

# Lab 2 - Reshaping Data

Datasource: Trees cared for and managed by the City of Pittsburgh Department of Public Works Forestry Division.

Source: [City of Pittsburgh](#)

## Setup & Read Data

```
In [2]: library(lubridate)
library(dplyr)
library(tidyverse)
library(dslabs)
library(data.table)
```

```
In [3]: trees_raw <- read_csv('../datasets/pittsburgh_trees.csv', col_types = cols(.default = col_guess(), street = col_guess()), as_tibble = FALSE)
head(trees_raw)
```

Warning message:

“One or more parsing issues, call `problems()` on your data frame for details, e.g.:  
dat <- vroom(...)  
problems(dat)”

| _id   | id         | address_number | street        | common_name        | scientific_name   | height | width | growth_space_length |
|-------|------------|----------------|---------------|--------------------|-------------------|--------|-------|---------------------|
| <dbl> | <dbl>      | <dbl>          | <chr>         | <chr>              | <chr>             | <dbl>  | <dbl> | <dbl>               |
| 1     | 754166088  | 7428           | MONTICELLO ST | Stump              | Stump             | 0      | 0     | 10                  |
| 2     | 1946899269 | 220            | BALVER AVE    | Linden: Littleleaf | Tilia cordata     | 0      | 0     | 99                  |
| 3     | 1431517397 | 2822           | SIDNEY ST     | Maple: Red         | Acer rubrum       | 22     | 6     | 6                   |
| 4     | 994063598  | 608            | SUISMON ST    | Maple: Freeman     | Acer x freemanii  | 25     | 10    | 3                   |
| 5     | 1591838573 | 1135           | N NEGLEY AVE  | Maple: Norway      | Acer platanoides  | 52     | 13    | 99                  |
| 6     | 1333224197 | 5550           | BRYANT ST     | Oak: Pin           | Quercus palustris | 45     | 18    | 35                  |

```
In [15]: # New df with limited columns
trees <- trees_raw %>% select('id', 'common_name', 'height', 'width', 'growth_space_length', 'growth_space_type', 'diameter_base_height', 'stems', 'overhead_utilities', 'condition', 'stormwater_benefits_dollar_value', 'property_value_benefits_dollar_value')
head(trees)
```

| id         | common_name           | height | width | growth_space_length | growth_space_width | growth_space_type       | diameter_bas |
|------------|-----------------------|--------|-------|---------------------|--------------------|-------------------------|--------------|
| <dbl>      | <chr>                 | <dbl>  | <dbl> | <dbl>               | <dbl>              | <chr>                   |              |
| 754166088  | Stump                 | 0      | 0     | 10                  | 2                  | Well or Pit             |              |
| 1946899269 | Linden:<br>Littleleaf | 0      | 0     | 99                  | 99                 | Open or Unrestricted    |              |
| 1431517397 | Maple: Red            | 22     | 6     | 6                   | 3                  | Well or Pit             |              |
| 994063598  | Maple: Freeman        | 25     | 10    | 3                   | 3                  | Well or Pit             |              |
| 1591838573 | Maple: Norway         | 52     | 13    | 99                  | 99                 | Open or Unrestricted    |              |
| 1333224197 | Oak: Pin              | 45     | 18    | 35                  | 3                  | Tree Lawn or<br>Parkway |              |

## Create New Dataframe by Subsetting

End result is a table with trees that are limited in their growth space width.

```
In [16]: rows_filter <- trees$growth_space_width <= 20
columns_filter <- c('id', 'height', 'width', 'growth_space_width', 'growth_space_type')

limited_width <- trees[rows_filter, columns_filter]
head(limited_width)
```

A tibble: 6 × 5

| id         | height | width | growth_space_width | growth_space_type    |
|------------|--------|-------|--------------------|----------------------|
| <dbl>      | <dbl>  | <dbl> | <dbl>              | <chr>                |
| 754166088  | 0      | 0     | 2                  | Well or Pit          |
| 1431517397 | 22     | 6     | 3                  | Well or Pit          |
| 994063598  | 25     | 10    | 3                  | Well or Pit          |
| 1333224197 | 45     | 18    | 3                  | Tree Lawn or Parkway |
| 239290336  | 8      | 4     | 3                  | Tree Lawn or Parkway |
| 1233652274 | 27     | 10    | 3                  | Tree Lawn or Parkway |

## Remove Rows with Missing Values

Removed a little over 5000 rows

```
In [17]: # Check NA heights
height_missing <- which(is.na(trees$height))

head(trees[height_missing, c('common_name', 'height', 'width')])
summary(trees)
```

A tibble: 6 × 3

| common_name              | height | width |
|--------------------------|--------|-------|
| <chr>                    | <dbl>  | <dbl> |
| Maple: Norway            | NA     | NA    |
| Vacant Site Not Suitable | NA     | NA    |
| Vacant Site Small        | NA     | NA    |
| Vacant Site Not Suitable | NA     | NA    |
| Vacant Site Not Suitable | NA     | NA    |
| Maple: Red               | NA     | NA    |

|                   |                  |                |                |
|-------------------|------------------|----------------|----------------|
| id                | common_name      | height         | width          |
| Min. :5.960e+03   | Length:45709     | Min. : 0.00    | Min. : 0.000   |
| 1st Qu.:5.356e+08 | Class :character | 1st Qu.: 9.00  | 1st Qu.: 2.000 |
| Median :1.073e+09 | Mode :character  | Median : 20.00 | Median : 6.000 |
| Mean :1.074e+09   |                  | Mean : 22.16   | Mean : 6.991   |
| 3rd Qu.:1.613e+09 |                  | 3rd Qu.: 35.00 | 3rd Qu.:10.000 |
| Max. :2.147e+09   |                  | Max. :158.00   | Max. :65.000   |
|                   |                  | NA's :4374     | NA's :4409     |

  

|                     |                    |                   |                      |
|---------------------|--------------------|-------------------|----------------------|
| growth_space_length | growth_space_width | growth_space_type | diameter_base_height |
| Min. : 0.00         | Min. : 0.00        | Length:45709      | Min. : 0.00          |
| 1st Qu.: 3.00       | 1st Qu.: 2.00      | Class :character  | 1st Qu.: 4.00        |
| Median : 20.00      | Median : 3.00      | Mode :character   | Median :10.00        |
| Mean : 48.87        | Mean :26.53        |                   | Mean :12.85          |
| 3rd Qu.: 99.00      | 3rd Qu.:25.00      |                   | 3rd Qu.:19.00        |
| Max. :188.00        | Max. :99.00        |                   | Max. :66.00          |
| NA's :4194          | NA's :4192         |                   | NA's :4329           |

  

|                |                    |                  |                  |
|----------------|--------------------|------------------|------------------|
| stems          | overhead_utilities | land_use         | condition        |
| Min. : 0.000   | Length:45709       | Length:45709     | Length:45709     |
| 1st Qu.: 1.000 | Class :character   | Class :character | Class :character |
| Median : 1.000 | Mode :character    | Mode :character  | Mode :character  |
| Mean : 1.039   |                    |                  |                  |
| 3rd Qu.: 1.000 |                    |                  |                  |
| Max. :211.000  |                    |                  |                  |
| NA's :2        |                    |                  |                  |

  

|                                  |                                     |
|----------------------------------|-------------------------------------|
| stormwater_benefits_dollar_value | property_value_benefits_dollarvalue |
| Min. : 0.000                     | Min. : -1.537                       |
| 1st Qu.: 1.878                   | 1st Qu.: 28.174                     |
| Median : 5.888                   | Median : 51.112                     |
| Mean :10.101                     | Mean : 53.936                       |
| 3rd Qu.:13.947                   | 3rd Qu.: 73.112                     |
| Max. :85.320                     | Max. :344.668                       |
| NA's :5665                       | NA's :5665                          |

  

|                  |               |                 |
|------------------|---------------|-----------------|
| neighborhood     | latitude      | longitude       |
| Length:45709     | Min. :40.36   | Min. : -80.09   |
| Class :character | 1st Qu.:40.43 | 1st Qu.: -80.00 |
| Mode :character  | Median :40.45 | Median : -79.95 |
|                  | Mean :40.45   | Mean : -79.96   |
|                  | 3rd Qu.:40.46 | 3rd Qu.: -79.92 |
|                  | Max. :40.50   | Max. : -79.87   |
|                  | NA's :251     | NA's :251       |

```
In [18]: cleaned_trees <- trees[complete.cases(trees), , drop = FALSE]
        head(cleaned_trees)
        summary(cleaned_trees)
```

| id         | common_name                 | height | width | growth_space_length | growth_space_width | growth_space_type       | diameter_bas |
|------------|-----------------------------|--------|-------|---------------------|--------------------|-------------------------|--------------|
| <dbl>      | <chr>                       | <dbl>  | <dbl> | <dbl>               | <dbl>              | <chr>                   |              |
| 1946899269 | Linden:<br>Littleleaf       | 0      | 0     | 99                  | 99                 | Open or Unrestricted    |              |
| 1431517397 | Maple: Red                  | 22     | 6     | 6                   | 3                  | Well or Pit             |              |
| 994063598  | Maple: Freeman              | 25     | 10    | 3                   | 3                  | Well or Pit             |              |
| 1591838573 | Maple: Norway               | 52     | 13    | 99                  | 99                 | Open or Unrestricted    |              |
| 1333224197 | Oak: Pin                    | 45     | 18    | 35                  | 3                  | Tree Lawn or<br>Parkway |              |
| 239290336  | Dogwood:<br>Corneliancherry | 8      | 4     | 99                  | 3                  | Tree Lawn or<br>Parkway |              |

| id                | common_name      | height         | width          |
|-------------------|------------------|----------------|----------------|
| Min. :5.960e+03   | Length:39945     | Min. : 0.00    | Min. : 0.000   |
| 1st Qu.:5.375e+08 | Class :character | 1st Qu.: 10.00 | 1st Qu.: 3.000 |
| Median :1.075e+09 | Mode :character  | Median : 20.00 | Median : 6.000 |
| Mean :1.075e+09   |                  | Mean : 22.86   | Mean : 7.215   |
| 3rd Qu.:1.612e+09 |                  | 3rd Qu.: 35.00 | 3rd Qu.:10.000 |
| Max. :2.147e+09   |                  | Max. :158.00   | Max. :65.000   |

  

| growth_space_length | growth_space_width | growth_space_type | diameter_base_height |
|---------------------|--------------------|-------------------|----------------------|
| Min. : 0.00         | Min. : 0.00        | Length:39945      | Min. : 0.00          |
| 1st Qu.: 3.00       | 1st Qu.: 2.00      | Class :character  | 1st Qu.: 4.00        |
| Median : 20.00      | Median : 3.00      | Mode :character   | Median :10.00        |
| Mean : 49.03        | Mean :26.63        |                   | Mean :12.87          |
| 3rd Qu.: 99.00      | 3rd Qu.:30.00      |                   | 3rd Qu.:19.00        |
| Max. :188.00        | Max. :99.00        |                   | Max. :66.00          |

  

| stems          | overhead_utilities | land_use         | condition        |
|----------------|--------------------|------------------|------------------|
| Min. : 0.000   | Length:39945       | Length:39945     | Length:39945     |
| 1st Qu.: 1.000 | Class :character   | Class :character | Class :character |
| Median : 1.000 | Mode :character    | Mode :character  | Mode :character  |
| Mean : 1.128   |                    |                  |                  |
| 3rd Qu.: 1.000 |                    |                  |                  |
| Max. :211.000  |                    |                  |                  |

  

| stormwater_benefits_dollar_value | property_value_benefits_dollarvalue |
|----------------------------------|-------------------------------------|
| Min. : 0.000                     | Min. : -1.537                       |
| 1st Qu.: 1.876                   | 1st Qu.: 28.174                     |
| Median : 5.888                   | Median : 51.112                     |
| Mean :10.104                     | Mean : 53.917                       |
| 3rd Qu.:13.947                   | 3rd Qu.: 73.112                     |
| Max. :85.320                     | Max. :344.668                       |

  

| neighborhood     | latitude      | longitude       |
|------------------|---------------|-----------------|
| Length:39945     | Min. :40.36   | Min. : -80.09   |
| Class :character | 1st Qu.:40.43 | 1st Qu.: -80.00 |
| Mode :character  | Median :40.45 | Median : -79.95 |
|                  | Mean :40.45   | Mean : -79.96   |
|                  | 3rd Qu.:40.46 | 3rd Qu.: -79.92 |
|                  | Max. :40.50   | Max. : -79.87   |

## Add Two Columns

- geo\_point: GeoJSON point format [longitude, latitude]
- property\_value\_per\_height: the property value benefit of the tree divided by its height.



```
In [21]: # Make geoJSON point function
makeGEO = function(longitude, latitude) {
  paste('[' , longitude, ', ', latitude, ']', sep = '')
}
```

```
In [23]: trees_geo <- mutate(trees, geo_point = makeGEO(longitude, latitude))
trees_geo_prop_height <- mutate(trees_geo, property_value_per_height = property_value_benefits_dollarvalue
head(trees_geo_prop_height)
```

| id         | common_name           | height | width | growth_space_length | growth_space_width | growth_space_type       | diameter_bas |
|------------|-----------------------|--------|-------|---------------------|--------------------|-------------------------|--------------|
| <dbl>      | <chr>                 | <dbl>  | <dbl> | <dbl>               | <dbl>              | <chr>                   |              |
| 754166088  | Stump                 | 0      | 0     | 10                  | 2                  | Well or Pit             |              |
| 1946899269 | Linden:<br>Littleleaf | 0      | 0     | 99                  | 99                 | Open or Unrestricted    |              |
| 1431517397 | Maple: Red            | 22     | 6     | 6                   | 3                  | Well or Pit             |              |
| 994063598  | Maple: Freeman        | 25     | 10    | 3                   | 3                  | Well or Pit             |              |
| 1591838573 | Maple: Norway         | 52     | 13    | 99                  | 99                 | Open or Unrestricted    |              |
| 1333224197 | Oak: Pin              | 45     | 18    | 35                  | 3                  | Tree Lawn or<br>Parkway |              |

## Create New Dataframe and Combine

Created a new dataframe with two more row entries and combined with original dataset.

```
In [27]: new_entries <- wrapr::build_frame(
  "id", "common_name", "height", "width", "growth_space_length", "growth_space_width", "growth_space_type",
  "stems", "overhead_utilities", "land_use", "condition", "stormwater_benefits_dollar_value", "property_value",
  1449000842, "Maple: Red", 20, 8, 10, 4, "Well or Pit", 8, 1, "Yes", "Residential", "Good", 7.245601, 41.245601,
  1000224821, "Oak: White", 28, 12, 6, 2, "Tree Lawn or Parkway", 18, 0, "No", "Commercial/Industrial", '')
```

```
In [35]: trees_bound <- rbind(trees, new_entries)
# checking if entry was added. Filtering with same id as first entry in manually created data frame
trees_bound[trees_bound$id == 1449000842,]
```

| id         | common_name | height | width | growth_space_length | growth_space_width | growth_space_type | diameter_bas |
|------------|-------------|--------|-------|---------------------|--------------------|-------------------|--------------|
| <dbl>      | <chr>       | <dbl>  | <dbl> | <dbl>               | <dbl>              | <chr>             |              |
| 1449000842 | Maple: Red  | 20     | 8     | 10                  | 4                  | Well or Pit       |              |

Pivot Wider

```
In [43]: new_wide_data <- trees %>%
  pivot_wider(names_from = land_use, values_from = common_name)

head(select(new_wide_data, id, "Vacant":"Cemetery"))
```

A tibble: 6 × 11

| id         | Vacant | Residential        | Commercial/Industrial | Institutional | Park  | Multi-family Residential | Transportation | Utility | Golf Course |  |
|------------|--------|--------------------|-----------------------|---------------|-------|--------------------------|----------------|---------|-------------|--|
| <dbl>      | <chr>  | <chr>              | <chr>                 | <chr>         | <chr> | <chr>                    | <chr>          | <chr>   | <chr>       |  |
| 754166088  | Stump  | NA                 | NA                    | NA            | NA    | NA                       | NA             | NA      | NA          |  |
| 1946899269 | NA     | Linden: Littleleaf | NA                    | NA            | NA    | NA                       | NA             | NA      | NA          |  |
| 1431517397 | NA     | NA                 | Maple: Red            | NA            | NA    | NA                       | NA             | NA      | NA          |  |
| 994063598  | NA     | Maple: Freeman     | NA                    | NA            | NA    | NA                       | NA             | NA      | NA          |  |
| 1591838573 | NA     | Maple: Norway      | NA                    | NA            | NA    | NA                       | NA             | NA      | NA          |  |
| 1333224197 | NA     | Oak: Pin           | NA                    | NA            | NA    | NA                       | NA             | NA      | NA          |  |

## Lab 1 & 2 Conclusions

I explored data on the public trees in the City of Pittsburgh in these two labs. Only a subset of the columns were used for these initial experiments, as there were too many to explore quickly. The initial summary experiments showed that the number "99" may be used as an indicator for unlimited growth width and height, as even though there were values higher than that, they were very few, and 99 appeared many times. This finding may show outliers or inconsistencies in how the data was collected. Related, I found an obvious but clear correlation between a growth space width or height of 99 and a growth space type of "Open or Unrestricted," giving more evidence that "99" was used as a placeholder for "Unlimited" growth space.

From plotting property value benefit versus land use, I found that trees in parks and on streets held more property value than any other land use. This plot was limited to one type of tree, "Ginko," so more experiments are needed to confirm this thesis. However, with many records of "Ginko" trees, the thesis would likely hold for other species. In both lab experiments, it was clear that many missing values would need to be appropriately cleaned up. Some records can be deleted, as they do not hold a tree and are labeled as "not suitable," but others would take more care as some trees have missing heights and widths. Lastly, I found this dataset fascinating and believe it could be very valuable for the City of Pittsburgh to find the most monetarily valuable or beneficial tree sites and for other cities in similar areas to explore which species or location types may benefit them.

In [ ]: