# Compute LST and NDVI in NYC for Landsat 5

## Introduction

In this notebook, we compute LST for the New York City using *Landsat 5* data that is clipped to NYC boundaries. (Another notebook is used to compute LST with Landsat 8 data.) To compute LST, we follow the procedure outlined in Using McConnell's 2022 paper. The steps are

- Convert Band 6 to Top of Atmosphere (TOA) spectral radiance using two constants from Landsat metadata
- Compute brightness temperature using TOA and 2 constants from metadata
- · Compute NDVI using

$$\frac{\text{NIR} - \text{Red}}{\text{NIR} + \text{Red}} = \frac{\text{Band } 4 - \text{Band } 3}{\text{Band } 4 + \text{Band } 3} \tag{1}$$

- · Convert NDVI to vegetation fraction
- · Compute emissivity using the formula specified in McConnell's paper
- Compute LST using brightness temperature, emissivity, and some constants also specified in McConnell's paper

The contents of this notebook are the following.

- In Section 1, we define functions to compute the outlined procedure
- In Section 2 we test the procedure on a single Landsat file and plot the result.
- In Section 3 we compute LST and NDVI for all the Landsat files and export results.

#### Results

LST and NDVI are computed in this notebook and exported for later use. A heatmap of LST/NDVI can be generated in Section 2.

### Data

The data imported into this notebook is clipped Landsat data located in 02-data/landsat\_clipped\_nyc/. These are raster files saved in .tif format. We import the files relevant to LST calculations with Landsat 5, which are bands 3, 4, and 6.

Data is exported to the folders 02-data/ndvi\_clipped\_nyc and 02-data/lst\_clipped\_nyc. The exported filenames contain the parameter computed with the original Landsat filename. For example, the file ndvi\_LT05\_L1TP\_013032\_19910801\_20160929\_01\_T1.tif contains the NDVI calculation in NYC for the Landsat file listed.

```
import os
In [1]:
         DIR PARENT = os.path.abspath(os.path.join(os.getcwd(), os.pardir))
         DIR SCRIPTS = DIR PARENT + "/01-scripts"
         """Push the directory to load helper scripts from"""
         import sys
         sys.path.append(DIR SCRIPTS)
         import helpers
         import rioxarray as rxr
         import xarray as xr
         import numpy as np
         # For plotting
         import matplotlib.pyplot as plt
         # Import directories
         DIR DATA = DIR PARENT + "/02-data"
         DIR_RAW_CLIPPED_NYC = DIR_PARENT + "/02-data/landsat_clipped_nyc"
         # Export directories
         DIR NDVI CLIPPED NYC = DIR PARENT + "/02-data/ndvi clipped nyc"
         DIR LST CLIPPED NYC = DIR PARENT + "/02-data/lst clipped nyc"
         DIR FIGS = DIR PARENT + "/03-figs"
```

## 1. Import data and define functions

```
In [2]:
         landsat filenames = []
         helpers.get filenames(DIR RAW CLIPPED NYC, landsat filenames)
         landsat filenames.sort()
         # Filter clipped Landsat files by band
          band3_filenames = [x \text{ for } x \text{ in } landsat_filenames if ("B3" in x and "LT05" in x)]
          band4 filenames = [x \text{ for } x \text{ in } landsat filenames if ("B4" in x and "LT05" in x)]
          band6_filenames = [x \text{ for } x \text{ in } landsat_filenames if ("B6" in x and "LT05" in x)]
          band3 filenames.sort()
          band4 filenames.sort()
          band6 filenames.sort()
          print("Number of B3 files = ", len(band3_filenames))
          print("Number of B4 files = ", len(band4_filenames))
         print("Number of B6 files = ", len(band6_filenames))
         def get original landsat name(name):
              return "_".join(name.split("/")[-1].split(".")[0].split("_")[2:-1])
         def import_txt_as_dict(name):
              d = \{\}
              with open(name) as f:
                  for line in f:
                       if len(line.split("="))>1:
                           (key, val) = line.split("=")
                           d[key] = val.split("\n")[0]
              return d
```

```
def open mtl file(landsat filename):
    dirname = "/".join(landsat filename.split("/")[:-1])
    fileroot = get_original_landsat_name(landsat_filename)
    return import_txt_as_dict(dirname+"/"+fileroot+"_MTL"+".txt")
def open masked band(filename, mask value):
    band = rxr.open rasterio(filename)
    data_xarray = xr.DataArray(np.ma.masked_where(band==mask_value, \
                                                   band).squeeze(),
        dims=["y", "x"],
        coords={"x":band["x"].data,
                "y":band["y"].data,
                "band":1,
                "spatial_ref":0},
        attrs=band.attrs)
    data xarray.rio.write crs(band.rio.crs, inplace=True)
    return data_xarray
def compute toa radiance(band, meta):
    Ml = float(meta[" RADIANCE MULT BAND 6 "])
    Al = float(meta["
                         RADIANCE ADD BAND 6 "])
    return Ml*band + Al
def compute_brightness_temp(toa, meta):
    K1 = float(meta["
                       K1_CONSTANT_BAND_6 "])
    K2 = float(meta["
                         K2 CONSTANT BAND 6 "])
    return K2/np.log(K1/toa + 1)
def compute ndvi(nir, red, meta):
    nir toa = compute toa radiance(nir, meta)
    red toa = compute toa radiance(red, meta)
    return (nir_toa-red_toa)/(nir_toa+red_toa)
def compute vegetation fraction(ndvi):
    ndvi min = np.min(ndvi)
    ndvi max = np.max(ndvi)
    return (ndvi-ndvi_min/(ndvi_max-ndvi_min))**2
def compute emissivity(p):
    return 0.004*p + 0.986481
def compute lst(w, bt, emiss):
    0 = 1.438*10**(-2)
    return bt/(1 + w*bt*np.log(emiss)/Q)
Number of B3 files = 92
```

```
Number of B4 files = 92
Number of B6 files = 92
```

## 2. Test the computation for a single date

```
In [5]:
    """Test the program by selecting a single file"""
    select = 90 # OPTIONS: Integer between 0 and (Number of Landsat files) - 1.

# Open band 6 and its metadata file
    band6_test = open_masked_band(band6_filenames[select], 0.0)
    mtl_test = open_mtl_file(band6_filenames[select])
```

```
# Open nir and red
band4 test = open masked band(band4 filenames[select], 0.0)
band3 test = open masked band(band3 filenames[select], 0.0)
print(band3 filenames[select])
print(band4_filenames[select])
print(band6 filenames[select])
# Begin LST equations
toa = compute toa radiance(band6 test, mtl test)
bt = compute brightness temp(toa, mtl test)
ndvi = compute ndvi(band4 test, band3 test, mtl test)
vf = compute vegetation fraction(ndvi)
emiss = compute emissivity(vf)
w = 11.45*10**-6 \# From USGS, Band 6 wavelengths = 10.40 - 12.50 \mum
lst = compute lst(w, bt, emiss)
exportname lst = DIR LST CLIPPED NYC + "/lst " + \
    get original landsat name(band6 filenames[select])
exportname ndvi = DIR NDVI CLIPPED NYC + "/ndvi " + \
    get original landsat name(band6 filenames[select])
# NOTE: Running this will overwrite any data already exported
# lst.rio.to_raster(exportname_lst, driver="GTiff")
# ndvi.rio.to raster(exportname ndvi, driver="GTiff")
/home/aderrasc/Documents/japa final/02-data/landsat clipped nyc/clipped nyc LT05
```

/home/aderrasc/Documents/japa\_final/02-data/landsat\_clipped\_nyc/clipped\_nyc\_LT05

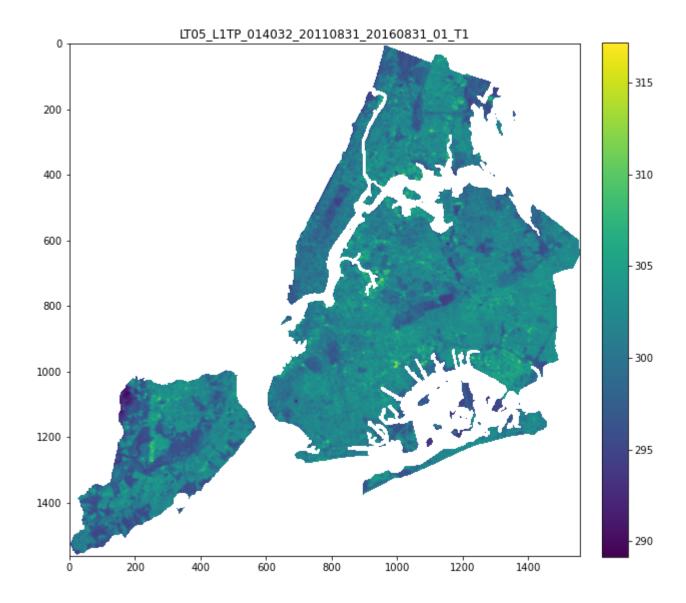
/home/aderrasc/Documents/japa final/02-data/landsat clipped nyc/clipped nyc LT05

#### Plot results

L1TP\_014032\_20110831\_20160831\_01\_T1\_B3.TIF

\_L1TP\_014032\_20110831\_20160831\_01\_T1\_B4.TIF

L1TP 014032 20110831 20160831 01 T1 B6.TIF



## 3. Export LST and NDVI for all dates

```
In [10]:
          for index in range(len(band6_filenames)):
              # Open bands and metadata file
              band6 = open masked band(band6 filenames[index], 0.0)
              band4 = open_masked_band(band4_filenames[index], 0.0)
              band3 = open_masked_band(band3_filenames[index], 0.0)
              mtl = open mtl file(band6 filenames[index])
              # Begin LST equations
              toa = compute_toa_radiance(band6, mtl)
              bt = compute_brightness_temp(toa, mtl)
              ndvi = compute ndvi(band4, band3, mtl)
              vf = compute vegetation fraction(ndvi)
              emiss = compute emissivity(vf)
              w = 11.45*10**-6 \# Center of Band 6 = 10.40 - 12.50 \mu m
              lst = compute_lst(w, bt, emiss)
              suffix = get_original_landsat_name(band6_filenames[index]) + ".tif"
              exportname_lst = DIR_LST_CLIPPED_NYC + "/lst_" + suffix
              exportname ndvi = DIR NDVI CLIPPED NYC + "/ndvi " + suffix
              print("Saving ", suffix)
```

```
LT05_L1TP_013032_19850901_20161004_01_T1.tif
Saving
        LT05_L1TP_013032_19850917_20161004_01_T1.tif
Saving
Saving
        LT05_L1TP_013032_19880621_20161002_01_T1.tif
Saving
        LT05 L1TP 013032 19880808 20161002 01 T1.tif
Saving
        LT05 L1TP 013032 19890726 20161002 01 T1.tif
        LT05_L1TP_013032_19900830_20161001_01_T1.tif
Saving
        LT05_L1TP_013032_19910716_20160929_01_T1.tif
Saving
        LT05_L1TP_013032_19910801_20160929_01_T1.tif
LT05_L1TP_013032_19910817_20160929_01_T1.tif
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Saving
        LT05_L1TP_013032_19910902_20161001_01_T1.tif
Saving
        LT05_L1TP_013032_19920920_20160929_01_T1.tif
        LT05 L1TP 013032 19940622 20160927 01 T1.tif
Saving
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        LT05 L1TP 013032 19940708 20160927 01 T1.tif
        LT05_L1TP_013032_19940809_20160927_01_T1.tif
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        LT05_L1TP_013032_19940825_20160927_01_T1.tif
Saving
        LT05_L1TP_013032_19940910_20160927_01_T1.tif
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Saving
        LT05_L1TP_013032_19950727_20160927_01_T1.tif
Saving
        LT05_L1TP_013032_19960627_20160924_01_T1.tif
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        LT05 L1TP 013032 19960830 20160924 01 T1.tif
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        LT05 L1TP 013032 19980703 20160922 01 T1.tif
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        LT05 L1TP 013032 19980820 20160922 01 T1.tif
        LT05 L1TP 013032 19980905 20160924 01 T1.tif
Saving
        LT05_L1TP_013032_19990706_20160919_01_T1.tif
LT05_L1TP_013032_19990823_20160919_01_T1.tif
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        LT05_L1TP_013032_20000708_20160922_01_T1.tif
        LT05_L1TP_013032_20000825_20160918_01_T1.tif
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        LT05 L1TP 013032 20010727 20160917 01 T1.tif
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        LT05 L1TP 013032 20010913 20160917 01 T1.tif
        LT05_L1TP_013032_20020815_20160916_01_T1.tif
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        LT05 L1TP 013032 20030701 20160915 01 T1.tif
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        LT05_L1TP_013032_20030717_20160915_01_T1.tif
LT05_L1TP_013032_20040703_20160913_01_T1.tif
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        LT05_L1TP_013032_20040820_20160914_01_T1.tif
Saving
        LT05_L1TP_013032_20050823_20160912_01_T1.tif
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        LT05 L1TP 013032 20050908 20160912 01 T1.tif
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        LT05 L1TP 013032 20070626 20160907 01 T1.tif
        LT05_L1TP_013032_20070712_20160907_01_T1.tif
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        LT05_L1TP_013032_20080831_20160905_01_T1.tif
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        LT05_L1TP_013032_20090818_20160903_01_T1.tif
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        LT05_L1TP_013032_20100704_20160901_01_T1.tif
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        LT05 L1TP 013032 20100922 20160831 01 T1.tif
        LT05 L1TP 013032 20110707 20160831 01 T1.tif
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        LT05 L1TP 014032 19840719 20161004 01 T1.tif
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        LT05_L1TP_014032_19840921_20161004_01_T1.tif
LT05_L1TP_014032_19850823_20161004_01_T1.tif
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        LT05_L1TP_014032_19870914_20161003_01_T1.tif
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        LT05_L1TP_014032_19880628_20161003_01_T1.tif
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        LT05 L1TP 014032 19880730 20161003 01 T1.tif
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        LT05 L1TP 014032 19880815 20161003 01 T1.tif
        LT05 L1TP 014032 19880831 20161003 01 T1.tif
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Saving
        LT05_L1TP_014032_19880916_20161003_01_T1.tif
        LT05_L1TP_014032_19890701_20161002_01_T1.tif
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        LT05_L1TP_014032_19890903_20161002_01_T1.tif
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        LT05_L1TP_014032_19900704_20161002_01_T1.tif
        LT05_L1TP_014032_19900720_20161002_01_T1.tif
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        LT05_L1TP_014032_19910621_20160929_01_T1.tif
Saving
        LT05_L1TP_014032_19920826_20160928_01_T1.tif
        LT05_L1TP_014032_19930626_20160928_01_T1.tif
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        LT05 L1TP 014032 19930728 20160928 01 T1.tif
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         LT05 L1TP 014032 19930829 20160927 01 T1.tif
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         LT05_L1TP_014032_19960805_20160924_01_T1.tif
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         LT05_L1TP_014032_19970621_20160923_01_T1.tif
         LT05 L1TP 014032 19980912 20160923 01 T1.tif
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         LT05 L1TP 014032 20000816 20160918 01 T1.tif
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         LT05 L1TP 014032 20000917 20160918 01 T1.tif
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         LT05 L1TP 014032 20010702 20160917 01 T1.tif
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         LT05_L1TP_014032_20020705_20160916_01_T1.tif
LT05_L1TP_014032_20020806_20160916_01_T1.tif
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         LT05_L1TP_014032_20020907_20160916_01_T1.tif
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         LT05_L1TP_014032_20030825_20160915_01_T1.tif
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         LT05 L1TP 014032 20030910 20160914 01 T1.tif
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         LT05 L1TP 014032 20050814 20160912 01 T1.tif
         LT05 L1TP 014032 20060716 20160909 01 T1.tif
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         LT05 L1TP 014032 20060801 20160911 01 T1.tif
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         LT05_L1TP_014032_20060918_20160911_01_T1.tif
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         LT05 L1TP 014032 20070921 20160906 01 T1.tif
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         LT05 L1TP 014032 20080822 20160905 01 T1.tif
         LT05 L1TP 014032 20080907 20160909 01 T1.tif
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         LT05_L1TP_014032_20090825_20160903_01_T1.tif
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LT05_L1TP_014032_20110714_20160831_01_T1.tif
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         LT05_L1TP_014032_20110730_20160831_01_T1.tif
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