

FGM

September 24, 2020

1 Read data from .mat and plot FGM (mooring mean)

```
[1]: # %matplotlib notebook
%matplotlib inline
import numpy as np
import pandas as pd
import xarray as xr
import scipy as sp
import matplotlib.pyplot as plt
import scipy.io as sio
import io
import gsw

from scipy import integrate
from matplotlib import cm
```

```
[2]: # load time-mean mooring data
mdirec='/Users/tantanmeow/Desktop/WORK/2018-2019/Jesse/sp-tg/';

data0 = sio.loadmat(mdirec+'data/mooring_averages.mat',squeeze_me =_
    ↪True,struct_as_record = False)
type(data0)
dict.keys(data0)
```

```
[2]: dict_keys(['__header__', '__version__', '__globals__', 'M5', 'P1', 'P3', 'P4',
    'T1', 'T2', 'T4', 'T5', 'T6', 'T7', 'T8', 'T9', 'T10', 'T11', 'T12'])
```

```
[3]: # load FGM outputs from a .mat dataset
data_name = 'TG_SI_mean_ex1.mat'
data = sio.loadmat(mdirec + 'codes/' + data_name,squeeze_me =_
    ↪True,struct_as_record = False)
type(data)
dict.keys(data)
```

```
[3]: dict_keys(['__header__', '__version__', '__globals__', 'B', 'CI', 'CL', 'CR',
    'GR', 'II', 'K', 'KFGM', 'L', 'N2', 'Ri', 'V', 'Vz', 'Vzz', 'W', 'botz', 'site',
    'zw'])
```

```

[4]: # Growth rate, imaginary phase speed, real phase speed, numbers of
      ↪ zero-crossing, wave vector of the FGM
      # GR = xr.DataArray(data['GR'], coords={"site": data['site'], "0-crossings":
      ↪ ("site", data['II'])}, dims=["site"])
      GR = xr.DataArray(data['GR'], coords={"site": data['site']}, dims=["site"],
      ↪ attrs={'longname': '$\sigma$: $hr^{-1}$'})
      CI = xr.DataArray(data['CI'], coords={"site": data['site']}, dims=["site"])
      CR = xr.DataArray(data['CR'], coords={"site": data['site']}, dims=["site"])
      II = xr.DataArray(data['II'], coords={"site": data['site']}, dims=["site"],
      ↪ attrs={'longname': '0-crossings'})
      KFGM = xr.DataArray(data['KFGM'], coords={"site": data['site'], "vector": ['k',
      ↪ 'l']}, dims=["site", "vector"])

      # profiles
      B = xr.DataArray(data['B'], coords={"z": data['zw'], "site": data['site']},
      ↪ dims=["z", "site"])
      N2 = xr.DataArray(data['N2'], coords={"z": data['zw'], "site": data['site']},
      ↪ dims=["z", "site"])
      Ri = xr.DataArray(data['Ri'], coords={"z": data['zw'], "site": data['site']},
      ↪ dims=["z", "site"])
      V = xr.DataArray(data['V'], coords={"z": data['zw'], "site": data['site']},
      ↪ dims=["z", "site"])
      Vz = xr.DataArray(data['Vz'], coords={"z": data['zw'], "site": data['site']},
      ↪ dims=["z", "site"])
      Vzz = xr.DataArray(data['Vzz'], coords={"z": data['zw'], "site": data['site']},
      ↪ dims=["z", "site"])

      botz = xr.DataArray(data['botz'], coords={"site": data['site']}, dims=["site"])

      # FGM in terms of w
      W = xr.DataArray(data['W'], coords={"z": data['zw'], "site": data['site']},
      ↪ dims=["z", "site"])

      # critical levels
      CL = xr.DataArray(data['CL'], coords={"site": data['site'], "n": np.
      ↪ arange(10)}, dims=["site", "n"])

      FGM_mean = xr.Dataset({'GR': ([ 'site' ], 2*np.pi/GR/3600),
                             'CI': ([ 'site' ], CI),
                             'CR': ([ 'site' ], CR),
                             'II': ([ 'site' ], II),
                             'K': ([ 'site', 'vector' ], KFGM),
                             'b': ([ 'z', 'site' ], B),
                             'N2': ([ 'z', 'site' ], N2),
                             'Ri': ([ 'z', 'site' ], Ri),
                             'V': ([ 'z', 'site' ], V),
                             'Vz': ([ 'z', 'site' ], Vz),

```

```

'Vzz': (['z', 'site'], Vzz),
'W': (['z', 'site'], W),
'CL': (['site', 'n'], CL),
'botz': (['site'], botz)},
coords={'site': data['site'],
        'z': data['zw'],
        'n': np.arange(10)},
attrs={'title': 'FGM, mean mooring profiles'})

```

```

[5]: EB=['P4', 'T8', 'T1', 'T2', 'T4', 'T6', 'T5']
WB=['T12', 'M5', 'T9', 'T10', 'T11']
OT=['P1', 'P3', 'T7']

```

Plot site vs. growth rate, colorbar representing the number of zero-crossings

```

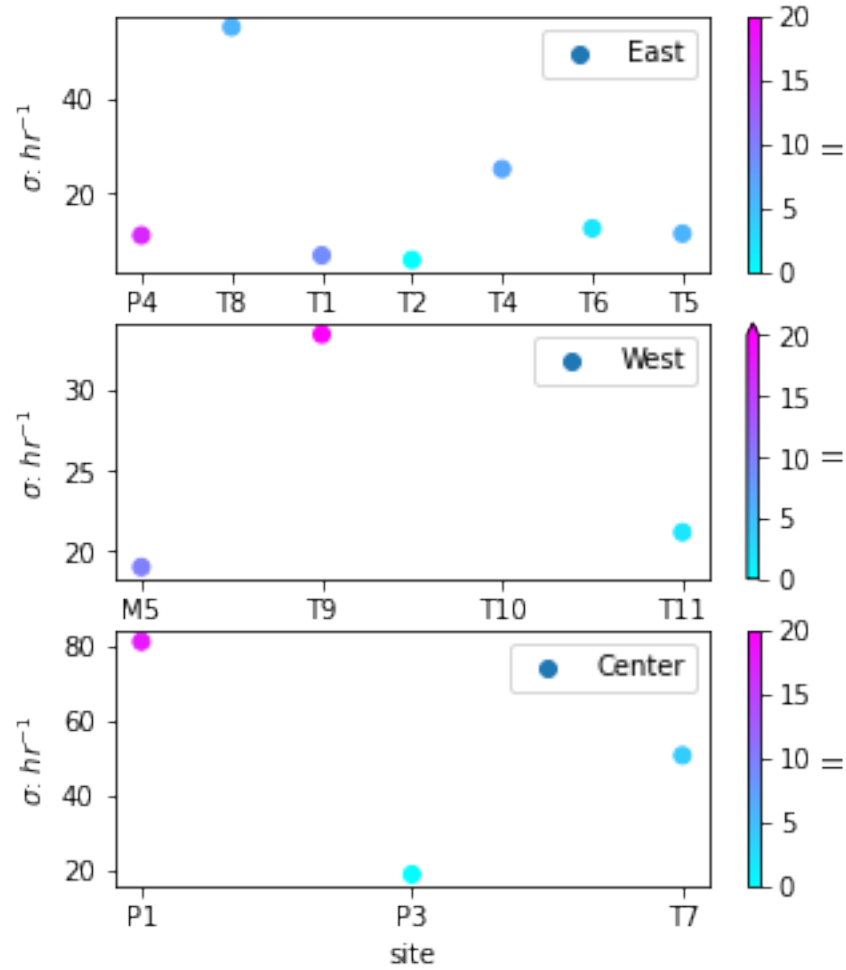
[6]: fig, ax = plt.subplots(nrows=3, ncols=1, figsize=(5, 6))
FGM_mean.loc[dict(site=EB)].plot.scatter(x='site', y='GR', hue='II',
    ↪marker='o', label='East',
    ax=ax[0], cmap=cm.cool, vmax=20, vmin=0,
    ↪add_guide=True)
ax[0].set_ylabel('$\sigma$: $hr^{-1}$')
ax[0].legend()
FGM_mean.loc[dict(site=WB)].plot.scatter(x='site', y='GR', hue='II',
    ↪marker='o', label='West',
    ax=ax[1], cmap=cm.cool, vmax=20, vmin=0,
    ↪add_guide=True)
ax[1].set_ylabel('$\sigma$: $hr^{-1}$')
ax[1].legend()
FGM_mean.loc[dict(site=OT)].plot.scatter(x='site', y='GR', hue='II',
    ↪marker='o', label='Center',
    ax=ax[-1], cmap=cm.cool, vmax=20, vmin=0,
    ↪add_guide=True)
ax[-1].set_ylabel('$\sigma$: $hr^{-1}$')
ax[-1].legend()

```

```

[6]: <matplotlib.legend.Legend at 0x7fe677d37b80>

```



Plot site vs. critical level, colorbar representing the growth rate, black profiles show v

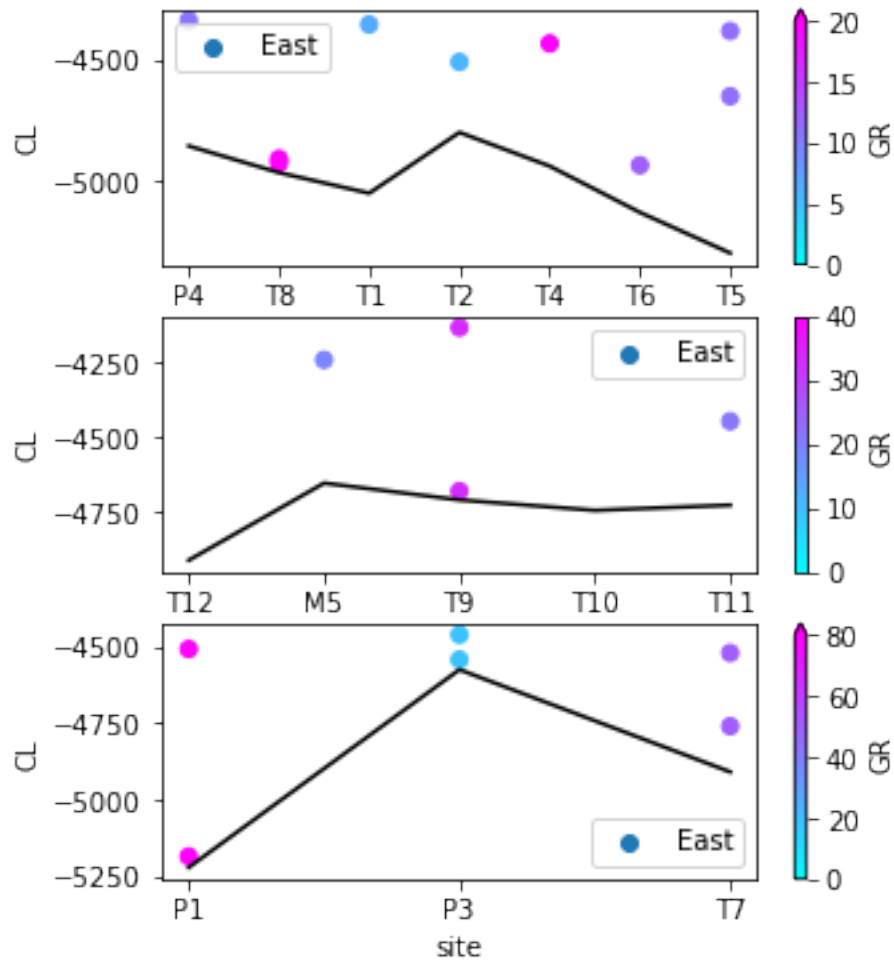
```
[7]: fig, ax = plt.subplots(nrows=3, ncols=1, figsize=(5, 6))
FGM_mean.loc[dict(site=EB)].plot.scatter(x='site', y='CL', hue='GR',
    ↪marker='o',label='East',
    ax=ax[0], cmap=cm.cool, vmax=20, vmin=0,
    ↪add_guide=True)
ax[0].plot(FGM_mean.batz.loc[dict(site=EB)].site, FGM_mean.batz.
    ↪loc[dict(site=EB)].data,c='k')
ax[0].legend()
FGM_mean.loc[dict(site=WB)].plot.scatter(x='site', y='CL', hue='GR',
    ↪marker='o',label='East',
    ax=ax[1], cmap=cm.cool, vmax=40, vmin=0,
    ↪add_guide=True)
ax[1].plot(FGM_mean.batz.loc[dict(site=WB)].site, FGM_mean.batz.
    ↪loc[dict(site=WB)].data,c='k')
```

```

ax[1].legend()
FGM_mean.loc[dict(site=OT)].plot.scatter(x='site', y='CL', hue='GR',
    ↪marker='o',label='East',
    ax=ax[-1], cmap=cm.cool, vmax=80, vmin=0,
    ↪add_guide=True)
ax[-1].plot(FGM_mean.botz.loc[dict(site=OT)].site, FGM_mean.botz.
    ↪loc[dict(site=OT)].data,c='k')
ax[-1].legend()

```

[7]: <matplotlib.legend.Legend at 0x7fe678a5d970>



2 Read data from .mat and plot FGM (CTD&LADCP snapshot)

Raw profiles (snapshots) have many overturns (especially near sea bottom) and cause violet-shift of the growth rate, suggesting convective instability. As Larry suggested, I sorted the buoyancy profiles to form a stable configuration and made sure $N^2 > 0$ everywhere. I did not process the

velocity profiles.

```
[8]: # load FGM outputs from a .mat dataset
data_name = 'TG_SI_snapshot_ex1.mat'
data = sio.loadmat(mdirec + 'codes/' + data_name, squeeze_me = 
    ↪ True, struct_as_record = False)
type(data)
dict.keys(data)

[8]: dict_keys(['__header__', '__version__', '__globals__', 'B', 'CI', 'CL', 'CR',
'GR', 'II', 'K', 'KFGM', 'L', 'LAT', 'LON', 'N2', 'Ri', 'V', 'Vz', 'Vzz', 'W',
'zw'])

[9]: # Growth rate, imaginary phase speed, real phase speed, numbers of 
    ↪ zero-crossing, wave vector of the FGM
# GR = xr.DataArray(data['GR'], coords={"site": data['site'], "0-crossings": 
    ↪ ("site", data['II'])}, dims=["site"])
GR = xr.DataArray(data['GR'], coords={"site": np.arange(len(data['LON']))}, 
    ↪ dims=["site"], attrs={'longname': '$\sigma$: $hr^{-1}$'})
CI = xr.DataArray(data['CI'], coords={"site": np.arange(len(data['LON']))}, 
    ↪ dims=["site"])
CR = xr.DataArray(data['CR'], coords={"site": np.arange(len(data['LON']))}, 
    ↪ dims=["site"])
II = xr.DataArray(data['II'], coords={"site": np.arange(len(data['LON']))}, 
    ↪ dims=["site"], attrs={'longname': '0-crossings'})
KFGM = xr.DataArray(data['KFGM'], coords={"site": np.arange(len(data['LON']))}, 
    ↪ "vector": ['k', 'l'], dims=["site", "vector"])
LON = xr.DataArray(data['LON'], coords={"site": np.arange(len(data['LON']))}, 
    ↪ dims=["site"])
LAT = xr.DataArray(data['LAT'], coords={"site": np.arange(len(data['LON']))}, 
    ↪ dims=["site"])

# profiles
B = xr.DataArray(data['B'], coords={"z": data['zw'], "site": np.
    ↪ arange(len(data['LON']))}, dims=["z", "site"])
N2 = xr.DataArray(data['N2'], coords={"z": data['zw'], "site": np.
    ↪ arange(len(data['LON']))}, dims=["z", "site"])
Ri = xr.DataArray(data['Ri'], coords={"z": data['zw'], "site": np.
    ↪ arange(len(data['LON']))}, dims=["z", "site"])
V = xr.DataArray(data['V'], coords={"z": data['zw'], "site": np.
    ↪ arange(len(data['LON']))}, dims=["z", "site"])
Vz = xr.DataArray(data['Vz'], coords={"z": data['zw'], "site": np.
    ↪ arange(len(data['LON']))}, dims=["z", "site"])
Vzz = xr.DataArray(data['Vzz'], coords={"z": data['zw'], "site": np.
    ↪ arange(len(data['LON']))}, dims=["z", "site"])
```

```

# FGM in terms of w
W = xr.DataArray(data['W'], coords={"z":data['zw'], "site": np.
    ↳arange(len(data['LON']))}, dims=["z" , "site"])
# critical levels
CL = xr.DataArray(data['CL'], coords={"site": np.arange(len(data['LON'])), "n":
    ↳np.arange(data['CL'].shape[-1])}, dims=["site" , "n"])

FGM_snapshot = xr.Dataset({'GR': ([ 'site'], 2*np.pi/GR/3600),
    'CI': ([ 'site'], CI),
    'CR': ([ 'site'], CR),
    'II': ([ 'site'], II),
    'K': ([ 'site', 'vector'], KFGM),
    'LON': ([ 'site'], LON),
    'LAT': ([ 'site'], LAT),
    'b': ([ 'z', 'site'], B),
    'N2': ([ 'z', 'site'], N2),
    'Ri': ([ 'z', 'site'], Ri),
    'V': ([ 'z', 'site'], V),
    'Vz': ([ 'z', 'site'], Vz),
    'Vzz': ([ 'z', 'site'], Vzz),
    'W': ([ 'z', 'site'], W),
    'CL': ([ 'site', 'n'], CL)},
    coords={'site': np.arange(len(data['LON'])),
        'z': data['zw'],
        'n': np.arange(data['CL'].shape[-1])},
    attrs={'title': 'FGM, CTD/LADCP profiles'})

```

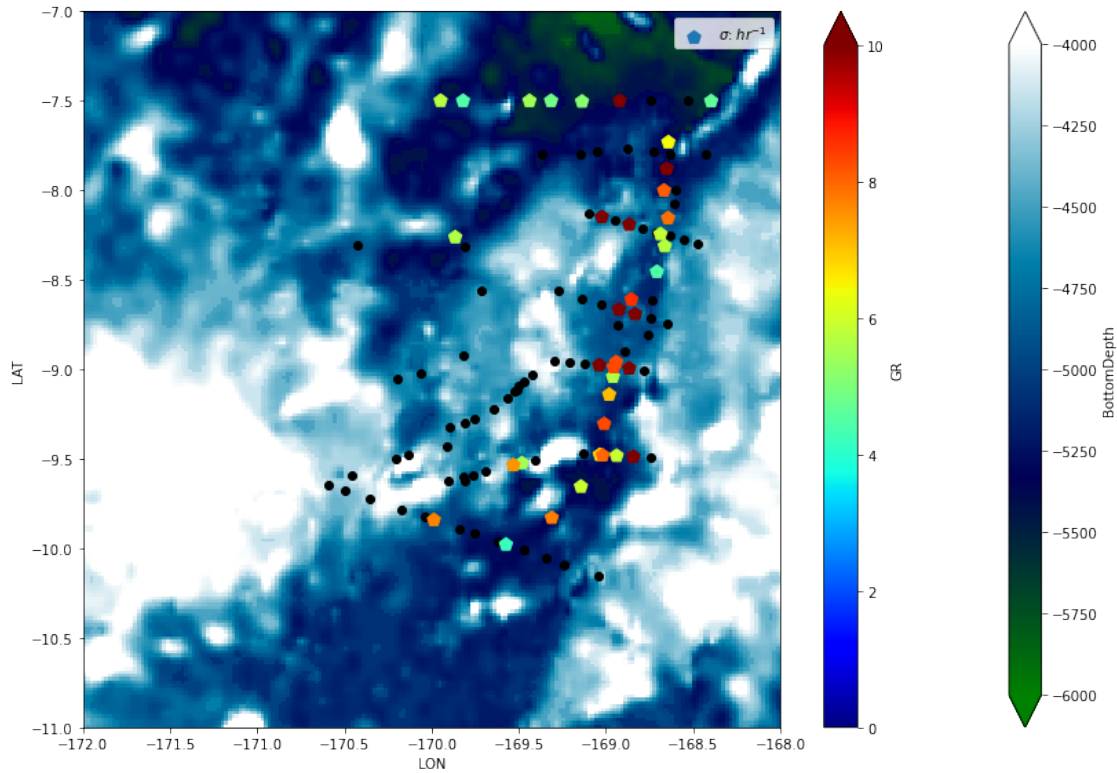
Plot site vs. growth rate

```

[10]: topo = xr.open_dataset('/Users/tantanmeow/WORK/larry-data/
    ↳sp_model_bottom_velocities.nc')
    BottomDepth = -topo.BottomDepth

[11]: fig, ax = plt.subplots(nrows=1, ncols=1, figsize=(12, 8))
    BottomDepth.plot(ax=ax, xlim=[-172, -168], ylim=[-11, -7], vmax=-4000,
    ↳vmin=-6000, cmap=cm.ocean)
    FGM_snapshot.plot.scatter(x='LON', y='LAT', c='k')
    FGM_snapshot.plot.scatter(x='LON', y='LAT', hue='GR', marker='p', s=100,
    ↳label='$\sigma$: $hr^{-1}$',
    ax=ax, cmap=cm.jet, vmax=10, vmin=0,
    ↳add_guide=True)
    ax.legend()
    fig.tight_layout()

```



3 Read data from .mat and plot FGM (tow-yo)

```
[12]: def dataFGM(section):
import os
import glob

towyo_files = np.sort(glob.glob(os.path.join(mdirec + 'codes/TG_SI_TY_' +
↪section + "*ex1*")))

# Growth rate, imaginary phase speed, real phase speed, numbers of
↪zero-crossing, wave vector of the FGM
GRs = np.squeeze(np.concatenate([sio.loadmat(file)["GR"] for file in
↪towyo_files] , axis=0))
CIs = np.squeeze(np.concatenate([sio.loadmat(file)["CI"] for file in
↪towyo_files] , axis=0))
CRs = np.squeeze(np.concatenate([sio.loadmat(file)["CR"] for file in
↪towyo_files] , axis=0))
IIs = np.squeeze(np.concatenate([sio.loadmat(file)["II"] for file in
↪towyo_files] , axis=0))
KFGMs = np.squeeze(np.concatenate([sio.loadmat(file)["KFGM"] for file in
↪towyo_files] , axis=0))
```



```

    LONs = np.squeeze(np.concatenate([sio.loadmat(file)["LON"] for file in
↳ towyo_files] , axis=-1))
    LATs = np.squeeze(np.concatenate([sio.loadmat(file)["LAT"] for file in
↳ towyo_files] , axis=-1))

    # profiles
    Bs = np.squeeze(np.concatenate([sio.loadmat(file)["B"] for file in
↳ towyo_files] , axis=-1))
    N2s = np.squeeze(np.concatenate([sio.loadmat(file)["N2"] for file in
↳ towyo_files] , axis=-1))
    Ris = np.squeeze(np.concatenate([sio.loadmat(file)["Ri"] for file in
↳ towyo_files] , axis=-1))
    Vs = np.squeeze(np.concatenate([sio.loadmat(file)["V"] for file in
↳ towyo_files] , axis=-1))
    Vzs = np.squeeze(np.concatenate([sio.loadmat(file)["Vz"] for file in
↳ towyo_files] , axis=-1))
    Vzss = np.squeeze(np.concatenate([sio.loadmat(file)["Vzz"] for file in
↳ towyo_files] , axis=-1))

    # FGM in terms of w
    Ws = np.squeeze(np.concatenate([sio.loadmat(file)["W"] for file in
↳ towyo_files] , axis=-1))
    # CLs = np.squeeze(np.concatenate([sio.loadmat(file)["CL"] for file in
↳ towyo_files] , axis=0))

    towyo_files_others = np.sort(glob.glob(os.path.join(mdirec[:-6] +
↳ 'proc_data/TY_' + section + ".*")))

    # interface height, bottom height, critical level
    zw = np.squeeze(sio.loadmat(towyo_files[0])["zw"])
    ideps = np.squeeze(np.concatenate([sio.loadmat(file)["zo"] for file in
↳ towyo_files_others] , axis=1))
    bdeps = np.squeeze(np.concatenate([sio.loadmat(file)["bdepth"] for file in
↳ towyo_files_others] , axis=1))
    cdeps = np.zeros(LONs.shape, dtype='f')
    nans = np.isnan(np.nanmax(Ws.real, axis=0))
    cdeps[~nans] = zw[np.int_(np.nanargmax(Ws.real[:,~nans], axis=0))]
    cdeps[nans] = np.nan

    FGM_towyo = xr.Dataset({'GR': ([ 'site' ], 2*np.pi/GRs/3600),
                             'CI': ([ 'site' ], CIs),
                             'CR': ([ 'site' ], CRs),
                             'II': ([ 'site' ], IIs),
                             'K': ([ 'site', 'vector' ], KFGMs),
                             'LON': ([ 'site' ], LONs),
                             'LAT': ([ 'site' ], LATs),

```

```

        'zo': (['site'], ideps),
        'bdepth': (['site'], -bdeps),
        'cdepth': (['site'], cdeps),
        'iab': (['site'], ideps+bdeps),
        'cab': (['site'], cdeps+bdeps),
        'b': (['z', 'site'], Bs),
        'N2': (['z', 'site'], N2s),
        'Ri': (['z', 'site'], Ris),
        'V': (['z', 'site'], Vs),
        'Vz': (['z', 'site'], Vzs),
        'Vzz': (['z', 'site'], Vzzs), #
    → 'CL': (['site', 'n'], CLs),
        'W': (['z', 'site'], Ws)},
    coords={'site': np.arange(len(LONs)),
            'z': zw}, #, 'n': np.arange(CLs.shape[-1])
    attrs={'title': 'FGM, tow-yo profiles'})

    return FGM_towyo

```

```

[13]: mdirec='/Users/tantanmeow/Desktop/WORK/2018-2019/Jesse/sp-tg/'
FGM_towyo = dataFGM("P")
FGM_towyo_P2 = dataFGM("P2")
FGM_towyo_P4 = dataFGM("P4")
FGM_towyo_P5 = dataFGM("P5")

```

```

<ipython-input-12-8b7321b496c5>:35: RuntimeWarning: All-NaN slice encountered
      nans = np.isnan(np.nanmax(Ws.real, axis=0))

```

3.1 1. Plot site vs. growth rate

```

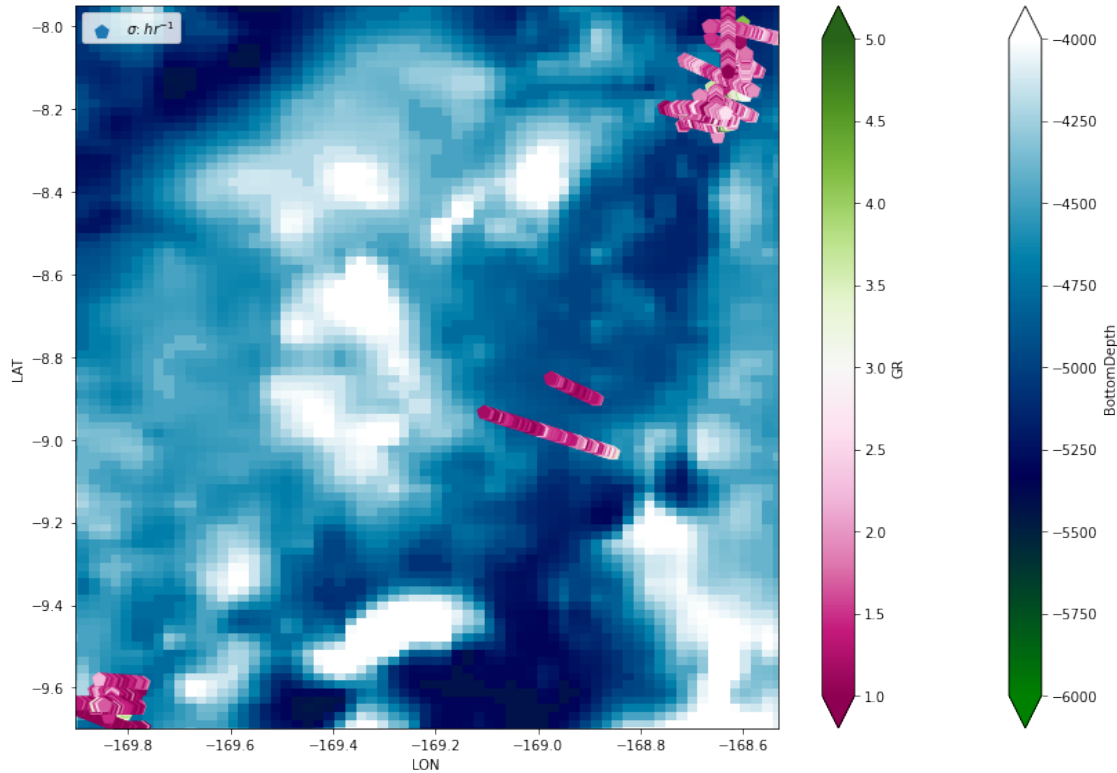
[14]: topo = xr.open_dataset('/Users/tantanmeow/WORK/larry-data/
    →sp_model_bottom_velocities.nc')
BottomDepth = -topo.BottomDepth

```

```

[15]: fig, ax = plt.subplots(nrows=1, ncols=1, figsize=(12, 8))
BottomDepth.plot(ax=ax, xlim=[FGM_towyo.LON.min(), FGM_towyo.LON.max()],
    →ylim=[FGM_towyo.LAT.min(), FGM_towyo.LAT.max()], vmax=-4000, vmin=-6000,
    →cmap=cm.ocean)
FGM_towyo.plot.scatter(x='LON', y='LAT', c='k', ax=ax)
FGM_towyo.plot.scatter(x='LON', y='LAT', hue='GR', marker='p', s=100,
    →label='$\sigma$: $hr^{-1}$',
                                ax=ax, cmap=cm.PiYG, vmax=5, vmin=1,
    →add_guide=True)
ax.legend()
fig.tight_layout()

```



```
[16]: fig, ax = plt.subplots(nrows=3, ncols=1, figsize=(8, 12))

BottomDepth.plot(ax=ax[0], xlim=[FGM_towyo_P2.LON.min(), FGM_towyo_P2.LON.
    ↳max()], ylim=[FGM_towyo_P2.LAT.min(), FGM_towyo_P2.LAT.max()], vmax=-4000,
    ↳vmin=-6000, cmap=cm.ocean)
FGM_towyo_P2.plot.scatter(x='LON', y='LAT', c='k', ax=ax[0])
FGM_towyo_P2.plot.scatter(x='LON', y='LAT', hue='GR', marker='p', s=100,
    ↳label='$\sigma$: $hr^{-1}$',
                                cmap=cm.PiYG, vmax=5, vmin=1, add_guide=True,
    ↳ax=ax[0])
ax[0].legend()
ax[0].set_title('P2')

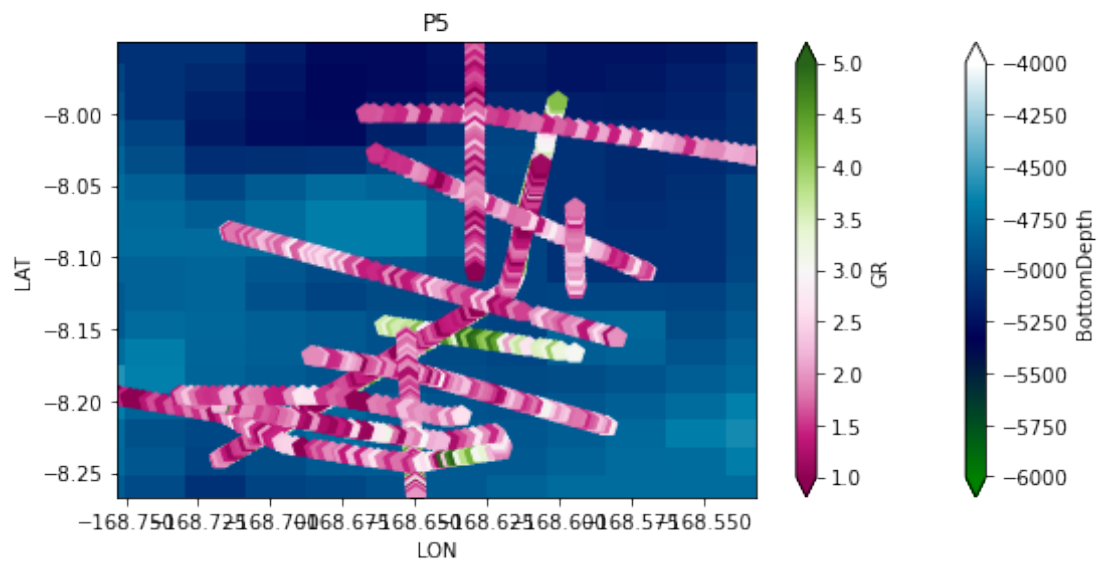
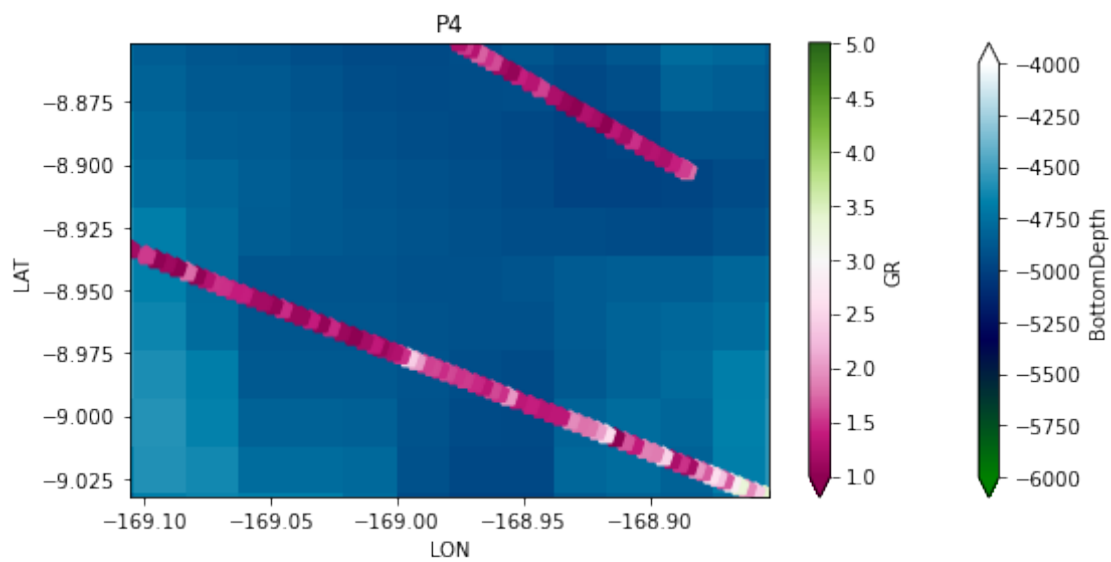
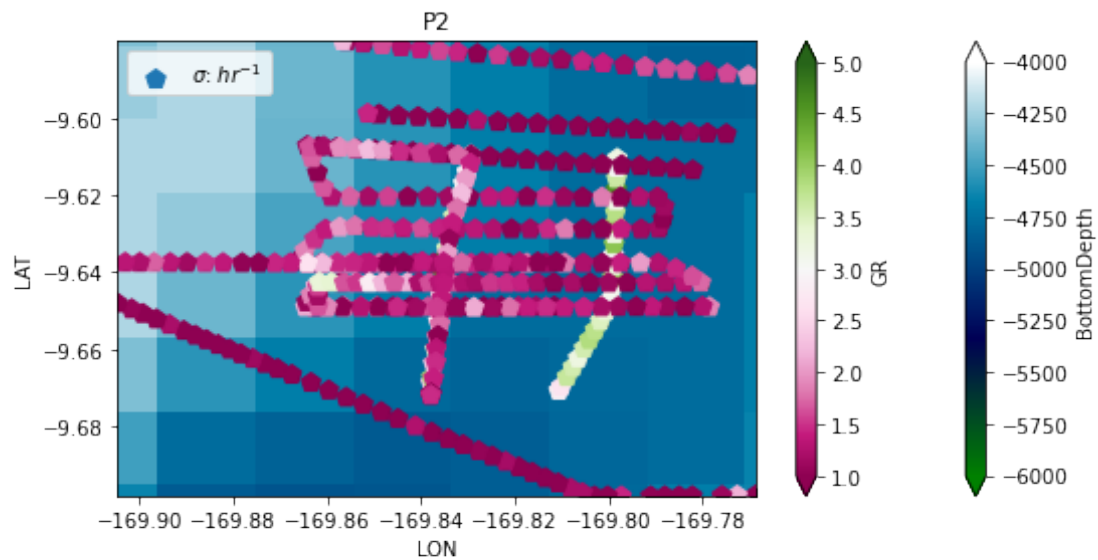
BottomDepth.plot(ax=ax[1], xlim=[FGM_towyo_P4.LON.min(), FGM_towyo_P4.LON.
    ↳max()], ylim=[FGM_towyo_P4.LAT.min(), FGM_towyo_P4.LAT.max()], vmax=-4000,
    ↳vmin=-6000, cmap=cm.ocean)
FGM_towyo_P4.plot.scatter(x='LON', y='LAT', c='k', ax=ax[1])
FGM_towyo_P4.plot.scatter(x='LON', y='LAT', hue='GR', marker='p', s=100,
    ↳label='$\sigma$: $hr^{-1}$',
                                cmap=cm.PiYG, vmax=5, vmin=1, add_guide=True,
    ↳ax=ax[1])
ax[1].set_title('P4')
```

```

BottomDepth.plot(ax=ax[-1], xlim=[FGM_towyo_P5.LON.min(), FGM_towyo_P5.LON.
↳max()], ylim=[FGM_towyo_P5.LAT.min(), FGM_towyo_P5.LAT.max()], vmax=-4000,↳
↳vmin=-6000, cmap=cm.ocean)
FGM_towyo_P5.plot.scatter(x='LON', y='LAT', c='k', ax=ax[-1])
FGM_towyo_P5.plot.scatter(x='LON', y='LAT', hue='GR', marker='p', s=100,↳
↳label='$\sigma$: $hr^{-1}$',
                                cmap=cm.PiYG, vmax=5, vmin=1, add_guide=True,↳
↳ax=ax[-1])
ax[-1].set_title('P5')

fig.tight_layout()

```

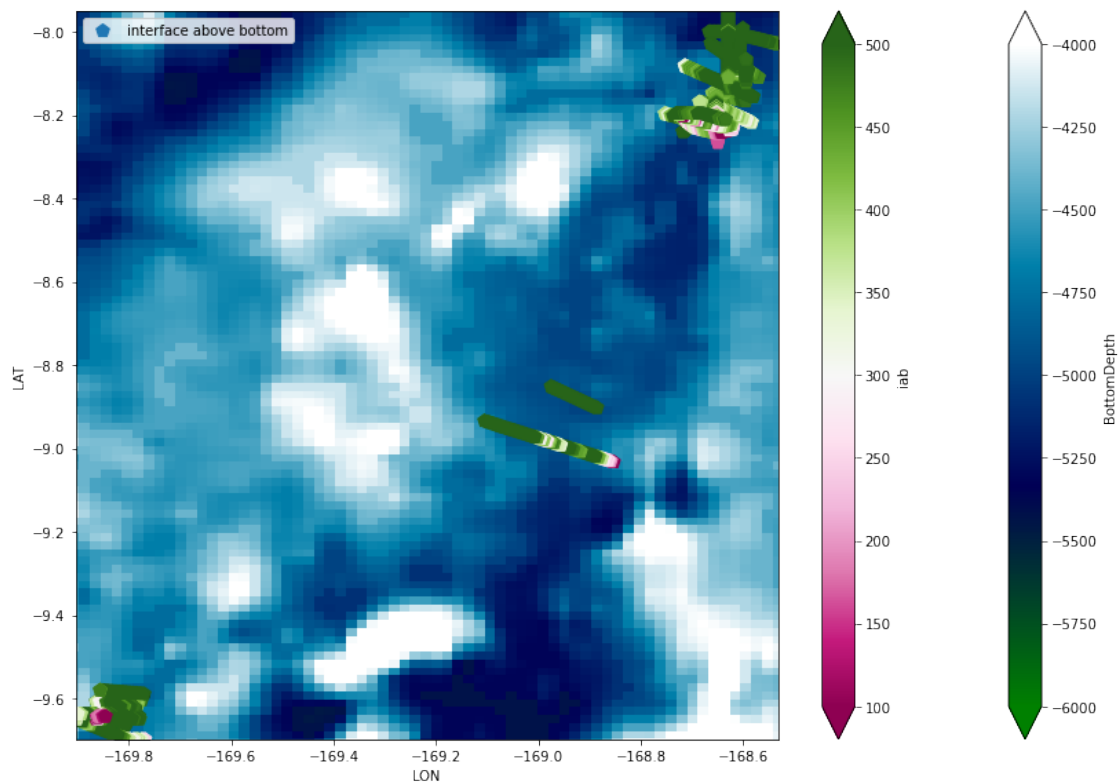
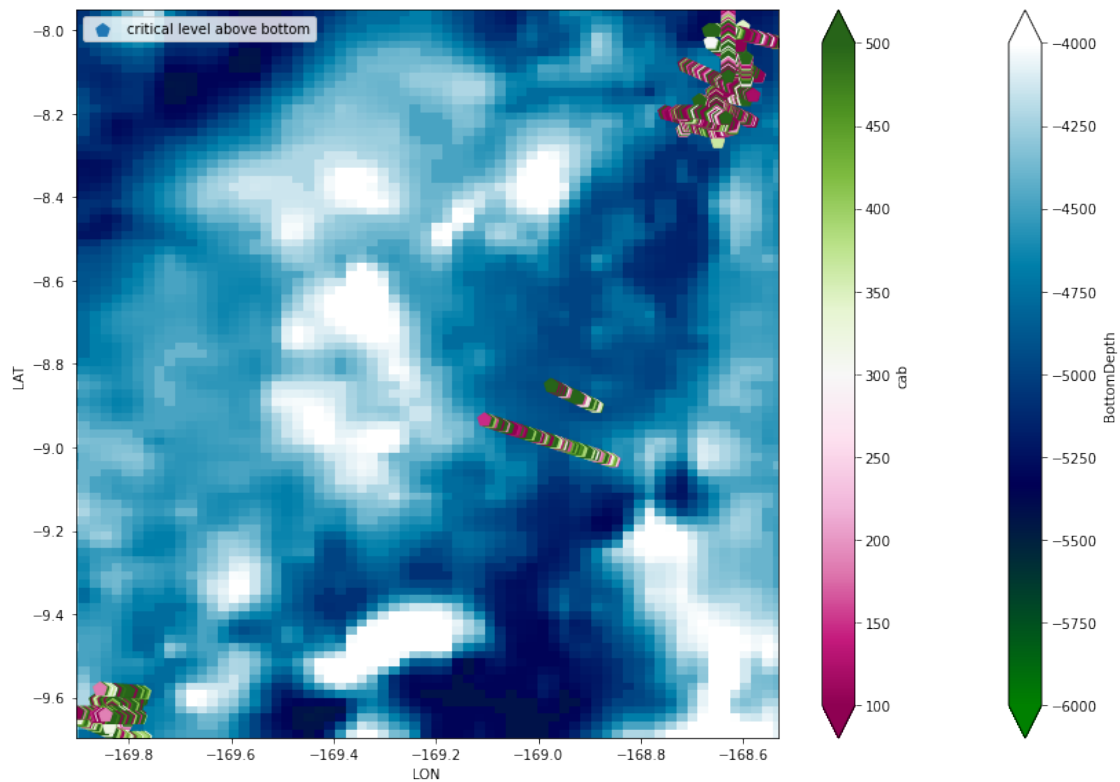


3.2 2. Plot site vs. critical level above bottom

```
[17]: fig, ax = plt.subplots(nrows=2, ncols=1, figsize=(12, 16))
BottomDepth.plot(ax=ax[0], xlim=[FGM_towyo.LON.min(), FGM_towyo.LON.max()],
    ↪ylim=[FGM_towyo.LAT.min(), FGM_towyo.LAT.max()], vmax=-4000, vmin=-6000,
    ↪cmap=cm.ocean)
FGM_towyo.plot.scatter(x='LON', y='LAT', c='k', ax=ax[0])
FGM_towyo.plot.scatter(x='LON', y='LAT', hue='cab', marker='p', s=100,
    ↪label='critical level above bottom',
    ax=ax[0], cmap=cm.PiYG, vmax=500, vmin=100,
    ↪add_guide=True)
ax[0].legend()

BottomDepth.plot(ax=ax[1], xlim=[FGM_towyo.LON.min(), FGM_towyo.LON.max()],
    ↪ylim=[FGM_towyo.LAT.min(), FGM_towyo.LAT.max()], vmax=-4000, vmin=-6000,
    ↪cmap=cm.ocean)
FGM_towyo.plot.scatter(x='LON', y='LAT', c='k', ax=ax[1])
FGM_towyo.plot.scatter(x='LON', y='LAT', hue='iab', marker='p', s=100,
    ↪label='interface above bottom',
    ax=ax[1], cmap=cm.PiYG, vmax=500, vmin=100,
    ↪add_guide=True)
ax[1].legend()

fig.tight_layout()
```



```

[18]: fig, ax = plt.subplots(nrows=3, ncols=1, figsize=(8, 12))

BottomDepth.plot(ax=ax[0], xlim=[FGM_towyo_P2.LON.min(), FGM_towyo_P2.LON.
    ↪max()], ylim=[FGM_towyo_P2.LAT.min(), FGM_towyo_P2.LAT.max()], vmax=-4000,
    ↪vmin=-6000, cmap=cm.ocean)
FGM_towyo_P2.plot.scatter(x='LON', y='LAT', c='k', ax=ax[0])
FGM_towyo_P2.plot.scatter(x='LON', y='LAT', hue='cab', marker='p', s=100,
    ↪label='critical level above bottom',
                                cmap=cm.PiYG, vmax=500, vmin=100, add_guide=True,
    ↪ax=ax[0])
ax[0].legend()
ax[0].set_title('P2')

BottomDepth.plot(ax=ax[1], xlim=[FGM_towyo_P4.LON.min(), FGM_towyo_P4.LON.
    ↪max()], ylim=[FGM_towyo_P4.LAT.min(), FGM_towyo_P4.LAT.max()], vmax=-4000,
    ↪vmin=-6000, cmap=cm.ocean)
FGM_towyo_P4.plot.scatter(x='LON', y='LAT', c='k', ax=ax[1])
FGM_towyo_P4.plot.scatter(x='LON', y='LAT', hue='cab', marker='p', s=100,
    ↪label='critical level above bottom',
                                cmap=cm.PiYG, vmax=500, vmin=100, add_guide=True,
    ↪ax=ax[1])
ax[1].set_title('P4')
BottomDepth.plot(ax=ax[-1], xlim=[FGM_towyo_P5.LON.min(), FGM_towyo_P5.LON.
    ↪max()], ylim=[FGM_towyo_P5.LAT.min(), FGM_towyo_P5.LAT.max()], vmax=-4000,
    ↪vmin=-6000, cmap=cm.ocean)
FGM_towyo_P5.plot.scatter(x='LON', y='LAT', c='k', ax=ax[-1])
FGM_towyo_P5.plot.scatter(x='LON', y='LAT', hue='cab', marker='p', s=100,
    ↪label='critical level above bottom',
                                cmap=cm.PiYG, vmax=500, vmin=100, add_guide=True,
    ↪ax=ax[-1])
ax[-1].set_title('P5')

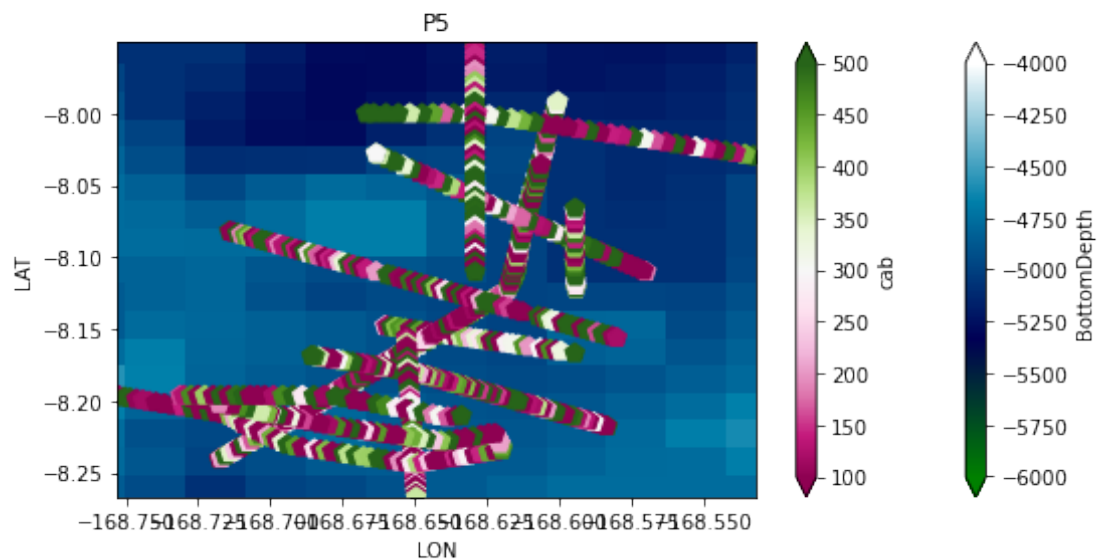
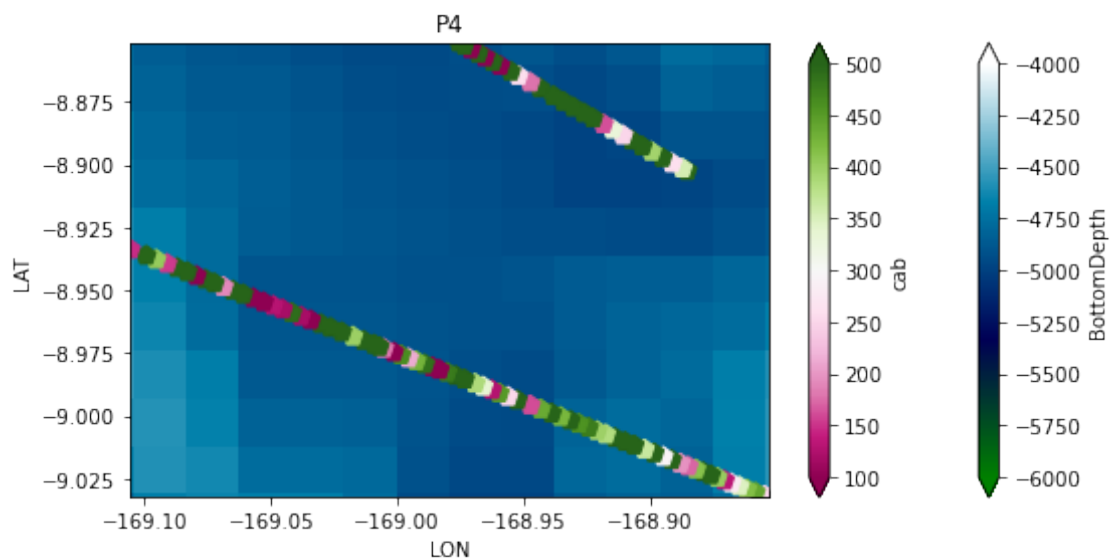
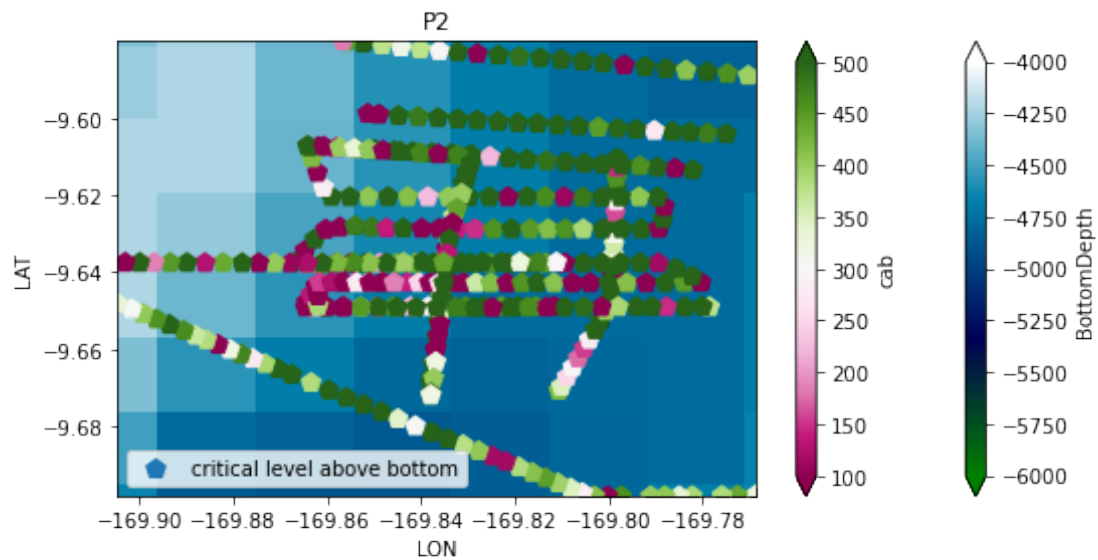
fig.tight_layout()

```

```

<ipython-input-18-c8255bacf86d>:21: UserWarning: Creating legend with loc="best"
can be slow with large amounts of data.
fig.tight_layout()

```

```

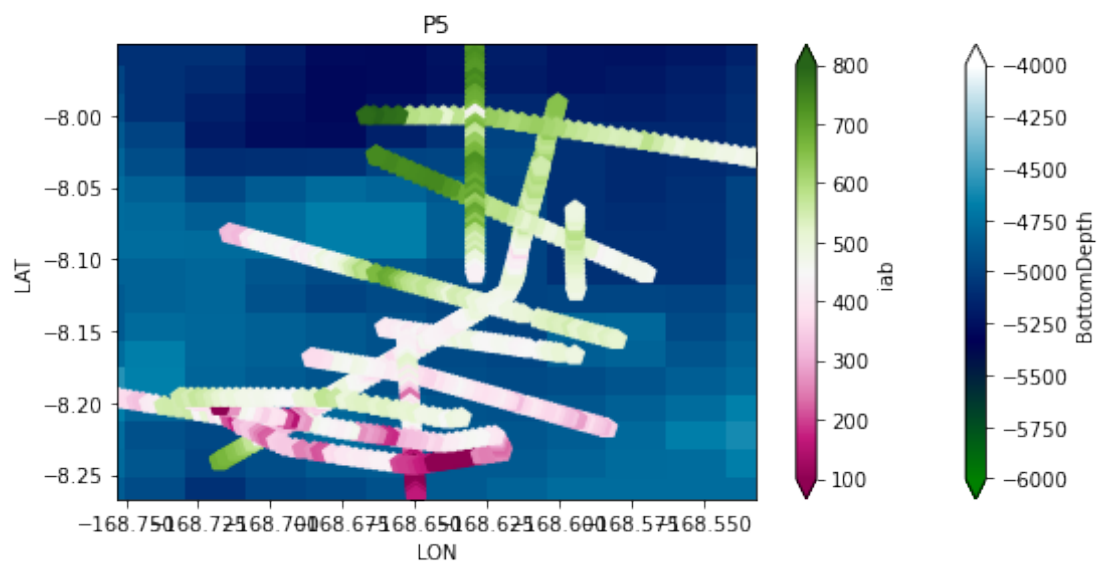
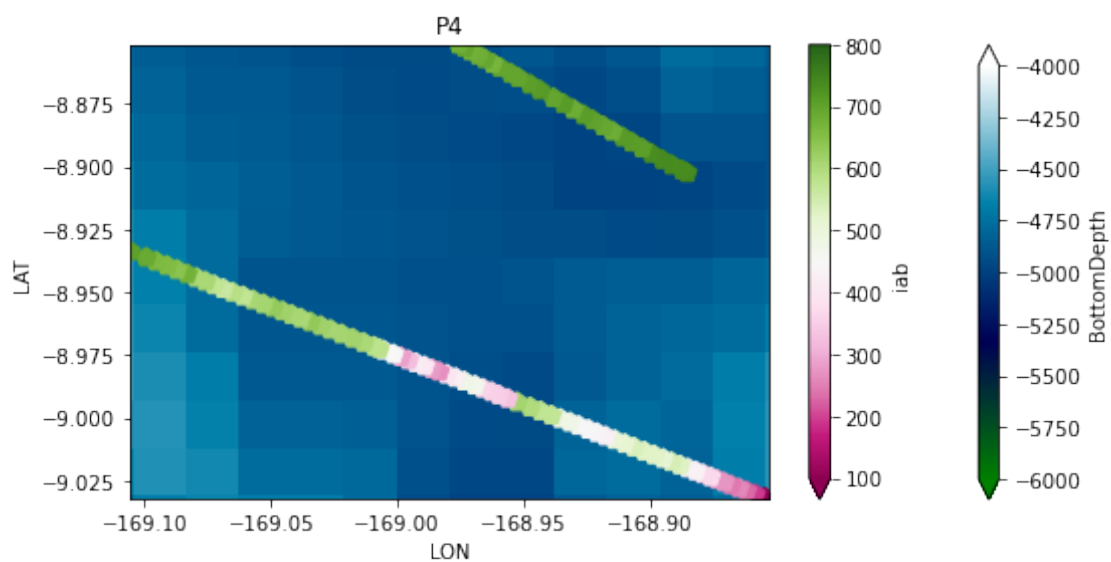
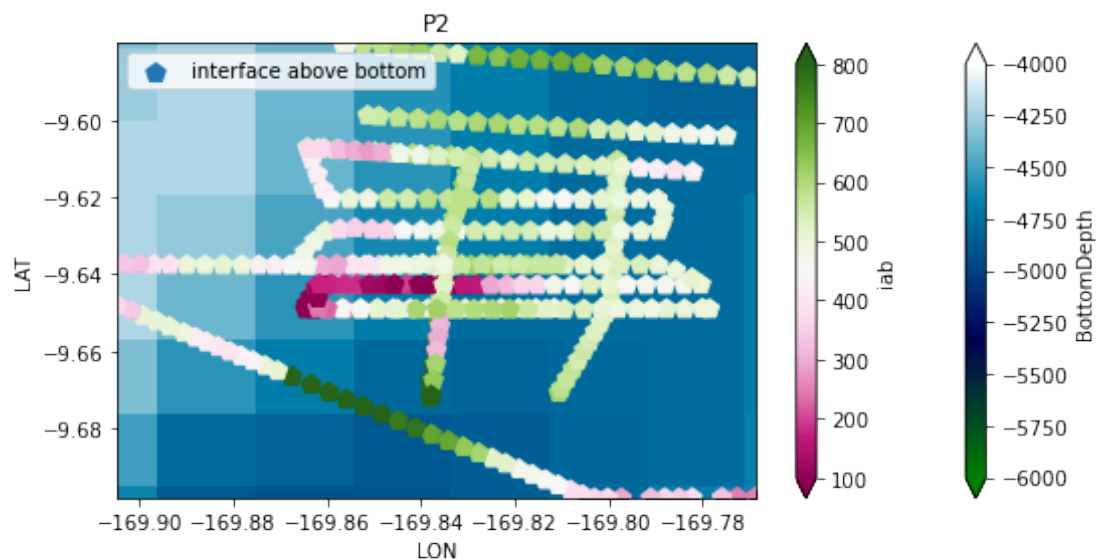
[19]: fig, ax = plt.subplots(nrows=3, ncols=1, figsize=(8, 12))

BottomDepth.plot(ax=ax[0], xlim=[FGM_towyo_P2.LON.min(), FGM_towyo_P2.LON.
    ↪max()], ylim=[FGM_towyo_P2.LAT.min(), FGM_towyo_P2.LAT.max()], vmax=-4000,
    ↪vmin=-6000, cmap=cm.ocean)
FGM_towyo_P2.plot.scatter(x='LON', y='LAT', c='k', ax=ax[0])
FGM_towyo_P2.plot.scatter(x='LON', y='LAT', hue='iab', marker='p', s=100,
    ↪label='interface above bottom',
                                cmap=cm.PiYG, vmax=800, vmin=100, add_guide=True,
    ↪ax=ax[0])
ax[0].legend()
ax[0].set_title('P2')

BottomDepth.plot(ax=ax[1], xlim=[FGM_towyo_P4.LON.min(), FGM_towyo_P4.LON.
    ↪max()], ylim=[FGM_towyo_P4.LAT.min(), FGM_towyo_P4.LAT.max()], vmax=-4000,
    ↪vmin=-6000, cmap=cm.ocean)
FGM_towyo_P4.plot.scatter(x='LON', y='LAT', c='k', ax=ax[1])
FGM_towyo_P4.plot.scatter(x='LON', y='LAT', hue='iab', marker='p', s=100,
    ↪label='interface above bottom',
                                cmap=cm.PiYG, vmax=800, vmin=100, add_guide=True,
    ↪ax=ax[1])
ax[1].set_title('P4')
BottomDepth.plot(ax=ax[-1], xlim=[FGM_towyo_P5.LON.min(), FGM_towyo_P5.LON.
    ↪max()], ylim=[FGM_towyo_P5.LAT.min(), FGM_towyo_P5.LAT.max()], vmax=-4000,
    ↪vmin=-6000, cmap=cm.ocean)
FGM_towyo_P5.plot.scatter(x='LON', y='LAT', c='k', ax=ax[-1])
FGM_towyo_P5.plot.scatter(x='LON', y='LAT', hue='iab', marker='p', s=100,
    ↪label='interface above bottom',
                                cmap=cm.PiYG, vmax=800, vmin=100, add_guide=True,
    ↪ax=ax[-1])
ax[-1].set_title('P5')

fig.tight_layout()

```



```

[20]: # a closer look at a repeated along-path section, (P5 2012 vs 2014)
fig, ax = plt.subplots(nrows=3, ncols=2, figsize=(12, 16))

sc = ax[0,0].scatter(FGM_towyo_P5.LON[136:254], FGM_towyo_P5.LAT[136:254],
    ↪c=FGM_towyo_P5.GR[136:254], marker='o',vmax=4, vmin=0, cmap=cm.PiYG,
    ↪label='P5 2014')
ax[0,0].scatter(FGM_towyo_P5.LON[0:100], FGM_towyo_P5.LAT[0:100],
    ↪c=FGM_towyo_P5.GR[0:100], marker='+',vmax=4, vmin=0, cmap=cm.PiYG, label='P5
    ↪2012')
ax[0,0].set_xlabel('lon'); ax[0,0].set_ylabel('lat'); ax[0,0].legend()
fig.colorbar(sc,label=" ",ax=ax[0,0])

ax[0,1].plot(FGM_towyo_P5.LAT[136:254], FGM_towyo_P5.bdepth[136:254], 'r-',
    ↪label='sea bottom')
ax[0,1].plot(FGM_towyo_P5.LAT[136:254], FGM_towyo_P5.zo[136:254], 'r--',
    ↪label='interface')
ax[0,1].plot(FGM_towyo_P5.LAT[136:254], FGM_towyo_P5.cdepth[136:254], 'r.',
    ↪label='critical level')
ax[0,1].plot(FGM_towyo_P5.LAT[0:100], FGM_towyo_P5.bdepth[0:100], 'g-')
ax[0,1].plot(FGM_towyo_P5.LAT[0:100], FGM_towyo_P5.zo[0:100], 'g--')
ax[0,1].plot(FGM_towyo_P5.LAT[0:100], FGM_towyo_P5.cdepth[0:100], 'g.')
ax[0,1].set_xlabel('lat'); ax[0,1].set_ylabel('z'); ax[0,1].legend()

ax[1,0].hist(FGM_towyo_P5.GR[136:254], facecolor='r', alpha=0.5, label='P5
    ↪2014')
ax[1,0].hist(FGM_towyo_P5.GR[0:100], facecolor='g', alpha=0.5, label='P5 2012')
ax[1,0].set_xlabel('lon'); ax[1,0].set_ylabel('GR'); ax[1,0].legend()

# ax[1,1].hist(FGM_towyo_P5.cdepth[136:254], facecolor='r', alpha=0.5,
    ↪label='P5 2014')
# ax[1,1].hist(FGM_towyo_P5.cdepth[0:100], facecolor='g', alpha=0.5, label='P5
    ↪2012')
# ax[1,1].set_xlabel('critical level height'); ax[1,1].legend()
wl = 2*np.pi/np.sqrt(FGM_towyo_P5.K[:,0]**2 + FGM_towyo_P5.K[:,1]**2)
ax[1,1].hist(wl[136:254], facecolor='r', alpha=0.5, label='P5 2014')
ax[1,1].hist(wl[0:100], facecolor='g', alpha=0.5, label='P5 2012')
ax[1,1].set_xlabel('wavelength'); ax[1,1].legend()

ax[-1,0].hist(FGM_towyo_P5.cab[136:254], facecolor='r', alpha=0.5, label='P5
    ↪2014')
ax[-1,0].hist(FGM_towyo_P5.cab[0:100], facecolor='g', alpha=0.5, label='P5
    ↪2012')
ax[-1,0].set_xlabel('critical level above bottom'); ax[-1,0].legend()

```

```

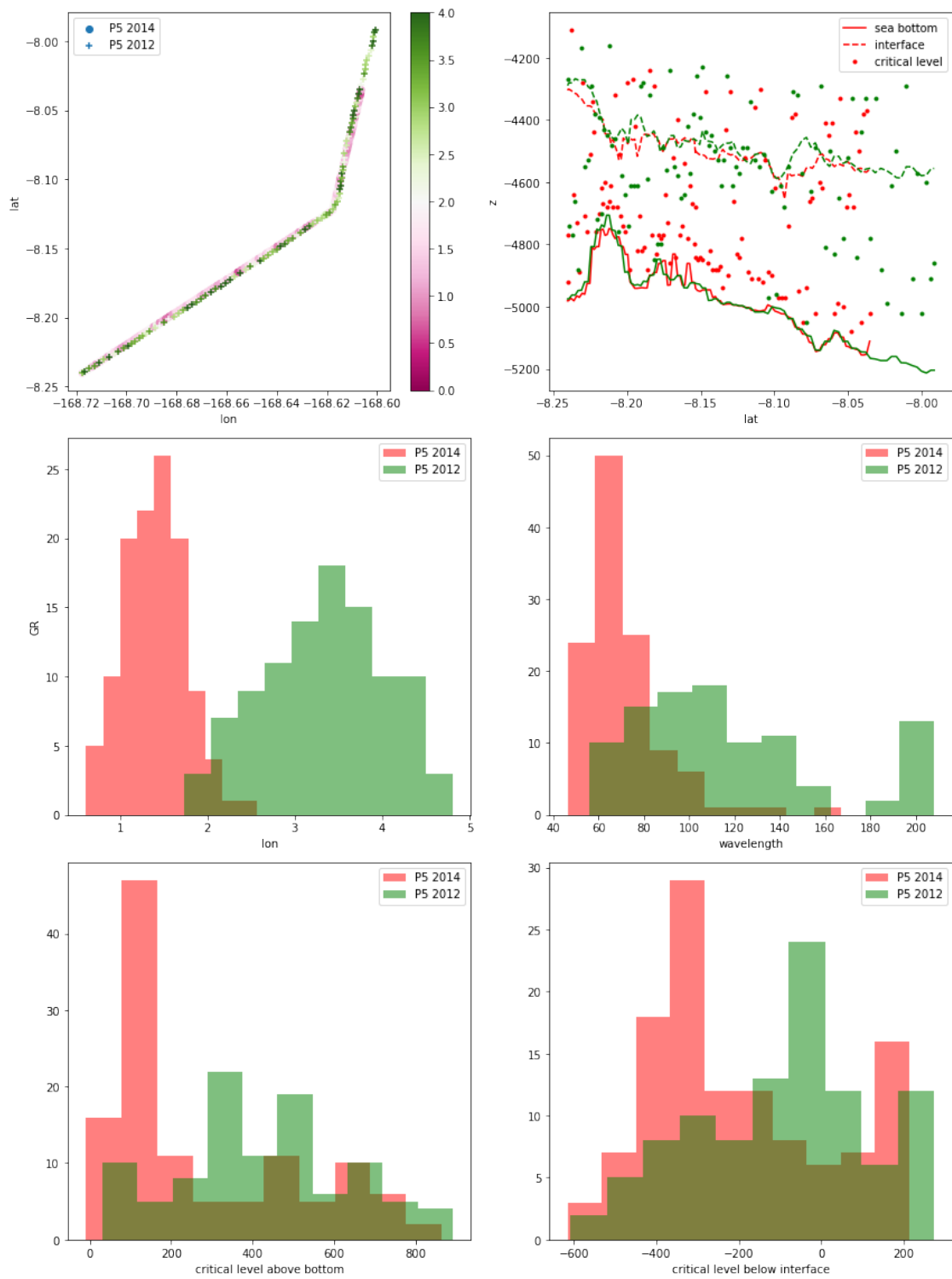
ax[-1,1].hist(FGM_towyo_P5.cab[136:254]-FGM_towyo_P5.iab[136:254],  

    ↪facecolor='r', alpha=0.5, label='P5 2014')
ax[-1,1].hist(FGM_towyo_P5.cab[0:100]-FGM_towyo_P5.iab[0:100], facecolor='g',  

    ↪alpha=0.5, label='P5 2012')
ax[-1,1].set_xlabel('critical level below interface'); ax[-1,1].legend()

fig.tight_layout()

```



3.3 3. statistics

```
[21]: fig, ax = plt.subplots(nrows=4, ncols=3, figsize=(16, 12))
# GR
GRc = 2.5
ax[0,0].hist(FGM_towyo.GR, facecolor='k', alpha=0.5, label='all GR')
ax[0,0].hist(FGM_towyo.GR[FGM_towyo.GR>GRc], facecolor='g', alpha=0.5,
    →label=['GR>' + str(GRc)])
ax[0,0].hist(FGM_towyo.GR[FGM_towyo.GR<=GRc], facecolor='r', alpha=0.5,
    →label=['GR<=' + str(GRc)])
ax[0,0].set_xlim([0,6]); ax[0,0].set_title("fastest growth rate"); ax[0,0].
    →set_ylabel('all sections'); ax[0,0].set_xlabel('GR'); ax[0,0].legend()

ax[1,0].hist(FGM_towyo_P2.GR, facecolor='k', alpha=0.5, label='all GR')
ax[1,0].hist(FGM_towyo_P2.GR[FGM_towyo_P2.GR>GRc], facecolor='g', alpha=0.5,
    →label=['GR>' + str(GRc)])
ax[1,0].hist(FGM_towyo_P2.GR[FGM_towyo_P2.GR<=GRc], facecolor='r', alpha=0.5,
    →label=['GR<=' + str(GRc)])
ax[1,0].set_xlim([0,6]); ax[1,0].set_title(""); ax[1,0].set_ylabel('P2');
    →ax[1,0].set_xlabel('GR');

ax[2,0].hist(FGM_towyo_P4.GR, facecolor='k', alpha=0.5, label='all GR')
ax[2,0].hist(FGM_towyo_P4.GR[FGM_towyo_P4.GR>GRc], facecolor='g', alpha=0.5,
    →label=['GR>' + str(GRc)])
ax[2,0].hist(FGM_towyo_P4.GR[FGM_towyo_P4.GR<=GRc], facecolor='r', alpha=0.5,
    →label=['GR<=' + str(GRc)])
ax[2,0].set_xlim([0,6]); ax[2,0].set_title(""); ax[2,0].set_ylabel('P4');
    →ax[2,0].set_xlabel('GR');

ax[-1,0].hist(FGM_towyo_P5.GR, facecolor='k', alpha=0.5, label='all GR')
ax[-1,0].hist(FGM_towyo_P5.GR[FGM_towyo_P5.GR>GRc], facecolor='g', alpha=0.5,
    →label=['GR>' + str(GRc)])
ax[-1,0].hist(FGM_towyo_P5.GR[FGM_towyo_P5.GR<=GRc], facecolor='r', alpha=0.5,
    →label=['GR<=' + str(GRc)])
ax[-1,0].set_xlim([0,6]); ax[-1,0].set_title(""); ax[-1,0].set_ylabel('P5');
    →ax[-1,0].set_xlabel('GR');

# wavelength
wl = 2*np.pi/np.sqrt(FGM_towyo.K[:,0]**2 + FGM_towyo.K[:,1]**2)
ax[0,1].hist(wl, facecolor='k', alpha=0.5, label='all GR')
ax[0,1].hist(wl[FGM_towyo.GR<=GRc], facecolor='r', alpha=0.5, label=['GR<=' +
    →str(GRc)])
ax[0,1].hist(wl[FGM_towyo.GR>GRc], facecolor='g', alpha=0.5, label=['GR>' +
    →str(GRc)])
ax[0,1].set_xlim([0,250]); ax[0,1].set_title("wavelength"); ax[0,1].
    →set_ylabel('all sections'); ax[0,1].set_xlabel('$\lambda$');
```

```

wl = 2*np.pi/np.sqrt(FGM_towyo_P2.K[:,0]**2 + FGM_towyo_P2.K[:,1]**2)
ax[1,1].hist(wl, facecolor='k', alpha=0.5, label='all GR')
ax[1,1].hist(wl[FGM_towyo_P2.GR<=GRc], facecolor='r', alpha=0.5, label=['GR<=' +
    ↳str(GRc)])
ax[1,1].hist(wl[FGM_towyo_P2.GR>GRc], facecolor='g', alpha=0.5, label=['GR>' +
    ↳str(GRc)])
ax[1,1].set_xlim([0,250]); ax[1,1].set_title(""); ax[1,1].set_ylabel('P2');
    ↳ax[1,1].set_xlabel('$\lambda$');

wl = 2*np.pi/np.sqrt(FGM_towyo_P4.K[:,0]**2 + FGM_towyo_P4.K[:,1]**2)
ax[2,1].hist(wl, facecolor='k', alpha=0.5, label='all GR')
ax[2,1].hist(wl[FGM_towyo_P4.GR<=GRc], facecolor='r', alpha=0.5, label=['GR<=' +
    ↳str(GRc)])
ax[2,1].hist(wl[FGM_towyo_P4.GR>GRc], facecolor='g', alpha=0.5, label=['GR>' +
    ↳str(GRc)])
ax[2,1].set_xlim([0,250]); ax[2,1].set_title(""); ax[2,1].set_ylabel('P4');
    ↳ax[2,1].set_xlabel('$\lambda$');

wl = 2*np.pi/np.sqrt(FGM_towyo_P5.K[:,0]**2 + FGM_towyo_P5.K[:,1]**2)
ax[-1,1].hist(wl, facecolor='k', alpha=0.5, label='all GR')
ax[-1,1].hist(wl[FGM_towyo_P5.GR<=GRc], facecolor='r', alpha=0.5, label=['GR<=' +
    ↳str(GRc)])
ax[-1,1].hist(wl[FGM_towyo_P5.GR>GRc], facecolor='g', alpha=0.5, label=['GR>' +
    ↳str(GRc)])
ax[-1,1].set_xlim([0,250]); ax[-1,1].set_title(""); ax[-1,1].set_ylabel('P5');
    ↳ax[-1,1].set_xlabel('$\lambda$');

# critical level above bottom
ax[0,-1].hist(FGM_towyo.cab, facecolor='k', alpha=0.5, label='all GR')
ax[0,-1].hist(FGM_towyo.cab[FGM_towyo.GR<=GRc], facecolor='r', alpha=0.5,
    ↳label=['GR<=' + str(GRc)])
ax[0,-1].hist(FGM_towyo.cab[FGM_towyo.GR>GRc], facecolor='g', alpha=0.5,
    ↳label=['GR>' + str(GRc)])
ax[0,-1].set_xlim([-50,1000]); ax[0,-1].set_title("critical level above
    ↳bottom"); ax[0,-1].set_ylabel('all sections'); ax[0,-1].set_xlabel('cab');

ax[1,-1].hist(FGM_towyo_P2.cab, facecolor='k', alpha=0.5, label='all GR')
ax[1,-1].hist(FGM_towyo_P2.cab[FGM_towyo_P2.GR<=GRc], facecolor='r', alpha=0.5,
    ↳label=['GR<=' + str(GRc)])
ax[1,-1].hist(FGM_towyo_P2.cab[FGM_towyo_P2.GR>GRc], facecolor='g', alpha=0.5,
    ↳label=['GR>' + str(GRc)])
ax[1,-1].set_xlim([-50,1000]); ax[1,-1].set_title(""); ax[1,-1].
    ↳set_ylabel('P2'); ax[1,-1].set_xlabel('cab');

ax[2,-1].hist(FGM_towyo_P4.cab, facecolor='k', alpha=0.5, label='all GR')

```



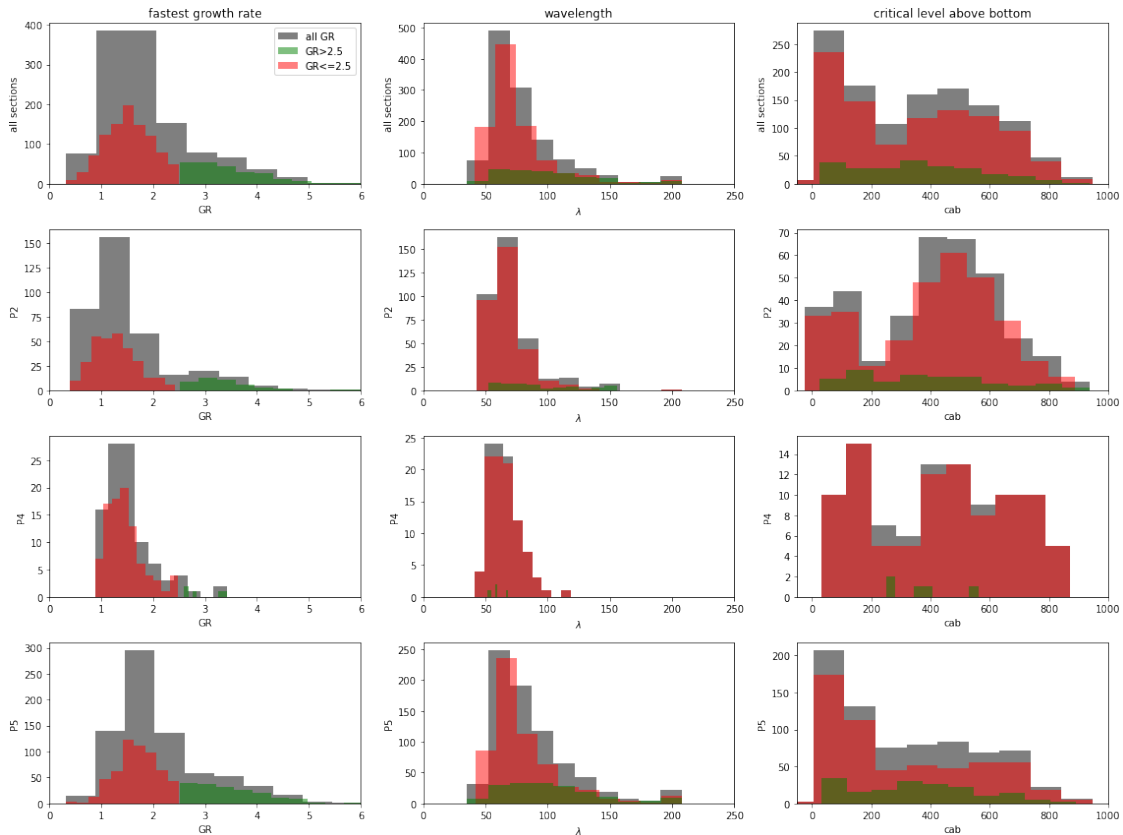
```

ax[2,-1].hist(FGM_towyo_P4.cab[FGM_towyo_P4.GR<=GRc], facecolor='r', alpha=0.5,
↳label=['GR<=' + str(GRc)])
ax[2,-1].hist(FGM_towyo_P4.cab[FGM_towyo_P4.GR>GRc], facecolor='g', alpha=0.5,
↳label=['GR>' + str(GRc)])
ax[2,-1].set_xlim([-50,1000]); ax[2,-1].set_title(""); ax[2,-1].
↳set_ylabel('P4'); ax[2,-1].set_xlabel('cab');

ax[-1,-1].hist(FGM_towyo_P5.cab, facecolor='k', alpha=0.5, label='all GR')
ax[-1,-1].hist(FGM_towyo_P5.cab[FGM_towyo_P5.GR<=GRc], facecolor='r', alpha=0.
↳5, label=['GR<=' + str(GRc)])
ax[-1,-1].hist(FGM_towyo_P5.cab[FGM_towyo_P5.GR>GRc], facecolor='g', alpha=0.5,
↳label=['GR>' + str(GRc)])
ax[-1,-1].set_xlim([-50,1000]); ax[-1,-1].set_title(""); ax[-1,-1].
↳set_ylabel('P5'); ax[-1,-1].set_xlabel('cab');

fig.tight_layout()

```



```

[22]: def datafromfile(data_name):
    data = sio.loadmat(mdirec + 'codes/' + data_name, squeeze_me =
↳True, struct_as_record = False)

```

```

type(data)
dict.keys(data)

# Growth rate, imaginary phase speed, real phase speed, numbers of
→zero-crossing, wave vector of the FGM
GR = xr.DataArray(data['GR'], coords={"site": np.arange(len(data['LON']))},
→dims=["site"], attrs={'longname': '$\sigma$: $hr^{-1}$'})
CI = xr.DataArray(data['CI'], coords={"site": np.arange(len(data['LON']))},
→dims=["site"])
CR = xr.DataArray(data['CR'], coords={"site": np.arange(len(data['LON']))},
→dims=["site"])
II = xr.DataArray(data['II'], coords={"site": np.arange(len(data['LON']))},
→dims=["site"], attrs={'longname': '0-crossings'})
KFGM = xr.DataArray(data['KFGM'], coords={"site": np.
→arange(len(data['LON'])), "vector": ['k', 'l']}, dims=["site", "vector"])
LON = xr.DataArray(data['LON'], coords={"site": np.
→arange(len(data['LON']))}, dims=["site"])
LAT = xr.DataArray(data['LAT'], coords={"site": np.
→arange(len(data['LON']))}, dims=["site"])

# profiles
B = xr.DataArray(data['B'], coords={"z":data['zw'], "site": np.
→arange(len(data['LON']))}, dims=["z", "site"])
N2 = xr.DataArray(data['N2'], coords={"z":data['zw'], "site": np.
→arange(len(data['LON']))}, dims=["z", "site"])
Ri = xr.DataArray(data['Ri'], coords={"z":data['zw'], "site": np.
→arange(len(data['LON']))}, dims=["z", "site"])
V = xr.DataArray(data['V'], coords={"z":data['zw'], "site": np.
→arange(len(data['LON']))}, dims=["z", "site"])
Vz = xr.DataArray(data['Vz'], coords={"z":data['zw'], "site": np.
→arange(len(data['LON']))}, dims=["z", "site"])
Vzz = xr.DataArray(data['Vzz'], coords={"z":data['zw'], "site": np.
→arange(len(data['LON']))}, dims=["z", "site"])

# FGM in terms of w
W = xr.DataArray(data['W'], coords={"z":data['zw'], "site": np.
→arange(len(data['LON']))}, dims=["z", "site"])

# critical levels
CL = xr.DataArray(data['CL'], coords={"site": np.arange(len(data['LON'])),
→"n": np.arange(data['CL'].shape[-1])}, dims=["site", "n"])

# interface height, bottom height
data0 = sio.loadmat(mdirec[:-7]+'/proc_data/'+data_name[6:-8]+'.'
→mat', squeeze_me = True, struct_as_record = False)
idep = xr.DataArray(data0['zo'], coords={"site": np.
→arange(len(data['LON']))}, dims=["site"])

```

```

    bdep = xr.DataArray(data0['bdepth'], coords={"site": np.
→arange(len(data['LON']))}, dims=["site"])

    FGM_towyo_ex = xr.Dataset({'GR': (['site'], 2*np.pi/GR/3600),
                                'CI': (['site'], CI),
                                'CR': (['site'], CR),
                                'II': (['site'], II),
                                'K': (['site', 'vector'], KFGM),
                                'LON': (['site'], LON),
                                'LAT': (['site'], LAT),
                                'zo': (['site'], idep),
                                'bdepth': (['site'], -bdep),
                                'b': (['z', 'site'], B),
                                'N2': (['z', 'site'], N2),
                                'Ri': (['z', 'site'], Ri),
                                'V': (['z', 'site'], V),
                                'Vz': (['z', 'site'], Vz),
                                'Vzz': (['z', 'site'], Vzz),
                                'W': (['z', 'site'], W),
                                'CL': (['site', 'n'], CL)},
                                coords={'site': np.arange(len(data['LON'])),
                                          'z': data['zw'],
                                          'n': np.arange(data['CL'].shape[-1])},
                                attrs={'title': 'FGM, tow-yo profiles, ex_'})

    return FGM_towyo_ex

```

FD and FG methods seem to have different results

```

[23]: # FD and FG

FGM_towyo_ex1 = datafromfile('TG_SI_TY_P2_00_2012_ex1.mat')
FGM_towyo_ex2 = datafromfile('TG_SI_TY_P2_00_2012_ex2.mat')

fig, ax = plt.subplots(nrows=4, ncols=1, figsize=(10, 10))
# 1. GR
ax[0].plot(FGM_towyo_ex1.LAT, FGM_towyo_ex1.GR) #FD
ax[0].plot(FGM_towyo_ex2.LAT, FGM_towyo_ex2.GR) #FG
ax[0].set_ylabel("Growth rate hr$^{-1}$")
# 2. CL
ax[1].plot(FGM_towyo_ex1.LAT, FGM_towyo_ex1.CL, 'ko') #FD
ax[1].plot(FGM_towyo_ex2.LAT, FGM_towyo_ex2.CL, 'ro') #FG
ax[1].set_ylabel("Critical level")
# 3. K and L
# K
ax[2].plot(FGM_towyo_ex1.LAT, 2*np.pi/FGM_towyo_ex1.K[:,0]) #FD
ax[2].plot(FGM_towyo_ex2.LAT, 2*np.pi/FGM_towyo_ex2.K[:,0]) #FG

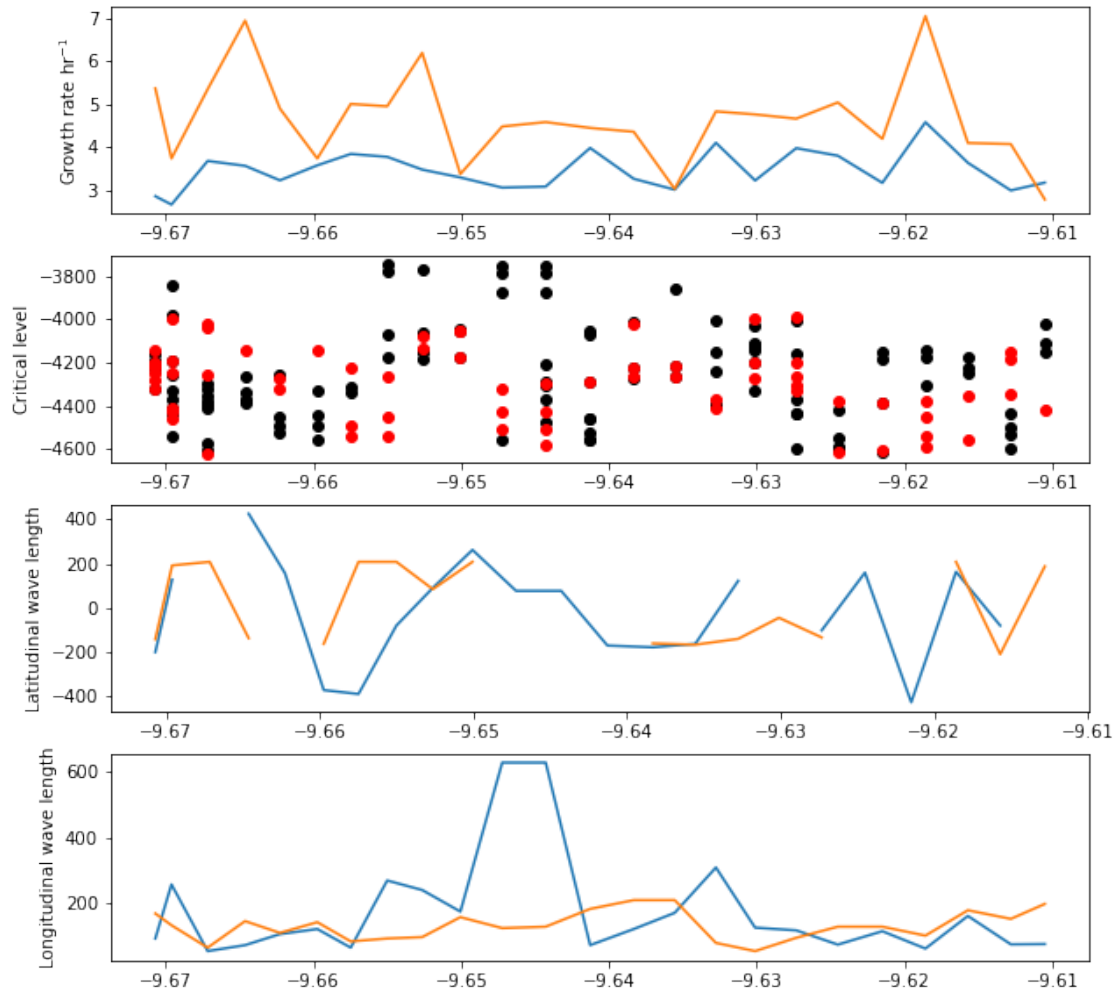
```

```

ax[2].set_ylabel("Latitudinal wave length")
# L
ax[-1].plot(FGM_towyo_ex1.LAT,2*np.pi/FGM_towyo_ex1.K[:,-1]) #FD
ax[-1].plot(FGM_towyo_ex2.LAT,2*np.pi/FGM_towyo_ex2.K[:,-1]) #FG
ax[-1].set_ylabel("Longitudinal wave length")

```

[23]: Text(0, 0.5, 'Longitudinal wave length')



[24]: # another tow-yo section

```

FGM_towyo_ex = datafromfile('TG_SI_TY_P2_01_2012_ex1.mat')

plt.plot(FGM_towyo_ex1.LON,FGM_towyo_ex1.LAT)
plt.plot(FGM_towyo_ex.LON,FGM_towyo_ex.LAT)

fig, ax = plt.subplots(nrows=4, ncols=1, figsize=(10, 10))

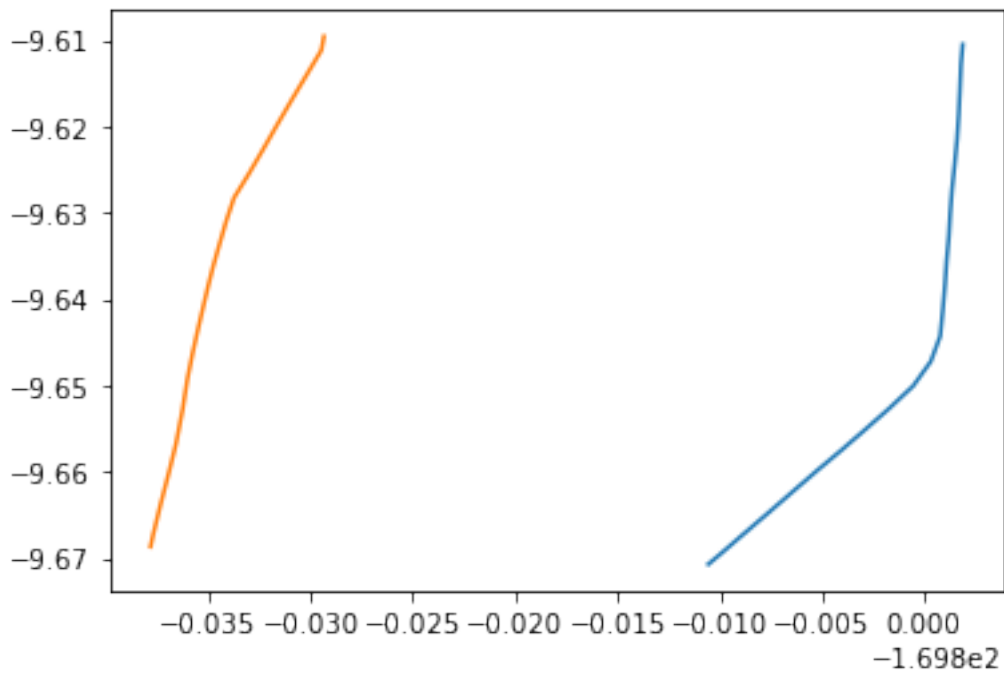
```

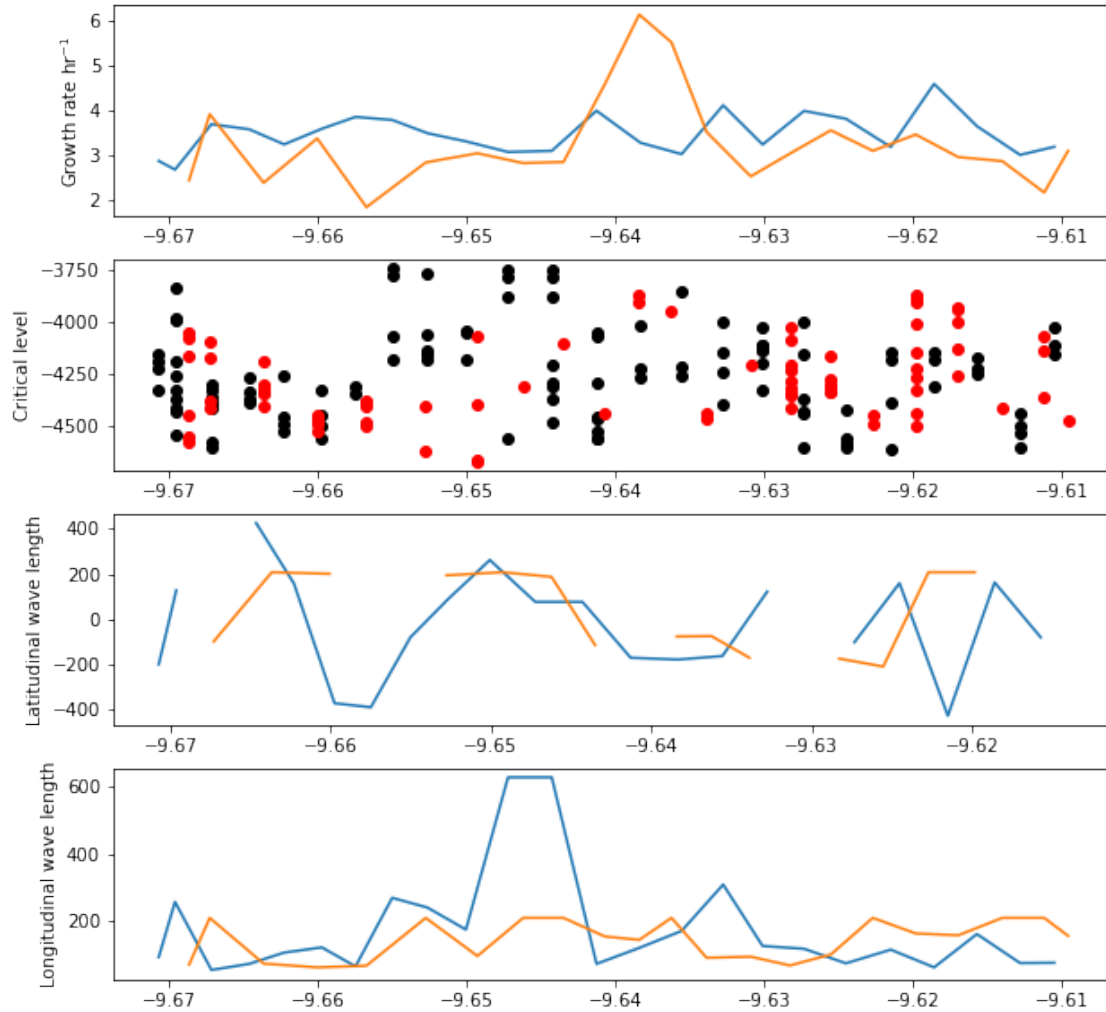
```

# 1. GR
ax[0].plot(FGM_towyo_ex1.LAT,FGM_towyo_ex1.GR)
ax[0].plot(FGM_towyo_ex.LAT,FGM_towyo_ex.GR)
ax[0].set_ylabel("Growth rate hr$^{-1}$")
# 2. CL
ax[1].plot(FGM_towyo_ex1.LAT,FGM_towyo_ex1.CL,'ko')
ax[1].plot(FGM_towyo_ex.LAT,FGM_towyo_ex.CL,'ro')
ax[1].set_ylabel("Critical level")
# 3. K and L
# K
ax[2].plot(FGM_towyo_ex1.LAT,2*np.pi/FGM_towyo_ex1.K[:,0])
ax[2].plot(FGM_towyo_ex.LAT,2*np.pi/FGM_towyo_ex.K[:,0])
ax[2].set_ylabel("Latitudinal wave length")
# L
ax[-1].plot(FGM_towyo_ex1.LAT,2*np.pi/FGM_towyo_ex1.K[:,-1])
ax[-1].plot(FGM_towyo_ex.LAT,2*np.pi/FGM_towyo_ex.K[:,-1])
ax[-1].set_ylabel("Longitudinal wave length")

```

[24]: Text(0, 0.5, 'Longitudinal wave length')





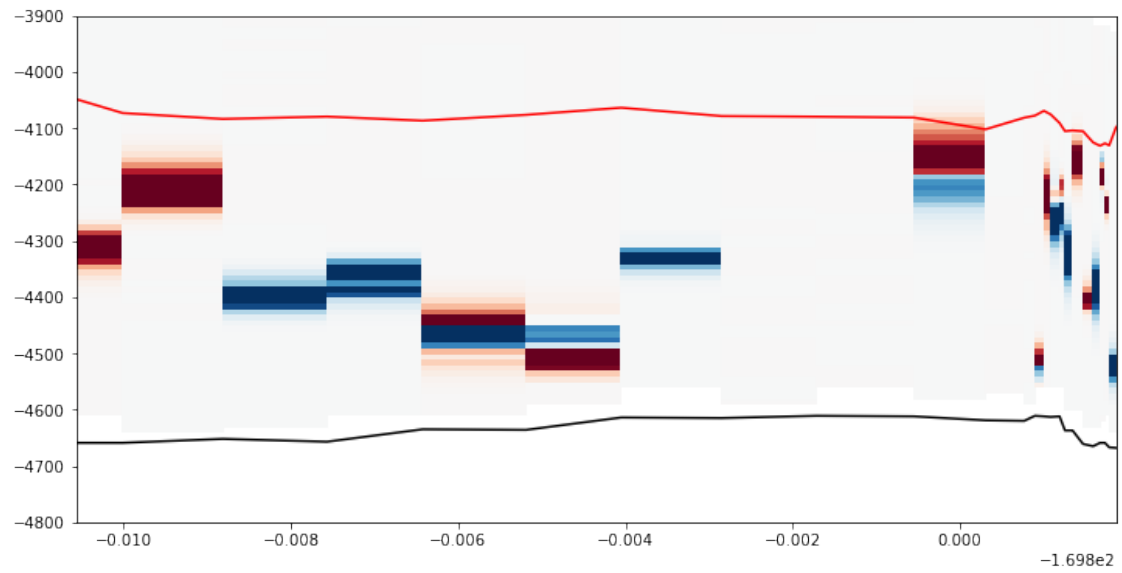
```
[25]: fig, ax = plt.subplots(nrows=1, ncols=1, figsize=(12, 6))

ax.pcolor(FGM_towyo_ex1.LON,FGM_towyo_ex1.z,FGM_towyo_ex1.W.real,cmap=cm.
↪RdBu,vmin=-.2, vmax=.2)
ax.plot(FGM_towyo_ex1.LON,FGM_towyo_ex1.bdepth,'k')
ax.plot(FGM_towyo_ex1.LON,FGM_towyo_ex1.zo,'r')
ax.set_ylim([-4800,-3900])
```

<ipython-input-25-6e1d5eec3edd>:3: MatplotlibDeprecationWarning: shading='flat' when X and Y have the same dimensions as C is deprecated since 3.3. Either specify the corners of the quadrilaterals with X and Y, or pass shading='auto', 'nearest' or 'gouraud', or set rcParams['pcolor.shading']. This will become an error two minor releases later.

```
ax.pcolor(FGM_towyo_ex1.LON,FGM_towyo_ex1.z,FGM_towyo_ex1.W.real,cmap=cm.RdBu,
vmin=-.2, vmax=.2)
```

[25]: (-4800.0, -3900.0)



[]: