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% file SIOC 221A HW 9
%
% author Julia Dohner
%
% due date December 13, 2017

% analysis of weekly flask-collected co2 data at Mauna Loa and La✓
Jolla
% stations

clear all; close all;

%% load CO2 data

dataML0 = fopen('monthly_flask_co2_mlo_JLD.txt');
dataLJ0 = fopen('monthly_flask_co2_ljo_JLD.txt');
dataSP0 = fopen('monthly_flask_co2_spo_JLD.txt');

valsML0 = textscan(dataML0, '%f %f', ...
    'delimiter', '\t');
valsLJ0 = textscan(dataLJ0, '%f %f', ...
    'delimiter', '\t');
valsSP0 = textscan(dataSP0, '%f %f', ...
    'delimiter', '\t');

fclose(dataML0);
fclose(dataLJ0);
fclose(dataSP0);

% format of .txt files is year, co2 value
LJ0year = valsLJ0{1};
LJ0co2 = valsLJ0{2};

ML0year = valsML0{1};
ML0co2 = valsML0{2};

SP0year = valsSP0{1};
SP0co2 = valsSP0{2};

% remove flagged data
for i = 1:length(ML0co2)
    if ML0co2(i) == -99.99
```

```
        ML0co2(i) = nan;
    end
end
for i = 1:length(LJ0co2)
    if LJ0co2(i) == -99.99
        LJ0co2(i) = nan;
    end
end
for i = 1:length(SP0co2)
    if SP0co2(i) == -99.99
        SP0co2(i) = nan;
    end
end

% remove nan's
% TODO: if time, go back and change this to a linear interpolation
addpath✓
('/Users/juliadohner/Documents/MATLAB/SIOC_221A/HW9/Inpaint_nans/Inpa✓
int_nans');
ML0co2 = inpaint_nans(ML0co2);
LJ0co2 = inpaint_nans(LJ0co2);
SP0co2 = inpaint_nans(SP0co2);

%% inspect spacing of data

% inspect time spacing between measurements
ML0_t_diff = diff(ML0year);
LJ0_t_diff = diff(LJ0year);
SP0_t_diff = diff(SP0year);

% figure
% plot(1:length(ML0year)-1,ML0_t_diff);
% figure
% plot(1:length(LJ0year)-1,LJ0_t_diff);
% figure
% plot(1:length(SP0year)-1,SP0_t_diff);

minDiffLJ0 = min(LJ0_t_diff);
maxDiffLJ0 = max(LJ0_t_diff);
minDiffML0 = min(ML0_t_diff);
maxDiffML0 = max(ML0_t_diff);
```

```

minDiffSP0 = min(SP0_t_diff);
maxDiffSP0 = max(SP0_t_diff);

% too big differences in time increments of daily LJ0 flask sampling, ✓
will try
% monthly data instead

% update: time differences range between 0.0767 and 0.0850 years for ✓
both
% ML0 and LJ0 records (difference of 0.0083) or ~3 days, deemed small
% enough difference in time increments
% read: counts in my book as even spacing

%% shorten data to same lengths

startYear = LJ0year(1,1); % 1.9690411000000000e+03 (latest start)
endYear = SP0year(length(SP0year),1); % earliest end
startIndex_LJ0 = find(LJ0year == startYear);
startIndex_ML0 = find(ML0year == startYear);
startIndex_SP0 = find(SP0year == startYear);
endIndex_LJ0 = find(LJ0year == endYear);
endIndex_ML0 = find(ML0year == endYear);
endIndex_SP0 = find(SP0year == endYear);

% create new vectors
LJ0co2_2 = LJ0co2(startIndex_LJ0:endIndex_LJ0);
LJ0year_2 = LJ0year(startIndex_LJ0:endIndex_LJ0);
ML0co2_2 = ML0co2(startIndex_ML0:endIndex_ML0);
ML0year_2 = ML0year(startIndex_ML0:endIndex_ML0);
SP0co2_2 = SP0co2(startIndex_SP0:endIndex_SP0);
SP0year_2 = SP0year(startIndex_SP0:endIndex_SP0);

% plot timeseries
figure('name','Atmospheric CO2 Timeseries');
plot(LJ0year_2,LJ0co2_2, '-r', ML0year_2,ML0co2_2, '-b', SP0year_2, ✓
SP0co2_2, '-g');
xlabel('\fontsize{14}year')
ylabel('\fontsize{14}ppm')
title('\fontsize{16}Atmospheric CO2 Records')
legend('\fontsize{12}La Jolla Station', '\fontsize{12}Mauna Loa', ✓
'\fontsize{12}South Pole', 'Location', 'northwest');

```

```
%% compute spectra (from in-class coherence example)
```

```
N = length(LJ0co2_2);
segment_length = N/2; % length of each chunk of data (aka segment✓
length)
M = segment_length/2;
Nseg = N/segment_length; % number of segments splitting data into

% using three segments with 50% overlap (concatenating in lines✓
below)
LJ0_use=[reshape(LJ0co2_2,segment_length,Nseg) reshape(LJ0co2_2(M+1:✓
end-M),segment_length,Nseg-1)];
ML0_use=[reshape(ML0co2_2,segment_length,Nseg) reshape(ML0co2_2(M+1:✓
end-M),segment_length,Nseg-1)];
SP0_use=[reshape(SP0co2_2,segment_length,Nseg) reshape(SP0co2_2(M+1:✓
end-M),segment_length,Nseg-1)];
```

```
LJ0_ft=fft(detrend(LJ0_use).*(hann(segment_length)*ones(1,3)));
ML0_ft=fft(detrend(ML0_use).*(hann(segment_length)*ones(1,3)));
SP0_ft=fft(detrend(SP0_use).*(hann(segment_length)*ones(1,3)));
```

```
% question: mean is still in here. Do I want it?
```

```
LJ0_spec=sum(abs(LJ0_ft(1:M+1,:)).^2,2)/N; % sum over all spectra✓
(2nd dim)
LJ0_spec(2:end)=LJ0_spec(2:end)*2; % multiply by 2 to make up for✓
lost energy
```

```
ML0_spec=sum(abs(ML0_ft(1:M+1,:)).^2,2)/N;
ML0_spec(2:end)=ML0_spec(2:end)*2;
```

```
SP0_spec=sum(abs(SP0_ft(1:M+1,:)).^2,2)/N;
SP0_spec(2:end)=SP0_spec(2:end)*2;
```

```
%% uncertainty estimate on spectra
```

```
% question: is this nu calculation right??
```

```
nu = 1.9*2*Nseg; % DOF = 2*number of segments*1.9 (1.9 for the✓
Hanning)
err_high = nu/chi2inv(0.05/2,nu);
err_low = nu/chi2inv(1-0.05/2,nu);
```

```
ratio_chi2 = err_high/err_low;
```

```
%% plot spectra
```

```
% Question: I added the +1 to the M here to make it match the dims of ✓  
the specs
```

```
% (145x1) because means are still in there
```

```
frequency=(1:M+1)/(segment_length/12);
```

```
frequency = frequency';
```

```
figure('name','Power Spectra of CO2 Records');
```

```
% TODO: fix the locations of the uncertainty estimates
```

```
loglog(frequency,LJ0_spec, '-r', [.2 .2],[err_low err_high]*LJ0_spec ✓  
(100), ...
```

```
    frequency, ML0_spec, '-b', [.1 .1],[err_low err_high]*ML0_spec ✓  
(100), ...
```

```
    frequency, SP0_spec, '-g', [.3 .3],[err_low err_high]*SP0_spec ✓  
(100))
```

```
xlabel('\fontsize{14}cycles per year')
```

```
ylabel('\fontsize{14}ppm^2/cpy')
```

```
title('\fontsize{16}Power Spectra of CO2 Records')
```

```
legend('\fontsize{12}La Jolla Station','\fontsize{12}Mauna Loa ✓  
Station', '\fontsize{12}South Pole','Location','northeast');
```

```
%% compute coherence
```

```
% compute cross covariance of LJ0/ML0
```

```
ccLM=sum(LJ0_ft(1:M+1,:).*conj(ML0_ft(1:M+1,:)),2)/N;
```

```
ccLM(2:end)=ccLM(2:end)*2;
```

```
% compute coherence
```

```
C_LM=abs(ccLM)./sqrt(LJ0_spec.*ML0_spec);
```

```
phase_LM = atan2(-imag(ccLM),real(ccLM));
```

```
deltaPhase_LM = sqrt((1-C_LM.^2)./(abs(C_LM).^2*2*Nseg));
```

```
% compute cross covariance of ML0/SP0
```

```
ccMS=sum(ML0_ft(1:M+1,:).*conj(SP0_ft(1:M+1,:)),2)/N;
```

```
ccMS(2:end)=ccMS(2:end)*2;
```

```
% compute coherence
```

```
C_MS=abs(ccMS)./sqrt(ML0_spec.*SP0_spec);
```

```
phase_MS = atan2(-imag(ccMS),real(ccMS));
```

```
deltaPhase_MS = sqrt((1-C_MS.^2)./(abs(C_MS).^2*2*Nseg));
```

```
%% uncertainty estimate
```

```
alpha = 0.05; % 95% confidence level
gamma_threshold= sqrt(1-alpha^(1/(Nseg-1)));
```

```
%% plot the coherence
```

```
figure('name','Coherence Plots of CO2 Records');
subplot(2,1,1)
plot(frequency, C_LM,[frequency(1) frequency(end)],[gamma_threshold↵
gamma_threshold]);
axis tight;
xlabel('\fontsize{14}cycles per year')
ylabel('\fontsize{14}coherence')
title('\fontsize{16}Coherence of CO2 Records (LJ0 and ML0)')
legend('\fontsize{12}La Jolla vs. Mauna Loa', '\fontsize{12}↵
Uncertainty Threshold', 'Location', 'southeast');
```

```
subplot(2,1,2)
plot(frequency, C_MS,[frequency(1) frequency(end)],[gamma_threshold↵
gamma_threshold]);
axis tight
xlabel('\fontsize{14}cycles per year')
ylabel('\fontsize{14}coherence')
title('\fontsize{16}Coherence of CO2 Records (ML0 and SP0)')
legend('\fontsize{12}Mauna Loa vs. South Pole', '\fontsize{12}↵
Uncertainty Threshold', 'Location', 'southeast');
```

```
% Question: is this threshold right? seems really high... but I↵
suppose it's that 5%
% of the data will be above the threshold just due to random chance,↵
so it should be
% high?
% "set a threshold for evaluating whether a calculated coherence↵
exceeds
% what we might expect from random white noise"
```

```
%% plot the phase
```

```
% Question: I'm having a hard time understanding this plot (read Lec↵
15
```

% Notes)

% Question: what are the units on the y axis? (again, read lec 15✓
notes)

figure('name','Phase Plot for Mauna Loa and South Pole Coherence');

semilogx(frequency,[phase_MS phase_MS+deltaPhase_MS phase_MS-✓
deltaPhase_MS]);

xlabel('\fontsize{14}cycles per year')

ylabel('\fontsize{14}phase units')

title('\fontsize{16}Phase Plot for Mauna Loa and South Pole✓
Coherence')

legend('\fontsize{12}phase', 'phase+delta phase','phase-delta✓
phase','Location','northeast');

axis tight