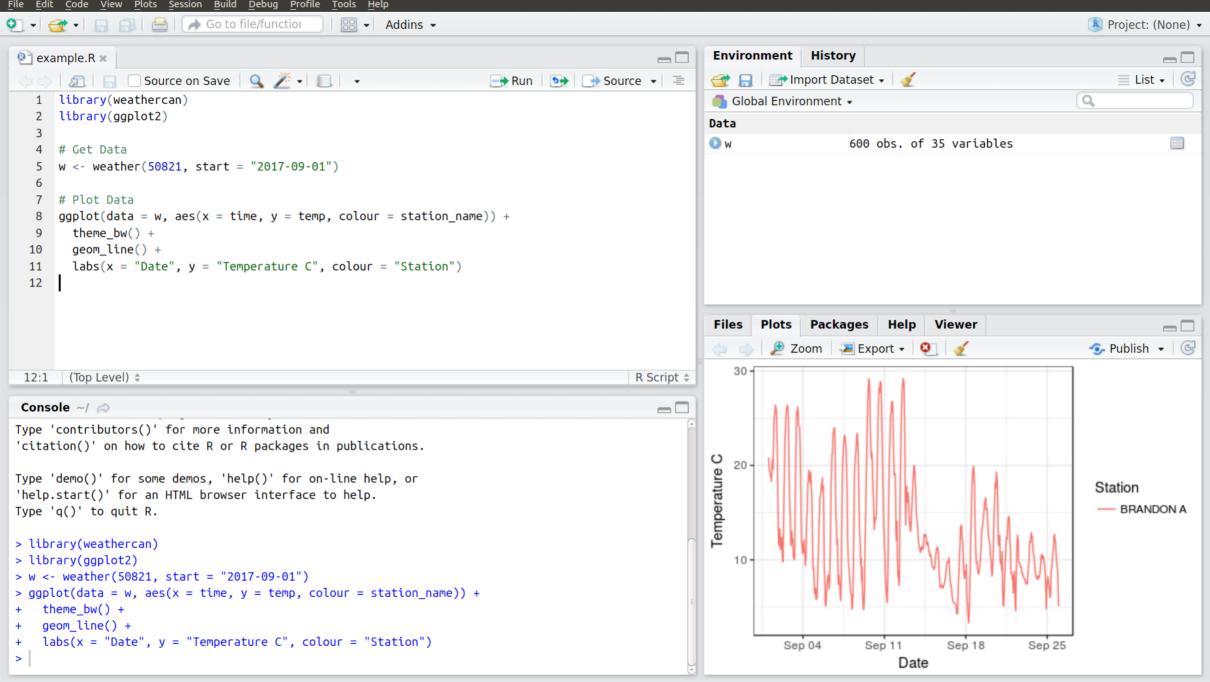


What's R?

An open source, programming language, and software environment

Often used with RStudio IDE







Free

• Free *and* open-source software (FOSS)



Free

• Free and open-source software (FOSS)

Fast and Easy

- One line of code to download data from many stations, over many years
- Instantly usable



Free

Free and open-source software (FOSS)

Fast and Easy

- One line of code to download data from many stations, over many years
- Instantly usable

Customizable

- Data is trimmed to start and end times
- You can specify stations, time intervals, timezones, etc.



Reproducible!

- Scripts provide a record of actions
- Make a note of the weathercan version (packageVersion (weathercan))
- Hard to document mouse clicks or website searches



Getting started with weathercan

Latest stable version (v0.2.7):

```
install.packages("weathercan")
```

Developmental version (v0.2.7.9000):

```
library(devtools)
install_github("ropensci/weathercan", build_vignettes = TRUE)
```



Basic usage

Code

```
library(weathercan)
w <- weather_dl(station_ids = c(50821, 51097), start = "2017-09-01", interval = "hour")</pre>
```



Basic usage

Code

```
library(weathercan)
w <- weather_dl(station_ids = c(50821, 51097), start = "2017-09-01", interval = "hour")</pre>
```

Output

```
## # A tibble: 15,984 x 29
    station_name station_id station_operator prov lat lon elev climate_id WMO_id TC_id
                                          <fct> <dbl> <dbl> <chr>
## * <chr>
                     <dbl> <chr>
                                                                            <chr> <chr>
## 1 BRANDON A
                     50821 NAV Canada
                                                 49.9 -100.0 409. 5010481
                                                                            71140
                                          MB
                                                                                  YBR
## 2 BRANDON A
                     50821 NAV Canada
                                           MB
                                                 49.9 -100.0 409. 5010481
                                                                            71140
                                                                                  YBR
## 3 BRANDON A
                     50821 NAV Canada
                                           MB
                                                 49.9 -100.0 409. 5010481
                                                                            71140
                                                                                  YBR
## 4 BRANDON A
                     50821 NAV Canada
                                                 49.9 -100.0 409. 5010481
                                           MB
                                                                            71140
                                                                                  YBR
                                                 49.9 -100.0 409. 5010481
## 5 BRANDON A
                     50821 NAV Canada
                                           MB
                                                                            71140
                                                                                  YBR
## # ... with 1.598e+04 more rows, and 19 more variables
```

Basic usage

Code

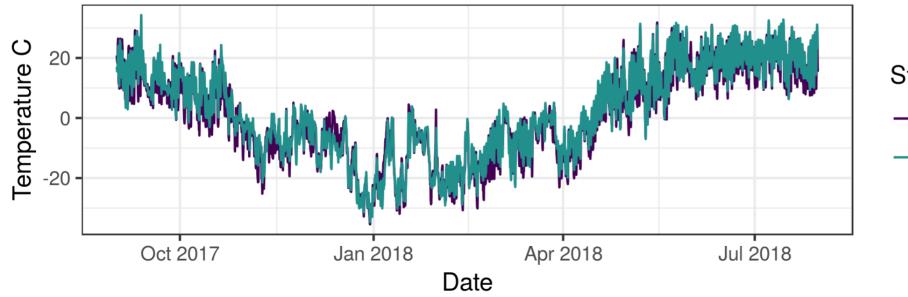
```
library(weathercan)
w <- weather_dl(station_ids = c(50821, 51097), start = "2017-09-01", interval = "hour")</pre>
```

Output

```
## # A tibble: 15,984 x 29
                                                   lat lon elev climate_id WMO_id TC_id
    station_name station_id station_operator prov
                                             <fct> <dbl> <dbl> <dbl> <chr>
## * <chr>
                      <dbl> <chr>
                                                                                <chr> <chr>
  1 BRANDON A
                      50821 NAV Canada
                                                    49.9 -100.0 409. 5010481
                                                                                71140
                                             MB
                                                                                       YBR
## 2 BRANDON A
                      50821 NAV Canada
                                             MB
                                                    49.9 -100.0 409. 5010481
                                                                                71140
                                                                                       YBR
## 3 BRANDON A
                                                                                71140
                      50821 NAV Canada
                                             MB
                                                    49.9 -100.0 409. 5010481
                                                                                      YBR
  4 BRANDON A
                      50821 NAV Canada
                                                    49.9 -100.0 409. 5010481
                                             MB
                                                                                71140
                                                                                      YBR
                                                    49.9 -100.0 409. 5010481
## 5 BRANDON A
                      50821 NAV Canada
                                             MB
                                                                                71140
                                                                                       YBR
## # ... with 1.598e+04 more rows, and 19 more variables
```

Plotting

```
library(ggplot2)
ggplot(data = w, aes(x = time, y = temp, colour = station_name)) +
    theme_bw() +
    geom_line() +
    scale_colour_viridis_d(end = 0.5) +
    labs(x = "Date", y = "Temperature C", colour = "Station")
```



Station

- BRANDON A
- WINNIPEG INTL A



And done!

```
library(weathercan)
w <- weather_dl(station_ids = c(50821, 51097), start = "2017-09-01", interval = "hour")

ggplot(data = w, aes(x = time, y = temp, colour = station_name)) +
    theme_bw() +
    geom_line() +
    scale_colour_viridis_d(end = 0.5) +
    labs(x = "Date", y = "Temperature C", colour = "Station")</pre>
```



Hmmm...

```
library(weathercan)

w <- weather_dl(station_ids = c(50821, 51097), start = "2017-09-01")

ggplot(data = w, aes(x = time, y = temp, colour = station_name)) +
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```



Hmmm...

```
library(weathercan)

w <- weather_dl(station_ids = c(50821, 51097), start = "2017-09-01")

ggplot(data = w, aes(x = time, y = temp, colour = station_name)) +
    theme_bw() +
    geom_line() +
    scale_colour_viridis_d(end = 0.5) +
    labs(x = "Date", y = "Temperature C", colour = "Station")</pre>
```

How do we get station ids?



Stations data set

stations



Stations data set

stations

```
# A tibble: 26,208 x 12
##
      prov station name
                              station id climate id WMO id TC id lat lon elev interval start
##
      <fct> <chr>
                              <fct>
                                         <fct>
                                                     <fct> <fct> <dbl> <dbl> <dbl> <chr>
                                                                                               <int> <int>
            ABEE AGDM
##
    1 AB
                              32232
                                         3010010
                                                     71285
                                                            XAF
                                                                    54.3 -113.
                                                                                 664 dav
                                                                                                2002
                                                                                                      2018
##
    2 AB
            ABEE AGDM
                              32232
                                         3010010
                                                     71285
                                                            XAF
                                                                    54.3 -113.
                                                                                 664 hour
                                                                                                1990
                                                                                                      2018
##
    3 AB
            ABEE AGDM
                              32232
                                         3010010
                                                     71285
                                                            XAF
                                                                    54.3 -113.
                                                                                 664 month
                                                                                                2002
                                                                                                      2007
    4 AB
            ACADIA VALLEY
                              2030
                                         3020018
                                                     <NA>
                                                            <NA>
                                                                    51.2 -110.
                                                                                 732 day
                                                                                                1980
                                                                                                      1991
##
            ACADIA VALLEY
    5 AB
                                                     71048
                                                                    51.1 -110.
                              47748
                                         3020035
                                                            PAC
                                                                                 735 day
                                                                                                2009
                                                                                                      2018
    6 AB
            ACADIA VALLEY
                              2030
                                         3020018
                                                     <NA>
                                                            <NA>
                                                                    51.2 -110.
                                                                                 732 hour
                                                                                                  NA
                                                                                                        NA
    7 AB
            ACADIA VALLEY
                                         3020035
                                                     71048
                                                            PAC
                                                                    51.1 -110.
                                                                                 735 hour
                                                                                                2009
                              47748
                                                                                                      2018
##
    8 AB
            ACADIA VALLEY
                              2030
                                         3020018
                                                     <NA>
                                                            <NA>
                                                                    51.2 -110.
                                                                                 732 month
                                                                                                1980
                                                                                                      1991
##
    9 AB
            ACADIA VALLEY
                                                     71048
                                                                    51.1 -110.
                                                                                 735 month
                                                                                                  NA
                                                                                                        NA
                              47748
                                         3020035
                                                            PAC
  10 AB
            ACADIA VALLEY C... 2032
                                         3020022
                                                     <NA>
                                                            <NA>
                                                                    51.1 -110.
                                                                                  NA day
                                                                                                1965
                                                                                                      weathercan
## # ... with 2.62e+04 more rows
```

```
stations_search(name = "Brandon")
```

```
## # A tibble: 15 x 12
##
                             station id climate id WMO id TC id
                                                                     lat
                                                                            lon elev interval start
      prov station name
##
      <fct> <chr>
                             <fct>
                                         <fct>
                                                     <fct>
                                                            <fct> <dbl> <dbl> <dbl> <chr>
                                                                                                 <int> <int>
            BRANDON #1 WIN... 3474
                                                            <NA>
                                                                    49.8 -100.0
                                                                                  396
                                                                                                  1987
##
    1 MB
                                         5010498
                                                     <NA>
                                                                                       day
                                                                                                        2002
##
    2 MB
            BRANDON #1 WIN... 3474
                                         5010498
                                                     <NA>
                                                            <NA>
                                                                    49.8 -100.0
                                                                                  396
                                                                                       month
                                                                                                  1987
                                                                                                        2002
##
    3 MB
            BRANDON A
                             3471
                                         5010480
                                                     71140
                                                            YBR
                                                                    49.9 -100.0
                                                                                  409. day
                                                                                                  1941
                                                                                                        2012
            BRANDON A
                                         5010480
                                                     71140
                                                                    49.9 -100.0
                                                                                 409. hour
                                                                                                  1958
                                                                                                        2012
    4 MB
                             3471
                                                            YBR
##
    5 MB
            BRANDON A
                                                     71140
                                                                    49.9 -100.0
                                                                                  409, month
                             3471
                                         5010480
                                                            YBR
                                                                                                  1941
                                                                                                        2012
##
    6 MB
            BRANDON A
                             50821
                                         5010481
                                                     71140
                                                                    49.9 -100.0
                                                                                  409. day
                                                                                                  2012
                                                                                                        2018
                                                            YBR
            BRANDON A
                                                     71140
                                                                    49.9 -100.0
                                                                                  409. hour
                                                                                                  2012
                                                                                                        2018
##
    7 MB
                             50821
                                         5010481
                                                            YBR
##
    8 MB
            BRANDON CDA
                             3472
                                         5010485
                                                     <NA>
                                                            <NA>
                                                                    49.9 -100.0
                                                                                 363. day
                                                                                                  1890
                                                                                                        2010
##
            BRANDON CDA
                                                                                  363, month
    9 MB
                             3472
                                         5010485
                                                     <NA>
                                                            <NA>
                                                                    49.9 -100.0
                                                                                                        2007
                                                                                                  1890
  10 MB
            BRANDON RCS
                             49909
                                         5010490
                                                     71136
                                                            PB0
                                                                    49.9 -100.0
                                                                                  409. day
                                                                                                  2012
                                                                                                        20
                                                                                                        weathercan
## # ... with 5 more rows
```

```
stations_search(name = "Brandon")
```

```
# A tibble: 15 x 12
##
                             station id climate id WMO id TC id
                                                                     lat
                                                                            lon elev interval start
      prov station name
##
      <fct> <chr>
                             <fct>
                                         <fct>
                                                     <fct>
                                                            <fct> <dbl> <dbl> <dbl> <chr>
                                                                                                 <int> <int>
##
    1 MB
            BRANDON #1 WIN... 3474
                                                     <NA>
                                                            <NA>
                                                                    49.8 -100.0
                                                                                                  1987
                                         5010498
                                                                                  396
                                                                                       day
                                                                                                        2002
##
    2 MB
            BRANDON #1 WIN... 3474
                                         5010498
                                                     <NA>
                                                            <NA>
                                                                    49.8 -100.0
                                                                                  396
                                                                                       month
                                                                                                  1987
                                                                                                        2002
##
    3 MB
            BRANDON A
                             3471
                                         5010480
                                                     71140
                                                            YBR
                                                                    49.9 -100.0
                                                                                  409. day
                                                                                                  1941
                                                                                                        2012
##
    4 MB
            BRANDON A
                                         5010480
                                                     71140
                                                                    49.9 -100.0
                                                                                  409. hour
                                                                                                  1958
                                                                                                        2012
                             3471
                                                            YBR
##
    5 MB
            BRANDON A
                                                     71140
                                                                    49.9 -100.0
                                                                                  409, month
                                                                                                        2012
                             3471
                                         5010480
                                                            YBR
                                                                                                  1941
##
    6 MB
            BRANDON A
                             50821
                                         5010481
                                                     71140
                                                                    49.9 -100.0
                                                                                  409. day
                                                                                                  2012
                                                                                                        2018
                                                            YBR
            BRANDON A
                                                     71140
                                                                    49.9 -100.0
                                                                                  409. hour
                                                                                                  2012
                                                                                                        2018
##
    7 MB
                             50821
                                         5010481
                                                            YBR
##
    8 MB
            BRANDON CDA
                             3472
                                         5010485
                                                     <NA>
                                                             <NA>
                                                                    49.9 -100.0
                                                                                  363. day
                                                                                                  1890
                                                                                                        2010
##
            BRANDON CDA
                                                                                  363, month
    9 MB
                             3472
                                         5010485
                                                     <NA>
                                                            <NA>
                                                                    49.9 -100.0
                                                                                                  1890
                                                                                                        2007
   10 MB
            BRANDON RCS
                             49909
                                         5010490
                                                     71136
                                                            PB0
                                                                    49.9 -100.0
                                                                                  409. day
                                                                                                  2012
                                                                                                        20
                                                                                                        weathercan
## # ... with 5 more rows
```

```
stations_search(name = "Brandon", interval = "hour")
```



```
stations_search(name = "Brandon", interval = "hour")
```

```
## # A tibble: 3 x 12
##
    prov station_name station_id climate_id WMO_id TC_id lat lon elev interval start
    <fct> <chr>
                                           <fct> <fct> <dbl> <dbl> <dbl> <chr>
##
                      <fct>
                                 <fct>
                                                                                   <int> <int>
          BRANDON A
## 1 MB
                      3471
                                 5010480
                                           71140
                                                  YBR
                                                         49.9 -100.0
                                                                     409. hour
                                                                                    1958
                                                                                         2012
## 2 MB
          BRANDON A
                      50821
                                 5010481
                                           71140
                                                  YBR
                                                       49.9 -100.0
                                                                     409. hour
                                                                                    2012
                                                                                         2018
          BRANDON RCS 49909
                                           71136
                                                        49.9 -100.0 409. hour
                                                                                    2012 2018
## 3 MB
                                 5010490
                                                  PB0
```



Searching by station name (fancy)

```
stations_search(name = "Brandon|Winnipeg", interval = "hour")
```



Searching by station name (fancy)

```
stations_search(name = "Brandon|Winnipeg", interval = "hour")
```

```
## # A tibble: 8 x 12
##
                             station_id climate_id WMO_id TC_id
                                                                   lat
                                                                           lon elev interval start
     prov station name
##
     <fct> <chr>
                             <fct>
                                        <fct>
                                                    <fct> <fct> <dbl> <dbl> <dbl> <chr>
                                                                                               <int> <int>
           BRANDON A
##
  1 MB
                                                    71140
                                                           YBR
                                                                  49.9 -100.0
                                                                                409. hour
                                                                                                1958
                             3471
                                        5010480
                                                                                                      2012
## 2 MB
           BRANDON A
                             50821
                                        5010481
                                                    71140
                                                           YBR
                                                                  49.9 -100.0
                                                                                409. hour
                                                                                                2012
                                                                                                      2018
           BRANDON RCS
                                                    71136
## 3 MB
                             49909
                                        5010490
                                                           PB0
                                                                  49.9 -100.0
                                                                                409. hour
                                                                                                2012
                                                                                                      2018
## 4 MB
           WINNIPEG A CS
                             27174
                                        502S001
                                                    71849
                                                                         -97.2
                                                                                239. hour
                                                                                                2013
                                                                                                      2018
                                                           XWG
## 5 MB
           WINNIPEG INTL A
                                                                                239. hour
                                                    <NA>
                                                                         -97.2
                                                                                                2013
                                                                                                      2018
                             51097
                                        5023227
                                                           YWG
##
  6 MB
           WINNIPEG RICHAR... 47407
                                        5023226
                                                    71852
                                                                         -97.2
                                                                                239. hour
                                                                                                2008
                                                                                                      2013
                                                           YWG
           WINNIPEG RICHAR... 3698
                                                    71852
                                                                         -97.2
                                                                                239. hour
## 7 MB
                                        5023222
                                                           YWG
                                                                                                1953
                                                                                                      2013
## 8 MB
           WINNIPEG THE FO... 28051
                                        5023262
                                                    71579
                                                           XWN
                                                                         -97.1
                                                                                230
                                                                                                1999
                                                                                                      2018
                                                                                     hour
```



Searching by station name (fancy)

```
stations_search(name = "Brandon|Winnipeg", interval = "hour")
```

```
## # A tibble: 8 x 12
##
                             station_id climate_id WMO_id TC_id
                                                                           lon elev interval start
     prov
           station name
                                                                    lat
     <fct> <chr>
                             <fct>
                                        <fct>
                                                    <fct> <fct> <dbl> <dbl> <dbl> <chr>
                                                                                               <int> <int>
           BRANDON A
## 1 MB
                                                    71140
                                                           YBR
                                                                   49.9 -100.0
                                                                                409. hour
                                                                                                1958
                             3471
                                        5010480
                                                                                                      2012
           BRANDON A
## 2 MB
                             50821
                                         5010481
                                                    71140
                                                           YBR
                                                                   49.9 -100.0
                                                                                409. hour
                                                                                                2012
                                                                                                      2018
           BRANDON RCS
                                                    71136
                                                                                409. hour
## 3 MB
                             49909
                                         5010490
                                                           PB0
                                                                   49.9 -100.0
                                                                                                2012
                                                                                                      2018
## 4 MB
           WINNIPEG A CS
                                        502S001
                                                    71849
                                                                         -97.2
                                                                                239. hour
                                                                                                2013
                                                                                                      2018
                             27174
                                                           XWG
## 5 MB
           WINNIPEG INTL A
                                                                         -97.2
                                                                                239. hour
                             51097
                                                    <NA>
                                                                                                2013
                                         5023227
                                                           YWG
                                                                                                      2018
  6 MB
           WINNIPEG RICHAR... 47407
                                         5023226
                                                    71852
                                                                         -97.2
                                                                                239. hour
                                                                                                2008
                                                                                                      2013
                                                           YWG
           WINNIPEG RICHAR... 3698
                                                    71852
                                                                         -97.2
                                                                                239. hour
## 7 MB
                                         5023222
                                                           YWG
                                                                                                1953
                                                                                                      2013
## 8 MB
           WINNIPEG THE FO... 28051
                                         5023262
                                                    71579
                                                           XWN
                                                                         -97.1
                                                                                230
                                                                                                1999
                                                                                                      2018
                                                                                     hour
```

Make a note: 50821 (Brandon) and 51097 (Winnipeg)



Alternative: Searching by coordinates

- Search according to location: c(latitude, longitude)
- Search within 10km of this location: dist = 10

```
stations_search(coords = c(49.84847, -99.95009), dist = 10, interval = "hour")
```



Alternative: Searching by coordinates

- Search according to location: c(latitude, longitude)
- Search within 10km of this location: dist = 10

```
stations_search(coords = c(49.84847, -99.95009), dist = 10, interval = "hour")
```

```
## # A tibble: 3 x 13
    prov station_name station_id climate_id WMO_id TC_id lat lon elev interval start
                                                                                     end distance
    <fct> <chr>
                               <fct> <fct> <fct> <dol> <dbl> <dbl> <chr>
                     <fct>
                                                                               <int> <int>
                                                                                             <dbl>
## 1 MB
         BRANDON RCS 49909
                               5010490
                                         71136 PB0 49.9 -100.0 409. hour
                                                                                2012
                                                                                    2018
                                                                                             5.73
         BRANDON A
                                         71140 YBR
                                                    49.9 -100.0 409. hour
                                                                                             6.84
## 2 MB
                     3471
                               5010480
                                                                                1958
                                                                                     2012
                                         71140 YBR 49.9 -100.0 409. hour
                                                                                             6.84
## 3 MB
         BRANDON A
                     50821
                               5010481
                                                                                2012 2018
```



Alternative: Searching by coordinates

- Search according to location: c(latitude, longitude)
- Search within 10km of this location: dist = 10

```
stations_search(coords = c(49.84847, -99.95009), dist = 10, interval = "hour")
```

```
## # A tibble: 3 x 13
    prov station_name station_id climate_id WMO_id TC_id lat lon elev interval start
                                                                                     end distance
    <fct> <chr>
                               <fct> <fct> <fct> <dol> <dbl> <dbl> <chr>
                     <fct>
                                                                               <int> <int>
                                                                                             <dbl>
                                                                                2012 2018
                                                                                              5.73
## 1 MB
         BRANDON RCS 49909
                               5010490
                                         71136 PB0 49.9 -100.0 409. hour
         BRANDON A
                                         71140 YBR
                                                    49.9 -100.0 409. hour
                                                                                     2012
                                                                                              6.84
## 2 MB
                     3471
                               5010480
                                                                                1958
                                         71140 YBR 49.9 -100.0 409. hour
                                                                                              6.84
## 3 MB
         BRANDON A
                     50821
                               5010481
                                                                                2012 2018
```



Alternative: Searching with tidyverse

Note here we're using the stations data frame directly

```
library(tidyverse)
stations %>%
filter(prov == "MB", start > 2000, interval == "day")
```

```
## # A tibble: 40 x 12
                                                                      lon elev interval start
##
                           station_id climate_id WMO_id TC_id
                                                               lat
     prov station_name
     <fct> <chr>
                                                <fct> <fct> <dbl> <dbl> <dbl> <chr>
##
                           <fct>
                                     <fct>
                                                                                        <int> <int>
   1 MB
           BRANDON A
                           50821
                                     5010481
                                              71140 YBR
                                                              49.9 -100.0 409. day
                                                                                         2012
##
                                                                                              2018
   2 MB
           BRANDON RCS
                                                71136
                                                              49.9 -100.0 409. day
                                                                                         2012
                                                                                               2018
                           49909
                                     5010490
                                                       PB0
           CFB SHILO CCOC 43343
                                     5012673
                                                              49.8
                                                                    -99.6 372
   3 MB
                                                <NA>
                                                       <NA>
                                                                               day
                                                                                         2004
                                                                                               2005
   4 MB
           CHURCHILL
                                                              58.7 -94.1 29.3 day
                                                                                         2010
                                                                                               2018
                           48969
                                     5060595
                                                71618
                                                      YYQ
   5 MB
           CHURCHILL AWOS 47408
                                     5060601
                                                <NA>
                                                       <NA>
                                                              58.7
                                                                    -94.1 28.7 day
                                                                                         2008
                                                                                               2010
           CHURCHILL CLIM... 44244
   6 MB
                                     5060608
                                                71696
                                                       PY0
                                                                    -94.1 28.5 day
                                                                                         2005
                                                                                               2018
##
   7 MB
           CROSS LAKE JEN... 54658
                                     5060622
                                                71106
                                                       PJP
                                                              54.5 -98.0 219. day
                                                                                         2017
                                                                                               2018
           CYPRESS RIVER ... 48128
   8 MB
                                     5010641
                                                71239
                                                       POY
                                                              49.6 -99.1 374
                                                                               day
                                                                                         2009
                                                                                               2018
   9 MB
           DAUPHIN
                           48868
                                      5040689
                                                71036
                                                      YDN
                                                              51.1 -100. 304.
                                                                               day
                                                                                         2010
                                                                                               2018
```



Flags

For each measurement there is a corresponding 'flag' column

```
w_month <- weather_dl(station_id = 5401, start = "2017-01-01", interval = "month")
names(w_month) # List all the column names</pre>
```

```
[1] "station name"
                                   "station id"
                                                              "station operator"
    [4] "prov"
                                   "lat"
                                                              "lon"
                                   "climate id"
                                                              "WMO id"
    [7] "elev"
                                                              "vear"
  [10] "TC id"
                                   "date"
                                   "dir_max_gust"
  [13] "month"
                                                              "dir_max_gust_flag"
                                                              "extr_min_temp"
                                   "extr_max_temp_flag"
## [16] "extr_max_temp"
## [19] "extr_min_temp_flag"
                                   "mean max temp"
                                                              "mean_max_temp_flag"
## [22] "mean min temp"
                                   "mean min temp flag"
                                                              "mean temp"
## [25] "mean_temp_flag"
                                   "snow_grnd_last_day"
                                                              "snow_grnd_last_day_flag"
## [28] "spd max gust"
                                                              "total precip"
                                   "spd max gust flag"
## [31] "total_precip_flag"
                                                              "total_rain_flag"
                                   "total rain"
## [34] "total snow"
                                   "total snow flag"
```

Flags

For each measurement there is a corresponding 'flag' column

```
w_month <- weather_dl(station_id = 5401, start = "2017-01-01", interval = "month")
names(w_month) # List all the column names</pre>
```

```
[1] "station name"
                                   "station id"
                                                              "station operator"
    [4] "prov"
                                   "lat"
                                                              "lon"
                                   "climate id"
                                                              "WMO id"
    [7] "elev"
                                                              "vear"
  [10] "TC id"
                                   "date"
  [13] "month"
                                   "dir_max_gust"
                                                              "dir_max_gust_flag"
                                                              "extr_min_temp"
                                   "extr_max_temp_flag"
  [16] "extr_max_temp"
## [19] "extr_min_temp_flag"
                                   "mean max temp"
                                                              "mean_max_temp_flag"
                                   "mean_min_temp_flag"
       "mean min temp"
                                                             "mean temp"
## [22]
## [25] "mean_temp_flag"
                                   "snow_grnd_last_day"
                                                              "snow_grnd_last_day_flag"
## [28] "spd max gust"
                                                              "total precip"
                                   "spd max gust flag"
## [31] "total_precip_flag"
                                                              "total rain flag"
                                   "total rain"
## [34] "total snow"
                                   "total snow flag"
```

Flags

```
select(w_month, date, mean_temp_flag) # Pull out some columns
```

```
## # A tibble: 14 x 3
##
     date
               mean_temp mean_temp_flag
   * <date> <dbl> <chr>
   1 2017-01-01 -4.4 ""
   2 2017-02-01 -4.3 ""
               -5.2 ""
   3 2017-03-01
               7.9 ""
   4 2017-04-01
   5 2017-05-01
               11.8 E
   6 2017-06-01
                17.5 ""
                   19.3 ""
   7 2017-07-01
   8 2017-08-01
                   18.4 ""
   9 2017-09-01
                    17
                   12.7 ""
## 10 2017-10-01
                                                                                         weatherca
## # ... with 4 more rows
```

Flags

```
select(w_month, date, mean_temp_flag) # Pull out some columns
```

```
## # A tibble: 14 x 3
##
     date
               mean_temp mean_temp_flag
   * <date> <dbl> <chr>
   1 2017-01-01 -4.4 ""
   2 2017-02-01 -4.3 ""
               -5.2 ""
   3 2017-03-01
                 7.9 ""
   4 2017-04-01
                    11.8 E
   5 2017-05-01
   6 2017-06-01
                    17.5 ""
                    19.3 ""
   7 2017-07-01
   8 2017-08-01
                    18.4 ""
   9 2017-09-01
                    17
                    12.7 ""
  10 2017-10-01
## # ... with 4 more rows
```

Flags

```
vignette("flags", package = "weathercan")
```

code	meaning
E	Estimated
М	Missing
NA	Not Available
‡	Partner data that is not subject to review by the National Climate Archives
Α	Accumulated
С	Precipitation occurred, amount uncertain
F	Accumulated and estimated
L	Precipitation may or may not have occurred
N	Temperature missing but known to be > 0



Units and measurements

```
## # A tibble: 15,984 x 6
      station_id time
                                       temp temp_dew rel_hum wind_dir
##
##
           <dbl> <dttm>
                                                <dbl>
                                                        <dbl>
                                      <dbl>
                                                                  <dbl>
##
                                                                     18
           50821 2017-09-01 00:00:00
                                       20.8
                                                 17.3
                                                           80
##
           50821 2017-09-01 01:00:00
                                      20.8
                                                 17.2
                                                           80
                                                                     17
##
           50821 2017-09-01 02:00:00
                                                 16.9
                                                           83
                                                                     17
##
           50821 2017-09-01 03:00:00
                                      19.4
                                                 16.9
                                                           85
                                                                     16
##
           50821 2017-09-01 04:00:00
   5
                                       19.2
                                                 17.2
                                                           88
                                                                     19
##
           50821 2017-09-01 05:00:00
                                       18.8
                                                 17.8
                                                           93
                                                                     17
           50821 2017-09-01 06:00:00
##
                                       18.9
                                                 17.9
                                                           94
                                                                     16
##
           50821 2017-09-01 07:00:00
                                       18.3
                                                 17.7
                                                           96
                                                                     18
##
           50821 2017-09-01 08:00:00
                                                           88
                                       19.9
                                                 17.8
                                                                     20
           50821 2017-09-01 09:00:00
##
  10
                                       20.6
                                                 18.2
                                                           86
                                                                     23
## # ... with 1.597e+04 more rows
```

weatherca

Units and measurements

```
vignette("glossary", package = "weathercan")
```

Interval	ECCC Name	Formated weathercan name	units	Reference
hour	Date/Time	time	ISO date/time	NA
hour	Year	year	year	ECCC glossary page
hour	Month	month	month	ECCC glossary page
hour	Day	day	day	ECCC glossary page
hour	Time	hour	hour	ECCC glossary page
hour	Data Quality	qual	note	ECCC glossary page
hour	Temp (°C)	temp	°C	ECCC glossary page
hour	Temp Flag	temp_flag	note	See the 'flags' vignette
hour	Dew Point Temp (°C)	temp_dew	°C	ECCC glossary page
hour	Dew Point Temp Flag	temp_dew_flag	note	See the 'flags' vignette
hour	Rel Hum (%)	rel_hum	%	ECCC glossary page
hour	Rel Hum Flag	rel_hum_flag	note	See the 'flags' vignette
hour	Wind Dir (10s deg)	wind_dir	10s deg	ECCC glossary page
hour	Wind Dir Flag	wind_dir_flag	note	See the 'flags' vignette



Combining with other data

- Adding weather data to other data sets
- Times don't always line up



Combining with other data

- Adding weather data to other data sets
- Times don't always line up

Sediment data (for example)

```
## # A tibble: 1,392 x 2
##
     time
                         amount
     <dttm>
##
                          <dbl>
  1 2017-09-01 00:05:34
                           168.
  2 2017-09-01 00:35:34
                           157.
  3 2017-09-01 01:05:34
                           176.
  4 2017-09-01 01:35:34
                           185.
  5 2017-09-01 02:05:34
                           163.
  6 2017-09-01 02:35:34
                           169.
  7 2017-09-01 03:05:34
                           168.
## # ... with 1,385 more rows
```

Brandon weather data

```
## # A tibble: 7,992 x 3
##
     time
                          temp pressure
     <dttm>
                         <dbl>
                                   <dbl>
## 1 2017-09-01 00:00:00 20.8
                                    96.2
  2 2017-09-01 01:00:00
                          20.8
                                    96.2
## 3 2017-09-01 02:00:00
                                    96.1
                          20
                                    96.1
## 4 2017-09-01 03:00:00
                          19.4
## 5 2017-09-01 04:00:00
                                    96.1
                          19.2
## 6 2017-09-01 05:00:00
                          18.8
                                    96.0
## 7 2017-09-01 06:00:00 18.9
                                    96.0
                                            weathercar
## # ... with 7,985 more rows
```

Interpolating

- Linear interpolation where possible
- Only a single weather station at a time

temp is missing 7 out of 7992 data, interpolation may be less accurate as a result.

pressure is missing 7 out of 7992 data, interpolation may be less accurate as a result.



Interpolating

- Linear interpolation where possible
- Only a single weather station at a time

temp is missing 7 out of 7992 data, interpolation may be less accurate as a result.

pressure is missing 7 out of 7992 data, interpolation may be less accurate as a result.

Note messages regarding missing data. These are just a 'heads up', not errors



Interpolating

Sediment & weather data

```
## # A tibble: 1,392 x 4
##
     time
                          amount
                                temp pressure
     <dttm>
                           <dbl> <dbl>
##
                                          <dbl>
                           168.
                                  20.8
                                           96.2
   1 2017-09-01 00:05:34
  2 2017-09-01 00:35:34
                           157.
                                  20.8
                                           96.2
  3 2017-09-01 01:05:34
                           176.
                                  20.7
                                           96.1
   4 2017-09-01 01:35:34
                           185.
                                  20.3
                                           96.1
  5 2017-09-01 02:05:34
                           163.
                                  19.9
                                           96.1
   6 2017-09-01 02:35:34
                           169.
                                  19.6
                                           96.1
  7 2017-09-01 03:05:34
                           168.
                                 19.4
                                           96.1
## # ... with 1,385 more rows
```

Original weather data

```
## # A tibble: 7,992 x 3
     time
##
                           temp pressure
## * <dttm>
                                   <dbl>
                          <dbl>
## 1 2017-09-01 00:00:00
                           20.8
                                    96.2
## 2 2017-09-01 01:00:00
                           20.8
                                    96.2
## 3 2017-09-01 02:00:00
                           20
                                    96.1
## 4 2017-09-01 03:00:00
                           19.4
                                    96.1
## 5 2017-09-01 04:00:00
                           19.2
                                    96.1
## 6 2017-09-01 05:00:00
                           18.8
                                    96.0
## 7 2017-09-01 06:00:00
                           18.9
                                    96.0
## # ... with 7,985 more rows
```



Taking weathercan to the next level...



1. Download from multiple stations (spatial)

```
mb <- filter(stations, prov == "MB", start <= "2018", end >= "2018", interval == "hour")
mb
```

```
# A tibble: 60 x 12
##
      prov station name
                             station_id climate_id WMO_id TC_id
                                                                    lat
                                                                           lon elev interval start
##
      <fct> <chr>
                             <fct>
                                         <fct>
                                                    <fct> <fct> <dbl>
                                                                         <dbl> <dbl> <chr>
                                                                                                <int> <int>
    1 MB
            BERENS RIVER A
                             53321
                                         5030201
                                                    <NA>
                                                            YBV
                                                                   52.4
                                                                         -97.0 222.
                                                                                      hour
                                                                                                 2015
                                                                                                       2018
##
    2 MB
            BERENS RIVER A
                             53318
                                         5030204
                                                    <NA>
                                                            YBV
                                                                         -97.0 222.
                                                                                      hour
                                                                                                 2015
                                                                                                       2018
##
    3 MB
            BERENS RIVER CS 3721
                                         5030203
                                                    71158
                                                            WCF
                                                                   52.4 -97.0 222.
                                                                                      hour
                                                                                                 1985
                                                                                                       2018
    4 MB
            BRANDON A
                             50821
                                         5010481
                                                    71140
                                                                   49.9 -100.0 409.
                                                                                                 2012
                                                                                                       2018
                                                            YBR
                                                                                      hour
    5 MB
            BRANDON RCS
                             49909
                                         5010490
                                                    71136
                                                            PB0
                                                                   49.9 -100.0 409.
                                                                                      hour
                                                                                                 2012
                                                                                                       2018
            CARBERRY CS
                                                    71170
    6 MB
                             27741
                                         5010547
                                                            WZE
                                                                         -99.4 384.
                                                                                      hour
                                                                                                 1994
                                                                                                       2018
##
    7 MB
            CARMAN U OF M ... 26857
                                         502I001
                                                    71147
                                                                   49.5
                                                                         -98.0 268.
                                                                                      hour
                                                                                                 1995
                                                                                                       2018
                                                            WNK
    8 MB
##
            CHURCHILL
                             48969
                                         5060595
                                                    71618
                                                                   58.7
                                                                         -94.1 29.3 hour
                                                                                                 2010
                                                                                                       2018
                                                            YY0
            CHURCHILL A
                                                                                                       20
      MB
                             50148
                                         5060605
                                                    71618
                                                            YY0
                                                                   58.7
                                                                         -94.1
                                                                                 29.3 hour
                                                                                                 2012
                                                                                                       weathercar
   10 MB
            CHURCHILL CLIM... 44244
                                         5060608
                                                    71696
                                                            PY0
                                                                   58.7
                                                                         -94.1
                                                                                28.5 hour
                                                                                                 2005
## # ... with 50 more rows
```

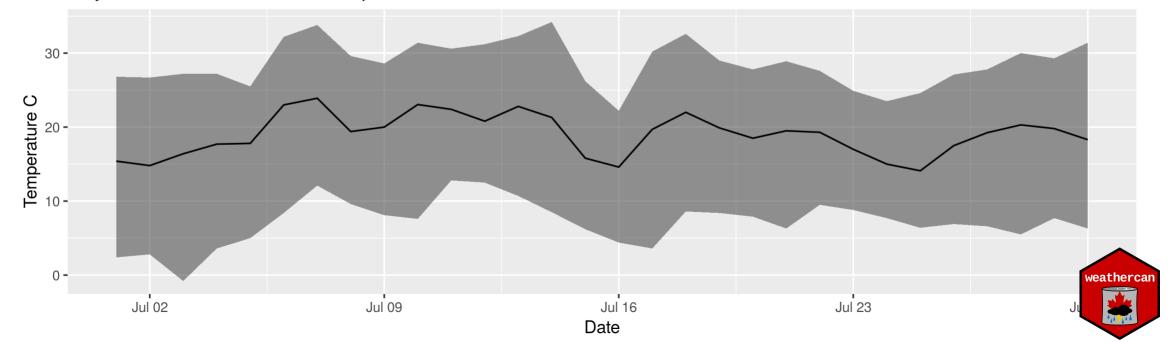
```
manitoba <- weather_dl(station_ids = mb$station_id, start = "2018-07-01")
```

Big data sets can take time to download: save the output for later

```
write_csv(manitoba, "./Data/manitoba_2018-07-01.csv")
```



July 2018 Min/Median/Max Temperatures in Manitoba, Canada



Linking to GEOS 3.5.1, GDAL 2.1.3, proj.4 4.9.2



2. Download from multiple years (temporal)

- no 'start' means download until the 'end' date
- no 'end' means download from the 'start' date to the present (or end of the data record)
- no 'start' OR 'end' means download all data

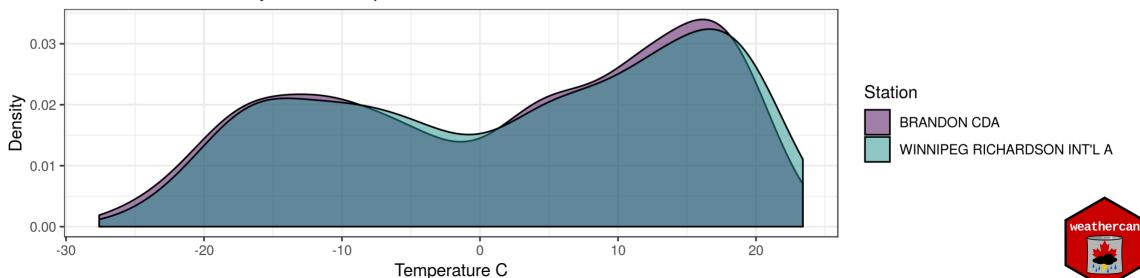
Download ALL data:

```
w <- weather_dl(station_ids = c(3472, 3698), interval = "month")
write_csv(w, "./Data/brandon_winnipeg_historical.csv")</pre>
```



```
ggplot(data = w, aes(x = mean_temp, fill = station_name)) +
    theme_bw() +
    geom_density(alpha = 0.5) +
    scale_fill_viridis_d(end = 0.5) +
    labs(title = "Distribution of Monthly Mean Temperatures",
        x = "Temperature C", y = "Density", fill = "Station")
```

Distribution of Monthly Mean Temperatures





1. Load weathercan package

library(weathercan)



1. Load weathercan package

library(weathercan)

2. Find a station

stations_search("Brandon")



1. Load weathercan package

```
library(weathercan)
```

2. Find a station

```
stations_search("Brandon")
```

3. Download weather

```
w <- weather_dl(station_ids = 50821, start = "2017-09-01")</pre>
```



1. Load weathercan package

```
library(weathercan)
```

2. Find a station

```
stations_search("Brandon")
```

3. Download weather

```
w <- weather_dl(station_ids = 50821, start = "2017-09-01")</pre>
```

4. Add weather data to an existing data set

```
sediment <- weather_interp(data = sediment, weather = w, cols = "temp")</pre>
```



Last, but not least

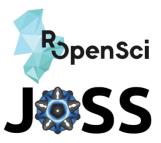
5. Cite weathercan

```
citation("weathercan")
```

```
##
## To cite 'weathercan' in publications, please use:
##
## LaZerte, Stefanie E and Sam Albers (2018). weathercan: Download and format weather data
## from Environment and Climate Change Canada. The Journal of Open Source Software
## 3(22):571. doi:10.21105/joss.00571.
```

weathercan is

- Part of the <u>ropensci project</u>
- Published in Journal of Open Source Software



Both involve rigorous review of code, best-practices and usability



We invite contributions!

Openly developed on GitHub

Contribute what you can (You don't have to be an R programmer!):

- Ideas / Feature-requests
- Bugs
- Bug-fixes
- Development





Get help with weathercan

Tutorials and Reference: http://ropensci.github.io/weathercan

This presentation: https://steffilazerte.github.io/Presentations/











Get help with weathercan

Tutorials and Reference: http://ropensci.github.io/weathercan

This presentation: https://steffilazerte.github.io/Presentations/









Thanks!



Analysis and Data Tools for Science



Slides created with the R package <u>xaringan</u>, using <u>remark.js</u>, <u>knitr</u>, and <u>R Markdown</u> Compiled on 2018-07-31 with weathercan v0.2.7