2000_monthly_prepare_run_era5

August 21, 2025

[1]:
```
import numpy as np
import xarray as xr
import pandas as pd
import scipy
import sys
import warnings
warnings.filterwarnings('ignore')
import time as timer
start_all = timer.time()
```

[2]:
```
dataf ="/Volumes/ESA_F4R/era/"
datao ="/Volumes/ESA_F4R/ed_prepare/"
datap ="/Users/ellendyer/Library/Mobile Documents/com~apple~CloudDocs/
 ↪1SHARED_WORK/Work/3_ESA_GRANT/MODEL/plots/era/"
```

[14]:
```
#For selection and plotting
YR = 2000
time_bnds = (str(Y)+'-01-01',str(Y)+'-12-31')
lon_bnds, lat_bnds = (14, 31), (6,-11)
lon_bnds_f, lat_bnds_f = (15, 30), (-10,5)
p_bnds = (30000,100000)
```

Read in ERA5 data on pressure levels (hourly in fortnightly files) - resampled to monthly MS timestep - shum multiplied by 1000 to convert from kg/kg –> g/kg - pressure levels are divided by 100 to convert from Pa to hPa (only for fortnightly files) - sort data by descending pressure levels (only for fortnightly files)

[ ]:
```
start = timer.time()
from functools import partial
def _preprocess_pres(x, lon_bnds, lat_bnds, p_bnds):
    return x.sel(lon=slice(*lon_bnds), lat=slice(*lat_bnds),
                 plev=slice(*p_bnds),drop=True)
partial_func_pres = partial(_preprocess_pres, lon_bnds=lon_bnds,␣
 ↪lat_bnds=lat_bnds, p_bnds=p_bnds)

#Reading in pressure level variables from ERA5
ds_era_pres = xr.open_mfdataset(dataf+"era5/pressure_levels/
 ↪era5_pressure_level_variables_central_africa_"+str(YR)+"*.nc",
```

```
                                drop_variables=['r','t','w'],
                                preprocess=partial_func_pres,parallel=True).
 ↪resample(time='MS').mean(dim='time').load()
ds_era_pres = ds_era_pres.rename({'plev':'level','q':'Shum','u':'Uwnd','v':
 ↪'Vwnd'})
ds_era_pres['Shum'] = 1000.0*ds_era_pres['Shum']
ds_era_pres['level'] = ds_era_pres['level']/100.0
ds_era_pres = ds_era_pres.sortby('level', ascending=False)
end = timer.time()
length = end - start
print("ERA5 pressure level data read in took ", length, "seconds")
```

```
ERA5 pressure level data read in took  872.2501728534698 seconds
```

Read in ERA5 land data (hourly in monthly files) - selecting hour 23 (0-23) of Prec and Evap because of how ERA5 Land variables are accumulated (https://confluence.ecmwf.int/pages/viewpage.action?pageId=197702790) - prec is multiplied by 1000 to convert from m to mm - evap is multiplied by -1000 to convert from m to mm and upward fluxes in land model are considered negative - Prec, Evap, and Psfc are then resampled to MS monthly and also interpolated to coarser pressure level grid

[ ]:
```
start = timer.time()
from functools import partial
def _preprocess_land(x, lon_bnds, lat_bnds):
    x = x.sel(longitude=slice(*lon_bnds), latitude=slice(*lat_bnds),drop=True)
    return x
partial_func_land = partial(_preprocess_land, lon_bnds=lon_bnds,␣
 ↪lat_bnds=lat_bnds)

#Reading in surface variables from ERA5 Land
ds_era_land = xr.open_mfdataset("/Volumes/ESA_F4R/era/era5_land/
 ↪era5_land_variables_central_africa_"+str(YR)+"*.nc",
                                ␣
 ↪drop_variables=['expver','number','pev','ssr','t2m'],
                                preprocess=partial_func_land,parallel=True).
 ↪load()
ds_era_land = ds_era_land.rename({'valid_time':'time','latitude':'lat',
                                  'longitude':'lon','tp':'Prec','e':'Evap','sp':
 ↪'Psfc'})
ds_era_land = ds_era_land.
 ↪interp(lat=ds_era_pres['lat'],lon=ds_era_pres['lon'],method='linear',kwargs={"fill_value":
 ↪ "extrapolate"})
Prec = ds_era_land['Prec'].where(ds_era_land['time.hour']==23,drop=True)*1000.0
Evap = ds_era_land['Evap'].where(ds_era_land['time.hour']==23,drop=True)*-1000.0
Prec = Prec.resample(time='MS').mean(dim='time')
Evap = Evap.resample(time='MS').mean(dim='time')
Psfc = ds_era_land['Psfc'].resample(time='MS').mean(dim='time')/100.0
```

```
ds_era_land.close()
end = timer.time()
length = end - start
print("ERA5 land data read in took ", length, "seconds")
```

```
ERA5 land data read in took  98.51497983932495 seconds
```

Merging the two datasets into one dataset for recyling code called ds - close both input datasets - sort everything so latitude is south to north - transpose dimensions so they run (lon,lat,level,time) as in recycling code - save input ds to file

[ ]:
```
start = timer.time()
ds = xr.merge([ds_era_pres,Prec,Evap,Psfc])
ds_era_pres.close()
ds = ds.sortby('lat', ascending=True)
ds = ds.sel(lat=slice(*lat_bnds_f),lon=slice(*lon_bnds_f))
ds = ds.transpose("lon", "lat", "level", "time",missing_dims='ignore')
ds.to_netcdf(datao+"erads_"+str(YR)+".nc", mode='w', format='NETCDF4',␣
 ↪engine='netcdf4')
end = timer.time()
length = end - start
print("Merging and dataset output took ", length, "seconds")
```

```
Merging and dataset output took  0.8869009017944336 seconds
```

[7]:
```
#Prepping datasets near surface for recycling
import bulk_recycling_model.numerical_integration

# Integrate 10^-3 Shum Uwnd dp
# Because the integration limits are from high pressure to low pressure, we␣
 ↪need to invert the sign.
integrand = -1 * 1e-3 * ds["Shum"] * ds["Uwnd"]
Fx = bulk_recycling_model.numerical_integration.
 ↪integrate_with_extrapolation(integrand, ds["Psfc"])
# Units: mb x m/s

# Integrate 10^-3 Shum Vwnd dp
# Because the integration limits are from high pressure to low pressure, we␣
 ↪need to invert the sign.
integrand = -1 * 1e-3 * ds["Shum"] * ds["Vwnd"]
Fy = bulk_recycling_model.numerical_integration.
 ↪integrate_with_extrapolation(integrand, ds["Psfc"])
# Units: mb x m/s
```

[8]:
```
# Prepare and scale the data
from bulk_recycling_model import preprocess
from bulk_recycling_model.axis import Axis
from bulk_recycling_model.scaling import Scaling, UnitSystem
```

```
print("prepping data for recycling - scaling and flux calcs etc")

# degrees
L = ds.coords["lon"].max().item() - ds.coords["lon"].min().item()
# convert to meters
L = L * 111e3 * np.cos(np.deg2rad(ds.coords["lat"].mean().item()))
dx = L / ds.sizes["lon"]

# lon axis
lon_axis = Axis(
    ds.coords["lon"].min().item(),
    ds.coords["lon"].diff("lon").mean().item(),
    ds.sizes["lon"],
)

# degrees
H = ds.coords["lat"].values[-1] - ds.coords["lat"].values[0]
# convert to meters
H = H * 111e3
dy = H / ds.sizes["lat"]

# lat axis
lat_axis = Axis(
    ds.coords["lat"].min().item(),
    ds.coords["lat"].diff("lat").mean().item(),
    ds.sizes["lat"],
)

print(f"{L = :.2e} m")
print(f"{dx = :.2e} m")
print(f"{H = :.2e} m")
print(f"{dy = :.2e} m")

# make a scaling object to convert between unit systems
scaling = Scaling(H)

dx = scaling.distance.convert(dx, UnitSystem.SI, UnitSystem.scaled)
dy = scaling.distance.convert(dy, UnitSystem.SI, UnitSystem.scaled)
print(f"{dx = :.2e} scaled")
print(f"{dy = :.2e} scaled")

# convert Fx and Fy to scaled units
Fx = scaling.water_vapor_flux.convert(Fx.values, UnitSystem.natural, UnitSystem.
 ↪scaled)
Fy = scaling.water_vapor_flux.convert(Fy.values, UnitSystem.natural, UnitSystem.
 ↪scaled)
```

```
# convert E to scaled units
#print('pre-scaled',ds['Evap'])
E = scaling.evaporation.convert(ds["Evap"].values, UnitSystem.natural,␣
 ↪UnitSystem.scaled)
```

```
prepping data for recycling - scaling and flux calcs etc
L = 1.66e+06 m
dx = 2.73e+04 m
H = 1.66e+06 m
dy = 2.73e+04 m
dx = 1.64e-02 scaled
dy = 1.64e-02 scaled
```

- Create recycling output array based on the shape of one of the surface input files: evap (E)
- Run through each timestep in the input files and calculate recycling ratio at each timestep across domain

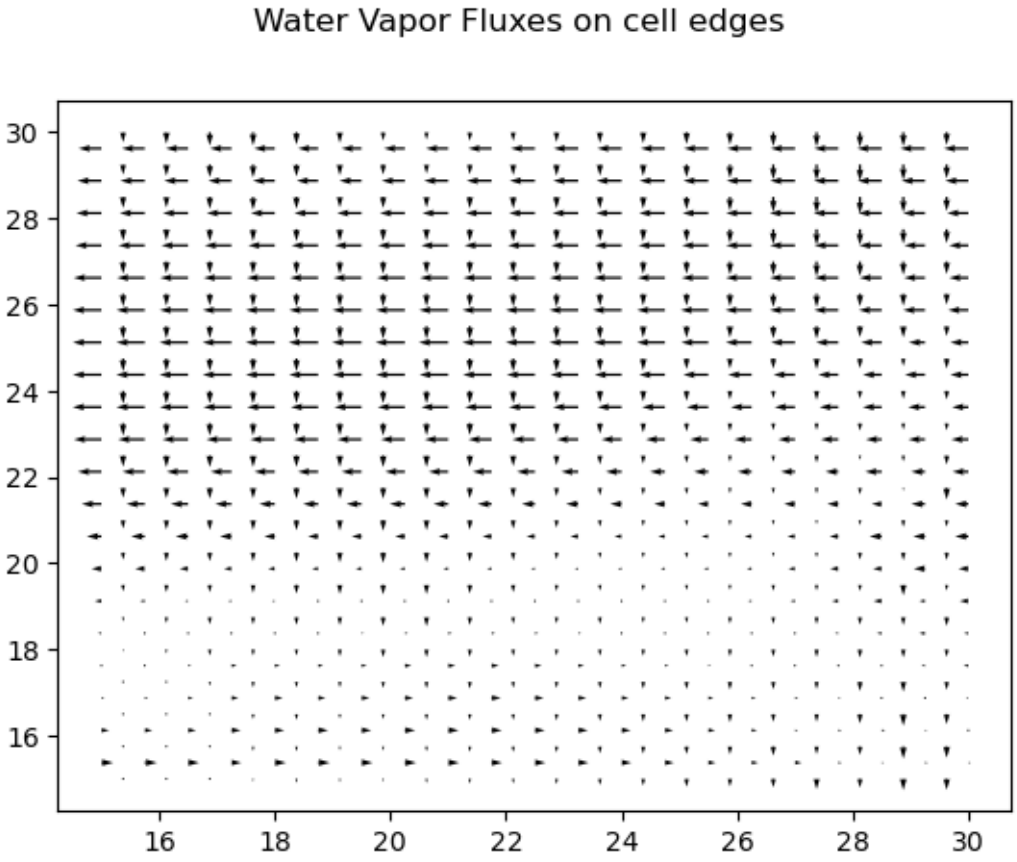
[9]:
```
import matplotlib.pyplot as plt
import logging
logging.basicConfig()
logging.getLogger("bulk_recycling_model").setLevel(logging.INFO)
from bulk_recycling_model import plotting
from bulk_recycling_model.main import run

rho_ar = np.empty((np.shape(E)[0]-1,np.shape(E)[1]-1,np.shape(E)[2]))
#Entering preprocessing and time step loop
#Run model and plot
for i,time in enumerate(ds.time):

    # preprocess E onto the secondary grid
    Ei = preprocess.prepare_E(E[:,:,i])

    # preprocess water vapor fluxes onto the secondary grid
    Fxi_left = preprocess.prepare_Fx_left(Fx[:,:,i])
    Fxi_right = preprocess.prepare_Fx_right(Fx[:,:,i])
    Fyi_bottom = preprocess.prepare_Fy_bottom(Fy[:,:,i])
    Fyi_top = preprocess.prepare_Fy_top(Fy[:,:,i])

    # compute P
    Pi = preprocess.calculate_precipitation(Fxi_left, Fxi_right, Fyi_bottom,␣
 ↪Fyi_top, Ei, dx, dy)

    # Create a quiver plot
    fig, ax = plt.subplots()
    U,V = plotting.build_uv_fluxes(Fxi_left, Fxi_right, Fyi_bottom, Fyi_top)
    X, Y = np.meshgrid(lon_axis.half_step, lon_axis.half_step, indexing="ij")
    ax.quiver(X[::3, ::3],Y[::3, ::3],U[::3, ::3],V[::3, ::3])
```

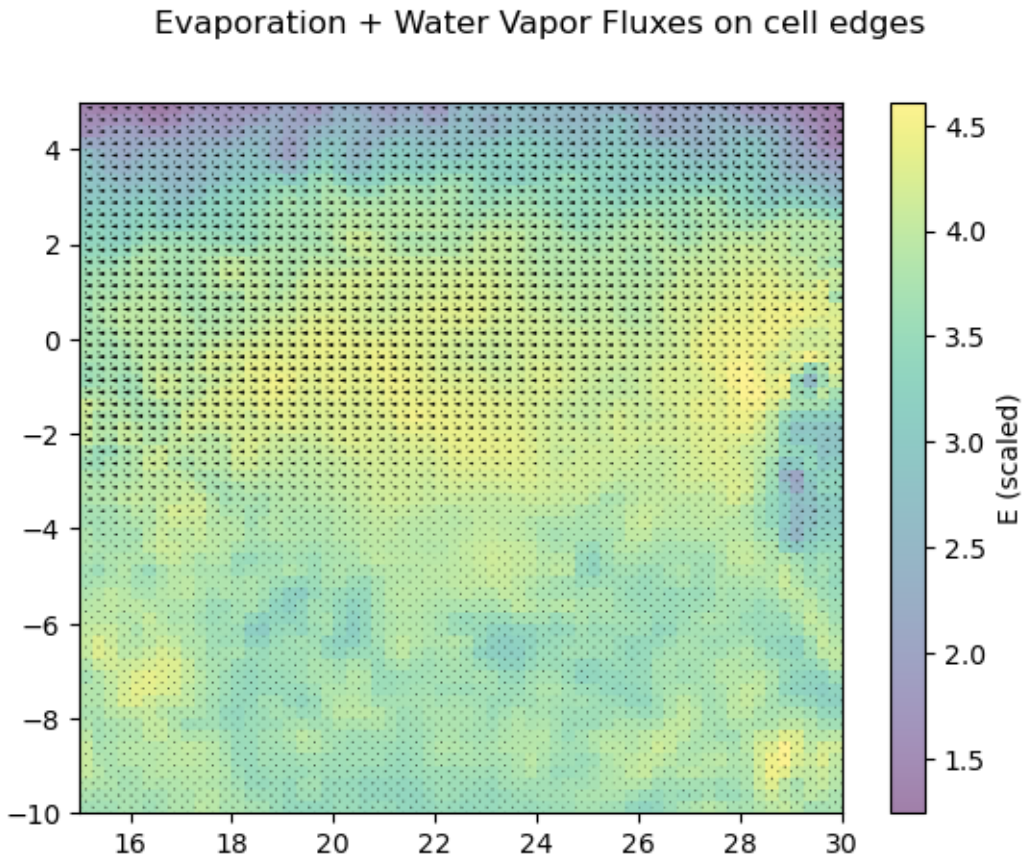
```
    fig.suptitle("Water Vapor Fluxes on cell edges")

    # Create a quiver plot
    fig, ax = plt.subplots()
    collection = plotting.pcolormesh(ax, Ei, lon_axis, lat_axis, alpha=0.5)
    fig.colorbar(collection, label="E (scaled)")
    plotting.quiver(ax, Fxi_left, Fxi_right, Fyi_bottom, Fyi_top, lon_axis,␣
↪lat_axis)
    fig.suptitle("Evaporation + Water Vapor Fluxes on cell edges")

    # Run the model
    status = run(
        Fxi_left,
        Fxi_right,
        Fyi_bottom,
        Fyi_top,
        Ei,
        Pi,
        dx,
        dy,
        max_iter=500,
        tol=1e-3,
    )

    #Print timestep and status (converged or not) and add rho to recycling␣
↪ration array
    print(i,time.values)
    print(status['k'])
    rho_ar[:,:,i] = status["rho"]

    # plot each timestep
    fig, ax = plt.subplots()
    cmap=plt.cm.viridis
    cmap.set_extremes(under='red', over='orange')
    collection = plotting.pcolormesh(ax, status["rho"], lon_axis, lat_axis,
                                     vmin=0.0, vmax=1,
                                     cmap=cmap)
    fig.colorbar(collection,extend='both')
    fig.suptitle(str(time.values)+" $\\rho$")
    #plt.savefig(datap+"rho_"+str(time.values)+".png")
    plt.show()
    plt.close()

    # plot the convergence
    deltas = status["deltas"]
    fig, ax = plt.subplots()
    ax.plot(deltas)
```

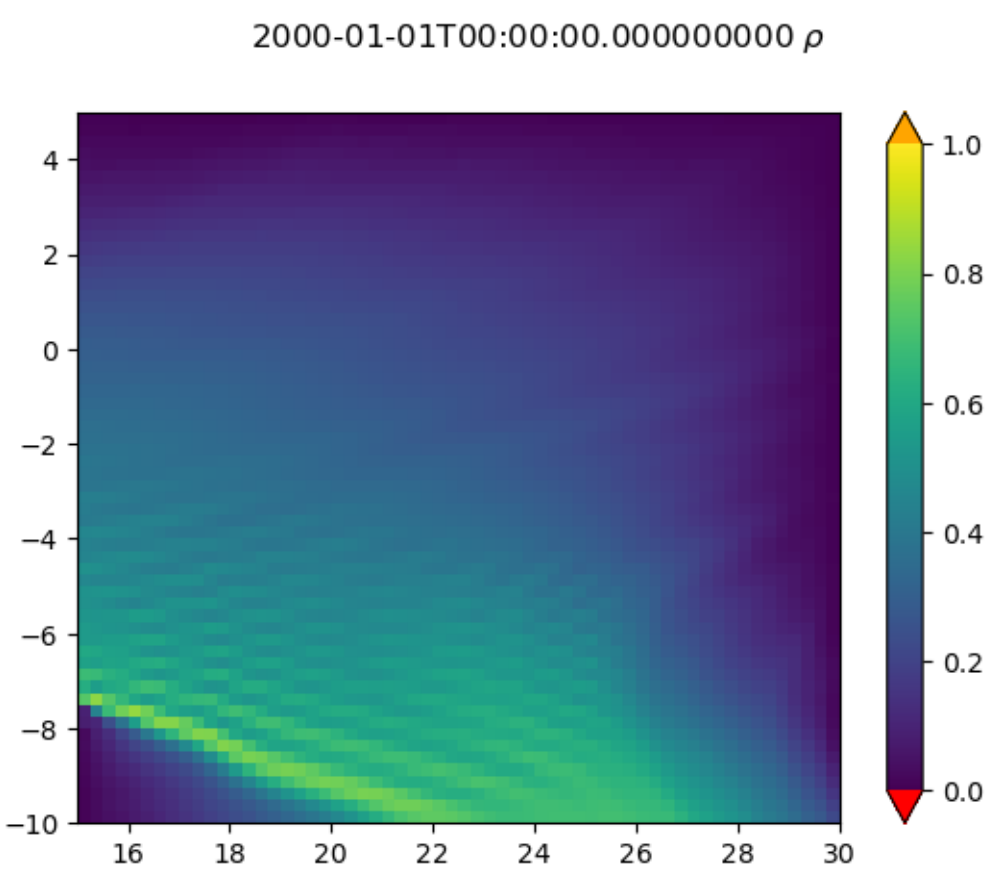
```
    ax.set_title("Convergence")
    ax.set_xlabel("Iteration")
    plt.show()
    plt.close()
```

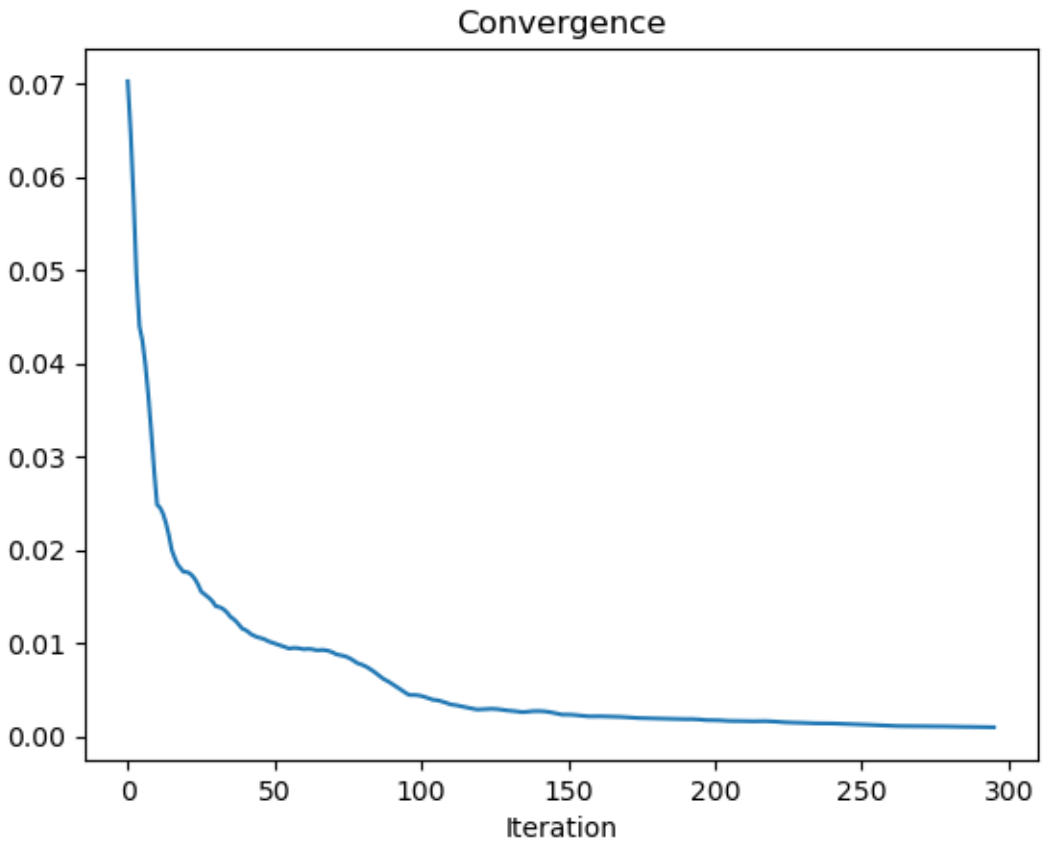
```
INFO:bulk_recycling_model.main:Converged in 296 iterations and 0:00:02.659021
```

```
0 2000-01-01T00:00:00.000000000
296
```

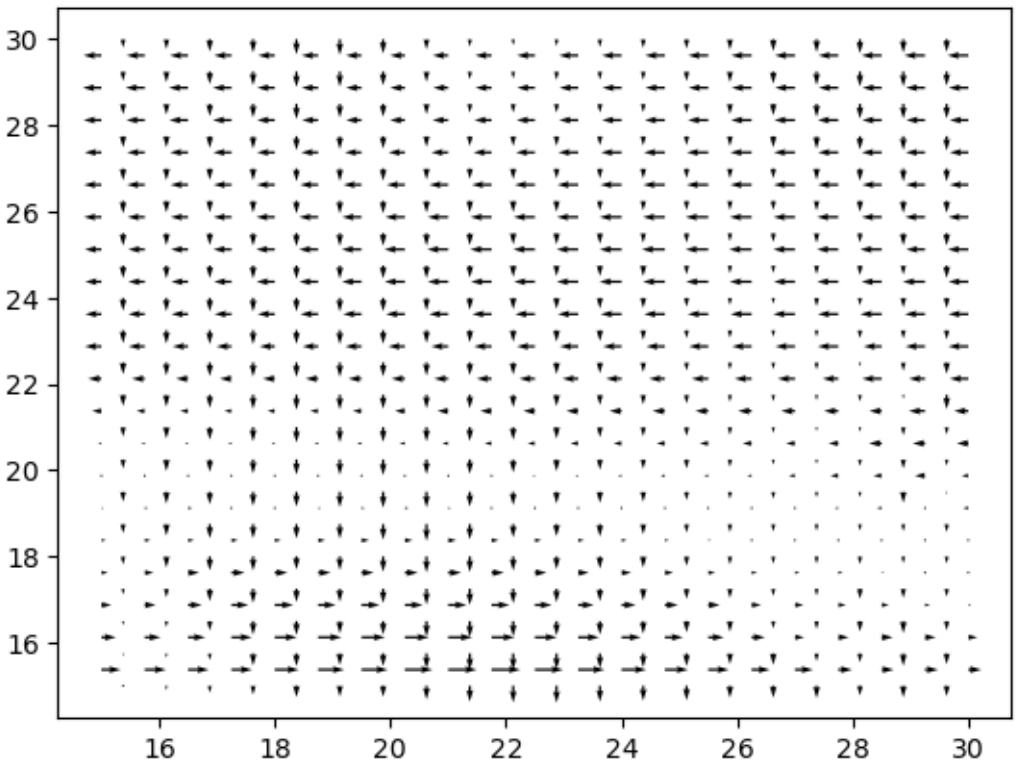


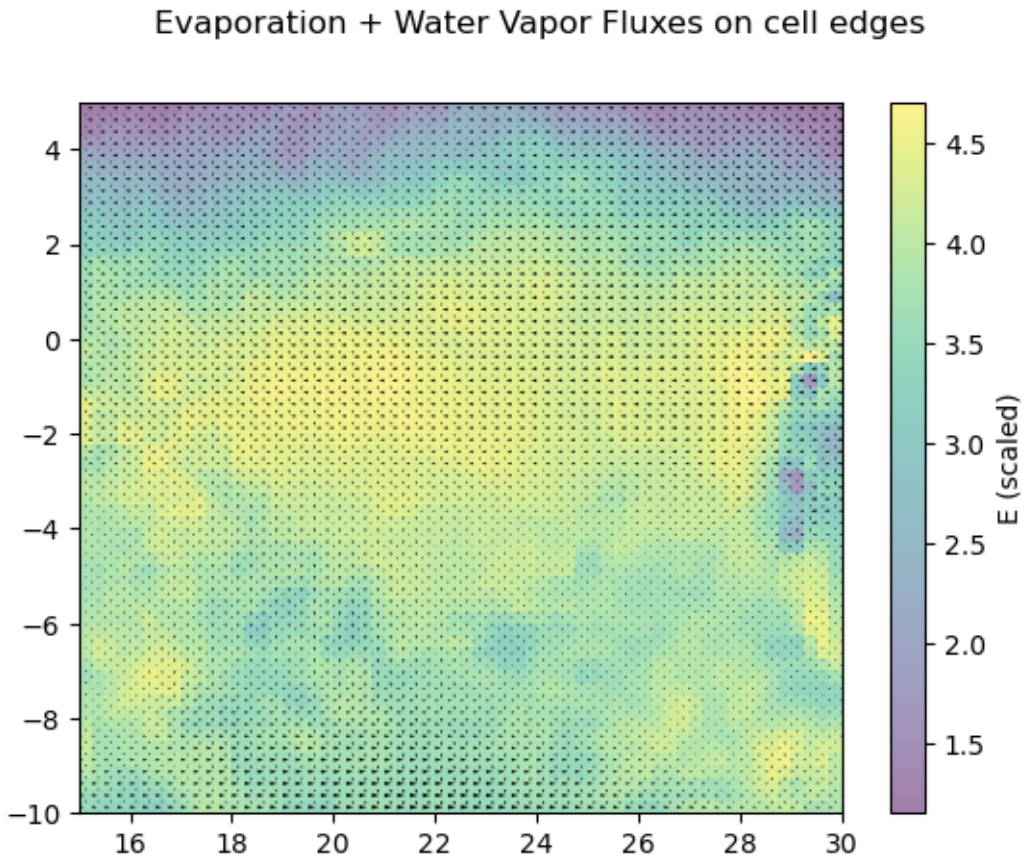

Evaporation + Water Vapor Fluxes on cell edges
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
4.5
4.0
3.5
3.0
2.5
2.0
1.5
E (scaled)


2000-01-01T00:00:00.000000000 ρ
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
1.0
0.8
0.6
0.4
0.2
0.0




```
INFO:bulk_recycling_model.main:Converged in 310 iterations and 0:00:02.747002
1 2000-02-01T00:00:00.000000000
310
```


Water Vapor Fluxes on cell edges
30
28
26
24
22
20
18
16
16
18
20
22
24
26
28
30


Evaporation + Water Vapor Fluxes on cell edges
4
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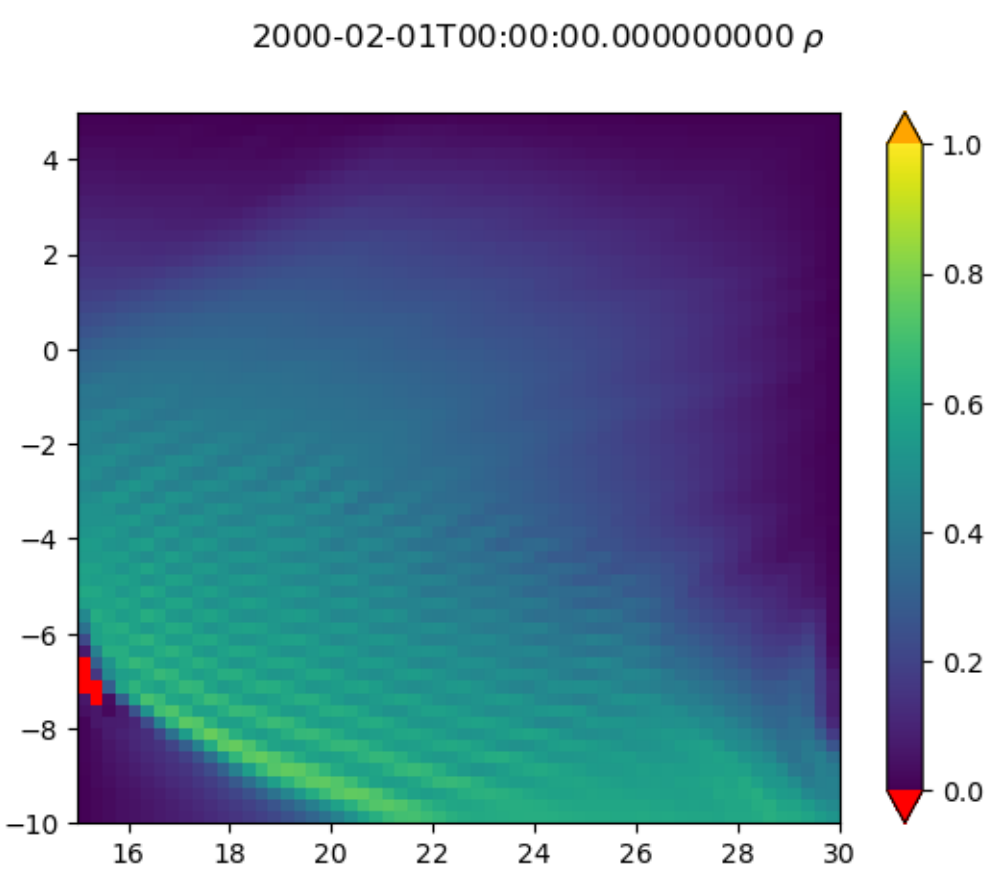
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
4.5
4.0
3.5
3.0
2.5
2.0
1.5
E (scaled)


2000-02-01T00:00:00.000000000 ρ
4
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30
1.0
0.8
0.6
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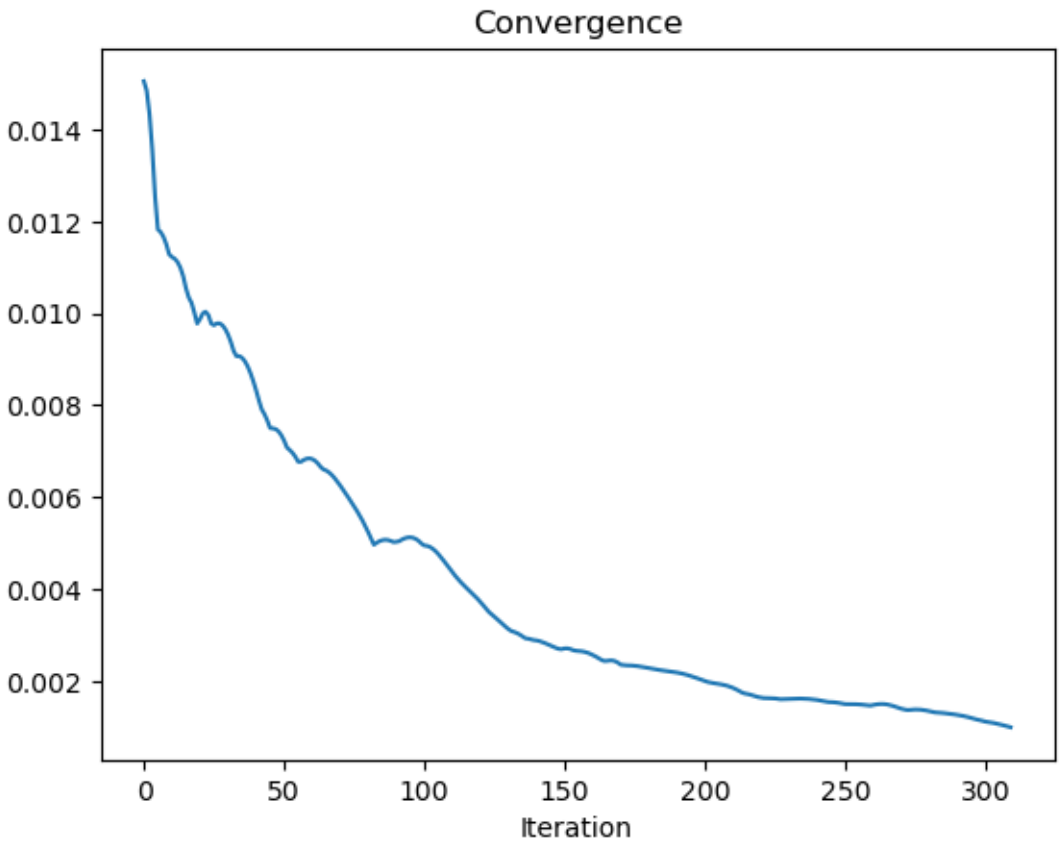
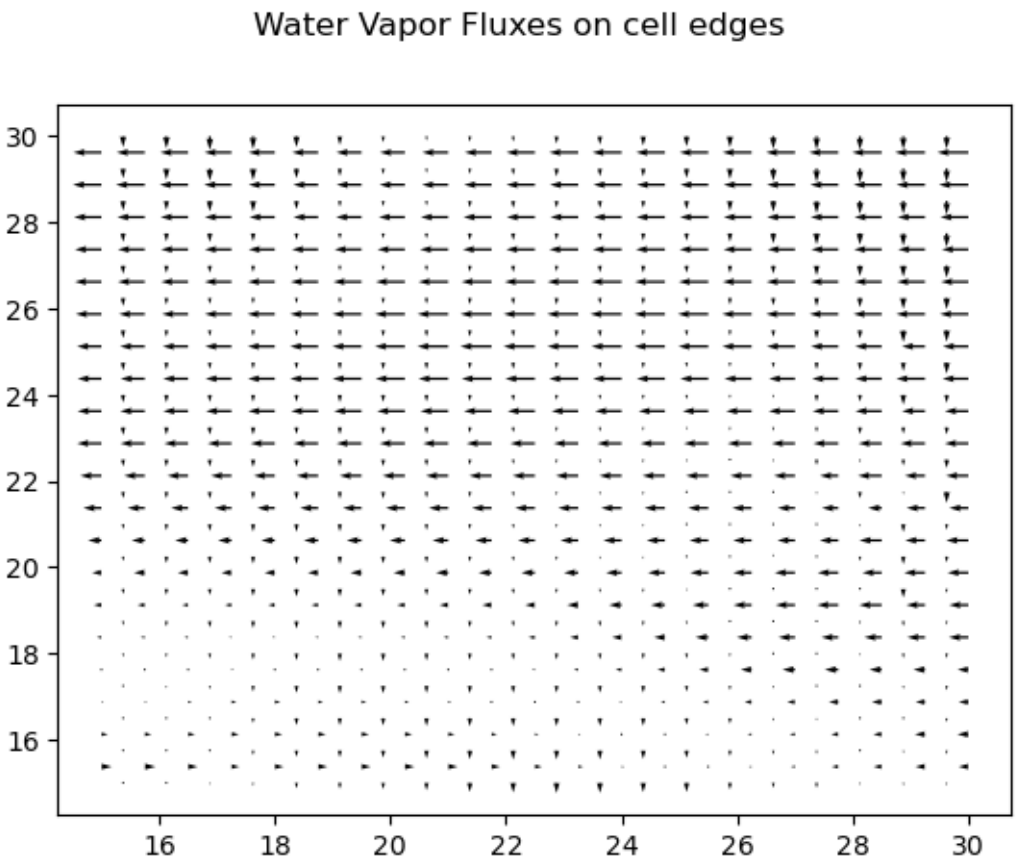
0.0




```
INFO:bulk_recycling_model.main:Converged in 252 iterations and 0:00:02.206642
2 2000-03-01T00:00:00.000000000
252
```


Water Vapor Fluxes on cell edges
30
28
26
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22
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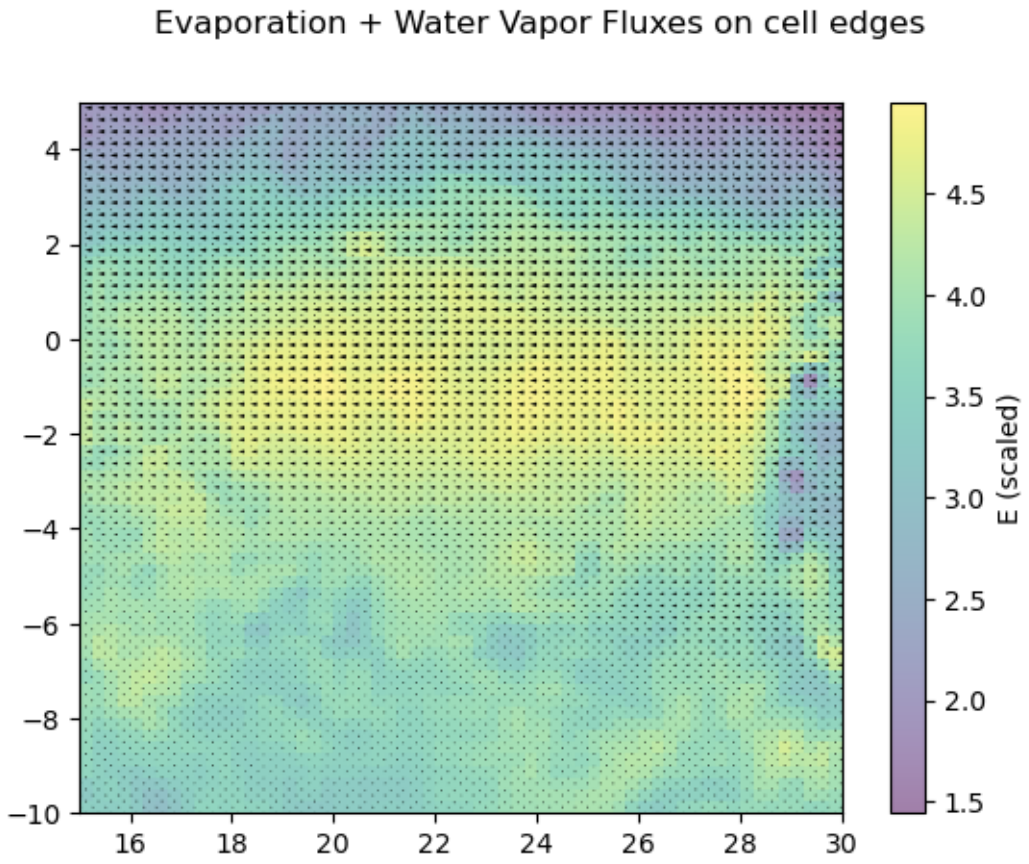
24
26
28
30


Evaporation + Water Vapor Fluxes on cell edges
4
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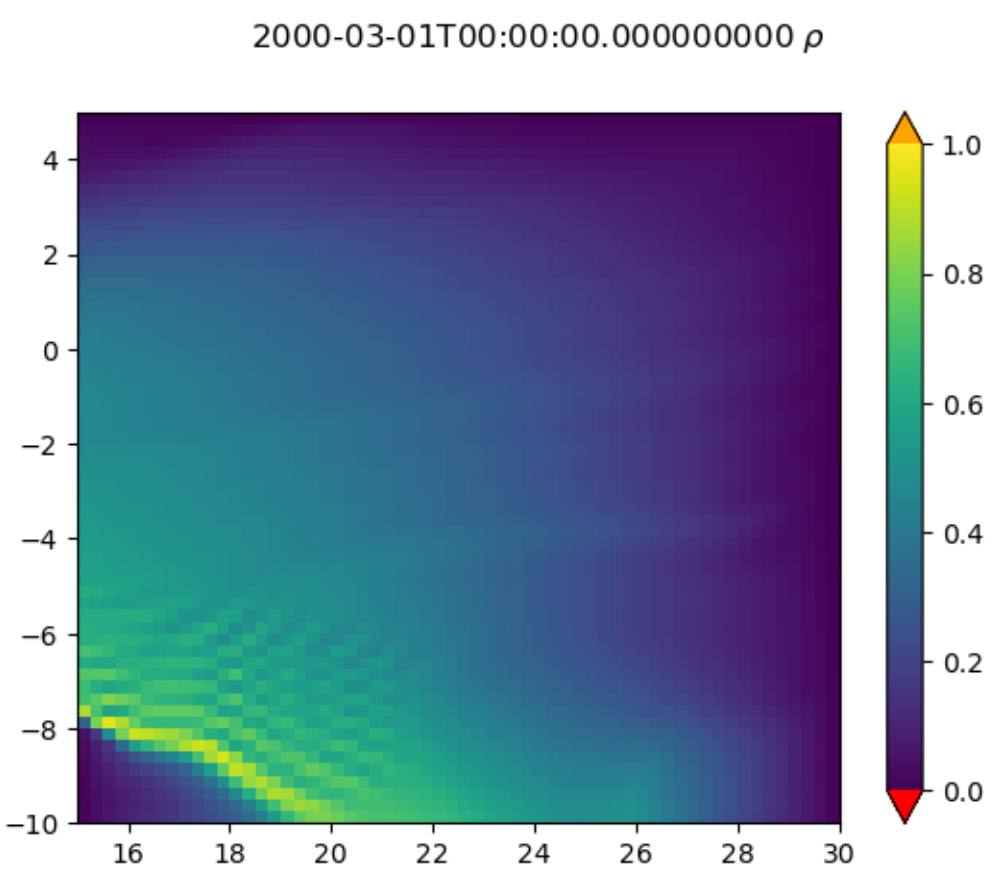
−4
−6
−8
−10
16
18
20
22
24
26
28
30
4.5
4.0
3.5
3.0
2.5
2.0
1.5
E (scaled)


2000-03-01T00:00:00.000000000 ρ
4
2
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−4
−6
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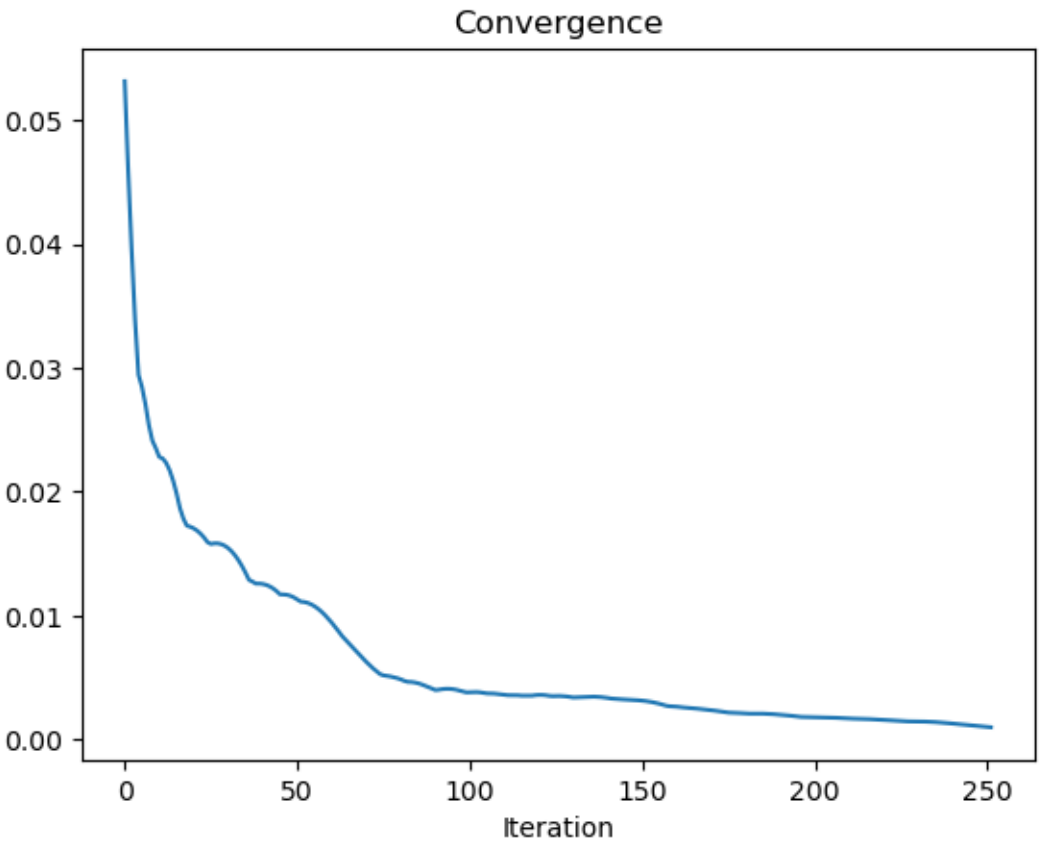
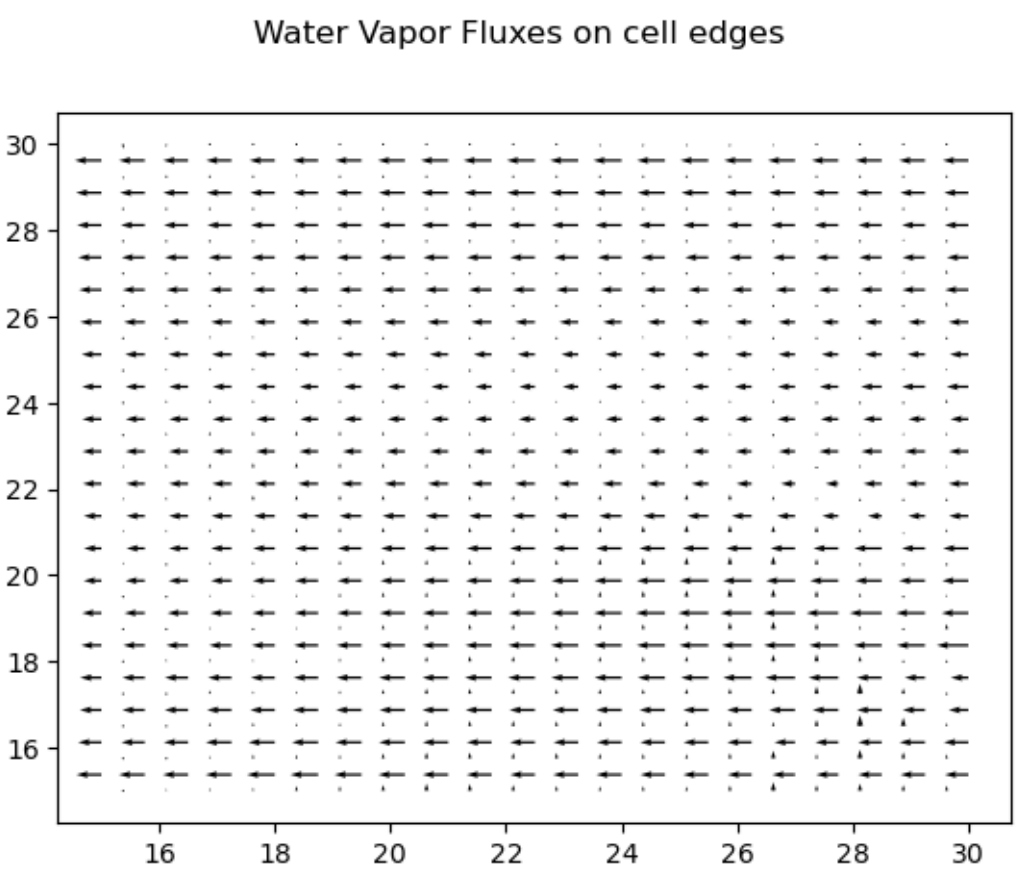
22
24
26
28
30
1.0
0.8
0.6
0.4
0.2
0.0




```
INFO:bulk_recycling_model.main:Converged in 209 iterations and 0:00:01.861986
3 2000-04-01T00:00:00.000000000
209
```


Water Vapor Fluxes on cell edges
30
28
26
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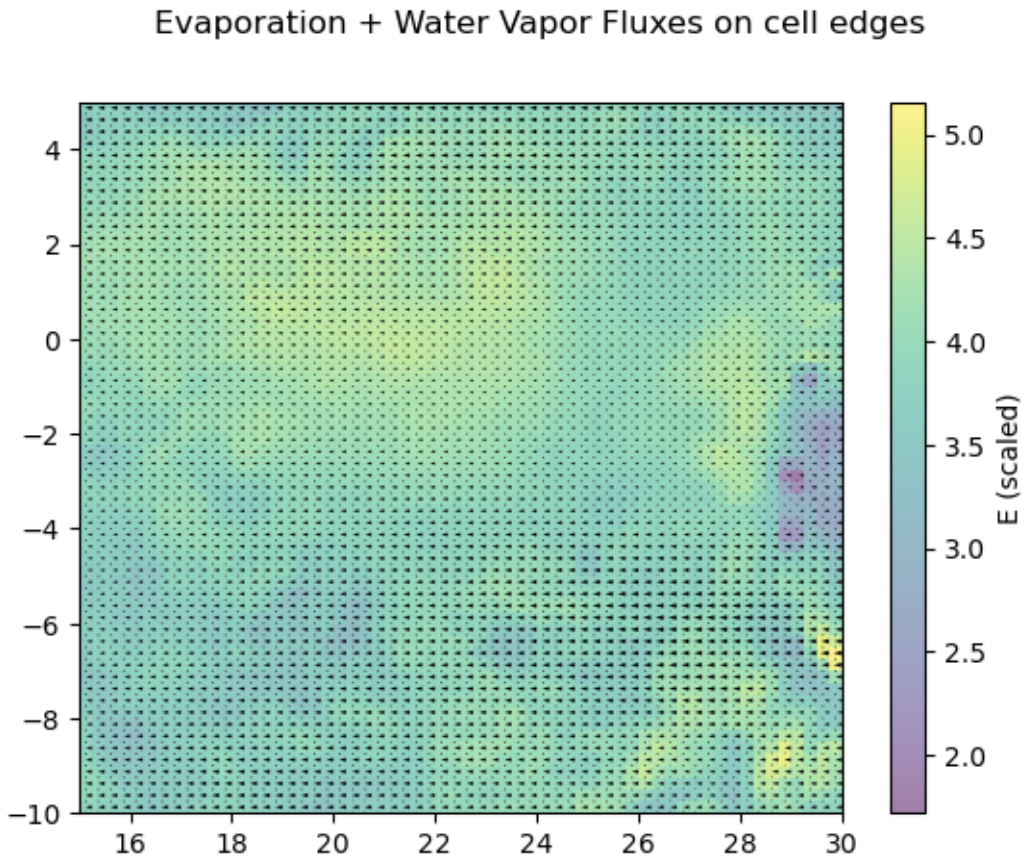
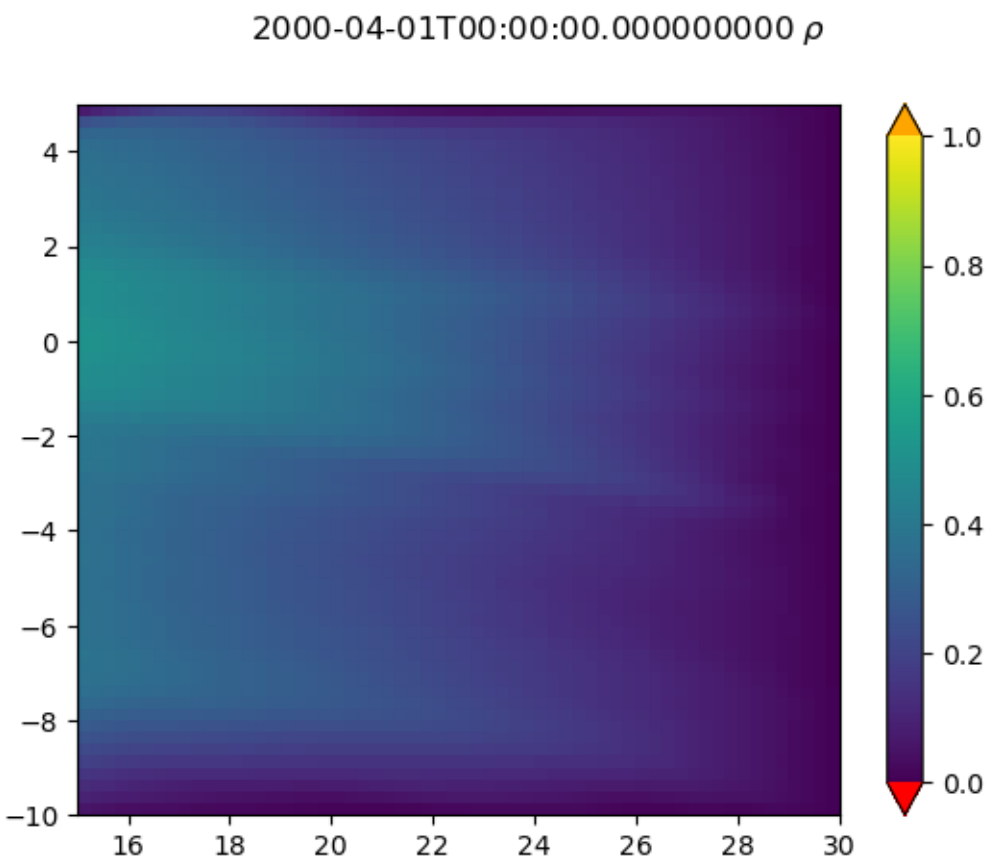
28
30


Evaporation + Water Vapor Fluxes on cell edges
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
5.0
4.5
4.0
3.5
3.0
2.5
2.0
E (scaled)


2000-04-01T00:00:00.000000000 ρ
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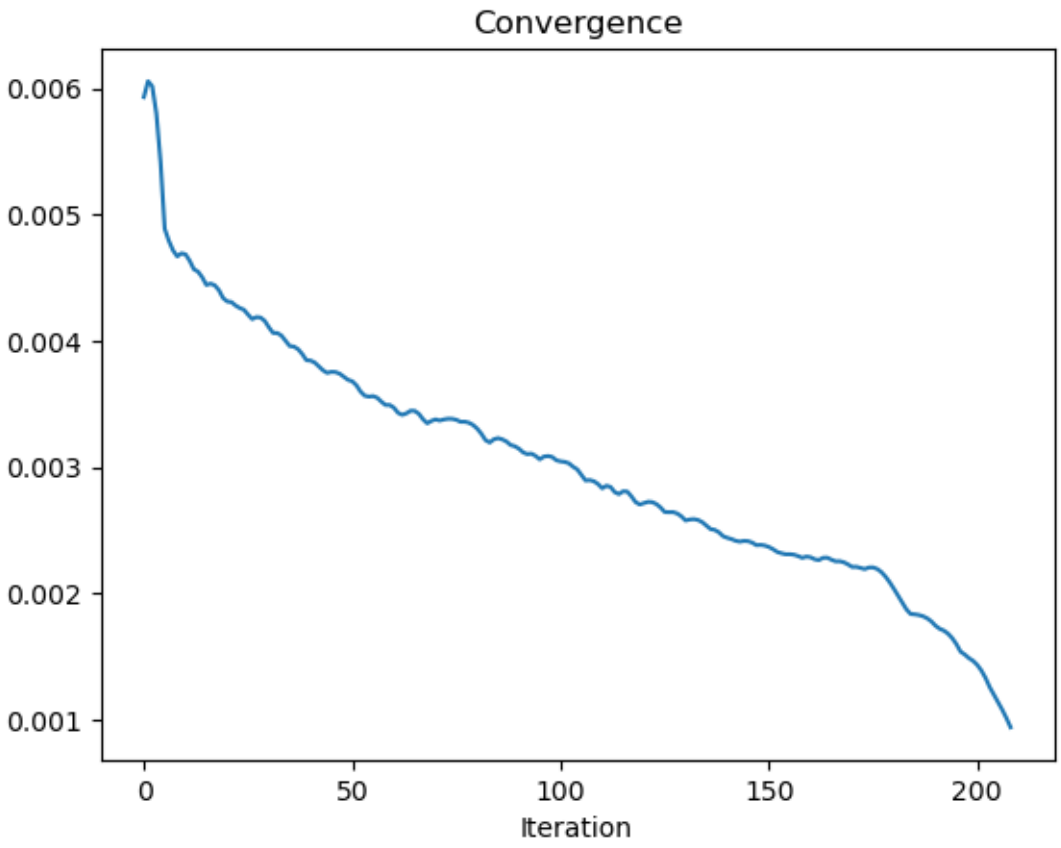
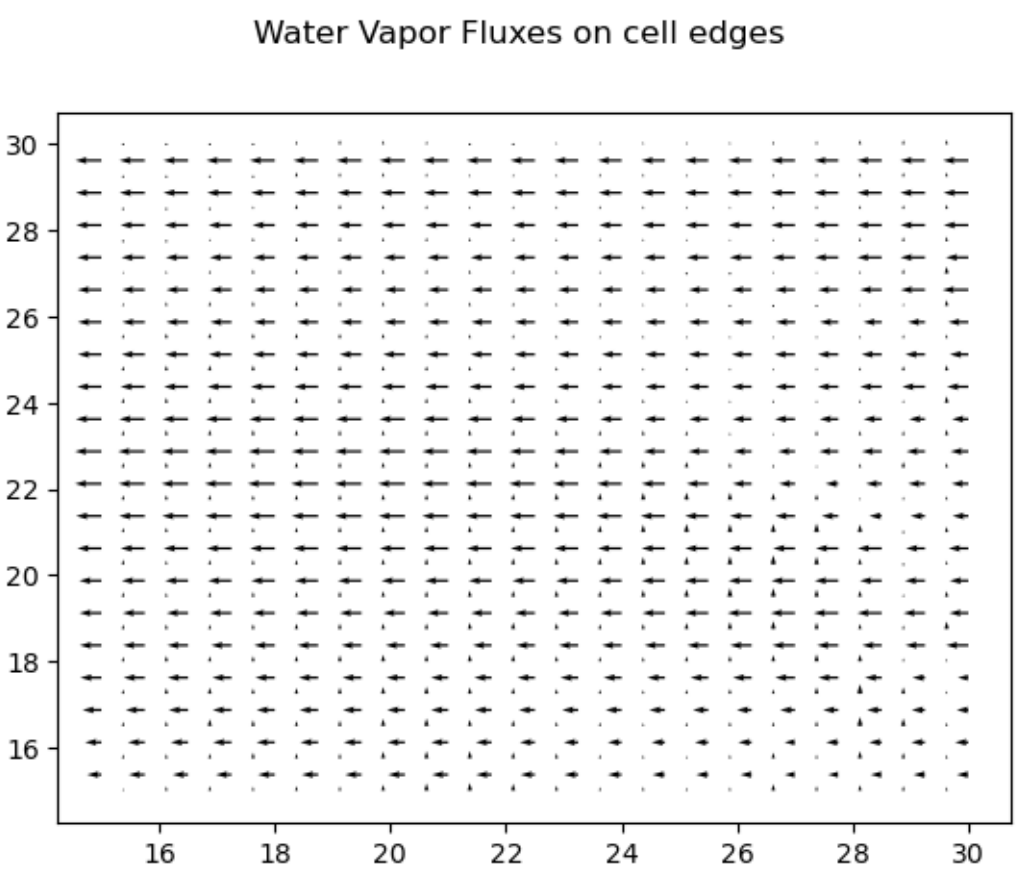
30
1.0
0.8
0.6
0.4
0.2
0.0




```
INFO:bulk_recycling_model.main:Converged in 378 iterations and 0:00:03.505664

4 2000-05-01T00:00:00.000000000
378
```


Water Vapor Fluxes on cell edges
30
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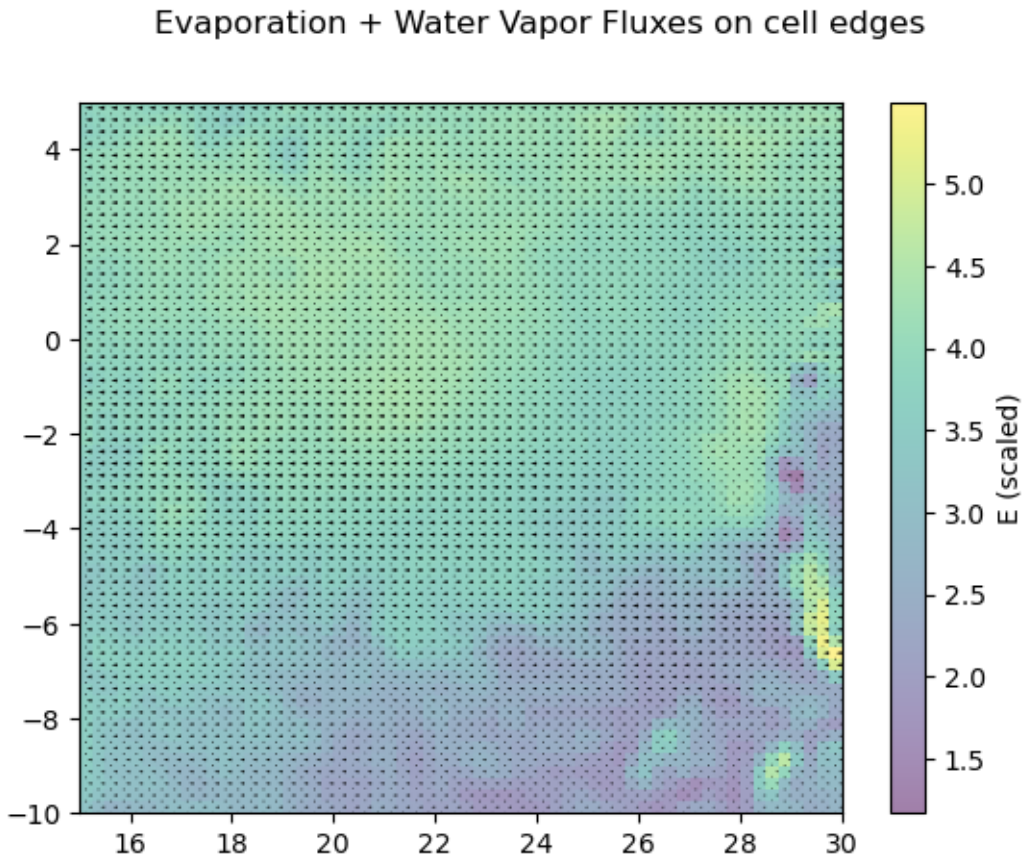
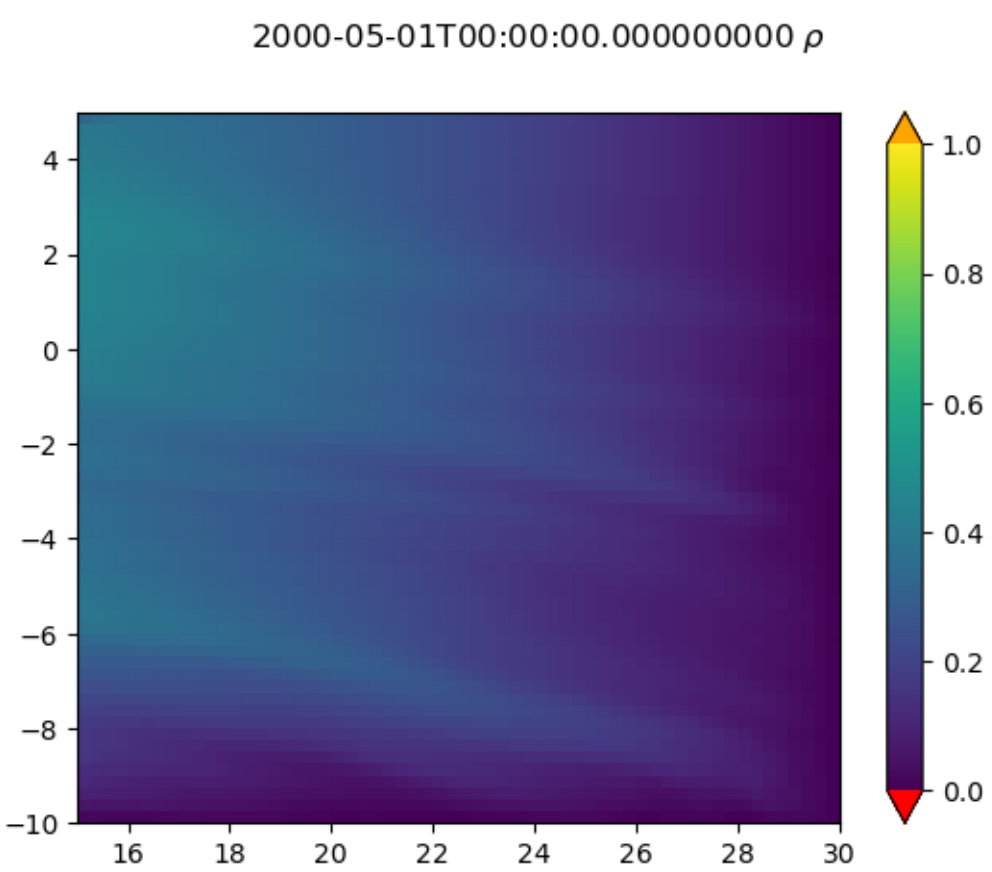
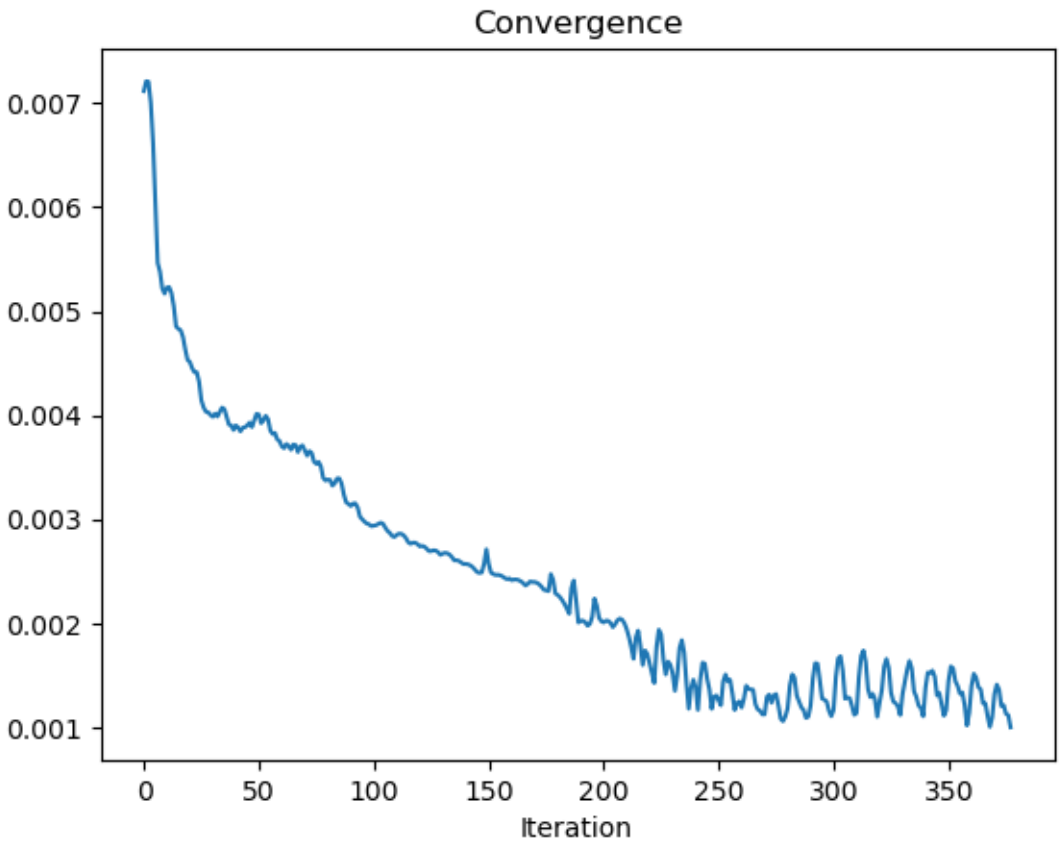
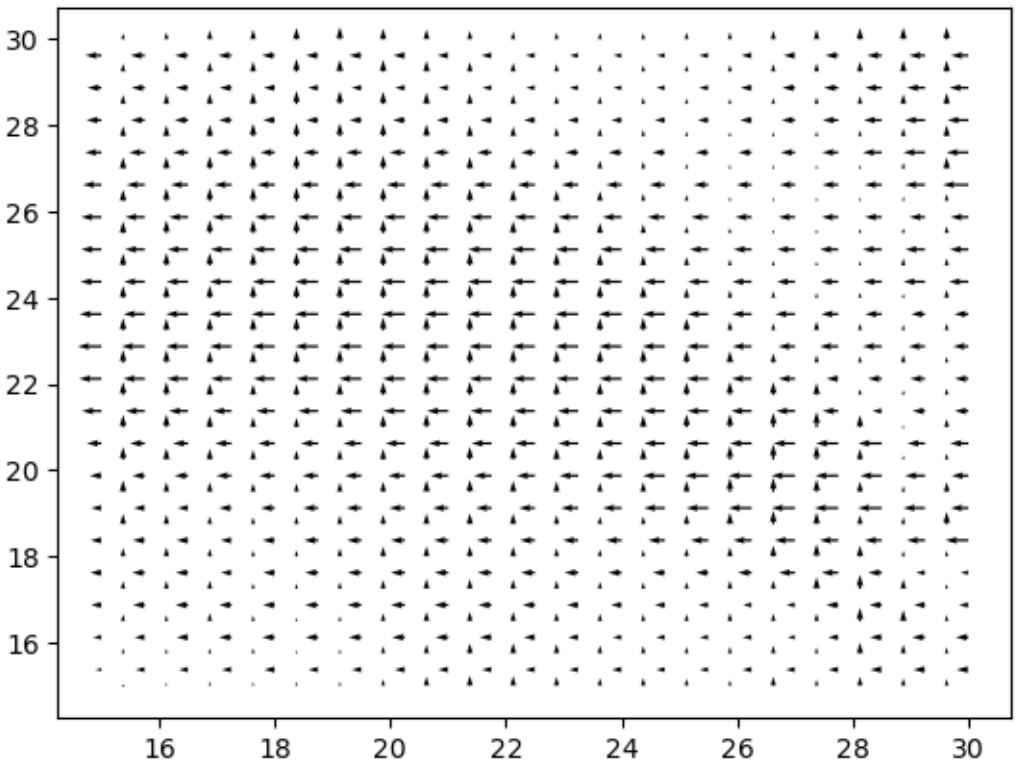
28
30

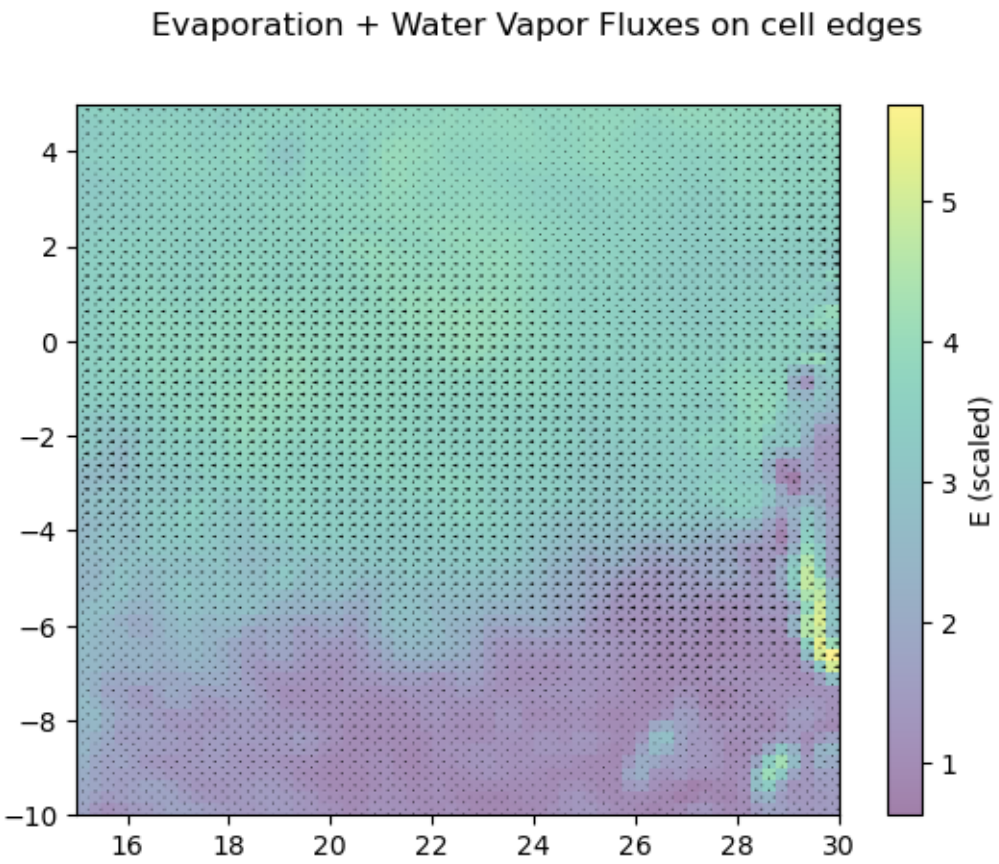

Evaporation + Water Vapor Fluxes on cell edges
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
5.0
4.5
4.0
3.5
3.0
2.5
2.0
1.5
E (scaled)

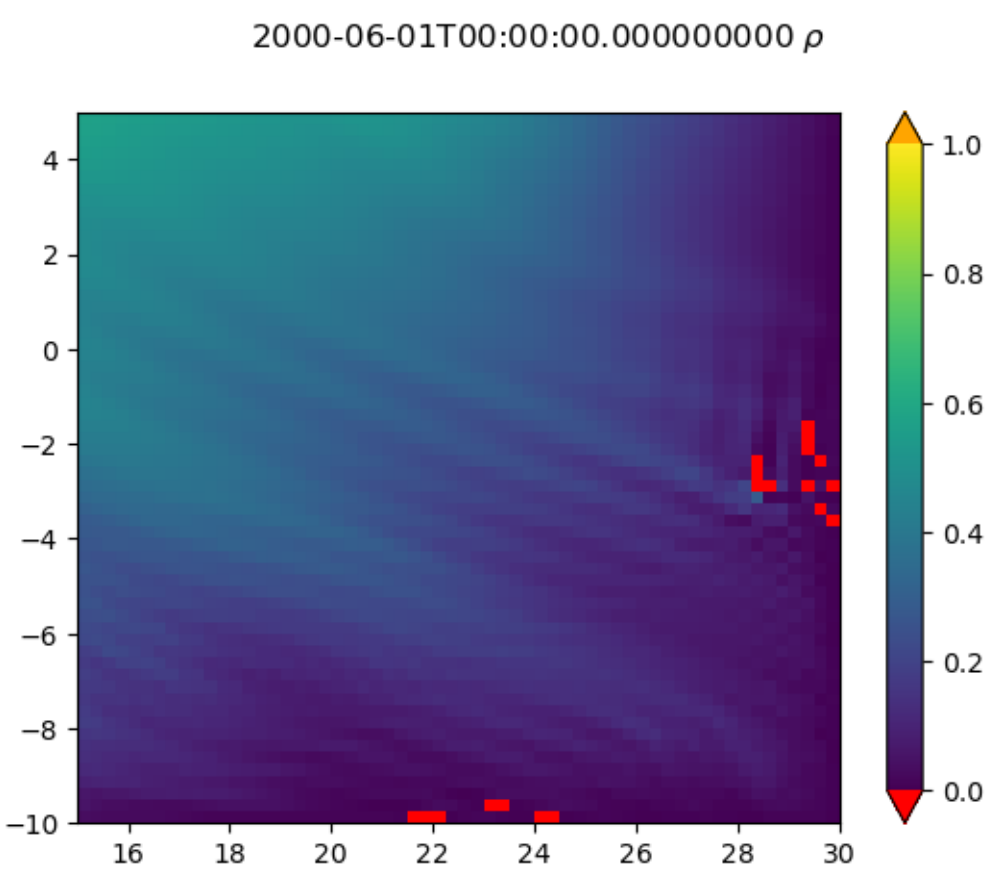

2000-05-01T00:00:00.000000000 ρ
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
1.0
0.8
0.6
0.4
0.2
0.0

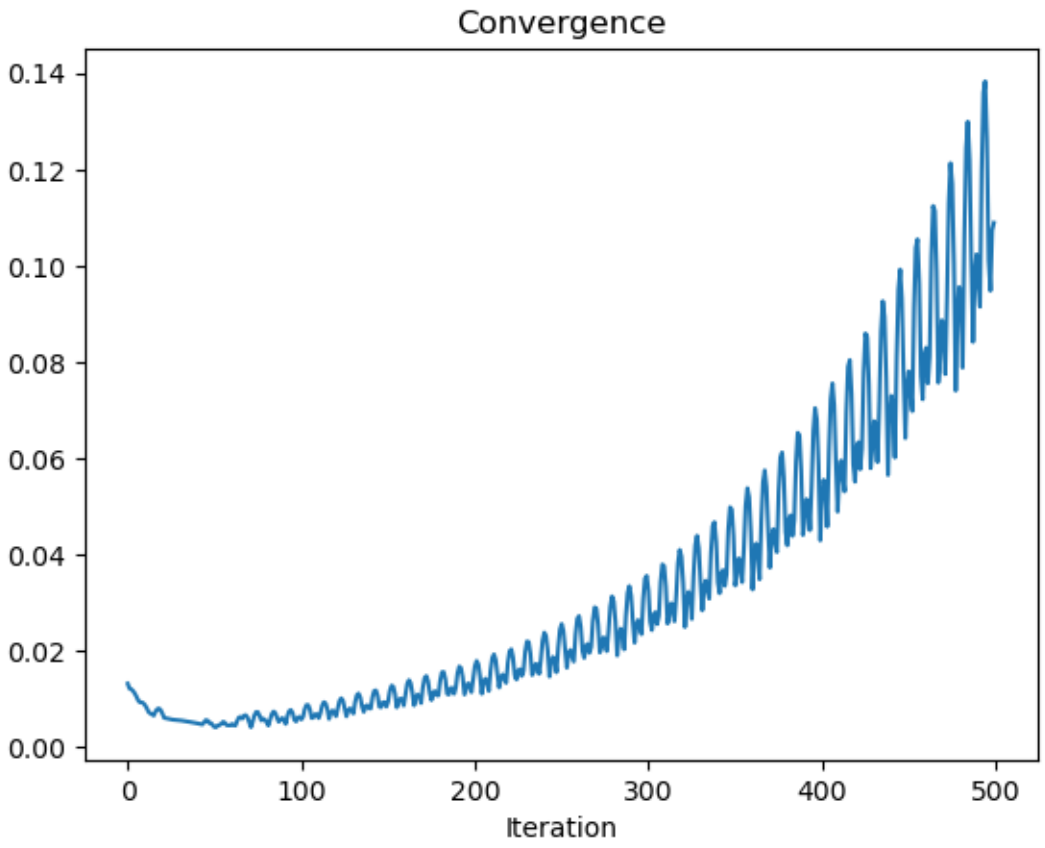



```
WARNING:bulk_recycling_model.main:Did not converge in 500 iterations
5 2000-06-01T00:00:00.000000000
500
```

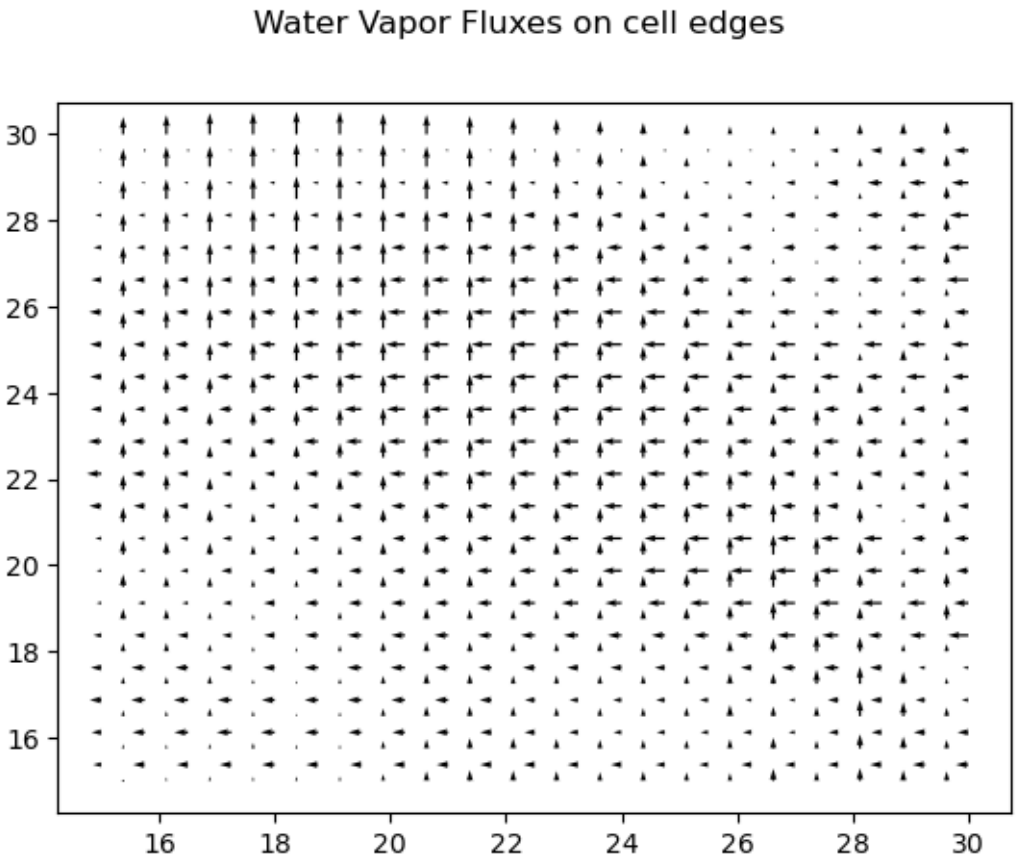

Water Vapor Fluxes on cell edges
30
28
26
24
22
20
18
16
16
18
20
22
24
26
28
30

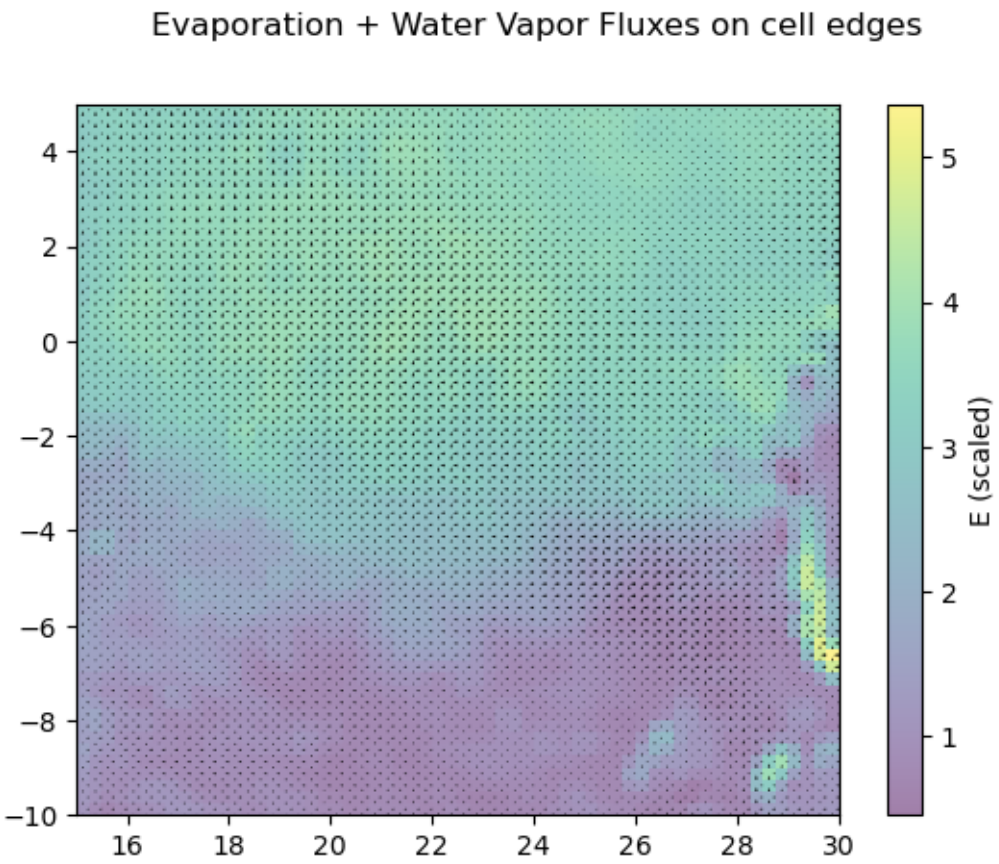

Evaporation + Water Vapor Fluxes on cell edges
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
5
4
3
2
1
E (scaled)

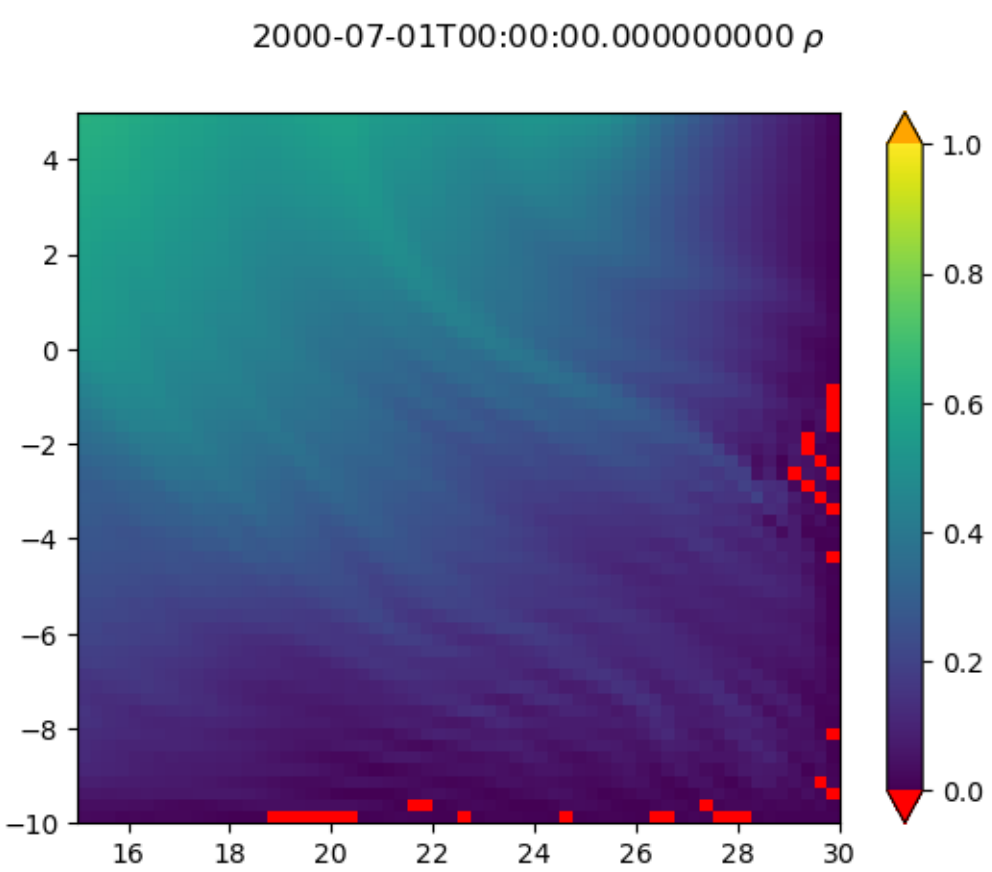

2000-06-01T00:00:00.000000000 ρ
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
1.0
0.8
0.6
0.4
0.2
0.0

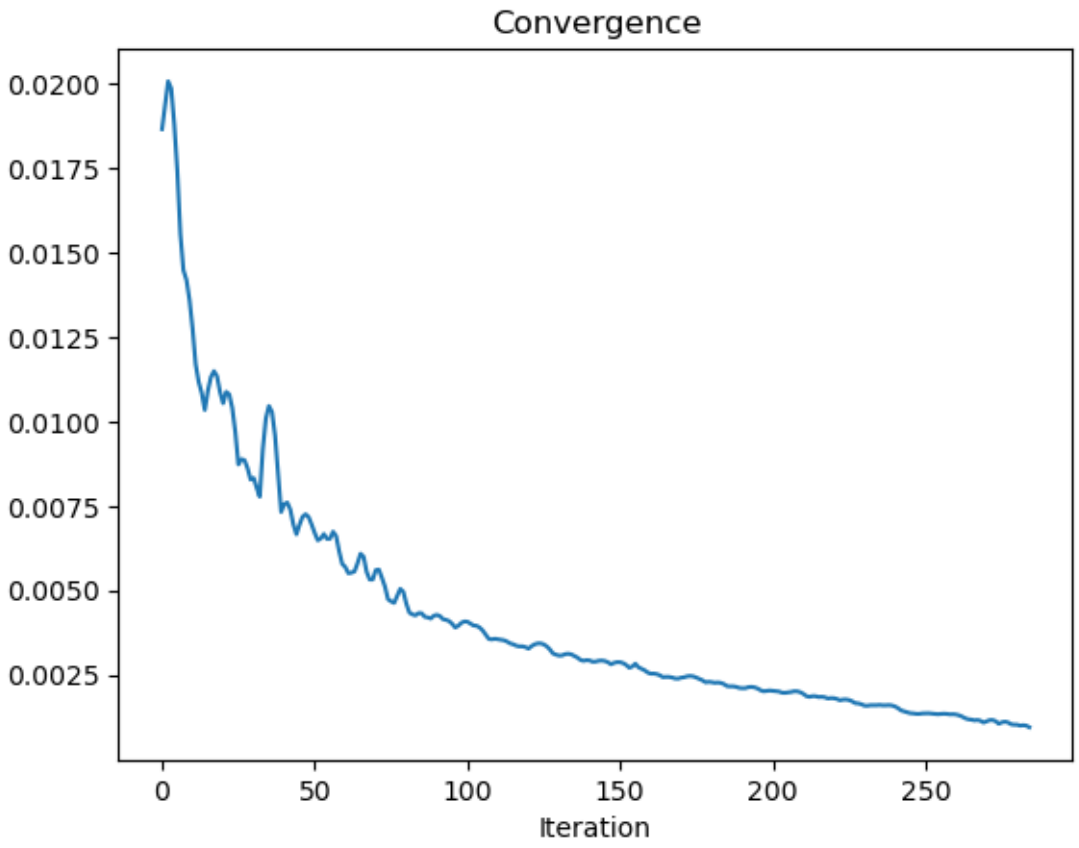



```
INFO:bulk_recycling_model.main:Converged in 285 iterations and 0:00:02.533190

6 2000-07-01T00:00:00.000000000
285
```

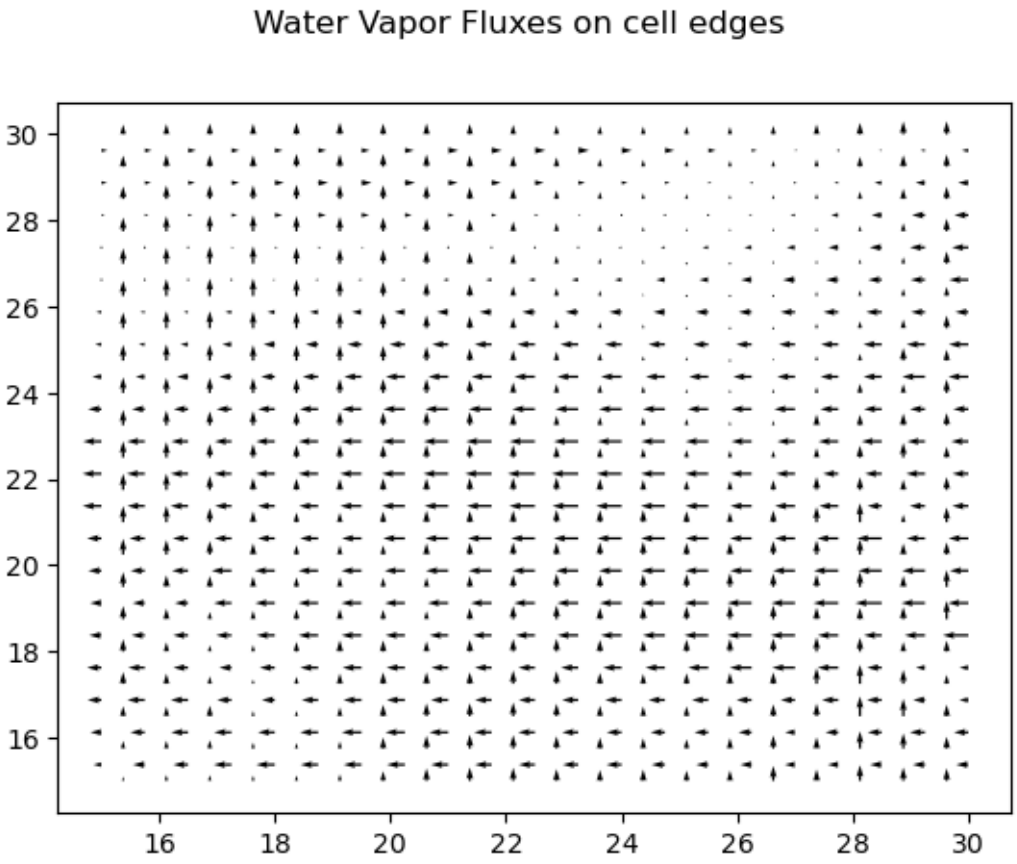

Water Vapor Fluxes on cell edges
30
28
26
24
22
20
18
16
16
18
20
22
24
26
28
30

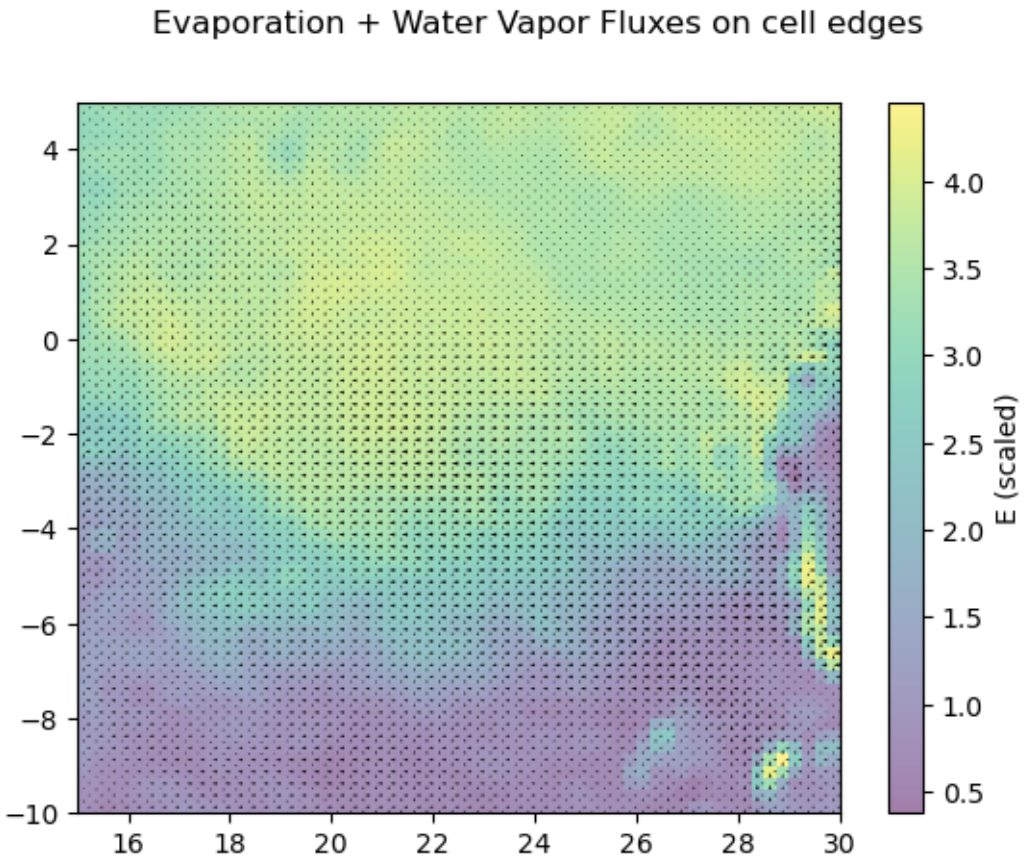

Evaporation + Water Vapor Fluxes on cell edges
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
5
4
3
2
1
E (scaled)

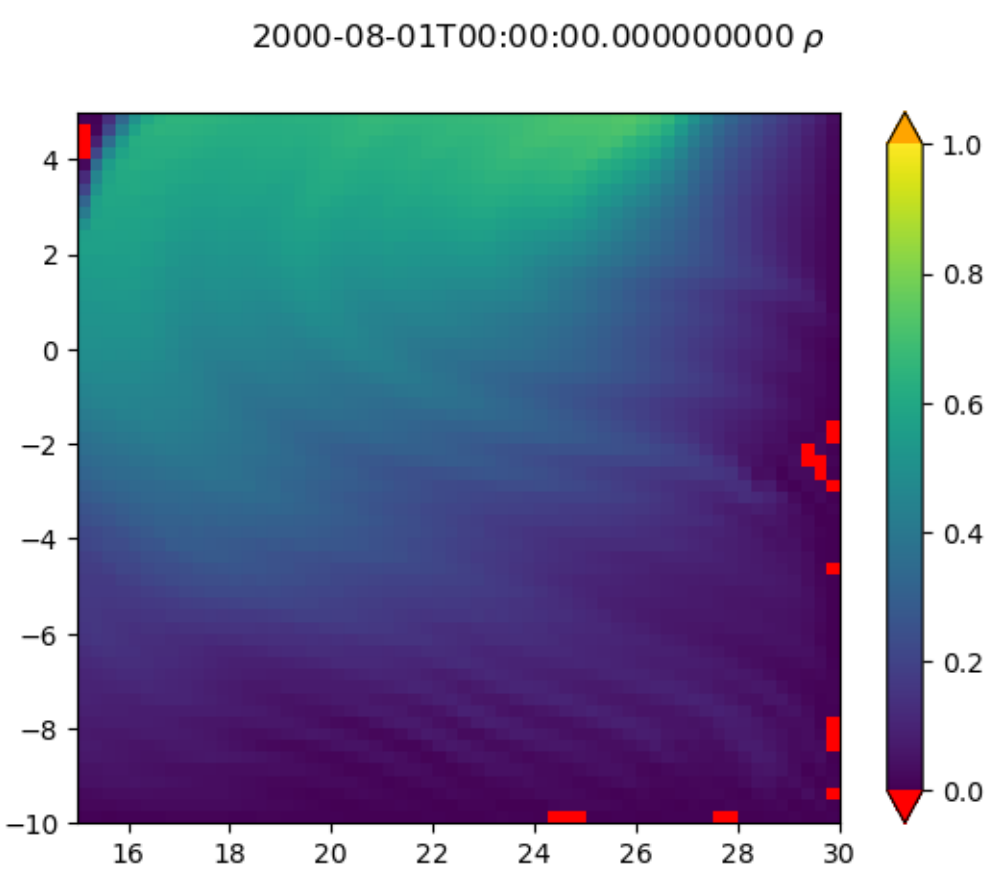

2000-07-01T00:00:00.000000000 ρ
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
1.0
0.8
0.6
0.4
0.2
0.0

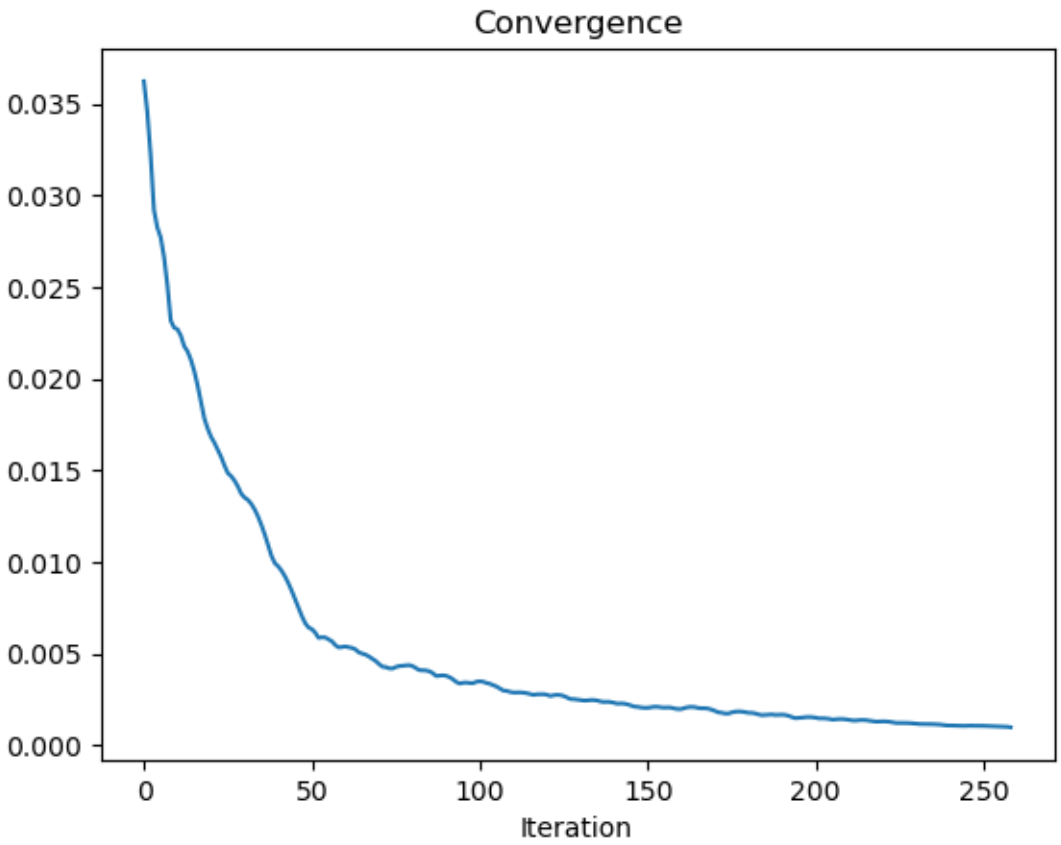



```
INFO:bulk_recycling_model.main:Converged in 259 iterations and 0:00:02.224706

7 2000-08-01T00:00:00.000000000
259
```

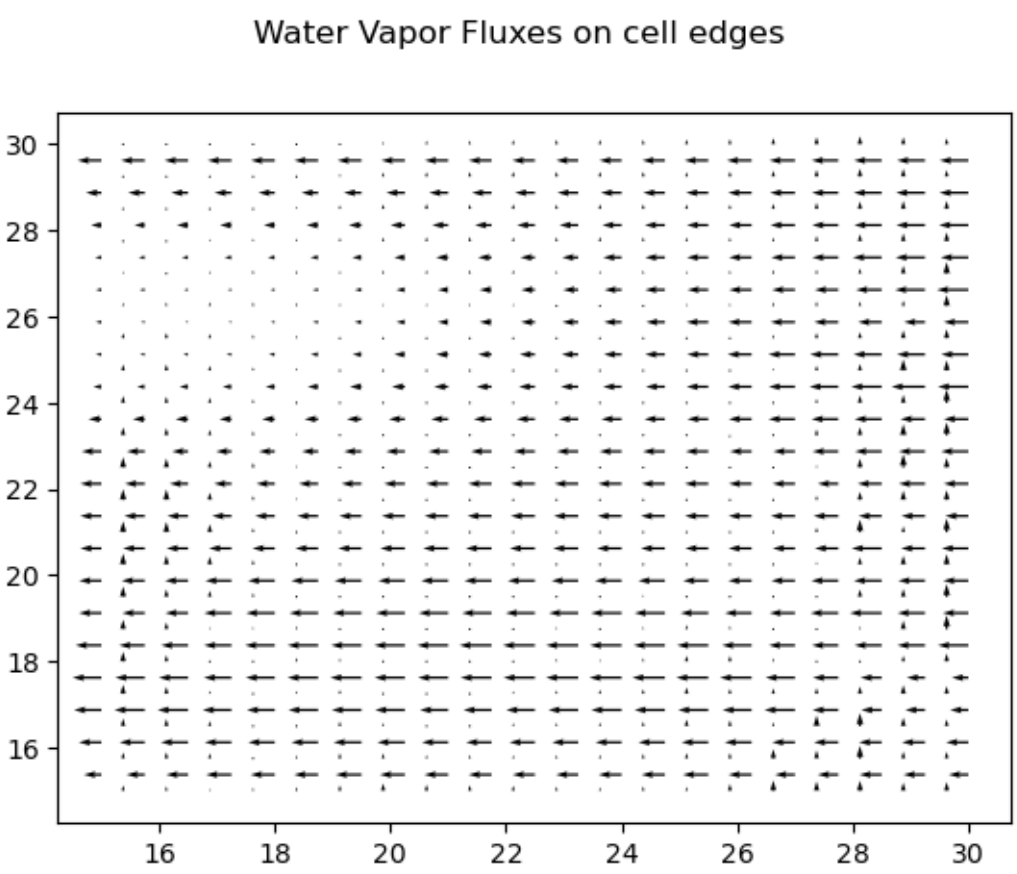

Water Vapor Fluxes on cell edges
30
28
26
24
22
20
18
16
16
18
20
22
24
26
28
30

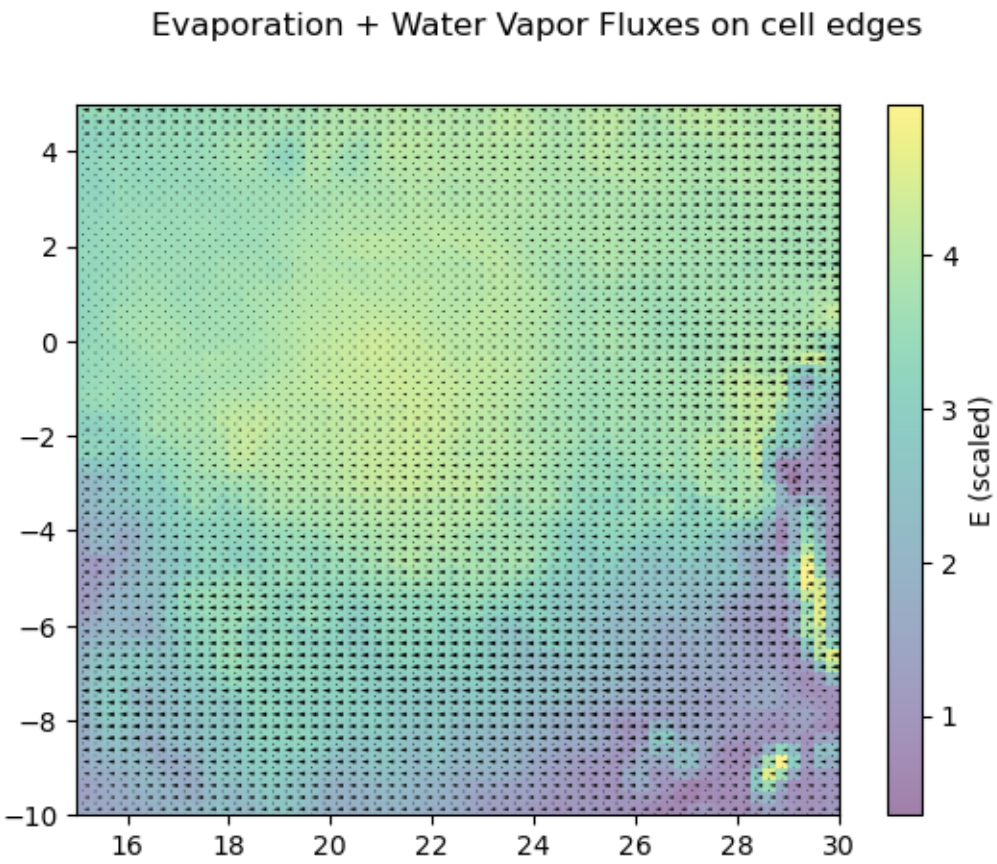

Evaporation + Water Vapor Fluxes on cell edges
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
4.0
3.5
3.0
2.5
2.0
1.5
1.0
0.5
E (scaled)

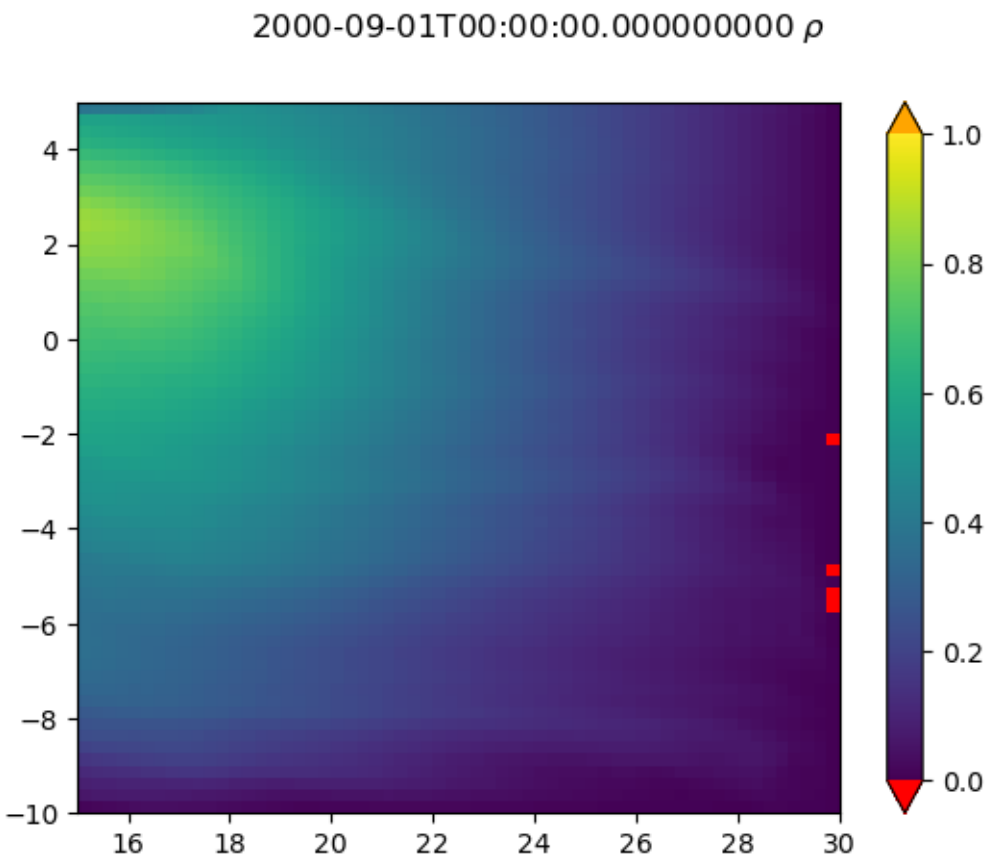

2000-08-01T00:00:00.000000000 ρ
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
1.0
0.8
0.6
0.4
0.2
0.0

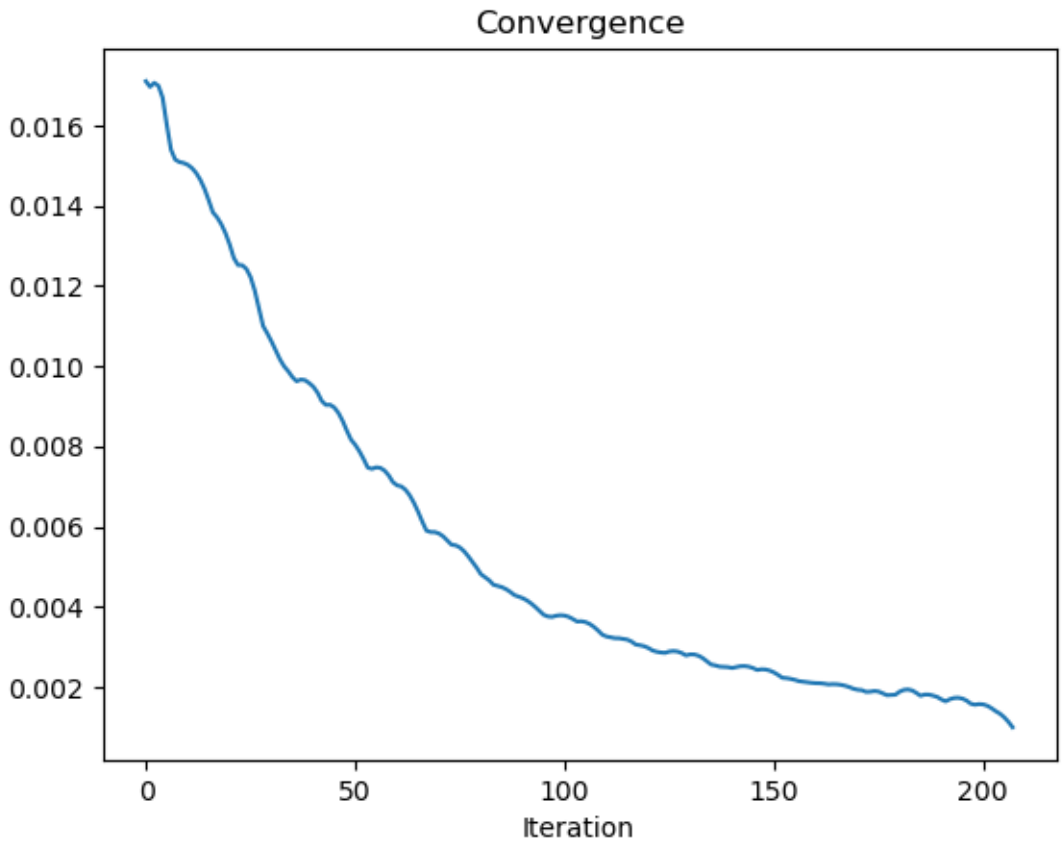



```
INFO:bulk_recycling_model.main:Converged in 208 iterations and 0:00:01.812280

8 2000-09-01T00:00:00.000000000
208
```

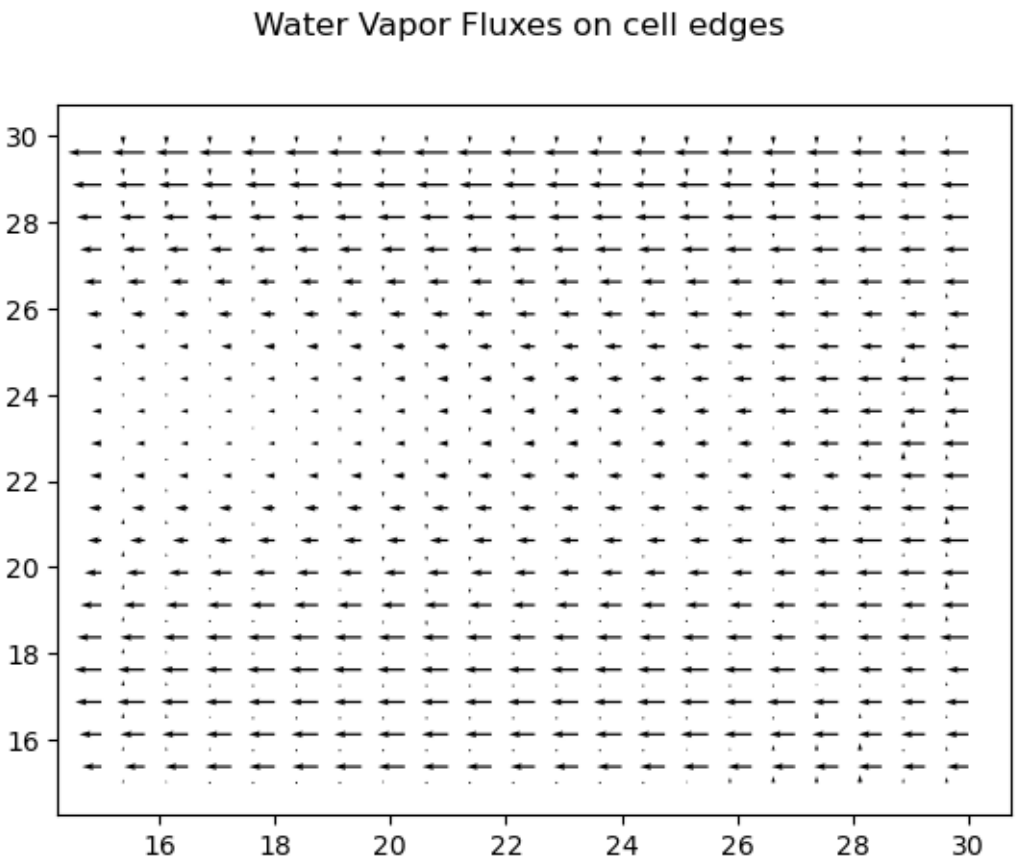

Water Vapor Fluxes on cell edges
30
28
26
24
22
20
18
16
16
18
20
22
24
26
28
30

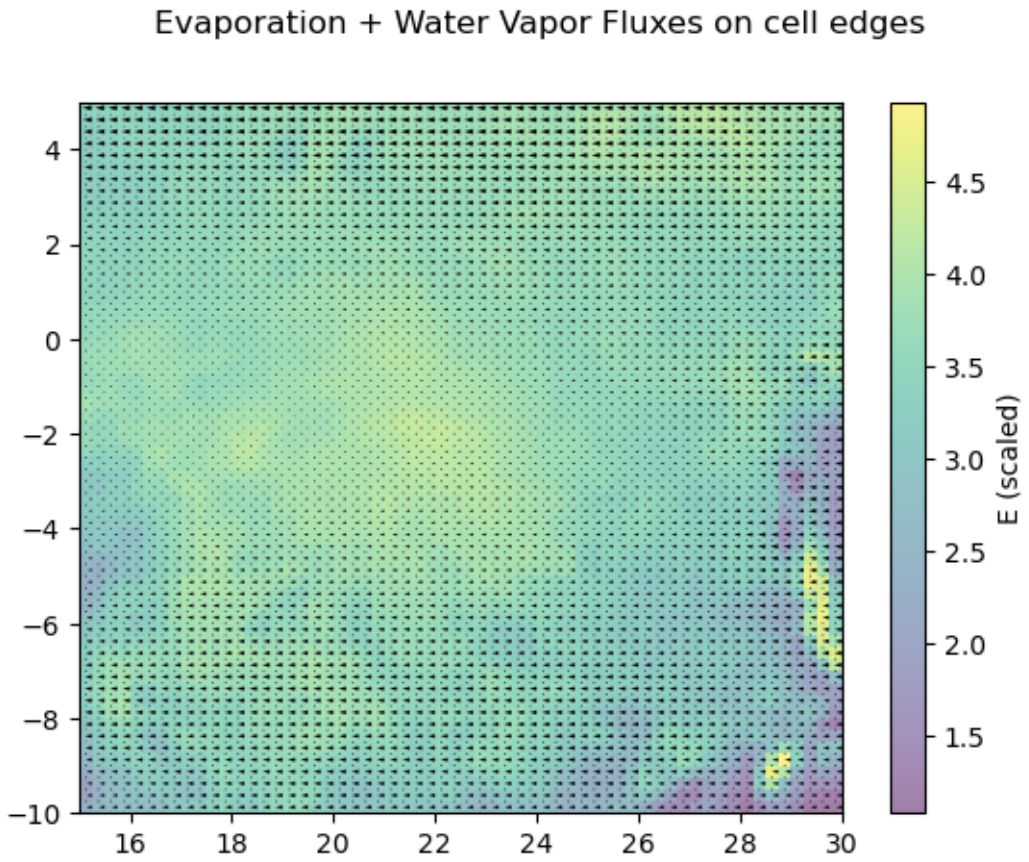

Evaporation + Water Vapor Fluxes on cell edges
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
E (scaled)
4
3
2
1

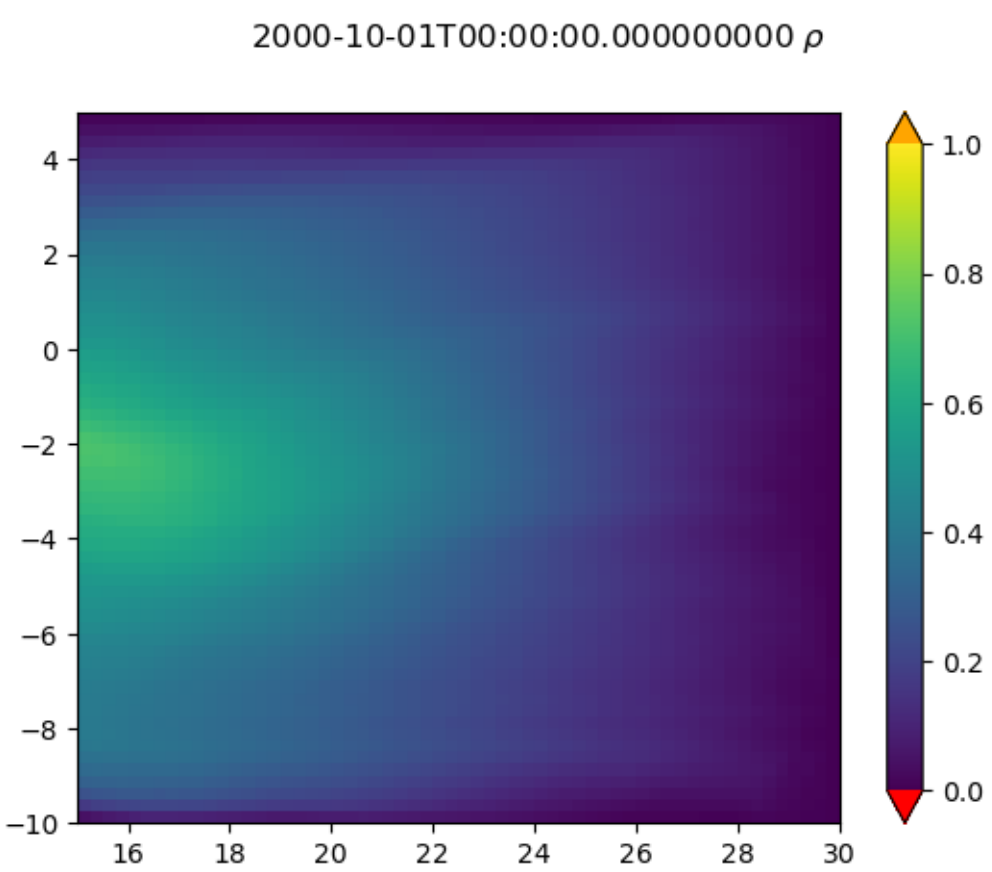

2000-09-01T00:00:00.000000000 ρ
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
1.0
0.8
0.6
0.4
0.2
0.0

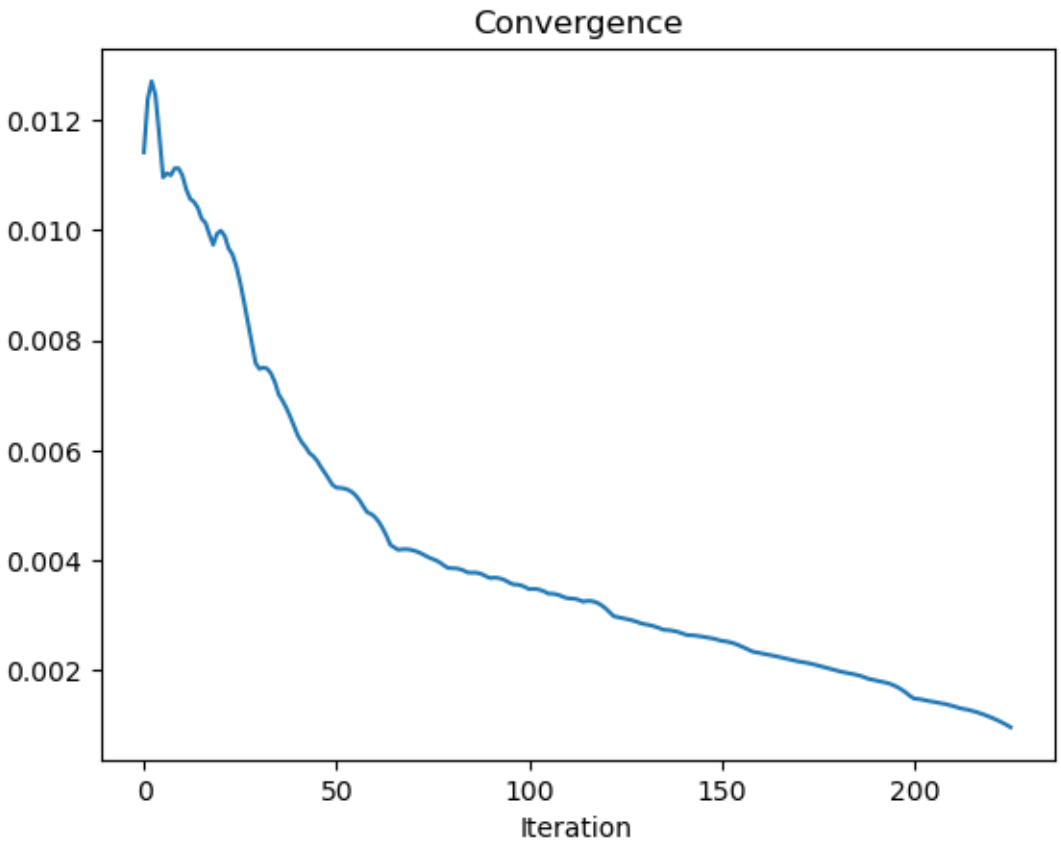



```
INFO:bulk_recycling_model.main:Converged in 226 iterations and 0:00:01.978841

9 2000-10-01T00:00:00.000000000
226
```

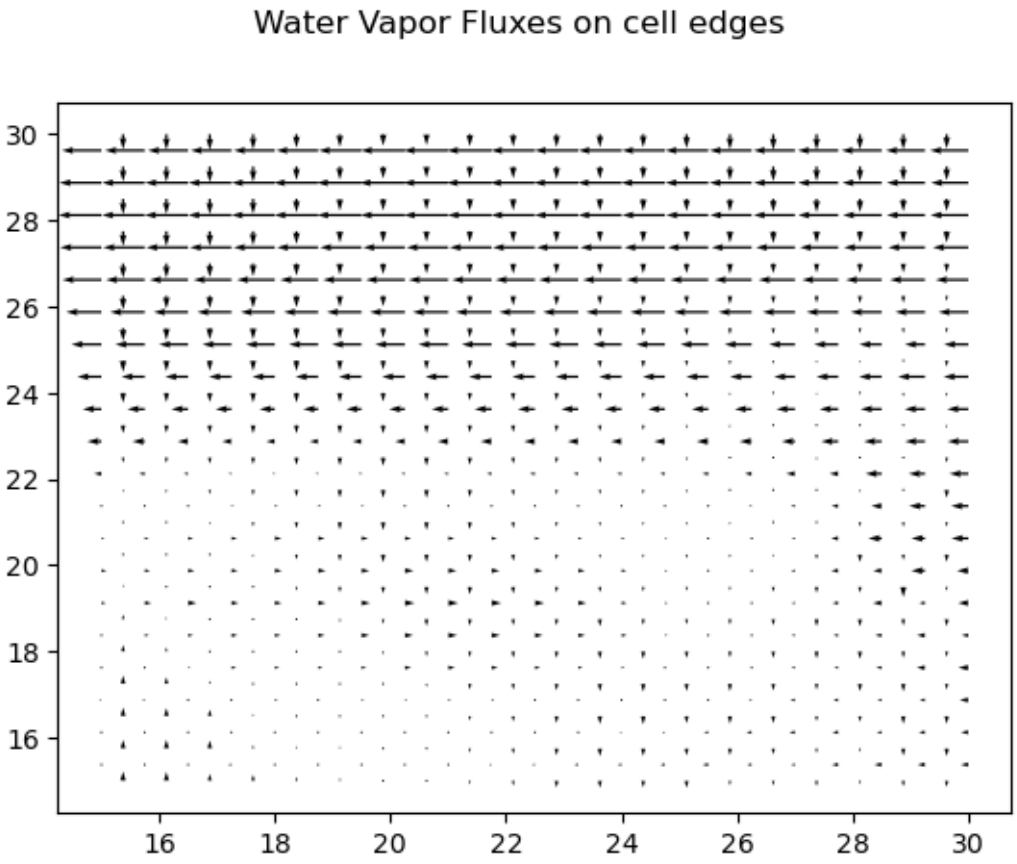

Water Vapor Fluxes on cell edges
30
28
26
24
22
20
18
16
16
18
20
22
24
26
28
30

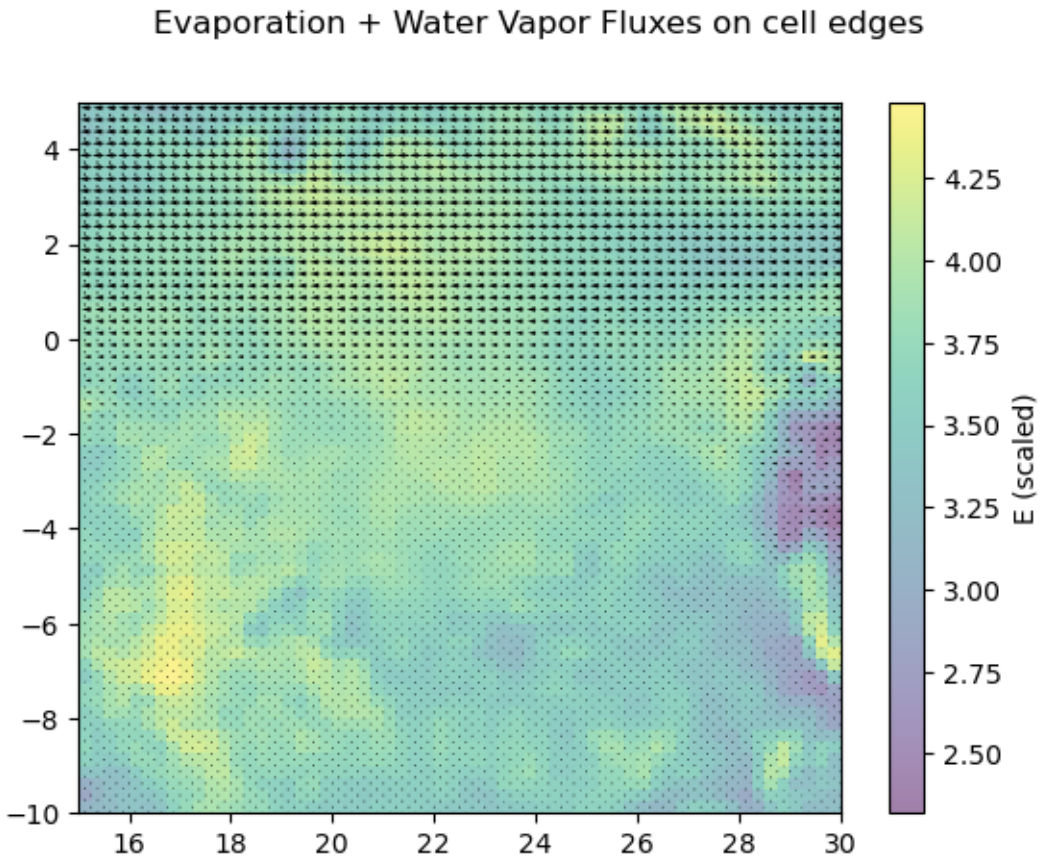

Evaporation + Water Vapor Fluxes on cell edges
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
4.5
4.0
3.5
3.0
2.5
2.0
1.5
E (scaled)

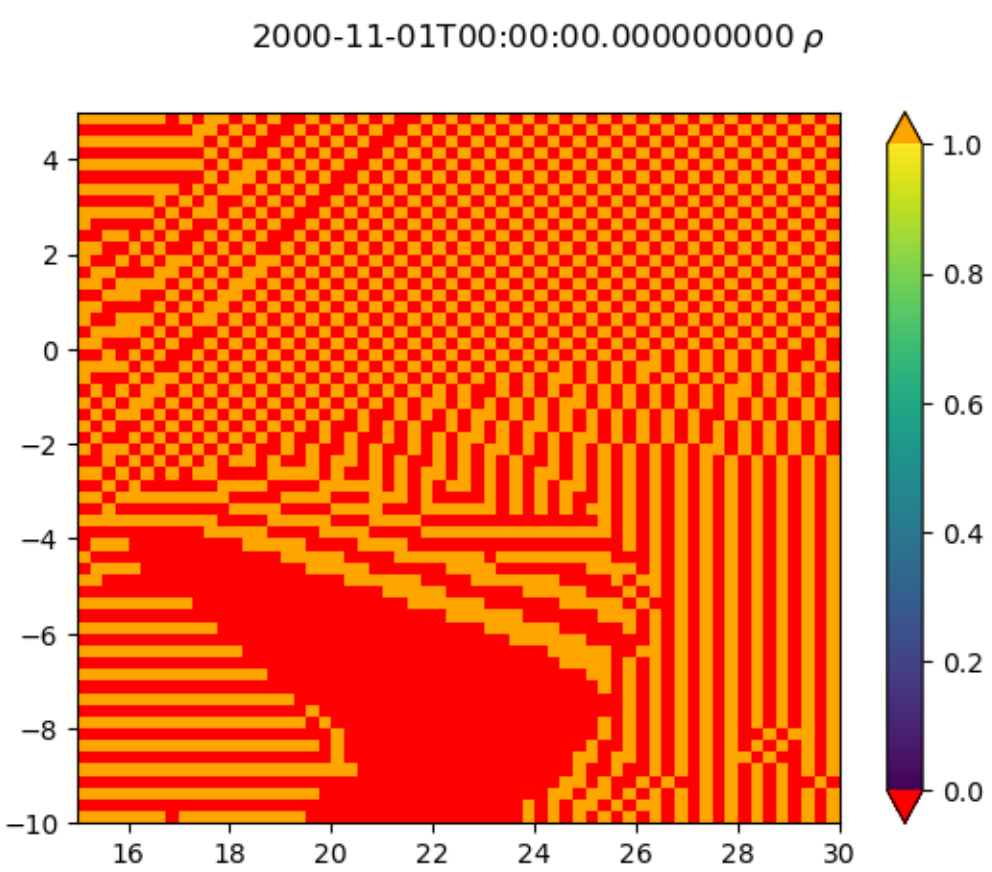

2000-10-01T00:00:00.000000000 ρ
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
1.0
0.8
0.6
0.4
0.2
0.0

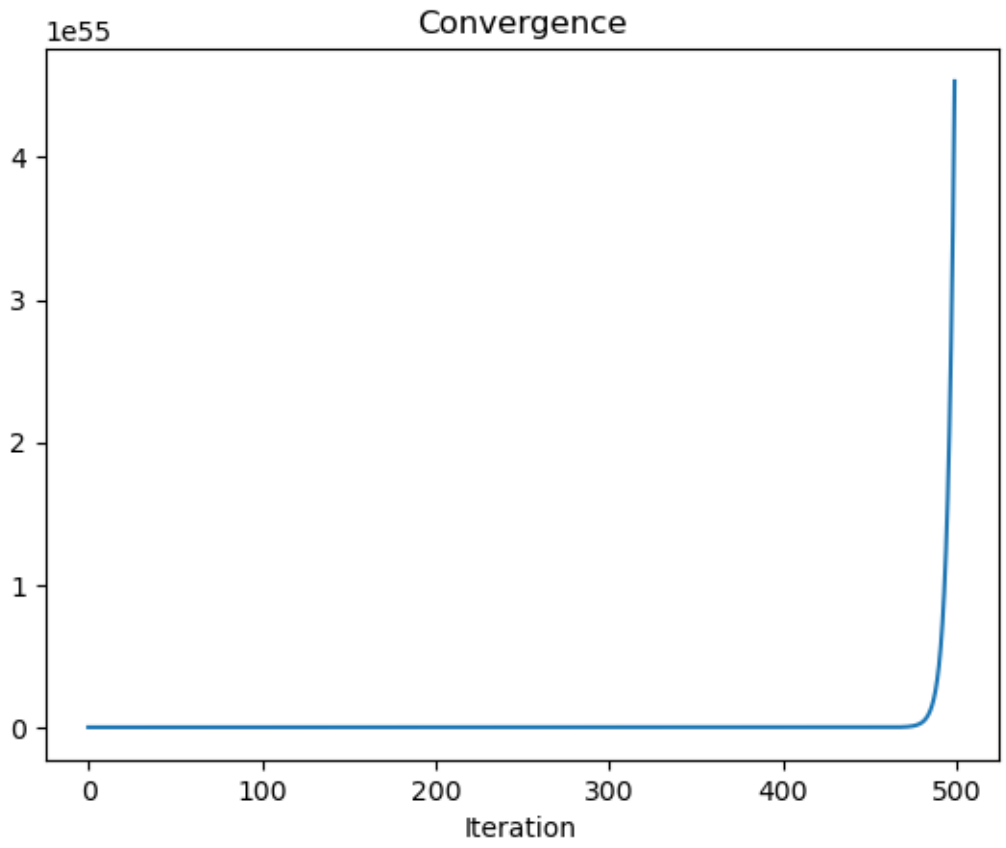



```
WARNING:bulk_recycling_model.main:Did not converge in 500 iterations
10 2000-11-01T00:00:00.000000000
500
```

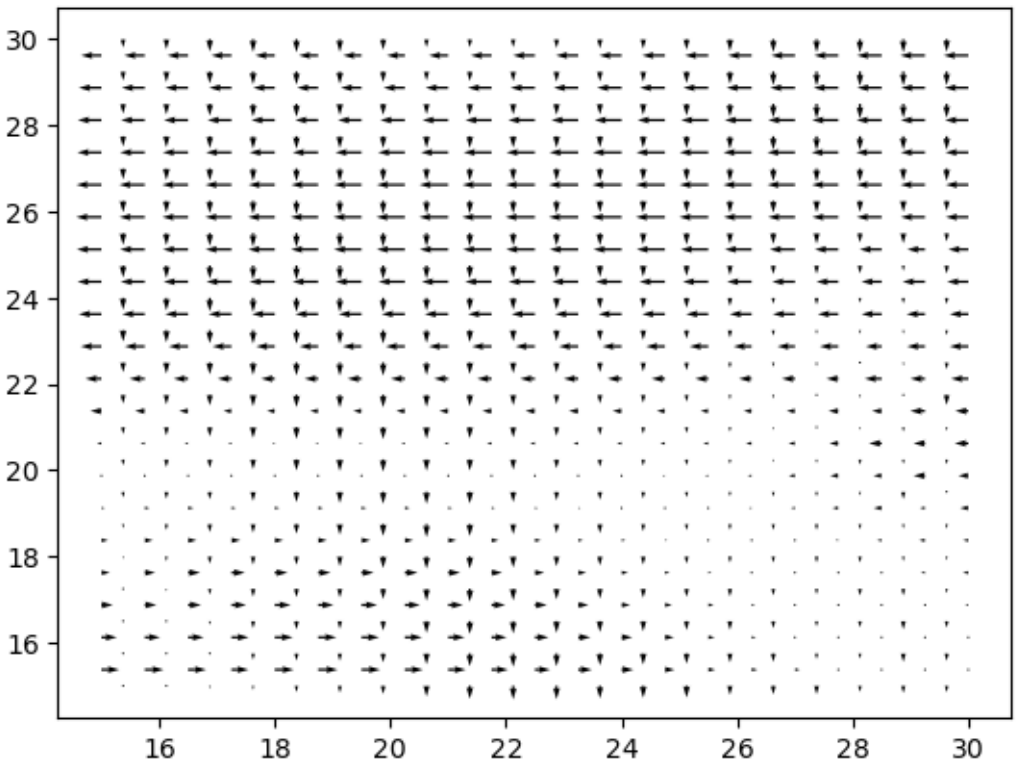

Water Vapor Fluxes on cell edges
30
28
26
24
22
20
18
16
16
18
20
22
24
26
28
30

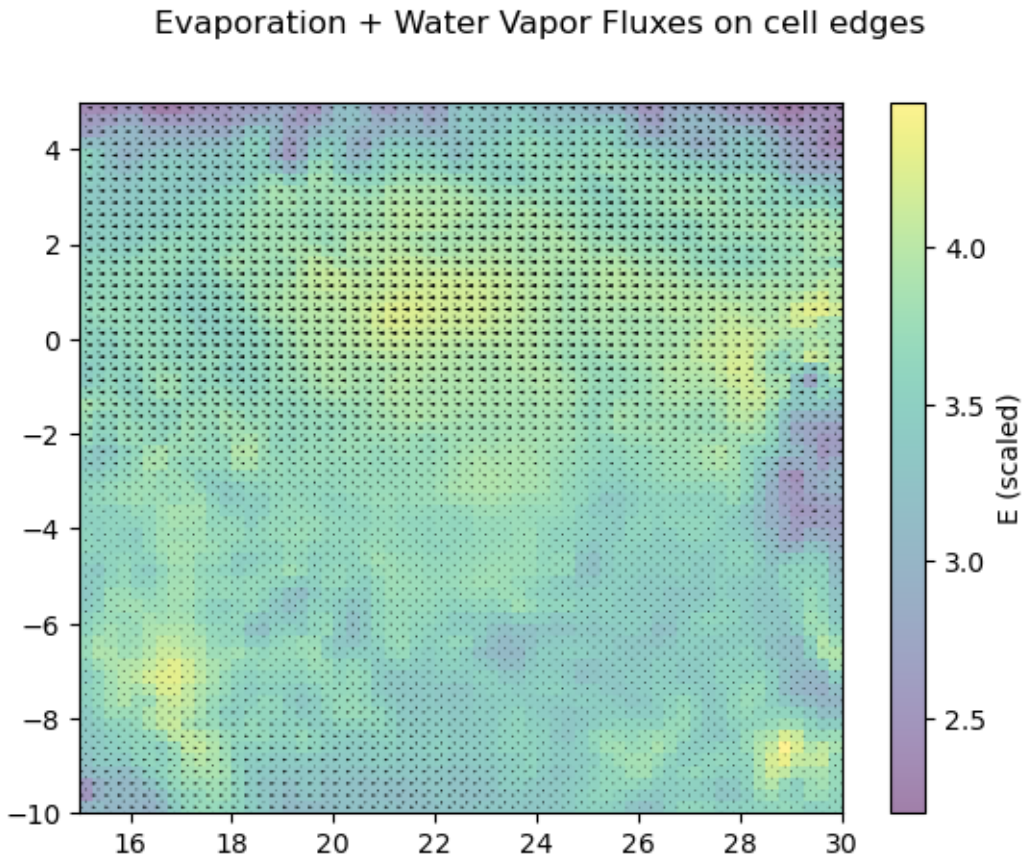

Evaporation + Water Vapor Fluxes on cell edges
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
4.25
4.00
3.75
3.50
3.25
3.00
2.75
2.50
E (scaled)

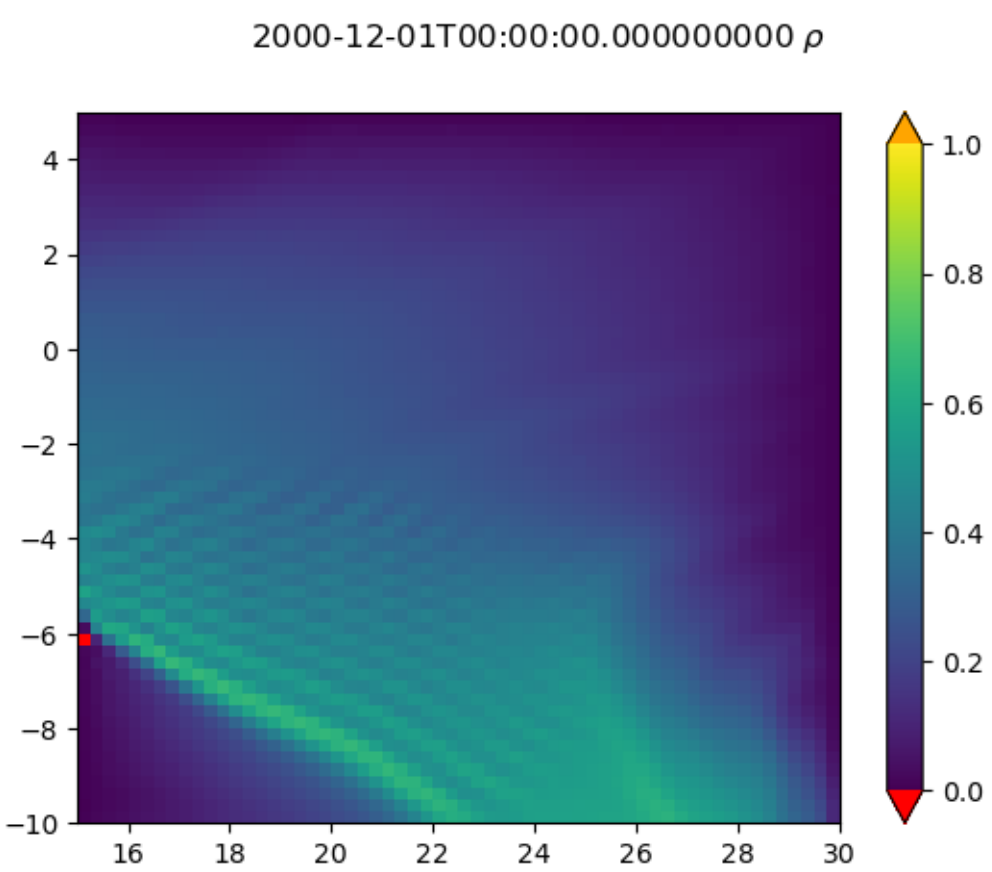

2000-11-01T00:00:00.000000000 ρ
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
1.0
0.8
0.6
0.4
0.2
0.0

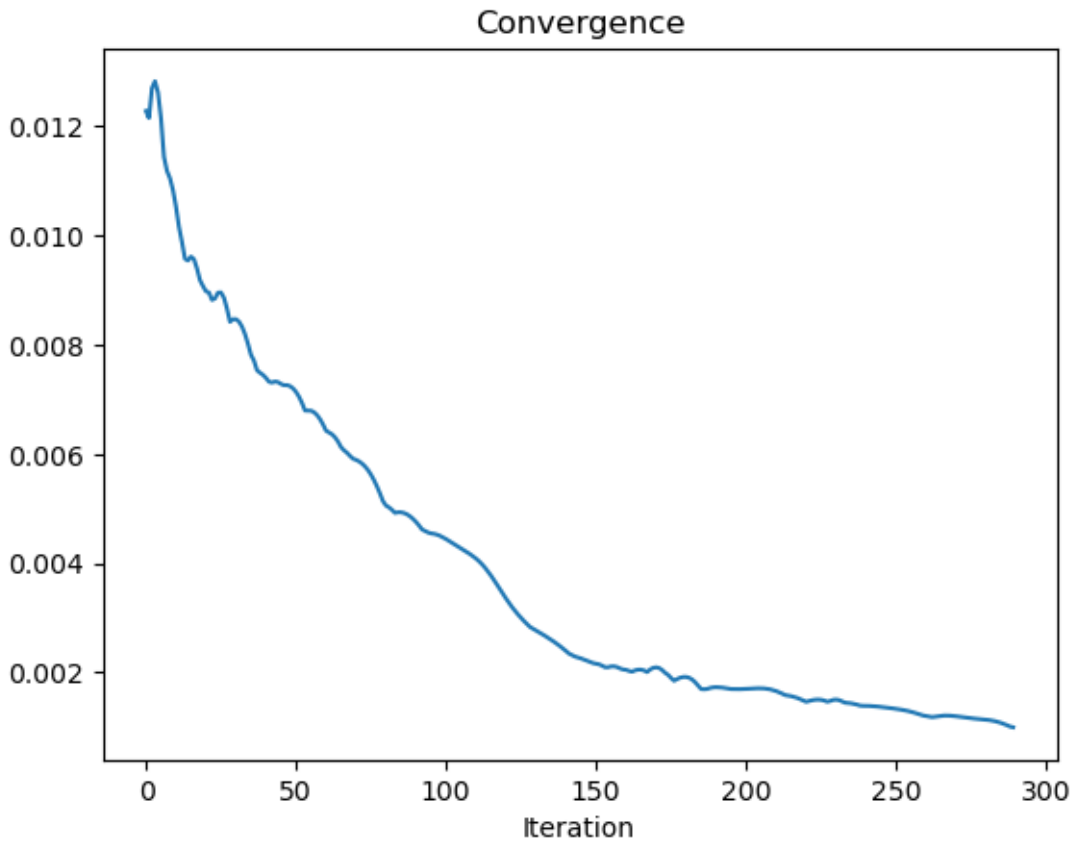



```
INFO:bulk_recycling_model.main:Converged in 290 iterations and 0:00:02.537688

11 2000-12-01T00:00:00.000000000
290
```


Water Vapor Fluxes on cell edges
30
28
26
24
22
20
18
16
16
18
20
22
24
26
28
30


Evaporation + Water Vapor Fluxes on cell edges
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
4.0
3.5
3.0
2.5
E (scaled)


2000-12-01T00:00:00.000000000 ρ
4
2
0
−2
−4
−6
−8
−10
16
18
20
22
24
26
28
30
1.0
0.8
0.6
0.4
0.2
0.0



- Create an xarray to store all of the calculated recycling ratios that is organised in an easy to plot/interpret format
- Count number of values in array over 1 - replace all of these with 1
- Save to file

[ ]:
```
lon_ar = np.linspace(start=ds.coords["lon"].min().values+lon_axis.step/2,
                     stop=ds.coords["lon"].max().values-lon_axis.step/2,
                     num=lon_axis.n_points-1)
lat_ar = np.linspace(start=ds.coords["lat"].min().values+lat_axis.step/2,
                     stop=ds.coords["lat"].max().values-lat_axis.step/2,
                     num=lat_axis.n_points-1)
rho_xarr = xr.DataArray(
    data=rho_ar,
    dims=["lon", "lat", "time"],
    coords=dict(
        lon=(["lon"], lon_ar),
        lat=(["lat"], lat_ar),
        time=(["time"],ds.time.data)
    ),
    attrs=dict(
```

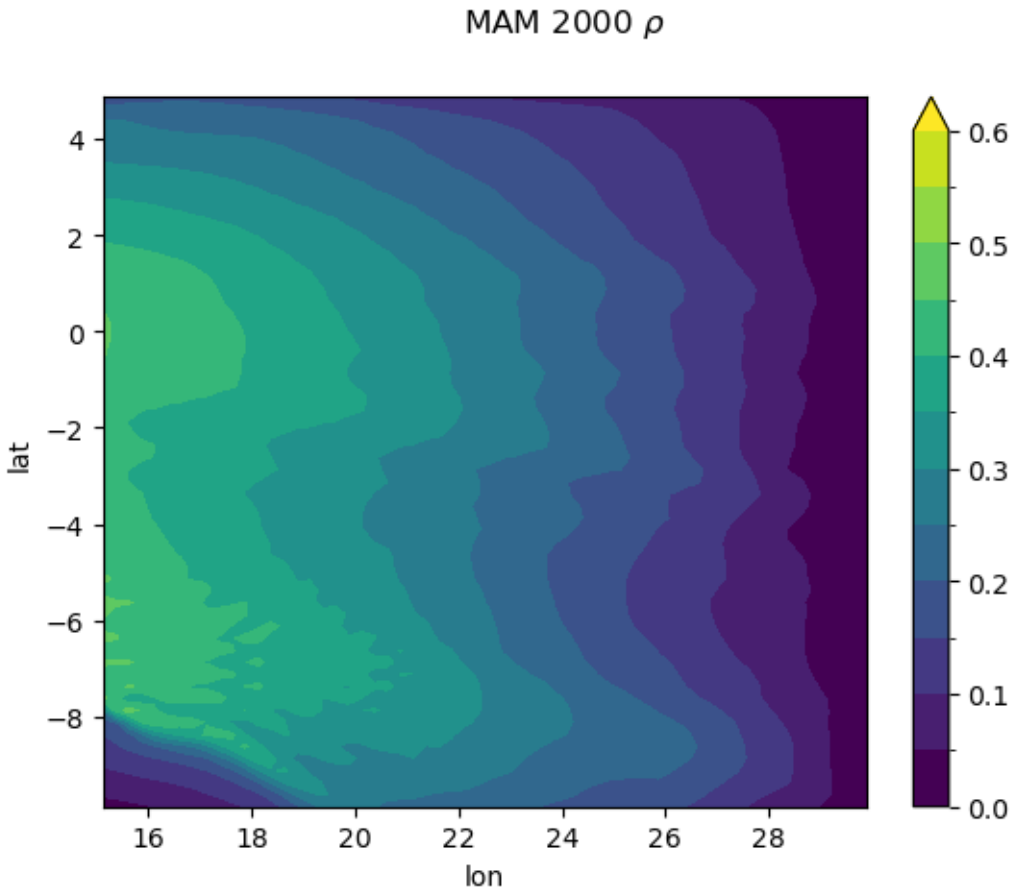
```
        description="Recycling ratio",
        units="%",
    ),
)
rho_xarr = rho_xarr.transpose("time","lat","lon")
print('Number of rhos over 1: ', rho_xarr.where(rho_xarr.values>1.0).count().
 ↪values)
print('Number of negative rhos: ', rho_xarr.where(rho_xarr.values<0.0).count().
 ↪values)
rho_xarr = rho_xarr.where(rho_xarr.values<=1.0,1.0)
rho_xarr = rho_xarr.where(rho_xarr.values>0.0,0.0)
print('Number of rhos over 1: ', rho_xarr.where(rho_xarr.values>1.0).count().
 ↪values)
print('Number of negative rhos: ', rho_xarr.where(rho_xarr.values<0.0).count().
 ↪values)
rho_xarr.to_netcdf(datao+"rho_era5_"+str(YR)+".nc")
end_all = timer.time()
length = end_all - start_all
print("Running the whole prep and recycling code took ", length, "seconds")
```

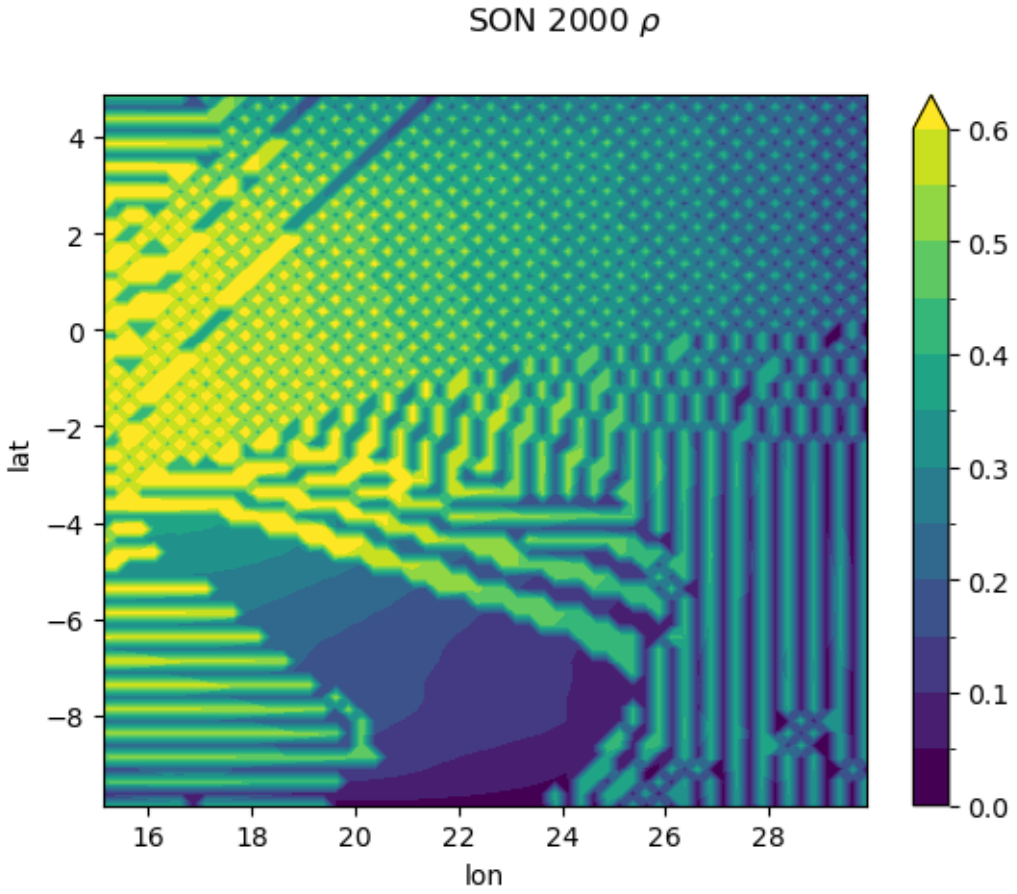
```
Number of rhos over 1:  1603
Number of negative rhos:  2079
Number of rhos over 1:  0
Number of negative rhos:  0
Running the whole prep and recycling code took  1364.8833558559418 seconds
```

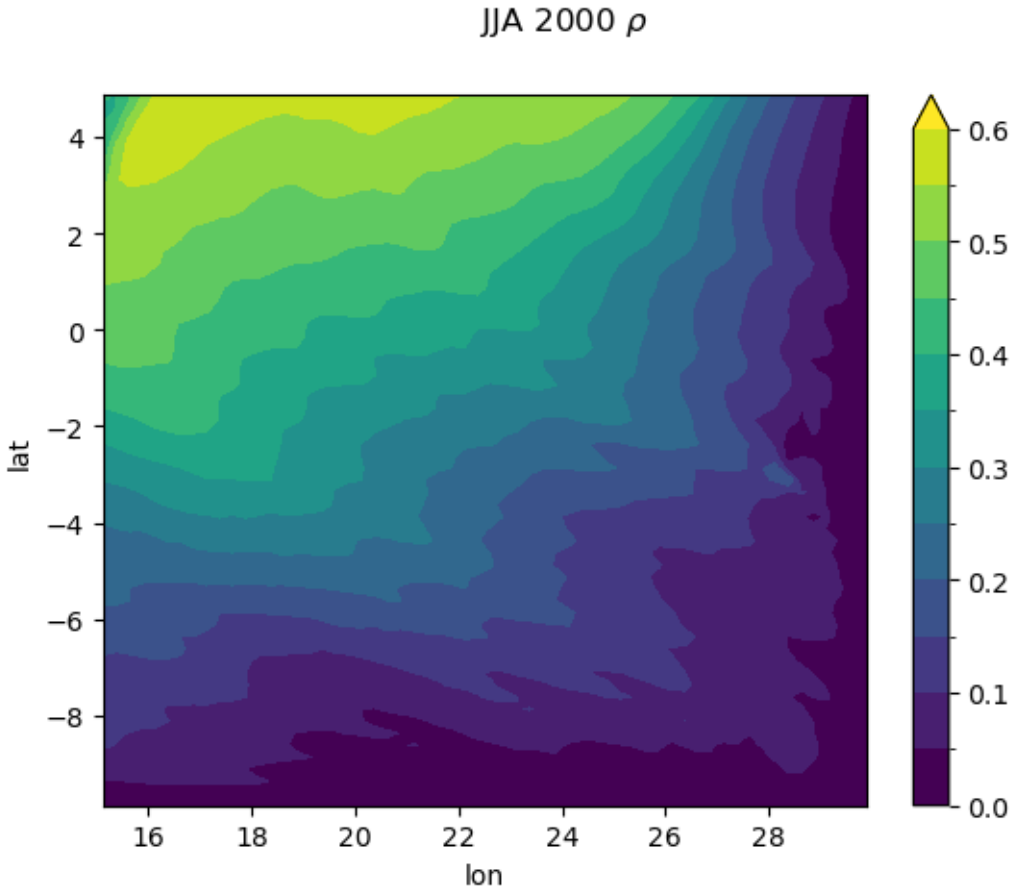
Create seasonal arrays and plot these

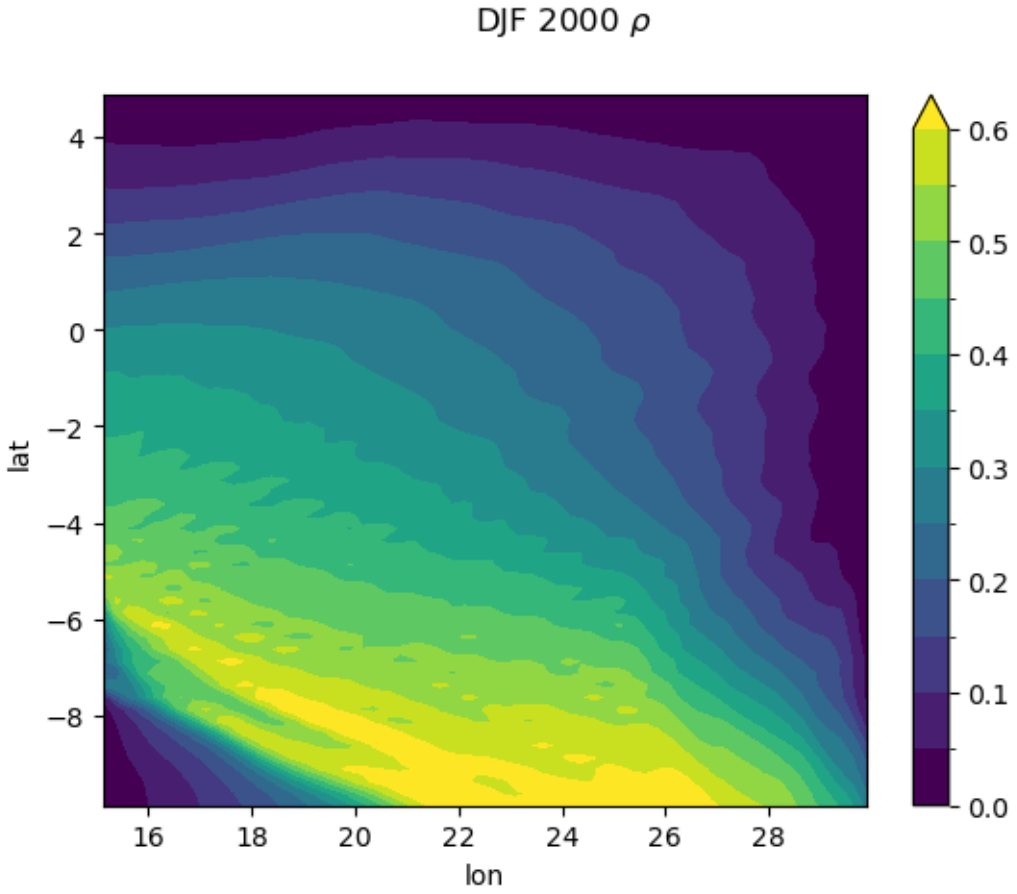
[16]:
```
mam_rho = rho_xarr.sel(time=rho_xarr.time.dt.month.isin([3,4,5]))
fig, ax = plt.subplots()
collection = mam_rho.mean("time").plot.contourf(vmin=0.0,vmax=0.
 ↪6,levels=13,ax=ax,extend='max')
fig.suptitle("MAM "+str(YR)+" $\\rho$")
#plt.savefig(datao+"rho_MAM_"+str(YR)+".png")
plt.show()

son_rho = rho_xarr.sel(time=rho_xarr.time.dt.month.isin([9,10,11]))
fig, ax = plt.subplots()
collection = son_rho.mean("time").plot.contourf(vmin=0.0,vmax=0.
 ↪6,levels=13,ax=ax,extend='max')
fig.suptitle("SON "+str(YR)+" $\\rho$")
#plt.savefig(datap+"rho_SON_"+str(YR)+".png")
plt.show()

jja_rho = rho_xarr.sel(time=rho_xarr.time.dt.month.isin([6,7,8]))
fig, ax = plt.subplots()
collection = jja_rho.mean("time").plot.contourf(vmin=0.0,vmax=0.
 ↪6,levels=13,ax=ax,extend='max')
```

```
fig.suptitle("JJA "+str(YR)+" $\\rho$")
#plt.savefig(datap+"rho_JJA_"+str(YR)+".png")
plt.show()

djf_rho = rho_xarr.sel(time=rho_xarr.time.dt.month.isin([12,1,2]))
fig, ax = plt.subplots()
collection = djf_rho.mean("time").plot.contourf(vmin=0.0,vmax=0.
↪6,levels=13,ax=ax,extend='max')
fig.suptitle("DJF "+str(YR)+" $\\rho$")
#plt.savefig(datap+"rho_DJF_"+str(YR)+".png")
plt.show()
```




SON 2000 ρ
lat
lon
4
2
0
−2
−4
−6
−8
16
18
20
22
24
26
28
0.6
0.5
0.4
0.3
0.2
0.1
0.0


JJA 2000 ρ
lat
lon
4
2
0
−2
−4
−6
−8
16
18
20
22
24
26
28
0.6
0.5
0.4
0.3
0.2
0.1
0.0


DJF 2000 ρ
lat
lon
4
2
0
−2
−4
−6
−8
16
18
20
22
24
26
28
0.6
0.5
0.4
0.3
0.2
0.1
0.0