

Heritability Analysis of imaging traits in the HCP

The following is a step-by-step tutorial on how to perform a classic polygenic and accelerated FPHI heritability analyses in the HCP dataset using SOLAR-Eclipse Imaging Genetics software and ‘solareclipser’ package can be found on our github page: <https://github.com/txbrain-org/solareclipser>.

At the moment this procedure has only been tested on linux OS. We are working to evaluate it on MacOS. It may take some little time to have it working on Windows

Start by reviewing your data. The same subject IDs must be used in your phenotype, pedigree and genotype files to avoid confusion and error.

**Note: In the following instructions, ‘>’ denotes a Bash prompt, while ‘>>’ denotes the R software prompt. Commands preceded by ‘>’ are for in the Bash terminal and should not be entered into R.

1. Installation

1. Download solar from https://www.nitrc.org/projects/se_linux, then install solar on your cluster and add solar directory to system path.

```
> ./install_solar `pwd` `pwd`  
> export PATH=$PATH:"/data/brutus_data31/Si/Rsolar/solar/"
```

- o Example

```
|sigao@node01:/data/brutus_data31/Si/Rsolar/solar$ ls  
install_solar  README  solar.tar  
|sigao@node01:/data/brutus_data31/Si/Rsolar/solar$ ./install_solar `pwd` `pwd`  
  
*****  
Ignore error messages (if any) from the tests below  
  
SOLAR Eclipse version 9.0.1, last updated on January 11, 2024  
Developed at Maryland Psychiatric Research Center,  
University of Maryland School of Medicine, Baltimore.  
Visit our documentation and tutorial website www.solar-eclipse-genetics.org  
Our download page https://www.nitrc.org/projects/se\_linux  
Our github page https://github.com/brian09/solar-eclipse  
For questions email: pkochunov@gmail.com  
Enter help for help, exit to exit, doc to browse documentation.  
The software development is supported by NIH grant R01EB015611  
from The National Institute for Biomedical Imaging and Bioengineering.  
Enter cite to see how to cite this software.  
  
solar.tcl is version 9.0.1  
solarmain binary is version 9.0.1  
  
Mismatched version of solar.tcl in /data/brutus_data31/Si/Rsolar/solar/lib  
Ignore error messages (if any) from the tests above  
*****  
  
*** Successful Installation ***  
  
SOLAR has been installed with the command name solar  
  
The new documentation directory is /data/brutus_data31/Si/Rsolar/solar/doc  
  
See README.linux if this version crashes after registering users  
or fails to accept keys in parallel queing systems. You may  
need to replace solarmain with solarmain.static or solarmain.dynamic.  
We can help if you email solar@txbiomedgenetics.org.  
  
|sigao@node01:/data/brutus_data31/Si/Rsolar/solar$ ls  
bin  install_solar  lib  README  solar  
|sigao@node01:/data/brutus_data31/Si/Rsolar/solar$ export PATH=$PATH:"/data/brutus_data31/Si/Rsolar/solar/"
```

2. Install ‘solareclipser’ package from github, and then install the packages and its dependencies.

```
> R
>> install.packages("devtools", repos = "https://cran.r-project.org/")
>> library("devtools")
>> install_github("enigma-1590c46634/solareclipser")
```

- Example

```
(base) sigao@openhpc-headnode:/data/brutus_data31/Si/Rsolar$ R
R version 4.4.1 (2024-06-14) -- "Race for Your Life"
Copyright (C) 2024 The R Foundation for Statistical Computing
Platform: x86_64-redhat-linux-gnu

R is free software and comes with ABSOLUTELY NO WARRANTY.
You are welcome to redistribute it under certain conditions.
Type 'license()' or 'licence()' for distribution details.

Natural language support but running in an English locale

R is a collaborative project with many contributors.
Type 'contributors()' for more information and
'citation()' on how to cite R or R packages in publications.

Type 'demo()' for some demos, 'help()' for on-line help, or
'help.start()' for an HTML browser interface to help.
Type 'q()' to quit R.

[Previously saved workspace restored]

> library("devtools")
Loading required package: usethis
> install_github("enigma-1590c46634/solareclipser")
```

2. Perform polygenic in R

1. Load library

```
>> library(solareclipser)
```

2. Specify output directory

```
>> sc <- SolarCommand$new(save_output_dir = "/data/brutus_data31/Si/Rsolar/")
```

3. Read pedigree file

```
>> sc$load(obj = "pedigree", fpath = "HCP_imputed_filtered_ped.csv", cond = "-t 0")
```

4. Read phenotype file

```
>> sc$load(obj = "phenotypes", fpath = "HCP_WM_ave_norm.csv")
```

5. Select a trait from the phenotype file

```
>> sc$trait("CC")$polygenic()
```

6. Run polygenic

```
>> sc$run()
```

o Example

```
> library(solareclipser)
> sc <- SolarCommand$new(save_output_dir = "/data/brutus_data31/Si/Rsolar/")
> sc$load(obj = "pedigree", fpath = "HCP_imputed_filtered_ped.csv", cond = "-t 0")
> sc$load(obj = "phenotypes", fpath = "HCP_WM_ave_norm.csv")
> sc$trait("CC")$polygenic()
> sc$run()
-----
proc file7bfc46212070 {} {
  load pedigree HCP_imputed_filtered_ped.csv -t 0
  load phenotypes HCP_WM_ave_norm.csv
  trait CC
  polygenic
}
-----
Unloading current pedigree data ...
Loading Empirical Pedigree...
There are 2284 people. If not correct, be sure ID's are unique.
Determining families (use -1 option to skip this)
Warning if number of families is greater than one it may
cause an issue when loading phi2 matrix. Use -1 option to
avoid any potential issues.
*****
* Maximize sporadic model
*****
*** Loglikelihood of sporadic model is -487.520945
*****
* Maximize polygenic model
*****
*** Loglikelihood of polygenic model is -332.229219
*** H2r in polygenic model is 0.9344430
*** Determining significance of H2r
*** Comparing polygenic and sporadic models
*** chi = 310.5835, deg = 1, p = 8.148806e-70
*****
* Summary of Results
*****
Pedigree: HCP_imputed_filtered_ped.csv empirical
Phenotypes: HCP_WM_ave_norm.csv
Trait: CC Individuals: 999
H2r is 0.9344430 p = 8.148806e-70 (Significant)
H2r Std. Error: 0.0104121
Warning. Unexpectedly high heritabilities might result from
numerical problems, especially if mztwins are present.
Output files and models are in directory CC/
Summary results are in CC/polygenic.out
Loglikelihoods and chi's are in CC/polygenic.Logs.out
Best model is named poly and null0 (currently loaded)
Final models are named poly, spor
Residual Kurtosis is -0.0900, within normal range
> |
```

3. Perform Fast and Powerful Heritability Inference (FPHI) in R.

1. Load library
>> library(solareclipser)
2. Specify output directory
>> sc <- SolarCommand\$new(save_output_dir = "/data/brutus_data31/Si/Rsolar/")
3. Read pedigree file. No need to load pedigree again if pedigree has been loaded
>> sc\$load(obj = "pedigree", fpath = "HCP_imputed_filtered_ped.csv", cond = "-t 0")
4. Read phenotype file
>> sc\$load(obj = "phenotypes", fpath = "HCP_WM_ave_norm.csv")
5. Select a trait from the phenotype file
>> sc\$trait("CC")
6. Create eigenvalue and eigenvector files for the phenotypes
>> sc\$create_evd_data(output_fbasename = "CC_evd")
7. Create fphi with evd data
>> sc\$fphi(evd_data = "CC_evd")
8. Run FPHI
>> sc\$run()

- o Example

```
> library(solareclipser)
> sc <- SolarCommand$new(save_output_dir = "/data/brutus_data31/Si/Rsolar/")
> sc$load(obj = "phenotypes", fpath = "HCP_WM_ave_norm.csv")
> sc$trait("CC")
> sc$create_evd_data(output_fbasename = "CC_evd")
> sc$fphi(evd_data = "CC_evd")
> sc$run()
-----
proc file7bfc764c31a7 {} {
  load phenotypes HCP_WM_ave_norm.csv
  trait CC
  create_evd_data --o CC_evd
  fphi --evd_data CC_evd
}
-----
*****
*          Fast Permutation Heritability Inference (FPHI) Summary of Results          *
*****
Pedigree:   HCP_imputed_filtered_ped.csv
Phenotypes: HCP_WM_ave_norm.csv
Trait:      CC H2r = 0.934443010898 SE = 0.0104086242211  Individuals: 999
polygenic loglik: -332.22921885  sporadic loglik: -487.520945344  p = 8.14880208133e-70 (Significant)
Fully Converged Parameters

      Name          Value          Std Error
-----
Parameter  Fit Value  Standard Error
mean       0.00404027444118  0.118458228889
e2         0.0655569891024  0.0104086242211
h2r        0.934443010898   0.0104086242211
sd         1.04560390379      0.0260963338527
>
```