Projet GLM

Code ▼

RABEARISOA Haingo 30 Juin 2024

I. EXPLORATION DES DONNEES

Hide

library(caret)

Hide

library(car)

1.

a. Chargement du jeu de données

Hide

d <- read.csv("C:/Users/rhhai/Documents/meteo.train.csv", header = TRUE, sep = ",", dec=".")
attach(d)</pre>

b. Visualisation des premières lignes

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head(d)

<		Year > <int></int>	Mo <int></int>	D I		Minute <int></int>	Temperature.daily.mean2.m.above.gnd. <dbl></dbl>
1	2	2010	6	2	0	0	14.99
2	4	2010	6	4	0	0	17.31
3	6	2010	6	6	0	0	21.62
4	8	2010	6	8	0	0	20.22
5	10	2010	6	10	0	0	22.64
6	12	2010	6	12	0	0	18.44

c. Description statistique sommaire

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summary(d)

```
Χ
                      Vear
                                   Month
                                                                    Hour
                                                                              Minute
                                                     Day
Min.
      :
         2.0
               Min.
                       :2010 Min.
                                     : 1.000 Min. : 1.0 Min.
                                                                     :0
                                                                          Min.
                                                                                 :0
                                                1st Qu.: 8.0
1st Qu.: 721.5
                 1st Qu.:2012
                               1st Qu.: 3.000
                                                               1st Qu.:0
                                                                          1st Qu.:0
Median :1451.0
                 Median :2014
                               Median : 6.000
                                                Median :16.0
                                                               Median :0
                                                                          Median:0
Mean
      :1459.8
                 Mean
                       :2014 Mean : 6.436
                                                Mean :15.8
                                                               Mean
                                                                     :0
                                                                          Mean
                                                                                 :0
3rd Qu.:2189.0
                 3rd Qu.:2016 3rd Qu.: 9.000
                                                3rd Qu.:23.0
                                                               3rd Qu.:0
                                                                           3rd Qu.:0
                                                               Max.
                                                                          Max.
Max. :2940.0
                 Max.
                       :2018 Max.
                                     :12.000
                                                Max.
                                                      :31.0
                                                                     :0
Temperature.daily.mean..2.m.above.gnd. Relative.Humidity.daily.mean..2.m.above.gnd.
Min. :-7.63
                                      Min.
                                             :38.33
1st Qu.: 6.71
                                       1st Qu.:64.82
Median :12.08
                                      Median :72.21
      :12.23
Mean
                                      Mean
                                             :71.40
3rd Qu.:17.54
                                      3rd Qu.:78.63
Max.
       :29.45
                                      Max.
                                             :95.54
Mean.Sea.Level.Pressure.daily.mean..MSL. Total.Precipitation.daily.sum..sfc. Snowfall.amoun
t.raw.daily.sum..sfc.
      : 978.9
                                              : 0.000
                                        Min.
                                                                           Min.
                                                                                   :0.00000
1st Qu.:1012.4
                                        1st Qu.: 0.000
                                                                           1st Qu.:0.00000
Median :1017.0
                                        Median : 0.100
                                                                           Median :0.00000
Mean :1017.0
                                        Mean : 2.085
                                                                           Mean
                                                                                  :0.04965
3rd Qu.:1022.0
                                        3rd Qu.: 2.300
                                                                           3rd Qu.:0.00000
                                        Max.
                                                                           Max.
      :1042.4
                                               :31.500
                                                                                  :8.61000
Total.Cloud.Cover.daily.mean..sfc. High.Cloud.Cover.daily.mean..high.cld.lay.
Min. : 0.00
                                  Min.
                                        : 0.000
1st Qu.: 23.80
                                  1st Qu.: 1.657
Median : 51.67
                                  Median : 11.880
Mean
      : 50.76
                                  Mean
                                         : 20.284
3rd Ou.: 78.53
                                  3rd Ou.: 33.260
      :100.00
                                         :100.000
Medium.Cloud.Cover.daily.mean..mid.cld.lay. Low.Cloud.Cover.daily.mean..low.cld.lay.
                                           Min.
1st Qu.: 1.83
                                           1st Qu.: 9.42
Median : 24.98
                                           Median : 36.35
                                           Mean : 39.34
Mean : 31.50
3rd Qu.: 54.21
                                           3rd Ou.: 65.76
       :100.00
                                                  :100.00
                                           Max.
Sunshine.Duration.daily.sum..sfc. Shortwave.Radiation.daily.sum..sfc. Wind.Speed.daily.mea
n..10.m.above.gnd.
Min.
      :
                                  Min.
                                        : 265.2
                                                                     Min. : 1.260
                                                                     1st Qu.: 6.428
1st Qu.: 114.3
                                  1st Qu.:2096.2
Median : 366.8
                                  Median :3675.3
                                                                     Median : 9.195
Mean : 373.1
                                  Mean
                                       :3984.6
                                                                     Mean
                                                                          :10.707
                                                                     3rd Qu.:12.977
3rd Qu.: 587.7
                                  3rd Qu.:5723.6
      :1015.8
                                  Max.
                                        :8363.3
                                                                           :42.210
Wind.Direction.daily.mean..10.m.above.gnd. Wind.Speed.daily.mean..80.m.above.gnd.
Min.
      : 11.19
                                          Min.
                                                : 1.34
1st Qu.:152.40
                                          1st Qu.: 8.68
Median :206.36
                                          Median :12.41
Mean
      :201.82
                                          Mean
                                                :14.28
3rd Qu.:254.19
                                          3rd Qu.:17.61
       :331.67
                                          Max.
                                                 :54.03
Wind.Direction.daily.mean..80.m.above.gnd. Wind.Speed.daily.mean..900.mb. Wind.Direction.dai
ly.mean..900.mb.
Min.
       : 12.18
                                          Min.
                                                 : 2.25
                                                                        Min.
                                                                                : 17.37
1st Ou.:157.42
                                          1st Qu.:13.02
                                                                        1st Qu.:144.02
```

```
Median :213.78
                                           Median :19.57
                                                                         Median :233.47
Mean
      :206.23
                                           Mean :24.57
                                                                         Mean
                                                                               :206.22
                                                                          3rd Qu.:265.93
3rd Ou.:259.06
                                           3rd Ou.:32.10
Max.
       :333.43
                                           Max.
                                                  :97.06
                                                                         Max.
                                                                                 :344.82
Wind.Gust.daily.mean..sfc. Temperature.daily.max..2.m.above.gnd. Temperature.daily.min..2.m.
above.gnd.
                           Min.
Min.
       : 2.25
                                  :-3.84
                                                                 Min.
                                                                        :-12.520
1st Ou.: 9.48
                           1st Ou.:10.58
                                                                 1st Ou.: 3.350
Median :14.06
                           Median :16.54
                                                                 Median : 8.005
Mean :16.69
                           Mean :16.54
                                                                 Mean : 8.062
3rd Ou.:21.15
                           3rd Ou.:22.36
                                                                 3rd Ou.: 13.092
      :79.38
                                                                 Max. : 23.940
                           Max.
                                  :35.77
Relative.Humidity.daily.max..2.m.above.gnd. Relative.Humidity.daily.min..2.m.above.gnd.
Min. : 59.00
                                            Min.
                                                   :19.00
1st Qu.: 83.00
                                            1st Qu.:45.00
Median: 89.00
                                            Median :54.00
      : 87.69
                                            Mean
                                                 :54.04
Mean
3rd Qu.: 94.00
                                            3rd Ou.:63.00
       :100.00
                                                   :92.00
Max.
                                            Max.
Mean.Sea.Level.Pressure.daily.max..MSL. Mean.Sea.Level.Pressure.daily.min..MSL. Total.Cloud.
Cover.daily.max..sfc.
Min. : 981.9
                                        Min. : 977
                                                                               Min.
                                                                                     : 0.
aa
1st Qu.:1015.4
                                        1st Qu.:1009
                                                                               1st Qu.:100.
Median :1019.5
                                        Median :1015
                                                                               Median :100.
aa
Mean
      :1019.9
                                        Mean
                                              :1014
                                                                                     : 88.
                                                                               Mean
23
3rd Qu.:1024.7
                                        3rd Qu.:1019
                                                                               3rd Ou.:100.
00
       :1045.4
                                                                                      :100.
Max.
                                        Max.
                                               :1039
                                                                               Max.
99
Total.Cloud.Cover.daily.min..sfc. High.Cloud.Cover.daily.max..high.cld.lay.
      : 0.000
                                  Min.
                                        : 0.00
Min.
1st Ou.: 0.000
                                  1st Ou.: 15.00
Median : 0.000
                                  Median : 97.00
Mean
      : 8.692
                                  Mean
                                        : 60.17
3rd Qu.: 2.400
                                  3rd Qu.:100.00
       :100.000
                                  Max.
                                         :100.00
High.Cloud.Cover.daily.min..high.cld.lay. Medium.Cloud.Cover.daily.max..mid.cld.lay.
      : 0.0000
                                                : 0.00
Min.
                                          Min.
1st Ou.: 0.0000
                                          1st Ou.: 22.75
Median : 0.0000
                                          Median :100.00
Mean
      : 0.9432
                                          Mean
                                                 : 70.94
3rd Qu.: 0.0000
                                          3rd Qu.:100.00
       :100.0000
                                          Max.
                                                 :100.00
Medium.Cloud.Cover.daily.min..mid.cld.lay. Low.Cloud.Cover.daily.max..low.cld.lay.
      : 0.000
                                           Min.
                                                 : 0
1st Ou.: 0.000
                                           1st Ou.:100
Median : 0.000
                                           Median:100
Mean
      : 2.097
                                           Mean: 80
3rd Qu.: 0.000
                                           3rd Qu.:100
       :100.000
                                           Max.
                                                  :100
Max.
Low.Cloud.Cover.daily.min..low.cld.lay. Wind.Speed.daily.max..10.m.above.gnd.
                                        Min. : 2.52
Min. : 0.000
```

```
1st Qu.: 0.000
                                       1st Qu.:12.32
Median : 0.000
                                       Median :17.36
Mean : 3.879
                                       Mean :19.06
3rd Qu.: 0.000
                                        3rd Qu.:23.44
      :100.000
                                       Max.
                                              :79.99
Max.
Wind.Speed.daily.min..10.m.above.gnd. Wind.Speed.daily.max..80.m.above.gnd. Wind.Speed.dail
y.min..80.m.above.gnd.
Min. : 0.00
                                      Min.
                                           : 3.98
                                                                           Min. : 0.000
1st Qu.: 1.14
                                      1st Qu.:18.27
                                                                           1st Qu.: 1.140
Median: 2.41
                                     Median :23.85
                                                                           Median : 2.600
Mean : 3.57
                                      Mean
                                           :25.35
                                                                           Mean
                                                                                  : 4.727
3rd Qu.: 4.45
                                      3rd Qu.:29.92
                                                                           3rd Qu.: 5.830
Max. :27.73
                                      Max.
                                             :93.84
                                                                           Max.
                                                                                  :37.700
Wind.Speed.daily.max..900.mb. Wind.Speed.daily.min..900.mb. Wind.Gust.daily.max..sfc. Wind.G
ust.daily.min..sfc.
Min.
     : 4.02
                              Min. : 0.00
                                                           Min. : 4.32
                                                                                     Min.
: 0.000
1st Qu.: 24.54
                             1st Qu.: 3.05
                                                           1st Qu.:19.08
                                                                                     1st Q
u.: 2.160
Median : 37.12
                              Median : 6.73
                                                           Median :26.10
                                                                                     Median
: 3.960
                                                           Mean :29.31
      : 41.82
                              Mean :11.09
Mean
                                                                                     Mean
: 6.502
                              3rd Qu.:15.31
3rd Qu.: 54.37
                                                           3rd Qu.:37.08
                                                                                     3rd Q
u.: 8.280
       :136.25
                              Max. :76.13
Max.
                                                           Max. :95.04
                                                                                     Max.
:57.960
pluie.demain
Mode :logical
FALSE:579
TRUE :601
```

Ce projet porte sur l'étude de la météorologie à Bâle (en Suisse) entre 2010 et 2018. La variable à expliquer est l'absence/présence de pluie du lendemain. Pour cela, nombreux sont les variables explicatives de notre donnée mais nous ne prennons que les variables pertinentes pour la modélisation. Ainsi, pour les étapes qui suivent, nous allons étudier les variables explicatives pour préparer la modélisation.

Le sommaire montre la présence de 3 colonnes numériques séparées (Year, Month, Day) qui peuvent être combinées en une seule (en date).

Les colonnes suivantes ne donnent pas beaucoup d'information pour notre modélisation car leurs valeurs sont constantes à 0 :

- Hour
- Minute

d. Etude des variables

- Transformation des 3 colonnes Year, Month, Day en une colonne Day

nous allons transformer la colonne Day en une colonne qui indique la date exacte du jour de prélèvement.

```
# Transformer les 3 colonnes Year, Month, Day en date
d1 <- d #afin de garder les données d originales
d1$Day <- as.Date(with(d, paste(d$Year, d$Month, d$Day, sep = "-")), format = "%Y-%m-%d")</pre>
```

Suppression des variables explicatives non pertinentes

Nous pouvons maintenant supprimer les colonnes Year et Month car la date exacte du jour de prélèvement est combinée dans la colonne Day.

```
d2 <- d1[, -2] # enlever la colonne Year
d3 <- d2[,-2] # enlever la colonne Month
```

Le sommaire montre que la colonne Hour et Minute ne sont remplis que par des 0. Donc, ces colonnes n'apportent pas d'informations. Nous allons les supprimer de nos données.

```
d4 <- d3[,-3] # enlever la colonne Hour
d5 <- d4[,-3] # enlever la colonne Minute
```

Les variables sont-elles catégorielles ou quantitatives?

str(d5)

Hide

```
'data.frame':
                1180 obs. of 43 variables:
$ X
                                               : int 2 4 6 8 10 12 14 16 18 20 ...
$ Day
                                               : Date, format: "2010-06-02" "2010-06-04" "201
0-06-06" "2010-06-08" ...
$ Temperature.daily.mean..2.m.above.gnd.
                                               : num 15 17.3 21.6 20.2 22.6 ...
$ Relative.Humidity.daily.mean..2.m.above.gnd.: num
                                                     76.5 77.6 69.5 75.1 73.5 ...
$ Mean.Sea.Level.Pressure.daily.mean..MSL.
                                               : num
                                                     1015 1017 1015 1008 1004 ...
$ Total.Precipitation.daily.sum..sfc.
                                                     1 0 3.7 0.2 0 2.2 1.8 1.8 17.5 1.2 ...
                                               : num
$ Snowfall.amount.raw.daily.sum..sfc.
                                                     0000000000...
                                               : num
$ Total.Cloud.Cover.daily.mean..sfc.
                                               : num
                                                     79.8 4.7 42.1 67.5 56.3 ...
$ High.Cloud.Cover.daily.mean..high.cld.lay.
                                                     3 0.67 21.21 54.71 50.25 ...
                                               : num
$ Medium.Cloud.Cover.daily.mean..mid.cld.lay. : num
                                                     31.6 0 25.9 65.8 55.3 ...
$ Low.Cloud.Cover.daily.mean..low.cld.lay.
                                                     79.2 4.5 35.3 18.9 34.2 ...
$ Sunshine.Duration.daily.sum..sfc.
                                                     287.2 821.4 441.3 41.9 473.2 ...
$ Shortwave.Radiation.daily.sum..sfc.
                                                     6710 7974 4834 5390 7216 ...
                                               : num
$ Wind.Speed.daily.mean..10.m.above.gnd.
                                                     11.64 6.34 8.4 5.4 9.16 ...
                                               : num
$ Wind.Direction.daily.mean..10.m.above.gnd.
                                                     275 230 215 205 179 ...
$ Wind.Speed.daily.mean..80.m.above.gnd.
                                                     14.99 8.92 10.38 6.53 11.91 ...
                                               : num
$ Wind.Direction.daily.mean..80.m.above.gnd.
                                                     268 199 208 206 186 ...
                                               : num
$ Wind.Speed.daily.mean..900.mb.
                                                     20.6 27.9 18.9 10.4 21.9 ...
                                               : num
$ Wind.Direction.daily.mean..900.mb.
                                               : num 180.4 93.7 250.1 238.6 153 ...
$ Wind.Gust.daily.mean..sfc.
                                               : num 14.88 9.48 13.5 5.31 12.21 ...
$ Temperature.daily.max..2.m.above.gnd.
                                               : num 18.5 25 26.2 24.2 30.7 ...
$ Temperature.daily.min..2.m.above.gnd.
                                               : num 11.1 10.4 17.7 14.7 16.9 ...
$ Relative.Humidity.daily.max..2.m.above.gnd. : int 94 92 91 89 97 92 96 96 97 95 ...
$ Relative.Humidity.daily.min..2.m.above.gnd. : int 59 54 57 62 39 65 69 64 74 61 ...
$ Mean.Sea.Level.Pressure.daily.max..MSL.
                                               : num 1017 1019 1016 1010 1006 ...
$ Mean.Sea.Level.Pressure.daily.min..MSL.
                                               : num
                                                     1014 1016 1013 1006 1001 ...
$ Total.Cloud.Cover.daily.max..sfc.
                                                     100 28 100 100 100 100 100 100 100 100
                                               : num
$ Total.Cloud.Cover.daily.min..sfc.
                                                     0 0 0 0 0 0 0 100 0 0 ...
                                               : num
$ High.Cloud.Cover.daily.max..high.cld.lay.
                                               : int
                                                     16 11 100 100 100 28 100 100 100 24 ...
$ High.Cloud.Cover.daily.min..high.cld.lay.
                                                      0000000000...
                                               : int
$ Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                               : int
                                                     100 0 100 100 100 100 100 100 100 41
$ Medium.Cloud.Cover.daily.min..mid.cld.lay.
                                               : int
                                                     0000000000...
$ Low.Cloud.Cover.daily.max..low.cld.lay.
                                               : int
                                                     100 28 100 100 100 100 100 100 100 100
$ Low.Cloud.Cover.daily.min..low.cld.lay.
                                               : int
                                                     0 0 0 0 0 0 0 29 0 0 ...
$ Wind.Speed.daily.max..10.m.above.gnd.
                                                     22 15.5 22.7 10.7 20.5 ...
                                                     5.62 1.08 2.41 0 2.52 2.28 1.3 4.32 7.2
$ Wind.Speed.daily.min..10.m.above.gnd.
8.05 ...
$ Wind.Speed.daily.max..80.m.above.gnd.
                                                     23.8 18.7 32 10.2 23.4 ...
                                               : num
$ Wind.Speed.daily.min..80.m.above.gnd.
                                                     8.65 0 0.51 1.44 2.97 ...
                                               : num
$ Wind.Speed.daily.max..900.mb.
                                                     32.1 48.1 44 22.2 40.8 ...
                                               : num
$ Wind.Speed.daily.min..900.mb.
                                               : num
                                                     12.25 6.62 5.48 4.69 4.68 ...
$ Wind.Gust.daily.max..sfc.
                                                     25.2 20.2 41.8 11.2 24.1 ...
                                               : num
$ Wind.Gust.daily.min..sfc.
                                                     6.48 2.16 1.08 0.36 1.44 ...
                                               : num
$ pluie.demain
                                               : logi FALSE FALSE TRUE TRUE TRUE TRUE ...
```

Cela indique que toutes les variables explicatives sont numériques et la variable à expliquer est booléenne.

- Effectif de chaque variable booléenne

```
fable(d5$pluie.demain)

FALSE TRUE
579 601
```

Cela indique qu'il y avait plus de jour de pluie que de temps sec dans cette région etre 2010 et 2018.

2. Etude de la corrélation des variables explicatives

```
d6 <- d5[,-2] #enlever la date car X représente déjà la date

cor_matrice <- cor(d6) #matrice de corrélation
options(max.print = 10000)
symnum(cor_matrice, abbr.colnames = FALSE)</pre>
```

```
X Temperature.daily.mean..2.m.above.gnd.
Χ
Temperature.daily.mean..2.m.above.gnd.
                                                1
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
                                                R
                                                В
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Relative. Humidity.daily.mean..2.m. above.gnd.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative.Humidity.daily.mean..2.m.above.gnd. 1
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
```

```
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Mean.Sea.Level.Pressure.daily.mean..MSL.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
                                              1
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
                                              В
```

```
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Total.Precipitation.daily.sum..sfc.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
                                             1
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
```

R

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Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Snowfall.amount.raw.daily.sum..sfc. Total.Cloud.
Cover.daily.mean..sfc.
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m.above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              High.Cloud.Cover.daily.mean..high.cld.lay.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative.Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
```

```
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
```

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Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative. Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Low.Cloud.Cover.daily.mean..low.cld.lay.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
                                              1
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
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Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Sunshine.Duration.daily.sum..sfc. Shortwave.Radi
ation.daily.sum..sfc.
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
                                              1
Shortwave.Radiation.daily.sum..sfc.
                                                                                 1
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Speed.daily.mean..10.m.above.gnd.
Χ
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```
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
                                              1
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Direction.daily.mean..10.m.above.gnd.
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
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Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative. Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Speed.daily.mean..80.m.above.gnd.
Х
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
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Wind.Speed.daily.mean..80.m.above.gnd.

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High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Direction.daily.mean..80.m.above.gnd.
Temperature.daily.mean..2.m.above.gnd.
Relative.Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
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Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Speed.daily.mean..900.mb. Wind.Direction.da
ily.mean..900.mb.
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
                                              1
Wind.Direction.daily.mean..900.mb.
                                                                             1
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Gust.daily.mean..sfc. Temperature.daily.ma
x..2.m.above.gnd.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
```

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Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
                                              1
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Temperature.daily.min..2.m.above.gnd.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative.Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
                                              1
```

```
Relative. Humidity.daily.max..2.m. above.gnd.
Relative. Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Relative.Humidity.daily.max..2.m.above.gnd.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
```

```
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Relative.Humidity.daily.min..2.m.above.gnd.
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd. 1
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Mean.Sea.Level.Pressure.daily.max..MSL.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
```

```
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Mean.Sea.Level.Pressure.daily.min..MSL.
Temperature.daily.mean..2.m.above.gnd.
Relative.Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
```

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Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
                                              1
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Total.Cloud.Cover.daily.max..sfc. Total.Cloud.Co
ver.daily.min..sfc.
Х
Temperature.daily.mean..2.m.above.gnd.
Relative.Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
                                              1
Total.Cloud.Cover.daily.min..sfc.
                                                                                1
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
```

```
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              High.Cloud.Cover.daily.max..high.cld.lay.
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
```

```
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Medium.Cloud.Cover.daily.max..mid.cld.lay.
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
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Sunshine.Duration.daily.sum..sfc. Shortwave.Radiation.daily.sum..sfc.

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Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m.above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Medium.Cloud.Cover.daily.min..mid.cld.lay.
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
```

```
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Low.Cloud.Cover.daily.max..low.cld.lay.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
                                              1
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
```

```
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Low.Cloud.Cover.daily.min..low.cld.lay.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
                                              1
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Speed.daily.max..10.m.above.gnd.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
```

```
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
                                              1
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Speed.daily.min..10.m.above.gnd.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative.Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
```

```
Relative. Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
                                              1
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Speed.daily.max..80.m.above.gnd.
Χ
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative. Humidity.daily.min..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
```

Relative. Humidity.daily.max..2.m. above.gnd.

```
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
                                              1
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Speed.daily.min..80.m.above.gnd. Wind.Spee
d.daily.max..900.mb.
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative. Humidity.daily.max..2.m. above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
                                                                                     1
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Speed.daily.min..900.mb. Wind.Gust.daily.ma
x..sfc.
Χ
Temperature.daily.mean..2.m.above.gnd.
```

```
Relative. Humidity.daily.mean..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
                                                                            1
Wind.Gust.daily.min..sfc.
pluie.demain
                                              Wind.Gust.daily.min..sfc. pluie.demain
Temperature.daily.mean..2.m.above.gnd.
Relative. Humidity.daily.mean..2.m. above.gnd.
Mean.Sea.Level.Pressure.daily.mean..MSL.
Total.Precipitation.daily.sum..sfc.
Snowfall.amount.raw.daily.sum..sfc.
Total.Cloud.Cover.daily.mean..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
Sunshine.Duration.daily.sum..sfc.
Shortwave.Radiation.daily.sum..sfc.
Wind.Speed.daily.mean..10.m.above.gnd.
Wind.Direction.daily.mean..10.m.above.gnd.
Wind.Speed.daily.mean..80.m.above.gnd.
```

```
Wind.Direction.daily.mean..80.m.above.gnd.
Wind.Speed.daily.mean..900.mb.
Wind.Direction.daily.mean..900.mb.
Wind.Gust.daily.mean..sfc.
Temperature.daily.max..2.m.above.gnd.
Temperature.daily.min..2.m.above.gnd.
Relative.Humidity.daily.max..2.m.above.gnd.
Relative.Humidity.daily.min..2.m.above.gnd.
Mean.Sea.Level.Pressure.daily.max..MSL.
Mean.Sea.Level.Pressure.daily.min..MSL.
Total.Cloud.Cover.daily.max..sfc.
Total.Cloud.Cover.daily.min..sfc.
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
Medium.Cloud.Cover.daily.max..mid.cld.lay.
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
Low.Cloud.Cover.daily.min..low.cld.lay.
Wind.Speed.daily.max..10.m.above.gnd.
Wind.Speed.daily.min..10.m.above.gnd.
Wind.Speed.daily.max..80.m.above.gnd.
Wind.Speed.daily.min..80.m.above.gnd.
Wind.Speed.daily.max..900.mb.
Wind.Speed.daily.min..900.mb.
Wind.Gust.daily.max..sfc.
Wind.Gust.daily.min..sfc.
                                              1
pluie.demain
                                                                        1
attr(,"legend")
[1] 0 ' ' 0.3 '.' 0.6 ',' 0.8 '+' 0.9 '*' 0.95 'B' 1
```

Ce résultat indique les intervalles des coefficients de corrélation entre les variables et s'explique comme suit.

Pour les variables ayant les coefficients de corrélation :

- compris entre 0 et 0.3, R n'affiche pas d'indication " "
- compris entre 0.3 et 0.6, R indique "."
- compris entre 0.6 et 0.8, R indique ","
- compris entre 0.8 et 0.9, R indique "+"
- compris entre 0.9 et 0.95, R indique "*"
- compris entre 0.95 et 1, R indique "B"
- et R indique 1 pour le coefficient de corrélation égal 1.

Rappelons que le coefficient de corrélation calculé ici est obtenu à partir de la formule suivante :

$$r = \frac{\mathrm{Cov}(X,Y)}{\sigma_X \sigma_Y}$$

C'est le rapport de la covariance des deux variables avec le produit de leur écart type.

Si r est compris entre -0.5 et 0.5, cela signifie que la corrélation entre les 2 variables est faible sinon, il y a une corrélation élevée.

Identifions donc les variables ayant de forte corrélation.

On remarque une forte correlation entre les variables mini, max et moyenne. Ce qui est normal. Les variables à 80m et 10m sont aussi très corrélées entre eux.

Nous allons donc identifer les corrélations très élevées et supprimer une des 2 variables corrélées.

```
#Identification des corrélations très élevées, prenons à partir de 0.80

cor_elevee <- findCorrelation(cor_matrice, cutoff = 0.80)

# Afficher les indices des variables à supprimer

print(cor_elevee)
```

```
[1] 7 13 19 11 15 34 40 38 17 41 35 20 25 4 23 21 14
```

```
# Supprimer les variables fortement corrélées
d7 <- d6[, -cor_elevee]
```

Les indices cités ci-dessus sont celles des variables qui ont été supprimées en raison d'une forte corrélation avec les autres variables.

Il nous reste donc les variables dont les coefficients de corrélation sont inférieurs à 0.80.

II. MODELISATION

1. modèle initial

a. Création du modèle

La variable à expliquer étant une variable booléenne, une regression logistique suivant la loi binomiale sera adaptée la modélisation

```
reg_toutes <- glm(pluie.demain ~ ., data=d7, family= binomial) # modèle avec toutes les var iables summary(reg_toutes)
```

Hide

```
Call:
glm(formula = pluie.demain ~ ., family = binomial, data = d7)
Coefficients:
                                              Estimate Std. Error z value Pr(>|z|)
                                             5.301e+01 1.157e+01 4.580 4.65e-06 ***
(Intercept)
                                             1.684e-04 8.466e-05 1.989 0.046647 *
Х
Temperature.daily.mean..2.m.above.gnd.
                                             2.155e-02 1.721e-02 1.252 0.210579
Relative.Humidity.daily.mean..2.m.above.gnd. -8.187e-03 1.655e-02 -0.495 0.620734
Total.Precipitation.daily.sum..sfc.
                                             1.950e-02 2.510e-02 0.777 0.437324
                                            -2.390e-01 1.870e-01 -1.278 0.201141
Snowfall.amount.raw.daily.sum..sfc.
High.Cloud.Cover.daily.mean..high.cld.lay.
                                            -1.242e-03 6.412e-03 -0.194 0.846424
                                             6.954e-03 5.302e-03 1.312 0.189661
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
Low.Cloud.Cover.daily.mean..low.cld.lay.
                                             3.513e-03 4.377e-03 0.803 0.422141
                                             1.452e-04 7.101e-05 2.045 0.040900 *
Shortwave.Radiation.daily.sum..sfc.
Wind.Direction.daily.mean..80.m.above.gnd.
                                            -3.715e-03 1.584e-03 -2.346 0.018992 *
                                             4.961e-03 1.314e-03 3.777 0.000159 ***
Wind.Direction.daily.mean..900.mb.
Relative.Humidity.daily.max..2.m.above.gnd.
                                             1.803e-02 1.619e-02
                                                                  1.114 0.265409
Mean.Sea.Level.Pressure.daily.max..MSL.
                                            -5.678e-02 1.127e-02 -5.037 4.72e-07 ***
Total.Cloud.Cover.daily.max..sfc.
                                             3.276e-03 4.580e-03
                                                                   0.715 0.474503
                                             7.335e-03 6.089e-03 1.205 0.228323
Total.Cloud.Cover.daily.min..sfc.
                                             3.646e-03 2.789e-03 1.308 0.191038
High.Cloud.Cover.daily.max..high.cld.lay.
High.Cloud.Cover.daily.min..high.cld.lay.
                                             8.353e-03 1.972e-02 0.424 0.671858
                                             7.529e-03 3.044e-03 2.473 0.013388 *
Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                            -4.086e-03 8.778e-03 -0.466 0.641558
Medium.Cloud.Cover.daily.min..mid.cld.lay.
Low.Cloud.Cover.daily.max..low.cld.lay.
                                             2.979e-03 3.222e-03 0.924 0.355316
Low.Cloud.Cover.daily.min..low.cld.lay.
                                             9.031e-04 6.835e-03 0.132 0.894886
Wind.Speed.daily.max..80.m.above.gnd.
                                             3.450e-02 9.667e-03 3.568 0.000359 ***
Wind.Speed.daily.min..80.m.above.gnd.
                                            -1.501e-02 1.875e-02 -0.801 0.423414
Wind.Speed.daily.min..900.mb.
                                             4.885e-03 9.088e-03
                                                                   0.538 0.590903
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
(Dispersion parameter for binomial family taken to be 1)
   Null deviance: 1635.4 on 1179
                                   degrees of freedom
Residual deviance: 1286.8 on 1155 degrees of freedom
AIC: 1336.8
Number of Fisher Scoring iterations: 4
```

Une regresssion logistique avec toutes les variables de la donnée finale a été réalisée et on remarque qu'il y a des variables encore plus pertinentes que d'autres (celles ayant les p-values très faibles) et qu'on peut encore affiner le modèle obtenu et choisir le modèle le plus adapté aux données.

b. Examen des résidus

Pour examiner les résidus, nous allons calculer le ratio entre la déviance résiduelle et le nombre de degré de liberté Ratio = déviance résiduelle/nombre de degré de liberté

[1] 1.114113

Ce ratio est proche de 1 cela confirme que le modèle logistique correspond à notre donnée.

c. Vérification de la multicolinéarité

Hide

```
vif(reg_toutes)
```

```
Х
                                                    Temperature.daily.mean..2.m.above.gnd.
                                     1.110345
                                                                                   3.018658
Relative.Humidity.daily.mean..2.m.above.gnd.
                                                       Total.Precipitation.daily.sum..sfc.
                                     5.459335
                                                                                   1.807651
         Snowfall.amount.raw.daily.sum..sfc.
                                                High.Cloud.Cover.daily.mean..high.cld.lay.
                                     1.245516
                                                                                   3.922853
 Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                                  Low.Cloud.Cover.daily.mean..low.cld.lay.
                                     4.766094
                                                                                   3.870268
         Shortwave.Radiation.daily.sum..sfc.
                                                Wind.Direction.daily.mean..80.m.above.gnd.
                                     5.197504
                                                                                   2.125081
          Wind.Direction.daily.mean..900.mb.
                                               Relative.Humidity.daily.max..2.m.above.gnd.
                                     1.980895
                                                                                   3.270166
     Mean.Sea.Level.Pressure.daily.max..MSL.
                                                         Total.Cloud.Cover.daily.max..sfc.
                                     1.266057
                                                                                   2.829595
           Total.Cloud.Cover.daily.min..sfc.
                                                 High.Cloud.Cover.daily.max..high.cld.lay.
                                     3.688509
                                                                                   3.018784
  High.Cloud.Cover.daily.min..high.cld.lay.
                                                Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                     1.419729
                                                                                   3.171209
 Medium.Cloud.Cover.daily.min..mid.cld.lay.
                                                   Low.Cloud.Cover.daily.max..low.cld.lay.
                                     1.674118
                                                                                   3.018682
     Low.Cloud.Cover.daily.min..low.cld.lay.
                                                     Wind.Speed.daily.max..80.m.above.gnd.
                                     2.621480
                                                                                   2.057141
       Wind.Speed.daily.min..80.m.above.gnd.
                                                             Wind.Speed.daily.min..900.mb.
                                     2.234722
                                                                                   2.254336
```

Avec une vif supérieure à 5, la variable Relative. Humidity. daily. mean.. 2.m. above.gnd. sera enlevée de la regression initiale.

```
reg_1 <- glm(pluie.demain ~ .-Relative.Humidity.daily.mean..2.m.above.gnd., data=d7, family=
binomial)
summary(reg_1)
```

```
Call:
glm(formula = pluie.demain ~ . - Relative.Humidity.daily.mean..2.m.above.gnd.,
    family = binomial, data = d7)
Coefficients:
                                             Estimate Std. Error z value Pr(>|z|)
(Intercept)
                                            5.301e+01 1.157e+01
                                                                  4.580 4.64e-06 ***
                                            1.752e-04 8.355e-05
                                                                   2.096 0.036063 *
Temperature.daily.mean..2.m.above.gnd.
                                            2.063e-02 1.710e-02
                                                                  1.207 0.227476
Total.Precipitation.daily.sum..sfc.
                                            1.855e-02 2.502e-02
                                                                  0.741 0.458433
Snowfall.amount.raw.daily.sum..sfc.
                                           -2.421e-01 1.868e-01 -1.296 0.195005
High.Cloud.Cover.daily.mean..high.cld.lay. -1.106e-03 6.406e-03 -0.173 0.862930
Medium.Cloud.Cover.daily.mean..mid.cld.lay. 6.977e-03 5.300e-03
                                                                   1.316 0.188063
Low.Cloud.Cover.daily.mean..low.cld.lay.
                                            3.313e-03 4.358e-03
                                                                  0.760 0.447106
Shortwave.Radiation.daily.sum..sfc.
                                            1.626e-04 6.172e-05
                                                                   2.634 0.008431 **
Wind.Direction.daily.mean..80.m.above.gnd. -3.855e-03 1.558e-03 -2.474 0.013364 *
                                            5.031e-03 1.306e-03
Wind.Direction.daily.mean..900.mb.
                                                                   3.853 0.000117 ***
Relative. Humidity.daily.max..2.m. above.gnd.
                                            1.201e-02 1.067e-02
                                                                   1.126 0.260294
Mean.Sea.Level.Pressure.daily.max..MSL.
                                           -5.688e-02 1.127e-02 -5.048 4.47e-07 ***
Total.Cloud.Cover.daily.max..sfc.
                                            3.249e-03 4.581e-03
                                                                   0.709 0.478223
                                            7.359e-03 6.087e-03
Total.Cloud.Cover.daily.min..sfc.
                                                                   1.209 0.226646
                                            3.643e-03 2.788e-03
                                                                   1.307 0.191304
High.Cloud.Cover.daily.max..high.cld.lay.
                                            8.615e-03 1.972e-02
High.Cloud.Cover.daily.min..high.cld.lay.
                                                                  0.437 0.662247
Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                            7.528e-03 3.043e-03
                                                                   2.473 0.013382 *
Medium.Cloud.Cover.daily.min..mid.cld.lay. -4.012e-03 8.778e-03 -0.457 0.647643
Low.Cloud.Cover.daily.max..low.cld.lay.
                                            2.996e-03 3.224e-03
                                                                  0.929 0.352766
                                            8.233e-04 6.832e-03
Low.Cloud.Cover.daily.min..low.cld.lay.
                                                                  0.121 0.904087
Wind.Speed.daily.max..80.m.above.gnd.
                                            3.460e-02 9.663e-03
                                                                  3.581 0.000343 ***
Wind.Speed.daily.min..80.m.above.gnd.
                                           -1.606e-02 1.865e-02 -0.861 0.389033
Wind.Speed.daily.min..900.mb.
                                            5.539e-03 8.991e-03
                                                                   0.616 0.537860
Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
(Dispersion parameter for binomial family taken to be 1)
    Null deviance: 1635.4 on 1179 degrees of freedom
Residual deviance: 1287.1 on 1156 degrees of freedom
AIC: 1335.1
Number of Fisher Scoring iterations: 4
```

d. Revérification

Hide

```
1287.1/1156 #Ratio = déviance résiduelle/nombre de degré de liberté
```

```
[1] 1.113408
```

```
vif(reg_1) #Revérification de la multicolinéarité
```

```
Х
                                                  Temperature.daily.mean..2.m.above.gnd.
                                    1.081904
                                                                                 2.981165
        Total.Precipitation.daily.sum..sfc.
                                                     Snowfall.amount.raw.daily.sum..sfc.
                                    1.796328
                                                                                 1.244699
High.Cloud.Cover.daily.mean..high.cld.lay. Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                    3.917870
                                                                                 4.764323
  Low.Cloud.Cover.daily.mean..low.cld.lay.
                                                     Shortwave.Radiation.daily.sum..sfc.
                                    3.836530
                                                                                 3.925356
Wind.Direction.daily.mean..80.m.above.gnd.
                                                      Wind.Direction.daily.mean..900.mb.
                                    2.056716
                                                                                 1.957306
Relative. Humidity.daily.max..2.m. above.gnd.
                                                 Mean.Sea.Level.Pressure.daily.max..MSL.
                                    1.420012
                                                                                 1.265818
          Total.Cloud.Cover.daily.max..sfc.
                                                       Total.Cloud.Cover.daily.min..sfc.
                                    2.830232
                                                                                 3.685976
 High.Cloud.Cover.daily.max..high.cld.lay.
                                               High.Cloud.Cover.daily.min..high.cld.lay.
                                    3.017353
                                                                                 1.422939
Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                              Medium.Cloud.Cover.daily.min..mid.cld.lay.
                                    3.170637
                                                                                 1.676194
   Low.Cloud.Cover.daily.max..low.cld.lay.
                                                 Low.Cloud.Cover.daily.min..low.cld.lay.
                                    3.020342
                                                                                 2.621493
     Wind.Speed.daily.max..80.m.above.gnd.
                                                   Wind.Speed.daily.min..80.m.above.gnd.
                                                                                 2.205606
                                    2.054759
              Wind.Speed.daily.min..900.mb.
                                    2.203574
```

Le problème de multicolinéarité est résolu (vif < 5) en enlevant la variable Relative.Humidity.daily.mean..2.m.above.gnd. On peut donc garder ce modèle comme modèle inital.

d. Rapports de cote

Le rapport de cote entre les deux individus suivants :

x et \tilde{x}

se calcule comme suit :

$$\mathrm{OR}(x, ilde{x}) = rac{\mathrm{odds}(x)}{\mathrm{odds}(ilde{x})} = rac{rac{p(x)}{1-p(x)}}{rac{p(ilde{x})}{1-p(ilde{x})}}$$

Ce qui revient à calculer l'exponentiel des coefficients.

Hide

exp(coef(reg_1))

```
(Intercept)
                                1.050525e+23
                                                                             1.000175e+00
     Temperature.daily.mean..2.m.above.gnd.
                                                     Total.Precipitation.daily.sum..sfc.
                                1.020849e+00
                                                                             1.018720e+00
        Snowfall.amount.raw.daily.sum..sfc.
                                              High.Cloud.Cover.daily.mean..high.cld.lay.
                                7.849633e-01
                                                                             9.988946e-01
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                                Low.Cloud.Cover.daily.mean..low.cld.lay.
                                1.007001e+00
                                                                             1.003319e+00
        Shortwave.Radiation.daily.sum..sfc.
                                              Wind.Direction.daily.mean..80.m.above.gnd.
                                1.000163e+00
                                                                             9.961524e-01
         Wind.Direction.daily.mean..900.mb. Relative.Humidity.daily.max..2.m.above.gnd.
                                1.005044e+00
                                                                             1.012078e+00
    Mean.Sea.Level.Pressure.daily.max..MSL.
                                                       Total.Cloud.Cover.daily.max..sfc.
                                9.447031e-01
                                                                             1.003254e+00
          Total.Cloud.Cover.daily.min..sfc.
                                               High.Cloud.Cover.daily.max..high.cld.lay.
                                1.007386e+00
                                                                             1.003649e+00
  High.Cloud.Cover.daily.min..high.cld.lay.
                                              Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                1.008652e+00
                                                                             1.007556e+00
 Medium.Cloud.Cover.daily.min..mid.cld.lay.
                                                 Low.Cloud.Cover.daily.max..low.cld.lay.
                                9.959959e-01
                                                                             1.003000e+00
    Low.Cloud.Cover.daily.min..low.cld.lay.
                                                   Wind.Speed.daily.max..80.m.above.gnd.
                                1.000824e+00
                                                                             1.035208e+00
      Wind.Speed.daily.min..80.m.above.gnd.
                                                           Wind.Speed.daily.min..900.mb.
                                9.840641e-01
                                                                             1.005554e+00
```

Un rapport de cotes > 1 indique que la probabilité augmente, et < 1 indique qu'elle diminue. S'il est égal à 1, la variable ne change pas la probabilité.

e. Déviance

La déviance d'un modèle s'écrit M_beta s'écrit :

$$D_{M_eta} = 2 \left(\mathcal{L}_{\mathrm{sat}} \, - \mathcal{L}_n(\hat{eta})
ight)$$

La déviance est égale à 2 fois une différence de log-vraisemblance. Elle constitue un écart en terme de log-vraisemblance entre le modèle saturé d'ajustement maximum et le modèle considéré.

Hide

reg 1\$deviance

[1] 1287.074

2. Deuxième modèle

a. Création du modèle

Nous avons vu que le modèle initial peut être amélioré. Nous allons proposer un deuxième modèle. Nous allons donc choisir les variables pertinentes pour le modèle.

```
reg_2 <- glm(pluie.demain ~ X + Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.me
an..80.m.above.gnd. + Wind.Direction.daily.mean..900.mb. + Mean.Sea.Level.Pressure.daily.ma
x..MSL. + Medium.Cloud.Cover.daily.max..mid.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd.
, data=d7, family= binomial)
summary(reg_2)</pre>
```

```
Call:
glm(formula = pluie.demain ~ X + Shortwave.Radiation.daily.sum..sfc. +
   Wind.Direction.daily.mean..80.m.above.gnd. + Wind.Direction.daily.mean..900.mb. +
   Mean.Sea.Level.Pressure.daily.max..MSL. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
   Wind.Speed.daily.max..80.m.above.gnd., family = binomial,
    data = d7
Coefficients:
                                            Estimate Std. Error z value Pr(>|z|)
(Intercept)
                                           7.268e+01 1.058e+01
                                                                 6.872 6.32e-12 ***
                                           1.287e-04 7.902e-05 1.628 0.10348
                                           9.095e-05 3.506e-05 2.594 0.00948 **
Shortwave.Radiation.daily.sum..sfc.
Wind.Direction.daily.mean..80.m.above.gnd. -1.614e-03 1.348e-03 -1.197 0.23128
                                           4.724e-03 1.190e-03 3.971 7.17e-05 ***
Wind.Direction.daily.mean..900.mb.
Mean.Sea.Level.Pressure.daily.max..MSL.
                                          -7.417e-02 1.031e-02 -7.197 6.15e-13 ***
Medium.Cloud.Cover.daily.max..mid.cld.lay. 1.469e-02 1.901e-03 7.728 1.09e-14 ***
                                           2.910e-02 7.271e-03 4.003 6.25e-05 ***
Wind.Speed.daily.max..80.m.above.gnd.
Signif. codes: 0 (***, 0.001 (**, 0.01 (*, 0.05 (., 0.1 (), 1
(Dispersion parameter for binomial family taken to be 1)
   Null deviance: 1635.4 on 1179 degrees of freedom
Residual deviance: 1326.0 on 1172 degrees of freedom
AIC: 1342
Number of Fisher Scoring iterations: 4
```

b. Examen des résidus

Ratio = déviance résiduelle/nombre de degré de liberté

Hide

1326/1172

[1] 1.131399

c. Vérification de la multicolinéarité

Hide

vif(reg_2)

```
X Shortwave.Radiation.daily.sum..sfc.
1.011631 1.291633
Wind.Direction.daily.mean..80.m.above.gnd. Wind.Direction.daily.mean..900.mb.
1.587747 1.658910
Mean.Sea.Level.Pressure.daily.max..MSL. Medium.Cloud.Cover.daily.max..mid.cld.lay.
1.087519 1.248793
Wind.Speed.daily.max..80.m.above.gnd.
1.185568
```

Les coefficients indiqués étant tous proche de 1 donc il n'y a pas de multicolinéarité.

d. Rapports de cote

```
Hide
exp(coef(reg_2))
                                (Intercept)
                               3.654826e+31
                                                                           1.000129e+00
       Shortwave.Radiation.daily.sum..sfc. Wind.Direction.daily.mean..80.m.above.gnd.
                               1.000091e+00
                                                                           9.983877e-01
        Wind.Direction.daily.mean..900.mb.
                                               Mean.Sea.Level.Pressure.daily.max..MSL.
                               1.004735e+00
                                                                           9.285133e-01
Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                                 Wind.Speed.daily.max..80.m.above.gnd.
                               1.014796e+00
                                                                           1.029532e+00
```

e. Déviance

| Hide | reg_2\$deviance | [1] 1326.047

3. Comparaison du modèle réduit avec le modèle complet

```
anova(reg_2, reg_1, test = "Chisq")
```

```
Analysis of Deviance Table
Model 1: pluie.demain ~ X + Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.mean..
80.m.above.gnd. +
   Wind.Direction.daily.mean..900.mb. + Mean.Sea.Level.Pressure.daily.max..MSL. +
   Medium.Cloud.Cover.daily.max..mid.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd.
Model 2: pluie.demain ~ (X + Temperature.daily.mean..2.m.above.gnd. +
    Relative.Humidity.daily.mean..2.m.above.gnd. + Total.Precipitation.daily.sum..sfc. +
    Snowfall.amount.raw.daily.sum..sfc. + High.Cloud.Cover.daily.mean..high.cld.lay. +
   Medium.Cloud.Cover.daily.mean..mid.cld.lay. + Low.Cloud.Cover.daily.mean..low.cld.lay. +
    Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.mean..80.m.above.gnd. +
   Wind.Direction.daily.mean..900.mb. + Relative.Humidity.daily.max..2.m.above.gnd. +
   Mean.Sea.Level.Pressure.daily.max..MSL. + Total.Cloud.Cover.daily.max..sfc. +
    Total.Cloud.Cover.daily.min..sfc. + High.Cloud.Cover.daily.max..high.cld.lay. +
   High.Cloud.Cover.daily.min..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
   Medium.Cloud.Cover.daily.min..mid.cld.lay. + Low.Cloud.Cover.daily.max..low.cld.lay. +
    Low.Cloud.Cover.daily.min..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd. +
   Wind.Speed.daily.min..80.m.above.gnd. + Wind.Speed.daily.min..900.mb.) -
    Relative. Humidity.daily.mean..2.m.above.gnd.
  Resid. Df Resid. Dev Df Deviance Pr(>Chi)
1
       1172
                1326.0
               1287.1 16 38.973 0.001097 **
2
       1156
Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
```

La déviance consitue un écart en terme de log-vraisemblance entre le modèle réduit et complet.

$$-2\left(\mathcal{L}_{n}\left(\hat{\mathcal{M}}_{1}
ight)-\mathcal{L}_{n}\left(\hat{\mathcal{M}}_{2}
ight)
ight)\overset{\mathcal{L}}{
ightarrow}\chi_{p_{2}-p_{1}}^{2}$$

Le test indique que la p-value est inférieur à 0.05, ce qui indique que les variables du modèle complet apportent une amélioration à l'ajustement du modèle. Ainsi, on garde le modèle initiale.

Nous avons fait une sélection de modèle manuelle mais que propose la sélection automatique de modèle ?

4. Sélection automatique de modèle

a. Création du modèle

Nous allons utiliser la méthode descendante pour la sélection automatique du modèle.

```
model_desc <- step(reg_1, direction = "backward")</pre>
```

```
Relative.Humidity.daily.mean..2.m.above.gnd. + Total.Precipitation.daily.sum..sfc. +
    Snowfall.amount.raw.daily.sum..sfc. + High.Cloud.Cover.daily.mean..high.cld.lay. +
   Medium.Cloud.Cover.daily.mean..mid.cld.lay. + Low.Cloud.Cover.daily.mean..low.cld.lay. +
    Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.mean..80.m.above.gnd. +
   Wind.Direction.daily.mean..900.mb. + Relative.Humidity.daily.max..2.m.above.gnd. +
   Mean.Sea.Level.Pressure.daily.max..MSL. + Total.Cloud.Cover.daily.max..sfc. +
    Total.Cloud.Cover.daily.min..sfc. + High.Cloud.Cover.daily.max..high.cld.lay. +
   High.Cloud.Cover.daily.min..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
   Medium.Cloud.Cover.daily.min..mid.cld.lay. + Low.Cloud.Cover.daily.max..low.cld.lay. +
    Low.Cloud.Cover.daily.min..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd. +
   Wind.Speed.daily.min..80.m.above.gnd. + Wind.Speed.daily.min..900.mb.) -
    Relative. Humidity.daily.mean..2.m. above.gnd.
                                              Df Deviance
                                                             AIC
- Low.Cloud.Cover.daily.min..low.cld.lay.
                                               1
                                                   1287.1 1333.1
                                                   1287.1 1333.1
- High.Cloud.Cover.daily.mean..high.cld.lay.
- Medium.Cloud.Cover.daily.min..mid.cld.lay.
                                                   1287.3 1333.3
                                               1
- High.Cloud.Cover.daily.min..high.cld.lay.
                                                   1287.3 1333.3
                                               1
- Wind.Speed.daily.min..900.mb.
                                                   1287.5 1333.5
                                               1
- Total.Cloud.Cover.daily.max..sfc.
                                               1
                                                   1287.6 1333.6
- Total.Precipitation.daily.sum..sfc.
                                                   1287.6 1333.6
                                               1
- Low.Cloud.Cover.daily.mean..low.cld.lay.
                                               1
                                                   1287.7 1333.7
- Wind.Speed.daily.min..80.m.above.gnd.
                                                   1287.8 1333.8
                                               1
- Low.Cloud.Cover.daily.max..low.cld.lay.
                                                   1287.9 1333.9
                                               1
- Relative. Humidity.daily.max..2.m. above.gnd.
                                               1
                                                   1288.3 1334.3
- Temperature.daily.mean..2.m.above.gnd.
                                               1
                                                   1288.5 1334.5
- Total.Cloud.Cover.daily.min..sfc.
                                                   1288.6 1334.6
                                               1
- High.Cloud.Cover.daily.max..high.cld.lay.
                                               1
                                                   1288.8 1334.8
- Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                               1
                                                   1288.8 1334.8
- Snowfall.amount.raw.daily.sum..sfc.
                                               1
                                                   1288.8 1334.8
<none>
                                                   1287.1 1335.1
- X
                                                   1291.5 1337.5
                                               1
- Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                               1
                                                   1293.3 1339.3
- Wind.Direction.daily.mean..80.m.above.gnd.
                                                   1293.3 1339.3
                                               1
- Shortwave.Radiation.daily.sum..sfc.
                                                   1294.1 1340.1
                                               1
- Wind.Speed.daily.max..80.m.above.gnd.
                                               1
                                                   1300.3 1346.3
- Wind.Direction.daily.mean..900.mb.
                                               1
                                                   1302.2 1348.2
- Mean.Sea.Level.Pressure.daily.max..MSL.
                                               1
                                                   1313.7 1359.7
Step: AIC=1333.09
pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Total.Precipitation.daily.sum..sf
    Snowfall.amount.raw.daily.sum..sfc. + High.Cloud.Cover.daily.mean..high.cld.lay. +
   Medium.Cloud.Cover.daily.mean..mid.cld.lay. + Low.Cloud.Cover.daily.mean..low.cld.lay. +
    Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.mean..80.m.above.gnd. +
   Wind.Direction.daily.mean..900.mb. + Relative.Humidity.daily.max..2.m.above.gnd. +
   Mean.Sea.Level.Pressure.daily.max..MSL. + Total.Cloud.Cover.daily.max..sfc. +
    Total.Cloud.Cover.daily.min..sfc. + High.Cloud.Cover.daily.max..high.cld.lay. +
   High.Cloud.Cover.daily.min..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
   Medium.Cloud.Cover.daily.min..mid.cld.lay. + Low.Cloud.Cover.daily.max..low.cld.lay. +
   Wind.Speed.daily.max..80.m.above.gnd. + Wind.Speed.daily.min..80.m.above.gnd. +
   Wind.Speed.daily.min..900.mb.
```

Start: AIC=1335.07

pluie.demain ~ (X + Temperature.daily.mean..2.m.above.gnd. +

```
Df Deviance
- High.Cloud.Cover.daily.mean..high.cld.lay.
                                                1
                                                    1287.1 1331.1
- High.Cloud.Cover.daily.min..high.cld.lay.
                                                    1287.3 1331.3
                                                1
- Medium.Cloud.Cover.daily.min..mid.cld.lay.
                                                1
                                                    1287.3 1331.3
- Wind.Speed.daily.min..900.mb.
                                                1
                                                    1287.5 1331.5
                                                    1287.6 1331.6
- Total.Cloud.Cover.daily.max..sfc.
                                                1
- Low.Cloud.Cover.daily.mean..low.cld.lay.
                                                1
                                                    1287.7 1331.7
- Total.Precipitation.daily.sum..sfc.
                                                1
                                                    1287.7 1331.7
- Wind.Speed.daily.min..80.m.above.gnd.
                                                1
                                                    1287.8 1331.8
- Low.Cloud.Cover.daily.max..low.cld.lay.
                                                1
                                                    1288.0 1332.0
- Relative. Humidity.daily.max..2.m. above.gnd.
                                                1
                                                    1288.3 1332.3
- Temperature.daily.mean..2.m.above.gnd.
                                                1
                                                    1288.5 1332.5
- High.Cloud.Cover.daily.max..high.cld.lay.
                                                1
                                                    1288.8 1332.8
- Snowfall.amount.raw.daily.sum..sfc.
                                                1
                                                    1288.8 1332.8
- Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                                    1288.8 1332.8
                                                    1287.1 1333.1
- Total.Cloud.Cover.daily.min..sfc.
                                                1
                                                    1290.2 1334.2
- X
                                                    1291.5 1335.5

    Wind.Direction.daily.mean..80.m.above.gnd.

                                                1
                                                    1293.3 1337.3
- Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                                1
                                                    1293.4 1337.4
- Shortwave.Radiation.daily.sum..sfc.
                                                    1294.1 1338.1
                                                1
- Wind.Speed.daily.max..80.m.above.gnd.
                                                1
                                                    1300.4 1344.4
- Wind.Direction.daily.mean..900.mb.
                                                    1302.2 1346.2
                                                1
- Mean.Sea.Level.Pressure.daily.max..MSL.
                                                1
                                                    1313.8 1357.8
Step: AIC=1331.12
pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Total.Precipitation.daily.sum..sf
c. +
    Snowfall.amount.raw.daily.sum..sfc. + Medium.Cloud.Cover.daily.mean..mid.cld.lay. +
    Low.Cloud.Cover.daily.mean..low.cld.lay. + Shortwave.Radiation.daily.sum..sfc. +
   Wind.Direction.daily.mean..80.m.above.gnd. + Wind.Direction.daily.mean..900.mb. +
    Relative.Humidity.daily.max..2.m.above.gnd. + Mean.Sea.Level.Pressure.daily.max..MSL. +
    Total.Cloud.Cover.daily.max..sfc. + Total.Cloud.Cover.daily.min..sfc. +
    High.Cloud.Cover.daily.max..high.cld.lay. + High.Cloud.Cover.daily.min..high.cld.lay. +
   Medium.Cloud.Cover.daily.max..mid.cld.lay. + Medium.Cloud.Cover.daily.min..mid.cld.lay. +
    Low.Cloud.Cover.daily.max..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd. +
   Wind.Speed.daily.min..80.m.above.gnd. + Wind.Speed.daily.min..900.mb.
                                               Df Deviance
                                                              AIC
- High.Cloud.Cover.daily.min..high.cld.lay.
                                                    1287.3 1329.3
- Medium.Cloud.Cover.daily.min..mid.cld.lay.
                                                1
                                                    1287.3 1329.3
- Wind.Speed.daily.min..900.mb.
                                                1
                                                    1287.5 1329.5
- Total.Cloud.Cover.daily.max..sfc.
                                                1
                                                    1287.6 1329.6
- Total.Precipitation.daily.sum..sfc.
                                                1
                                                    1287.7 1329.7
- Low.Cloud.Cover.daily.mean..low.cld.lay.
                                                1
                                                    1287.8 1329.8
- Wind.Speed.daily.min..80.m.above.gnd.
                                                1
                                                    1287.9 1329.9
- Low.Cloud.Cover.daily.max..low.cld.lay.
                                                1
                                                    1288.0 1330.0
- Relative.Humidity.daily.max..2.m.above.gnd.
                                                1
                                                    1288.4 1330.4
- Temperature.daily.mean..2.m.above.gnd.
                                                1
                                                    1288.5 1330.5
- Snowfall.amount.raw.daily.sum..sfc.
                                                1
                                                    1288.8 1330.8
- Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                                1
                                                    1289.1 1331.1
                                                    1287.1 1331.1
<none>
- High.Cloud.Cover.daily.max..high.cld.lay.
                                                1
                                                    1289.4 1331.4
                                                    1290.2 1332.2
- Total.Cloud.Cover.daily.min..sfc.
                                                1
- X
                                                1
                                                    1291.6 1333.6
```

1293.3 1335.3

- Wind.Direction.daily.mean..80.m.above.gnd.

ATC

```
- Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                                   1293.9 1335.9
- Shortwave.Radiation.daily.sum..sfc.
                                               1
                                                   1294.5 1336.5
- Wind.Speed.daily.max..80.m.above.gnd.
                                               1
                                                   1300.5 1342.5
- Wind.Direction.daily.mean..900.mb.
                                               1
                                                   1302.3 1344.3
- Mean.Sea.Level.Pressure.daily.max..MSL.
                                               1 1313.8 1355.8
Step: AIC=1329.29
pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Total.Precipitation.daily.sum..sf
c. +
    Snowfall.amount.raw.daily.sum..sfc. + Medium.Cloud.Cover.daily.mean..mid.cld.lay. +
    Low.Cloud.Cover.daily.mean..low.cld.lay. + Shortwave.Radiation.daily.sum..sfc. +
   Wind.Direction.daily.mean..80.m.above.gnd. + Wind.Direction.daily.mean..900.mb. +
    Relative.Humidity.daily.max..2.m.above.gnd. + Mean.Sea.Level.Pressure.daily.max..MSL. +
    Total.Cloud.Cover.daily.max..sfc. + Total.Cloud.Cover.daily.min..sfc. +
   High.Cloud.Cover.daily.max..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
   Medium.Cloud.Cover.daily.min..mid.cld.lay. + Low.Cloud.Cover.daily.max..low.cld.lay. +
   Wind.Speed.daily.max..80.m.above.gnd. + Wind.Speed.daily.min..80.m.above.gnd. +
   Wind.Speed.daily.min..900.mb.
                                              Df Deviance
                                                             ATC
                                               1
- Medium.Cloud.Cover.daily.min..mid.cld.lay.
                                                   1287.4 1327.4
- Wind.Speed.daily.min..900.mb.
                                               1
                                                   1287.7 1327.7
Total.Cloud.Cover.daily.max..sfc.
                                               1
                                                   1287.8 1327.8
- Total.Precipitation.daily.sum..sfc.
                                               1
                                                   1287.8 1327.8
- Low.Cloud.Cover.daily.mean..low.cld.lay.
                                                   1287.9 1327.9
                                               1
- Wind.Speed.daily.min..80.m.above.gnd.
                                                   1288.0 1328.0
                                               1
- Low.Cloud.Cover.daily.max..low.cld.lay.
                                                   1288.1 1328.1
                                               1
- Relative. Humidity.daily.max..2.m. above.gnd.
                                                   1288.6 1328.6
                                               1
- Temperature.daily.mean..2.m.above.gnd.
                                                   1288.7 1328.7
                                               1
- Snowfall.amount.raw.daily.sum..sfc.
                                                   1289.1 1329.1
                                                   1287.3 1329.3
<none>
- Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                               1
                                                   1289.4 1329.4
- High.Cloud.Cover.daily.max..high.cld.lay.
                                                   1289.7 1329.7
                                               1
- Total.Cloud.Cover.daily.min..sfc.
                                                   1290.4 1330.4
                                               1
- X
                                               1
                                                   1291.8 1331.8
- Wind.Direction.daily.mean..80.m.above.gnd.
                                               1
                                                   1293.5 1333.5
- Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                               1
                                                   1294.0 1334.0
- Shortwave.Radiation.daily.sum..sfc.
                                               1
                                                   1294.5 1334.5
- Wind.Speed.daily.max..80.m.above.gnd.
                                               1
                                                   1300.5 1340.5
- Wind.Direction.daily.mean..900.mb.
                                                   1302.6 1342.6
- Mean.Sea.Level.Pressure.daily.max..MSL.
                                               1
                                                   1314.1 1354.1
Step: AIC=1327.41
pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Total.Precipitation.daily.sum..sf
c. +
    Snowfall.amount.raw.daily.sum..sfc. + Medium.Cloud.Cover.daily.mean..mid.cld.lay. +
    Low.Cloud.Cover.daily.mean..low.cld.lay. + Shortwave.Radiation.daily.sum..sfc. +
   Wind.Direction.daily.mean..80.m.above.gnd. + Wind.Direction.daily.mean..900.mb. +
    Relative.Humidity.daily.max..2.m.above.gnd. + Mean.Sea.Level.Pressure.daily.max..MSL. +
    Total.Cloud.Cover.daily.max..sfc. + Total.Cloud.Cover.daily.min..sfc. +
   High.Cloud.Cover.daily.max..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
    Low.Cloud.Cover.daily.max..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd. +
   Wind.Speed.daily.min..80.m.above.gnd. + Wind.Speed.daily.min..900.mb.
                                              Df Deviance
                                                             ATC
- Wind.Speed.daily.min..900.mb.
                                                   1287.8 1325.8
```

```
- Total.Cloud.Cover.daily.max..sfc.
                                                   1287.9 1325.9
- Total.Precipitation.daily.sum..sfc.
                                                   1288.0 1326.0
                                               1
- Low.Cloud.Cover.daily.mean..low.cld.lay.
                                               1
                                                   1288.1 1326.1
- Wind.Speed.daily.min..80.m.above.gnd.
                                                   1288.2 1326.2
                                                1
- Low.Cloud.Cover.daily.max..low.cld.lay.
                                                1
                                                   1288.2 1326.2
- Relative. Humidity.daily.max..2.m. above.gnd.
                                               1
                                                   1288.7 1326.7
- Temperature.daily.mean..2.m.above.gnd.
                                                   1288.8 1326.8
                                                    1287.4 1327.4
<none>
- Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                                   1289.4 1327.4
                                               1
                                                   1289.5 1327.5
- Snowfall.amount.raw.daily.sum..sfc.
                                               1
- High.Cloud.Cover.daily.max..high.cld.lay.
                                               1
                                                    1289.8 1327.8
- Total.Cloud.Cover.daily.min..sfc.
                                                   1290.5 1328.5
                                               1
                                                   1291.9 1329.9
- Wind.Direction.daily.mean..80.m.above.gnd.
                                                   1293.6 1331.6
- Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                                    1294.5 1332.5
- Shortwave.Radiation.daily.sum..sfc.
                                                1
                                                   1294.6 1332.6
- Wind.Speed.daily.max..80.m.above.gnd.
                                               1
                                                   1300.7 1338.7
- Wind.Direction.daily.mean..900.mb.
                                                   1302.7 1340.7
- Mean.Sea.Level.Pressure.daily.max..MSL.
                                                   1314.2 1352.2
                                               1
Step: AIC=1325.82
pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Total.Precipitation.daily.sum..sf
c. +
    Snowfall.amount.raw.daily.sum..sfc. + Medium.Cloud.Cover.daily.mean..mid.cld.lay. +
    Low.Cloud.Cover.daily.mean..low.cld.lay. + Shortwave.Radiation.daily.sum..sfc. +
   Wind.Direction.daily.mean..80.m.above.gnd. + Wind.Direction.daily.mean..900.mb. +
    Relative.Humidity.daily.max..2.m.above.gnd. + Mean.Sea.Level.Pressure.daily.max..MSL. +
    Total.Cloud.Cover.daily.max..sfc. + Total.Cloud.Cover.daily.min..sfc. +
   High.Cloud.Cover.daily.max..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
    Low.Cloud.Cover.daily.max..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd. +
   Wind.Speed.daily.min..80.m.above.gnd.
                                               Df Deviance
                                                              ATC
- Wind.Speed.daily.min..80.m.above.gnd.
                                               1
                                                    1288.2 1324.2
- Total.Cloud.Cover.daily.max..sfc.
                                               1
                                                   1288.3 1324.3
- Total.Precipitation.daily.sum..sfc.
                                               1
                                                   1288.3 1324.3
- Low.Cloud.Cover.daily.mean..low.cld.lay.
                                               1
                                                   1288.4 1324.4
- Low.Cloud.Cover.daily.max..low.cld.lay.
                                               1
                                                   1288.7 1324.7
- Relative. Humidity.daily.max..2.m. above.gnd.
                                               1
                                                   1289.0 1325.0
- Temperature.daily.mean..2.m.above.gnd.
                                                   1289.4 1325.4
<none>
                                                    1287.8 1325.8
- Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                                   1289.9 1325.9
                                               1
- Snowfall.amount.raw.daily.sum..sfc.
                                                   1290.1 1326.1
                                                1
- High.Cloud.Cover.daily.max..high.cld.lay.
                                                1
                                                    1290.2 1326.2
- Total.Cloud.Cover.daily.min..sfc.
                                               1
                                                    1290.8 1326.8
                                                1
                                                   1292.2 1328.2
- Wind.Direction.daily.mean..80.m.above.gnd.
                                                1
                                                   1293.8 1329.8
- Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                               1
                                                   1294.7 1330.7
- Shortwave.Radiation.daily.sum..sfc.
                                                1
                                                   1294.7 1330.7
- Wind.Direction.daily.mean..900.mb.
                                               1
                                                   1303.1 1339.1
- Wind.Speed.daily.max..80.m.above.gnd.
                                               1
                                                   1304.5 1340.5
- Mean.Sea.Level.Pressure.daily.max..MSL.
                                               1
                                                   1314.2 1350.2
Step: AIC=1324.23
pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Total.Precipitation.daily.sum..sf
c. +
```

```
Snowfall.amount.raw.daily.sum..sfc. + Medium.Cloud.Cover.daily.mean..mid.cld.lay. +
Low.Cloud.Cover.daily.mean..low.cld.lay. + Shortwave.Radiation.daily.sum..sfc. +
Wind.Direction.daily.mean..80.m.above.gnd. + Wind.Direction.daily.mean..900.mb. +
Relative.Humidity.daily.max..2.m.above.gnd. + Mean.Sea.Level.Pressure.daily.max..MSL. +
Total.Cloud.Cover.daily.max..sfc. + Total.Cloud.Cover.daily.min..sfc. +
High.Cloud.Cover.daily.max..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
Low.Cloud.Cover.daily.max..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd.
```

```
Df Deviance
                                                              AIC
- Total.Precipitation.daily.sum..sfc.
                                                   1288.7 1322.7
- Total.Cloud.Cover.daily.max..sfc.
                                               1
                                                   1288.7 1322.7
- Low.Cloud.Cover.daily.mean..low.cld.lay.
                                                   1288.7 1322.7
Low.Cloud.Cover.daily.max..low.cld.lay.
                                                   1289.2 1323.2
- Relative. Humidity.daily.max..2.m. above.gnd.
                                                   1289.6 1323.6
- Temperature.daily.mean..2.m.above.gnd.
                                                    1290.0 1324.0
                                                    1288.2 1324.2
- Snowfall.amount.raw.daily.sum..sfc.
                                                1
                                                    1290.4 1324.4
- Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                                    1290.4 1324.4
                                                   1290.8 1324.8

    High.Cloud.Cover.daily.max..high.cld.lay.

                                                1
- Total.Cloud.Cover.daily.min..sfc.
                                                1
                                                    1291.1 1325.1
                                                   1292.6 1326.6
                                                1
- Wind.Direction.daily.mean..80.m.above.gnd.
                                                   1294.3 1328.3
                                               1
Shortwave.Radiation.daily.sum..sfc.
                                                1
                                                   1295.0 1329.0
- Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                               1
                                                   1295.0 1329.0
- Wind.Direction.daily.mean..900.mb.
                                                   1303.2 1337.2
                                               1
- Wind.Speed.daily.max..80.m.above.gnd.
                                                   1307.4 1341.4
                                               1
- Mean.Sea.Level.Pressure.daily.max..MSL.
                                                   1314.7 1348.7
                                               1
Step: AIC=1322.7
pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Snowfall.amount.raw.daily.sum..sf
c. +
```

Medium.Cloud.Cover.daily.mean..mid.cld.lay. + Low.Cloud.Cover.daily.mean..low.cld.lay. + Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.mean..80.m.above.gnd. + Wind.Direction.daily.mean..900.mb. + Relative.Humidity.daily.max..2.m.above.gnd. + Mean.Sea.Level.Pressure.daily.max..MSL. + Total.Cloud.Cover.daily.max..sfc. + Total.Cloud.Cover.daily.max..sfc. + Medium.Cloud.Cover.daily.max..high.cld.lay. + Medium.Cloud.Cover.daily.max..low.cld.lay. +

Df Deviance - Total.Cloud.Cover.daily.max..sfc. 1 1289.2 1321.2 - Low.Cloud.Cover.daily.mean..low.cld.lay. 1289.5 1321.5 - Low.Cloud.Cover.daily.max..low.cld.lay. 1 1289.6 1321.6 - Relative.Humidity.daily.max..2.m.above.gnd. 1 1290.4 1322.4 - Snowfall.amount.raw.daily.sum..sfc. 1290.6 1322.6 <none> 1288.7 1322.7 - Temperature.daily.mean..2.m.above.gnd. 1 1291.0 1323.0 - High.Cloud.Cover.daily.max..high.cld.lay. 1 1291.3 1323.3 - Medium.Cloud.Cover.daily.mean..mid.cld.lay. 1 1291.5 1323.5 - Total.Cloud.Cover.daily.min..sfc. 1 1291.6 1323.6 - X 1 1293.1 1325.1 - Wind.Direction.daily.mean..80.m.above.gnd. 1 1294.7 1326.7 - Shortwave.Radiation.daily.sum..sfc. 1 1295.2 1327.2 - Medium.Cloud.Cover.daily.max..mid.cld.lay. 1 1295.3 1327.3 - Wind.Direction.daily.mean..900.mb. 1 1304.1 1336.1 - Wind.Speed.daily.max..80.m.above.gnd. 1 1309.9 1341.9

Wind.Speed.daily.max..80.m.above.gnd.

```
    Mean.Sea.Level.Pressure.daily.max..MSL.

                                                   1315.6 1347.6
Step: AIC=1321.17
pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Snowfall.amount.raw.daily.sum..sf
c. +
   Medium.Cloud.Cover.daily.mean..mid.cld.lay. + Low.Cloud.Cover.daily.mean..low.cld.lay. +
   Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.mean..80.m.above.gnd. +
   Wind.Direction.daily.mean..900.mb. + Relative.Humidity.daily.max..2.m.above.gnd. +
   Mean.Sea.Level.Pressure.daily.max..MSL. + Total.Cloud.Cover.daily.min..sfc. +
   High.Cloud.Cover.daily.max..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
    Low.Cloud.Cover.daily.max..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd.
                                              Df Deviance
- Low.Cloud.Cover.daily.mean..low.cld.lay.
                                                   1290.0 1320.0
- Relative. Humidity.daily.max..2.m. above.gnd.
                                                   1291.0 1321.0
- Snowfall.amount.raw.daily.sum..sfc.
                                                   1291.1 1321.1
<none>
                                                   1289.2 1321.2
- Temperature.daily.mean..2.m.above.gnd.
                                                   1291.4 1321.4
- Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                                   1291.6 1321.6
                                               1
- High.Cloud.Cover.daily.max..high.cld.lay.
                                               1
                                                   1292.0 1322.0
- Total.Cloud.Cover.daily.min..sfc.
                                                   1292.1 1322.1
                                               1
- Low.Cloud.Cover.daily.max..low.cld.lay.
                                                   1292.1 1322.1
                                               1
- X
                                                   1293.6 1323.6
                                               1
                                                   1295.2 1325.2
- Wind.Direction.daily.mean..80.m.above.gnd.
                                               1
- Shortwave.Radiation.daily.sum..sfc.
                                               1
                                                   1295.8 1325.8
- Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                                   1300.1 1330.1
                                               1
- Wind.Direction.daily.mean..900.mb.
                                                   1304.5 1334.5
                                               1
- Wind.Speed.daily.max..80.m.above.gnd.
                                               1
                                                   1310.0 1340.0
- Mean.Sea.Level.Pressure.daily.max..MSL.
                                               1
                                                  1316.0 1346.0
Step: AIC=1319.96
pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Snowfall.amount.raw.daily.sum..sf
c. +
   Medium.Cloud.Cover.daily.mean..mid.cld.lay. + Shortwave.Radiation.daily.sum..sfc. +
   Wind.Direction.daily.mean..80.m.above.gnd. + Wind.Direction.daily.mean..900.mb. +
    Relative.Humidity.daily.max..2.m.above.gnd. + Mean.Sea.Level.Pressure.daily.max..MSL. +
   Total.Cloud.Cover.daily.min..sfc. + High.Cloud.Cover.daily.max..high.cld.lay. +
   Medium.Cloud.Cover.daily.max..mid.cld.lay. + Low.Cloud.Cover.daily.max..low.cld.lay. +
   Wind.Speed.daily.max..80.m.above.gnd.
                                              Df Deviance
                                                              AIC
- Snowfall.amount.raw.daily.sum..sfc.
                                                   1291.8 1319.8
                                                   1290.0 1320.0
- Temperature.daily.mean..2.m.above.gnd.
                                                   1292.3 1320.3
- Relative. Humidity.daily.max..2.m. above.gnd.
                                                   1292.3 1320.3
- High.Cloud.Cover.daily.max..high.cld.lay.
                                               1
                                                   1292.4 1320.4
- Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                               1
                                                   1292.8 1320.8
- X
                                                   1294.5 1322.5
                                               1
- Wind.Direction.daily.mean..80.m.above.gnd.
                                               1
                                                   1295.3 1323.3
- Total.Cloud.Cover.daily.min..sfc.
                                               1
                                                   1295.3 1323.3
- Low.Cloud.Cover.daily.max..low.cld.lay.
                                               1
                                                   1295.5 1323.5
- Shortwave.Radiation.daily.sum..sfc.
                                                   1295.9 1323.9
                                               1
- Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                               1
                                                   1301.1 1329.1
- Wind.Direction.daily.mean..900.mb.
                                               1
                                                   1305.3 1333.3
- Wind.Speed.daily.max..80.m.above.gnd.
                                               1
                                                   1311.2 1339.2
- Mean.Sea.Level.Pressure.daily.max..MSL.
                                               1
                                                   1317.3 1345.3
```

```
Step: AIC=1319.81
pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Medium.Cloud.Cover.daily.mean..mi
d.cld.lay. +
    Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.mean..80.m.above.gnd. +
   Wind.Direction.daily.mean..900.mb. + Relative.Humidity.daily.max..2.m.above.gnd. +
   Mean.Sea.Level.Pressure.daily.max..MSL. + Total.Cloud.Cover.daily.min..sfc. +
   High.Cloud.Cover.daily.max..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
    Low.Cloud.Cover.daily.max..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd.
                                              Df Deviance
                                                             AIC
                                                   1291.8 1319.8
<none>
- Relative.Humidity.daily.max..2.m.above.gnd.
                                              1
                                                   1293.9 1319.9
- High.Cloud.Cover.daily.max..high.cld.lay.
                                                   1294.4 1320.4
- Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                                   1294.5 1320.5
- Temperature.daily.mean..2.m.above.gnd.
                                               1
                                                   1294.8 1320.8
- X
                                               1
                                                   1296.6 1322.6
- Total.Cloud.Cover.daily.min..sfc.
                                               1
                                                   1296.7 1322.7
```

1

1

1

1

1

1

1297.4 1323.4

1297.5 1323.5

1297.8 1323.8

1302.9 1328.9

1307.6 1333.6

1311.9 1337.9

1319.0 1345.0

Ici, la sélection automatique se fait en fonction du critère AIC :

- Shortwave.Radiation.daily.sum..sfc.

- Wind.Direction.daily.mean..900.mb.

- Wind.Speed.daily.max..80.m.above.gnd.

- Mean.Sea.Level.Pressure.daily.max..MSL.

- Wind.Direction.daily.mean..80.m.above.gnd.

- Medium.Cloud.Cover.daily.max..mid.cld.lay.

- Low.Cloud.Cover.daily.max..low.cld.lay.

$$AIC(\mathcal{M}) = -2\mathcal{L}_n(\hat{\mathcal{M}}) + 2p$$

Ayant le critère AIC le plus faible, modèle proposé par la sélection automatique est le suivant :

```
reg3 <- glm(pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Medium.Cloud.Cover.da
ily.mean..mid.cld.lay. +
        Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.mean..80.m.above.gnd. +
        Wind.Direction.daily.mean..900.mb. + Relative.Humidity.daily.max..2.m.above.gnd. +
        Mean.Sea.Level.Pressure.daily.max..MSL. + Total.Cloud.Cover.daily.min..sfc. +
        High.Cloud.Cover.daily.max..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
        Low.Cloud.Cover.daily.max..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd., data=d7,
family= binomial)
summary(reg3)</pre>
```

```
Call:
glm(formula = pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. +
   Medium.Cloud.Cover.daily.mean..mid.cld.lay. + Shortwave.Radiation.daily.sum..sfc. +
   Wind.Direction.daily.mean..80.m.above.gnd. + Wind.Direction.daily.mean..900.mb. +
    Relative.Humidity.daily.max..2.m.above.gnd. + Mean.Sea.Level.Pressure.daily.max..MSL. +
    Total.Cloud.Cover.daily.min..sfc. + High.Cloud.Cover.daily.max..high.cld.lay. +
   Medium.Cloud.Cover.daily.max..mid.cld.lay. + Low.Cloud.Cover.daily.max..low.cld.lay. +
   Wind.Speed.daily.max..80.m.above.gnd., family = binomial,
    data = d7)
Coefficients:
                                             Estimate Std. Error z value Pr(>|z|)
(Intercept)
                                            5.291e+01 1.148e+01
                                                                   4.610 4.02e-06 ***
                                            1.811e-04 8.316e-05
                                                                   2.177 0.029460 *
                                            2.760e-02 1.610e-02
                                                                   1.715 0.086420 .
Temperature.daily.mean..2.m.above.gnd.
Medium.Cloud.Cover.daily.mean..mid.cld.lay. 6.847e-03 4.195e-03
                                                                   1.632 0.102609
Shortwave.Radiation.daily.sum..sfc.
                                            1.344e-04 5.698e-05
                                                                   2.359 0.018334 *
Wind.Direction.daily.mean..80.m.above.gnd. -3.569e-03 1.502e-03 -2.376 0.017496 *
Wind.Direction.daily.mean..900.mb.
                                            5.085e-03 1.295e-03
                                                                   3.928 8.57e-05 ***
Relative.Humidity.daily.max..2.m.above.gnd. 1.461e-02 1.007e-02
                                                                   1.451 0.146732
                                           -5.688e-02 1.115e-02 -5.100 3.40e-07 ***
Mean.Sea.Level.Pressure.daily.max..MSL.
Total.Cloud.Cover.daily.min..sfc.
                                            8.123e-03 3.744e-03
                                                                   2.170 0.030026 *
High.Cloud.Cover.daily.max..high.cld.lay.
                                            3.479e-03 2.161e-03
                                                                   1.610 0.107384
Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                            8.453e-03 2.560e-03
                                                                   3.302 0.000961 ***
                                            5.498e-03 2.262e-03
Low.Cloud.Cover.daily.max..low.cld.lay.
                                                                   2.431 0.015065 *
Wind.Speed.daily.max..80.m.above.gnd.
                                            3.328e-02 7.658e-03
                                                                   4.345 1.39e-05 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
(Dispersion parameter for binomial family taken to be 1)
   Null deviance: 1635.4 on 1179 degrees of freedom
Residual deviance: 1291.8 on 1166 degrees of freedom
AIC: 1319.8
Number of Fisher Scoring iterations: 4
```

b. Ratio entre la déviance résiduelle et le nombre de degré de liberté

Ratio = déviance résiduelle/nombre de degré de liberté

Hide

```
[1] 1.10789
```

1291.8/1166

c. Vérification de la multicolinéarité

vif(reg3)

```
Χ
                                                  Temperature.daily.mean..2.m.above.gnd.
                                    1.075663
                                                                                  2.640202
Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                                                     Shortwave.Radiation.daily.sum..sfc.
                                    2.997979
                                                                                  3.363917
 Wind.Direction.daily.mean..80.m.above.gnd.
                                                      Wind.Direction.daily.mean..900.mb.
                                    1.914434
                                                                                  1.912005
Relative.Humidity.daily.max..2.m.above.gnd.
                                                 Mean.Sea.Level.Pressure.daily.max..MSL.
                                                                                  1.246028
                                    1.267601
          Total.Cloud.Cover.daily.min..sfc.
                                               High.Cloud.Cover.daily.max..high.cld.lay.
                                    1.396625
                                                                                 1.818411
 Medium.Cloud.Cover.daily.max..mid.cld.lay.
                                                 Low.Cloud.Cover.daily.max..low.cld.lay.
                                                                                  1.516104
                                    2.253537
      Wind.Speed.daily.max..80.m.above.gnd.
                                    1.289902
```

Les coefficients indiqués étant tous inférieur à 5 donc il n'y a pas de multicolinéarité.

d. Rapports de cote

Hide

```
exp(coef(reg3))
```

```
(Intercept)
                                                                                      Χ
                              9.490354e+22
                                                                           1.000181e+00
   Temperature.daily.mean..2.m.above.gnd. Medium.Cloud.Cover.daily.mean..mid.cld.lay.
                              1.027986e+00
                                                                           1.006870e+00
      Shortwave.Radiation.daily.sum..sfc.
                                            Wind.Direction.daily.mean..80.m.above.gnd.
                              1.000134e+00
                                                                           9.964371e-01
       Wind.Direction.daily.mean..900.mb. Relative.Humidity.daily.max..2.m.above.gnd.
                              1.005098e+00
                                                                           1.014714e+00
  Mean.Sea.Level.Pressure.daily.max..MSL.
                                                     Total.Cloud.Cover.daily.min..sfc.
                              9.447079e-01
                                                                           1.008156e+00
High.Cloud.Cover.daily.max..high.cld.lay.
                                            Medium.Cloud.Cover.daily.max..mid.cld.lay.
                              1.003485e+00
                                                                           1.008489e+00
  Low.Cloud.Cover.daily.max..low.cld.lay.
                                                 Wind.Speed.daily.max..80.m.above.gnd.
                              1.005513e+00
                                                                           1.033836e+00
```

On remarque des variables augmentent (>1) et diminuent (<1) la probabilité que alors que d'autres (proche de 1) pour le modèle.

e. Déviance

Hide

reg3\$deviance

[1] 1291.813

5. Choix du modèle

a. Comparaison des modèles

```
Hide
```

```
anova(reg_1, reg3, test = "Chisq")
Analysis of Deviance Table
Model 1: pluie.demain ~ (X + Temperature.daily.mean..2.m.above.gnd. +
    Relative.Humidity.daily.mean..2.m.above.gnd. + Total.Precipitation.daily.sum..sfc. +
    Snowfall.amount.raw.daily.sum..sfc. + High.Cloud.Cover.daily.mean..high.cld.lay. +
    Medium.Cloud.Cover.daily.mean..mid.cld.lay. + Low.Cloud.Cover.daily.mean..low.cld.lay. +
    Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.mean..80.m.above.gnd. +
    Wind.Direction.daily.mean..900.mb. + Relative.Humidity.daily.max..2.m.above.gnd. +
    Mean.Sea.Level.Pressure.daily.max..MSL. + Total.Cloud.Cover.daily.max..sfc. +
    Total.Cloud.Cover.daily.min..sfc. + High.Cloud.Cover.daily.max..high.cld.lay. +
    High.Cloud.Cover.daily.min..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
    Medium.Cloud.Cover.daily.min..mid.cld.lay. + Low.Cloud.Cover.daily.max..low.cld.lay. +
    Low.Cloud.Cover.daily.min..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd. +
    Wind.Speed.daily.min..80.m.above.gnd. + Wind.Speed.daily.min..900.mb.) -
    Relative.Humidity.daily.mean..2.m.above.gnd.
Model 2: pluie.demain ~ X + Temperature.daily.mean..2.m.above.gnd. + Medium.Cloud.Cover.dail
y.mean..mid.cld.lay. +
    Shortwave.Radiation.daily.sum..sfc. + Wind.Direction.daily.mean..80.m.above.gnd. +
    Wind.Direction.daily.mean..900.mb. + Relative.Humidity.daily.max..2.m.above.gnd. +
    Mean.Sea.Level.Pressure.daily.max..MSL. + Total.Cloud.Cover.daily.min..sfc. +
    High.Cloud.Cover.daily.max..high.cld.lay. + Medium.Cloud.Cover.daily.max..mid.cld.lay. +
    Low.Cloud.Cover.daily.max..low.cld.lay. + Wind.Speed.daily.max..80.m.above.gnd.
```

Le test indique que la p-value est supérieure à 0.05, ce qui indique que le modèle proposé par la sélection automatique (reg3) propose un meilleur ajustement.

0.9079

III. PREDICTION

Resid. Df Resid. Dev Df Deviance Pr(>Chi)

1291.8 -10 -4.7392

1287.1

Afin de vérifier l'ajustement de la prédiction du modèle retenu, nous allons d'abord faire une prédiction avec les données d'entrainement et tester ses résultats avec les vrais résultats, puis réaliser la prédiction avec les données tests.

1. Test de de la prédiction sur les données d'apprentissage

a. Prédiction

1

2

1156

1166

b. Résultat de la prédiction en variable booléenne

Hide

```
pred1_bool <- ifelse(pred1_proba < 0.5, FALSE, TRUE)
table(pred1_bool)

pred1_bool
FALSE TRUE
545 635</pre>
```

c. Matrice de confusion

Hide

```
tab1 <- table(Predicted = pred1_bool, actual = d8$pluie.demain)
tab1</pre>
```

```
actual
Predicted FALSE TRUE
FALSE 403 142
TRUE 176 459
```

Ce matrice indique les erreurs du modèle : les "faux positifs" et les "faux négatifs".

d. Taux de faux prédiction du modèle

Hide

```
(176+142)/(403+176+142+459)*100
[1] 26.94915
```

Le modèle fait 26% d'erreurs de prédiction. Ce qui est acceptable.

2. Prédiction sur les données d'apprentissage

a. Chargement du jeu de données

```
d_test <- read.csv("C:/Users/rhhai/Documents/meteo.test.csv", header = TRUE, sep = ",", dec
=".")
```

b. Prédiction

Hide

```
pred2_proba <- predict(reg3, type= "response", newdata = d_test)
head(pred2_proba)</pre>
```

```
1 2 3 4 5 6
0.5264929 0.6918529 0.5142011 0.6410095 0.5235535 0.4276068
```

c. Résultat de la prédiction en variable booléenne

Hide

```
pred2_bool <- ifelse(pred2_proba < 0.5, FALSE, TRUE)
table(pred2_bool)</pre>
```

```
pred2_bool
FALSE TRUE
    124    166
```

d. Données avec le résultat de la prédiction

Hide

```
d_test_pred <- cbind(d_test, pred2_bool)
head(d_test_pred)</pre>
```

	Year t> <int></int>	Mo <int></int>			Minute <int></int>	Temperature.daily.mean2.m.above.gnd. <dbl></dbl>
1 36	2010	7	6	0	0	19.36
2 44	2010	7	14	0	0	25.74
3 54	2010	7	24	0	0	16.42
4 58	3 2010	7	28	0	0	17.96
5 74	2010	8	13	0	0	17.93
6 86	3 2010	8	25	0	0	18.02

e. Téléchargement du fichier csv

write.table(d_test_pred, "C:/Users/rhhai/Documents/d_test_pred.csv", row.names = FALSE, sep =
",", dec=".")

IV. CONCLUSION

Le logit de la probabilité de chaque observation est le suivant : logit(p(x)) = 52.9071479179 + 0.0001810591xX

- + 0.0276011590xTemperature.daily.mean..2.m.above.gnd. +
- 0.0068468594xMedium.Cloud.Cover.daily.mean..mid.cld.lay. +
- 0.0001343945xShortwave.Radiation.daily.sum..sfc.
- -0.0035692942xWind.Direction.daily.mean..80.m.above.gnd. +
- 0.0050847060xWind.Direction.daily.mean..900.mb + 0.0146065818xTotal.Cloud.Cover.daily.min..sfc.
- -0.0568795079xMean.Sea.Level.Pressure.daily.max..MSL. + 0.0081227067xTotal.Cloud.Cover.daily.min..sfc. +
- 0.0034793362xHigh.Cloud.Cover.daily.max..high.cld.lay. +
- 0.0084534157xMedium.Cloud.Cover.daily.max..mid.cld.lay. +
- 0.0054980902xLow.Cloud.Cover.daily.max..low.cld.lay. +
- 0.0332759280xWind.Speed.daily.max..80.m.above.gnd.

Le modèle avec que les variables significatives, ayant les p-values très basses, n'est pas forcément le meilleur modèle qui s'ajuste bien aux données. Les variables qui semblent avoir un rapport de cote proche de 1 peuvent être utiles à l'ajustement du modèle.

Par rapport à la regression linéaire, plusieurs notions ont été apprises comme la cote anglaise (qui est une autre expression de la probabilité), le rapport de cote, la déviance, ... mais la méthode générale reste inchangée comme la vérification de la multicolinéarité, examen du résidus.

Enfin, le modèle linéaire généralisé offre plusieurs possibilités de modélisation (Bernouilli/binomiale, Poisson,Gamma) et y compris le modèle linéaire (gaussien) avec la fonction glm().