

## Chapter 7

# PATHSAS: Path Coefficient Analysis of Quantitative Traits

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### *Purpose*

To calculate path coefficients (direct effects) and indirect effects between independent (x) and dependent (y) variables.

### *Definitions*

Path coefficient analysis: the correlation between two traits is a function of the direct relationship between two traits and the indirect relationships of related traits (Wright, 1934).

$$r_{10} = \rho_{01} + \rho_{02}r_{12} + \rho_{03}r_{13} + \rho_{04}r_{14}$$

where  $r_{10}$  = the correlation between  $X_1$  and  $Y$ ;  $\rho_{01}$  = the path coefficient between  $X_1$  and  $Y$ ;  $\rho_{02}$  = the path coefficient between  $X_2$  and  $Y$ ;  $r_{12}$  = the correlation between  $X_1$  and  $X_2$ ;  $\rho_{02}r_{12}$  = the indirect effect of  $X_2$  on the correlation between  $X_1$  and  $Y$ ;  $\rho_{03}$  = the path coefficient between  $X_3$  and  $Y$ ;  $r_{13}$  = the correlation between  $X_1$  and  $X_3$ ;  $\rho_{03}r_{13}$  = the indirect effect of  $X_3$  on the correlation between  $X_1$  and  $Y$ ;  $\rho_{04}$  = the path coefficient between  $X_4$  and  $Y$ ;  $r_{14}$  = the correlation between  $X_1$  and  $X_4$ ;  $\rho_{04}r_{14}$  = the indirect effect of  $X_4$  on the correlation between  $X_1$  and  $Y$ .

**Originator**

Wright, S. (1934). The method of path coefficients. *Annals of Mathematical Statistics* 5:161-215.

**Software Available**

Cramer, C.S., Wehner, T.C., and Donaghy, S.B. (1999). PATHSAS: A SAS computer program for path coefficient analysis of quantitative data. *Journal of Heredity* 90:260-262 (free of charge).

**Some References Where the Software Has Been Used**

- Cramer, C.S. and Wehner, T.C. (1998). Fruit yield and yield component means and correlations of four slicing cucumber populations improved through six to ten cycles of recurrent selection. *Journal of American Society of Horticulture Science* 123:388-395.
- Cramer, C.S. and Wehner, T.C. (1999). Little heterosis for yield and yield components in hybrids of six cucumber inbreds. *Euphytica* 110:101-110.
- Cramer, C.S. and Wehner, T.C. (2000). Path analysis of the correlation between fruit number and plant traits of cucumber populations. *HortScience* 35(4):708-711.

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**EXAMPLE**

Data to be analyzed:

Plot	Repli- cation	Cycle	Plant number	Pistillate flowers	Branch number	Leaf number	Total fruit number	Culled fruit number	Early fruit number
001	01	1	29	022	040	0240	01	00	00
002	02	1	21	017	034	0120	17	02	01
003	03	1	31	052	032	0440	29	15	03
004	04	1	30	049	077	0550	25	09	05
005	04	3	30	058	071	0810	30	10	05

006	03	3	23	039	040	0460	32	03	13
007	02	3	26	044	047	0460	27	07	08
008	01	3	22	023	027	0330	12	04	00
009	01	2	19	025	054	0510	27	05	04
010	02	2	27	035	038	0510	34	03	05
011	03	2	23	050	027	0290	01	00	00
012	04	2	32	035	055	0560	47	10	08
013	05	1	28	088	140	1315	58	13	27
014	06	1	28	162	105	0986	39	09	14
015	07	1	25	026	070	0741	36	05	10
016	08	1	31	074	125	0803	55	08	35
017	08	2	33	048	127	0870	57	11	13
018	07	2	25	069	038	0639	26	04	09
019	06	2	32	041	105	0878	31	04	13
020	05	2	30	021	098	0982	53	02	06
021	05	3	26	012	064	0622	31	03	09
022	06	3	31	024	111	1133	26	01	07
023	07	3	24	046	082	0879	33	04	04
024	08	3	28	048	161	1122	63	05	07

**SAS Program**

```

DATA DST1;
INPUT PLOT REP CYC PLANTNO PISTFLOW BRANCHNO LEAFNO TOTALNO CULLNO
      EARLYNO;
MARK=TOTALNO-CULLNO;
BRANPLAN=BRANCHNO/PLANTNO;
NODEBRAN=LEAFNO/(BRANCHNO+PLANTNO);
TOTFEMND=PISTFLOW+TOTALNO;
PERFENOD=(TOTFEMND/LEAFNO);
FRTSET=TOTALNO/PISTFLOW;
FRTPLANT=TOTALNO/PLANTNO;
MARKPLAN=MARK/PLANTNO;
EARPLAN=EARLYNO/PLANTNO;
CARDS;
001 01 1 29 022 040 0240 01 00 00
002 02 1 21 017 034 0120 17 02 01
003 03 1 31 052 032 0440 29 15 03
004 04 1 30 049 077 0550 25 09 05
005 04 3 30 058 071 0810 30 10 05
006 03 3 23 039 040 0460 32 03 13
007 02 3 26 044 047 0460 27 07 08

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008 01 3 22 023 027 0330 12 04 00
009 01 2 19 025 054 0510 27 05 04
010 02 2 27 035 038 0510 34 03 05
011 03 2 23 050 027 0290 01 00 00
012 04 2 32 035 055 0560 47 10 08
013 05 1 28 088 140 1315 58 13 27
014 06 1 28 162 105 0986 39 09 14
015 07 1 25 026 070 0741 36 05 10
016 08 1 31 074 125 0803 55 08 35
017 08 2 33 048 127 0870 57 11 13
018 07 2 25 069 038 0639 26 04 09
019 06 2 32 041 105 0878 31 04 13
020 05 2 30 021 098 0982 53 02 06
021 05 3 26 012 064 0622 31 03 09
022 06 3 31 024 111 1133 26 01 07
023 07 3 24 046 082 0879 33 04 04
024 08 3 28 048 161 1122 63 05 07
;

%macro path(data,indep,dep0,dep,bylist,printreg,printout);
  /*
    Parameters to macro are:
    data =name of dataset to analyze
    indep=list of independent variables
    dep0=primary dependent variable
    dep=other dependent variables
    bylist=by variable list
    printreg=print regression? ( value is either yes or no)
    printout=print results(direct,indirect effects)?
              (value is either yes or no)
  */

  %local noind word nodep noby bylast printr;

  /* create noind macro variable */
  /* noind is the number of independent variables in &indep */
  %let noind=0;
  %if &indep ne %then %do;
    %let word=%scan(&indep,1);
    %do %while (&word ne );
      %let noind=%eval(&noind+1);
      %let word=%scan(&indep,&noind+1);
    %end;
  %end;

  /* create nodep macro variable */
  /* nodep is the number of dependent variables in &dep */
  %let nodep=0;
  %if &dep ne %then %do;
    %let word=%scan(&dep,1);
    %do %while (&word ne );
      %let nodep=%eval(&nodep+1);
      %let word=%scan(&dep,&nodep+1);
    %end;
  %end;

  /* create noby macro variable */

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/* noby is the number of by variables in &bylist */
%let noby=0;
%if &bylist ne %then %do;
  %let word=%scan(&bylist,1);
  %do %while (&word ne );
    %let noby=%eval(&noby+1);
    %let word=%scan(&bylist,&noby+1);
  %end;
%let bylast=%scan(&bylist,&noby);

/* create printr macro variable */
/* printr has a blank value or the value NOPRINT */
/* specifies whether to print regression output or not */
%if %upcase(&printreg)=YES %then %let printr=;
%else %let printr=noprnt;

data datal; set &data;
  keep &bylist &dep0 &dep &indep;
run;

proc sort data=datall;
  by &bylist;
proc standard data=datall mean=0 std=1 out=sdata2;
  by &bylist;
  var &indep &dep0 &dep;
run;

proc reg data=sdata2 &printr
  outsscp=sscp(keep=&bylist intercep _type_)
  outest=estdep(drop=_model_ _type_ _rmse_ intercep);
  by &bylist;
  model &dep0=&indep;
run;

/*
_type_='N' is the number of obs in the dataset;
nobs, number of obs., is created
needed for checking that there are enough obs.
if not, the reg. coefficients are biased, and need to set to miss-
ing
*/
data sscp; set sscp;
  if _type_='N';
  rename intercep=nobs;
  drop _type_;

/* if no. of obs. is <= the no. of indep. variables, then
set the regression coefficients to missing */
data estdep; merge sscp estdep;
  by &bylist;
  array v &indep;
  look='no ';
  if nobs<=&noind then do;
    look='yes';
  do over v;
    v=.;
  end;
end;

```

```

        end;
    end;
run;

proc print data=estdep;
    where look='yes';
    var &bylist nob;
title3
'The following identification levels do not have enough obs. for anal-
ysis';
title4 '    and the regression coefficients were set to missing
';
run;
title3 ' ' ;

proc reg data=sdata2 &printr
    outest=estindep(drop=_model_ _type_ _rmse_ intercep);
    by &bylist;
    model &dep=&dep0;
run;

data estind2; set estindep;
    by &bylist;
    array r regcl-regc&nodep;
    retain regcl-regc&nodep;
    if first.&bylast then _i_=0;
    _i_+1;
    r=&dep0;
    if last.&bylast then do;
        output;
        do over r;
            r=.;
        end;
    end;
    drop &dep0 &dep _depvar_;
run;

proc corr data=data1 outp=corr noprint;
    by &bylist;
    var &indep;
run;
data corr; set corr;
    if _type_='CORR';
    drop _type_;
run;

data estdep; set estdep;
    array reg &indep;
    array r2 reg1-reg&noind;
    do over reg;
        r2=reg;
    end;
    drop &indep;
run;

data tog;
    merge corr estdep;

```

```

by &bylist;
array dir &indep;
array corr &indep;
array r2 reg1-reg&noind;
if first.&bylast then do;
  totc=0;
  n=0;
  end;
n+1;
&dep0=.;
do over dir;
  if n=_i_ then dir= r2;
  else dir=r2*corr;
  &dep0 + dir;
  end;
drop n;
keep &bylist--_name_ &indep &dep0 _depvar_ nobs;
format &indep &dep0 5.2;
run;

data tog2; merge tog estind2; by &bylist;
array r regc1-regc&nodep;
array t &dep;
do over r;
  t=&dep0 * r;
  end;
format &dep &dep0 5.2;
format regc1-regc&nodep 5.2;
* drop regc1-regc&nodep;
drop _depvar_;
run;

%if %upcase(%printout)=YES %then
  %str(proc print data=tog2(drop=regc1-regc&nodep); run);
%mend path;

%path(data=dst1,
  indep=branplan nodebran perfenod frtset,
  dep0=frtplant,
  dep=markplan earplan,
  bylist=cyc,
  printreg=no,
  printout=yes
);

RUN;

```

**SAS Output**

	B	N	P		F	M	
	R	O	E		R	A	E
	A	D	R	F	T	R	A
N	N	E	F	R	P	K	R
A	P	B	E	T . N	L	P	P

O	C	M	L	R	N	S	O	A	L	L
B	Y	E	A	A	O	E	B	N	A	A
S	C		N	N	D	T	S	T	N	N
001	1	BRANPLAN	0.72	0.18	-0.06	0.03	8	0.87	0.80	0.78
002	1	NODEBRAN	0.37	0.34	-0.10	0.04	8	0.65	0.61	0.59
003	1	PERFENOD	-0.17	-0.15	0.23	0.01	8	-0.08	-0.07	-0.07
004	1	FRTSET	0.07	0.05	0.01	0.30	8	0.42	0.39	0.38
005	2	BRANPLAN	0.72	-0.13	-0.41	0.42	8	0.61	0.54	0.31
006	2	NODEBRAN	-0.26	0.34	0.01	-0.01	8	0.08	0.07	0.04
007	2	PERFENOD	-0.58	0.01	0.50	-0.53	8	-0.60	-0.53	-0.30
008	2	FRTSET	0.40	-0.01	-0.34	0.77	8	0.82	0.72	0.41
009	3	BRANPLAN	1.06	-0.03	-0.37	0.12	8	0.78	0.75	0.28
010	3	NODEBRAN	-0.15	0.20	-0.31	-0.10	8	-0.36	-0.35	-0.13
011	3	PERFENOD	-0.46	-0.07	0.86	-0.22	8	0.10	0.09	0.04
012	3	FRTSET	0.28	-0.04	-0.42	0.46	8	0.28	0.26	0.10