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%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%%
%% Script to generate synthetic data with uniform distribution
%% to estimate the asymmetric relationship between the x and y
%% for positive and negative x's, and plot a scatter plot,
%%
%% Figure 1 of Frankignoul and Kwon (submitted to GRL)
%%
%% Frankignoul, C., and Y.-O. Kwon: On the statistical estimation of asymmetrical
%% relationship between two climate variables. Geophys. Res. Lett., submitted.
%%
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

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clear
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%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%% Set variables
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

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p0=[];           %% slope for the symmetric regresssion
p1p=[]; p1n=[]; %% slope for the method 1 asymmetric regression
p2p=[]; p2n=[]; %% slope for the method 2 asymmetric regression
c1p=[]; c1n=[]; %% composite slope using all positive and negative x's
c2p=[]; c2n=[]; %% composite slope using 25% threshold for x's
c3p=[]; c3n=[]; %% composite slope using 5% threshold for x's

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%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%% Iteration to generate the synthetic data for 1000 times
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nn=1000;
for i=1:nn
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%-----
% Generate sythetic 100 x-values with zero mean,
% uniformly distributed in interval (-50,50).
%-----
x=-50 + (50-(-50))*rand(1,100);
x=x-mean(x);

```

```

%-----
% Generate sythetic 100 noise values with the zero mean,
% uniformly distributed in interval (-50,50).
%-----
e=-50 + (50-(-50))*rand(1,100);
e=e-mean(e);

```

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%-----
% Define asymmetric y-time series with the asymmetry = 3:1
%-----
kpos=find(x>0);
kneg=find(x<=0);

y(kpos)=3*x(kpos)+e(kpos);
y(kneg)=1*x(kneg)+e(kneg);

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yp=y(kpos);
yn=y(kneg);
xp=x(kpos);
xn=x(kneg);

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%-----
% Calculate the anomaly Y time series
%-----

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y_mean=mean(y);
YY=y-y_mean;

YYp=yp-y_mean;
YYn=yn-y_mean;

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%-----
% Calculate symmetric regression
%-----

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p0(end+1)=(y*x')/(x*x');

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%-----
% Asymmetric regression model 1
% (i.e., removing means for entire x's and y's)
%-----

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p1p(end+1)=(YYp*xp')/(xp*xp');
p1n(end+1)=(YYn*xn')/(xn*xn');

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%-----
% Asymmetric regression model 2:
% (i.e., removing means for xp's and Yp's,
% and separately for xn's and Yn's)
%-----

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xn0=xn-mean(xn);
xp0=xp-mean(xp);
YYn0=YYn-mean(YYn);
YYp0=YYp-mean(YYp);

p2p(end+1)=(YYp0*xp0')/(xp0*xp0');
p2n(end+1)=(YYn0*xn0')/(xn0*xn0');

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%-----
% Composite for all positive x's and negative x's, respectively
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xnegcomp0=mean(xn);
YYnegcomp0=mean(YYn);
xposcomp0=mean(xp);
YYposcomp0=mean(YYp);

c1p(end+1)=YYposcomp0/xposcomp0;
c1n(end+1)=YYnegcomp0/xnegcomp0;

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%-----
% Composite for top and bottom 25% x's

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%-----
[xsort,ksort]=sort(x);
xnegcomp=mean(x(ksort(1:25)));
YYnegcomp=mean(YY(ksort(1:25)));
xposcomp=mean(x(ksort(76:100)));
YYposcomp=mean(YY(ksort(76:100)));

c2p(end+1)=YYposcomp/xposcomp;
c2n(end+1)=YYnegcomp/xnegcomp;

```

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%-----
% Composite for top and bottom 5% x's
%-----
xnegcomp2=mean(x(ksort(1:5)));
YYnegcomp2=mean(YY(ksort(1:5)));
xposcomp2=mean(x(ksort(96:100)));
YYposcomp2=mean(YY(ksort(96:100)));

c3p(end+1)=YYposcomp2/xposcomp2;
c3n(end+1)=YYnegcomp2/xnegcomp2;

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end

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%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%% Calculate the 90% uncertainty range for the slope estimates
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[psort,ksort]=sort(p0);
P0bot5=psort(nn*0.05);
P0top5=psort(nn*0.95);

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```

[psort,ksort]=sort(p1p);
P1pbot5=psort(nn*0.05);
P1ptop5=psort(nn*0.95);

```

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[psort,ksort]=sort(p1n);
P1nbot5=psort(nn*0.05);
P1ntop5=psort(nn*0.95);

```

```

[psort,ksort]=sort(p2p);
P2pbot5=psort(nn*0.05);
P2ptop5=psort(nn*0.95);

```

```

[psort,ksort]=sort(p2n);
P2nbot5=psort(nn*0.05);
P2ntop5=psort(nn*0.95);

```

```

[psort,ksort]=sort(c1p);
C1pbot5=psort(nn*0.05);
C1ptop5=psort(nn*0.95);

```

```

[psort,ksort]=sort(c1n);
C1nbot5=psort(nn*0.05);
C1ntop5=psort(nn*0.95);

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```

[psort,ksort]=sort(c2p);

```

```
C2pbot5=psort(nn*0.05);
C2ptop5=psort(nn*0.95);
```

```
[psort,ksort]=sort(c2n);
C2nbot5=psort(nn*0.05);
C2ntop5=psort(nn*0.95);
```

```
[psort,ksort]=sort(c3p);
C3pbot5=psort(nn*0.05);
C3ptop5=psort(nn*0.95);
```

```
[psort,ksort]=sort(c3n);
C3nbot5=psort(nn*0.05);
C3ntop5=psort(nn*0.95);
```

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%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%% Plotting the scatter plot using the last iteration
%% and show the estimates of the selected slope estimates
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```
figure;
axes('position',[0.08 0.45 0.25 0.5]);

h=plot(x,YY,'k.','color',[0.7 0.7 0.7],'MarkerSize',15);
hold on;
grid on;
set(gca,'xlim',[-60 60],'xtick',[-60:30:60],'ylim',[-180 180],'ytick',[-180:60:180]);

xpos=[1:55];
xneg=-1*xpos;
h1p=plot(xpos,xpos*mean(p1p),'r-','linewidth',1); hold on;
h1n=plot(xneg,xneg*mean(p1n),'r-','linewidth',1); hold on;
h2p=plot(xpos,(xpos-mean(xp))*mean(p2p)+mean(YYp),'k-','linewidth',1); hold on;
h2n=plot(xneg,(xneg-mean(xn))*mean(p2n)+mean(YYn),'k-','linewidth',1); hold on;
h3p=plot(xposcomp,xposcomp*mean(c2p),'ms','markersize',12,'markerfacecolor','m');
h3n=plot(xnegcomp,xnegcomp*mean(c2n),'ms','markersize',12,'markerfacecolor','m');

plot([0 0],[-180 180],'k-');
plot([-60 60],[0 0],'k-');

set(gca,'fontSize',10);
xlabel('\bf\it x','FontName','times');
ylabel('\bf\it Y','FontName','times');
text(-55,160,'\bf (a)','FontSize',12);
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%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%% Plotting the estimates of the slopes
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```
axes('position',[0.38 0.45 0.3 0.5]);

plot([0.5 6.5],[1 1],'k-','LineWidth',1,'Color',[0.7 0.7 0.7]); hold on;
plot([0.5 6.5],[3 3],'k-','LineWidth',1,'Color',[0.7 0.7 0.7]);
```

```

h0=plot([1 1],[P0bot5 P0top5],'b-','linewidth',1); hold on; grid on;
h0=plot(1,mean(p0),'b*'); hold on; grid on;

h1p=plot([2 2],[P1pbot5 P1ptop5],'r-','linewidth',1); hold on; grid on;
h1p=plot(2,mean(p1p),'rx');
h1n=plot([2 2],[P1nbot5 P1ntop5],'r-','linewidth',1); hold on; grid on;
h1n=plot(2,mean(p1n),'ro');

h2p=plot([3 3],[P2pbot5 P2ptop5],'k-','linewidth',1); hold on; grid on;
h2p=plot(3,mean(p2p),'kx');
h2n=plot([3 3],[P2nbot5 P2ntop5],'k-','linewidth',1); hold on; grid on;
h2n=plot(3,mean(p2n),'ko');

h3p=plot([4 4],[C1pbot5 C1ptop5],'c-','linewidth',1); hold on; grid on;
h3p=plot(4,mean(c1p),'cx');
h3n=plot([4 4],[C1nbot5 C1ntop5],'c-','linewidth',1); hold on; grid on;
h3n=plot(4,mean(c1n),'co');

h4p=plot([5 5],[C2pbot5 C2ptop5],'m-','linewidth',1); hold on; grid on;
h4p=plot(5,mean(c2p),'mx');
h4n=plot([5 5],[C2nbot5 C2ntop5],'m-','linewidth',1); hold on; grid on;
h4n=plot(5,mean(c2n),'mo');

h5p=plot([6 6],[C3pbot5 C3ptop5],'g-','linewidth',1); hold on; grid on;
h5p=plot(6,mean(c3p),'gx');
h5n=plot([6 6],[C3nbot5 C3ntop5],'g-','linewidth',1); hold on; grid on;
h5n=plot(6,mean(c3n),'go');

ylabel('\bf Slope estimates');
xlabel('\bf Method #'s');
text(0.8,3.8,'\bf (b)','FontSize',12);

set(gca,'xlim',[0.5 6.5],'xtick',[1:6]);
set(gca,'xticklabel',[0 1 2 3 3 3]);
set(gca,'ylim',[0 4]);

hleg=legend([h0,h1p,h1n,h2p,h2n,h3p,h3n,h4p,h4n,h5p,h5n],'symmetric↵
regression','positive asymmetric regression 1','negative asymmetric regression↵
1','positive asymmetric regression 2', ...
'negative asymmetric regression 2','all positive composite','all negative↵
composite', ...
'top 25% composite','bottom 25% composite','top 5% composite','bottom 5%↵
composite','location','SouthOutside');
set(gca,'position',[0.40 0.45 0.3 0.5]);
set(hleg,'fontsize',8,'position',[0.71 0.45 0.28 0.3643]);

```