

# Extended Twin Family Designs: The Motivation for Using Them

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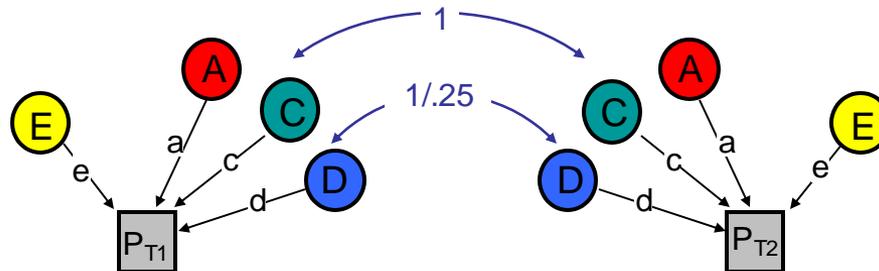
International Statistical Genetics Workshop 2022

# The point of this lecture

- Extending the Classical Twin Design (CTD) to include additional relative types not only allows estimation of additional quantities, but it also probably produces less biased estimates
- Unlike the effects of violations of assumptions in the CTD, understanding the influence of biased assumptions in ETFDs requires simulation.

# Classical Twin Design (CTD)

Assumption	biased up	biased down
Either $V_D$ or $V_C$ is zero	$\hat{V}_A$	$\hat{V}_C$ & $\hat{V}_D$
No assortative mating	$\hat{V}_C$	$\hat{V}_D$ & $\hat{V}_A$
No A-C covariance	$\hat{V}_C$	$\hat{V}_A$ & $\hat{V}_D$



# Assortative mating consequence on $V_A$

- ▶ AM: phenotypic correlation between mating partners
- ▶ Many examples (e.g., height  $\sim .25$ ; IQ  $\sim .4$ ; Social attitudes  $\sim .6$ )
- ▶ If AM leads to genetic similarity in partners (as it does if it's primary phenotypic AM), there are genetic consequences:
  - ▶ Height  $V_A$  increases in the population because 'tall' ('short') alleles are more concentrated in individuals than expected.
  - ▶ E.g., if you're a 'tall' allele sitting in an egg and are waiting around to see what other height alleles you'll get paired with from that sperm swimming to you, they are more likely than chance to be other 'tall' alleles (both at the same locus and at others; & this just considers the effects on  $V_A$  in 1<sup>st</sup> gen)

$$V_{A.equil} = \frac{V_{A0}}{1 - rh_{equil}^2}$$

# AM consequence on relative covariance

- ▶ AM increases genetic covariances and correlations between relatives (e.g., sibs, parents, cousins, etc). E.g.:

$$r_{A,DZ} = \frac{1}{2}(1 + rh_{equil}^2)$$

- ▶ Consider again being a ‘tall’ allele in a zygote. This time you are watching your co-twin’s zygote get formed. Regardless of whether you exist (are IBD) in your co-twin’s zygote, you can expect more tall alleles in your co-twin’s zygote.
- ▶ Thus, you can also expect to share more ‘tall’ alleles with your sibling(s) than expected under random mating.
- ▶ AM biases  $\hat{V}_C$  upwards and  $\hat{V}_A$  (or  $\hat{V}_D$ ) downwards
  - ▶  $r_{MZ.A1,A2}$  is already 1 so AM cannot increase it
  - ▶ AM will increase  $r_{DZ.A1,A2} > .50$

# Passive G-E Covariance (aka “genetic nurture”)

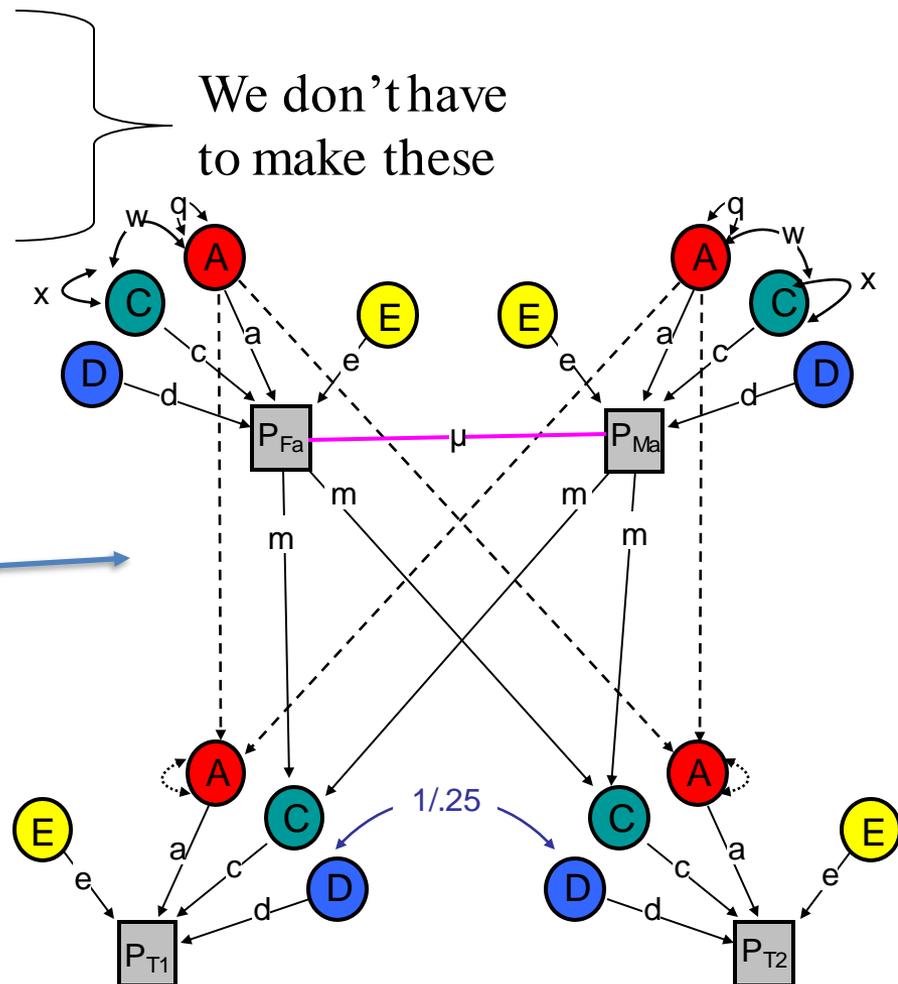
- ▶ Covariance between the average genetic effect in a family and the “familial environment” that occurs when parental trait directly influences the offspring trait, leading to covariance between genes affective a trait and the offspring rearing environment
- ▶ E.g., educated parents pass on both genes and environments that predispose to higher education
- ▶ Because it is a covariance between the *average* genetic effect and the familial environment, it increases the covariance of all siblings by the same amount regardless of their relatedness (e.g., MZ vs. DZ). It therefore mimics, and leads to an overestimate, of  $V_C$  in the CTD.

# Adding parents gets us around all these assumptions

Assumption biased up biased down

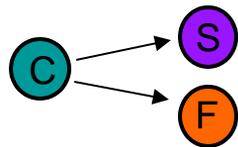
Either  $V_D$  or  $V_C$  is zero  
 No assortative mating  
 No A-C covariance

Nuclear Twin Family Design



# We can model $V_C$ as either $V_S$ or $V_F$

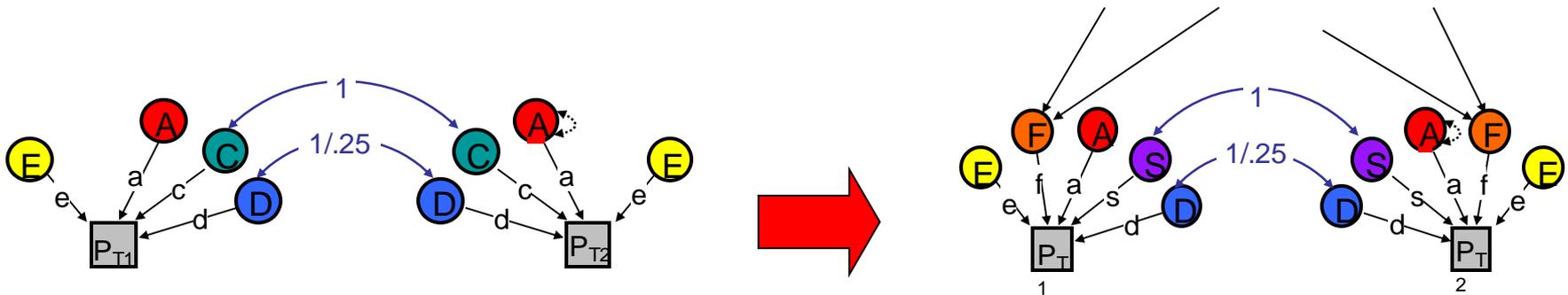
With parents, we can break  $V_C$  up into:



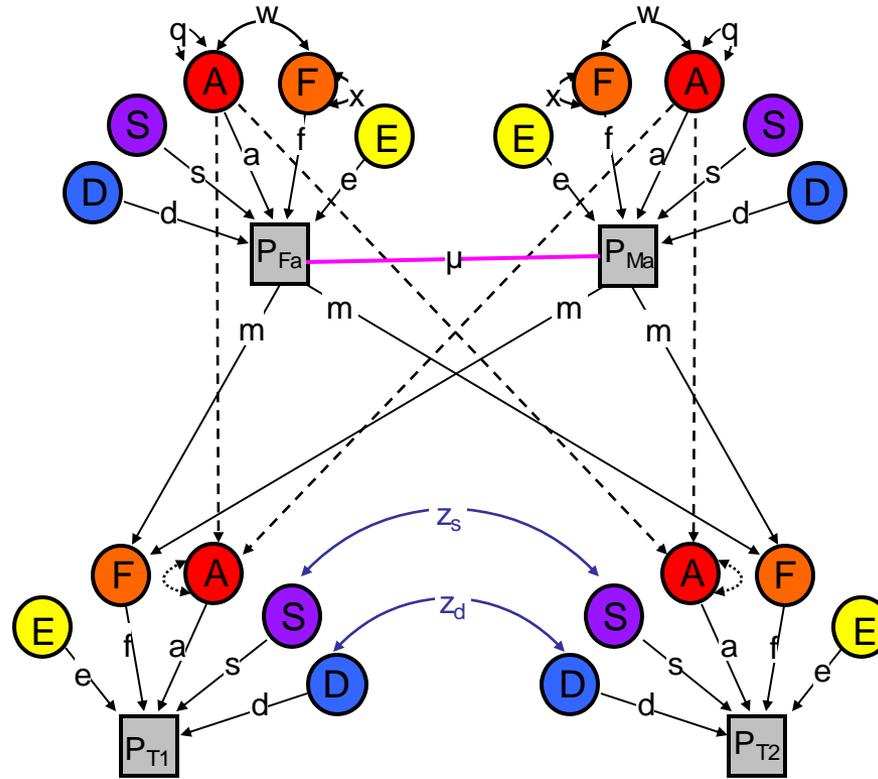
S = env. factors shared only between **sibs**

F = **familial** env factors passed from parents to offspring

But we can only estimate one of these (or more technically, three of  $V_A$ ,  $V_S$ ,  $V_F$ , &  $V_D$ )



# Nuclear Twin Family Design (NTFD)

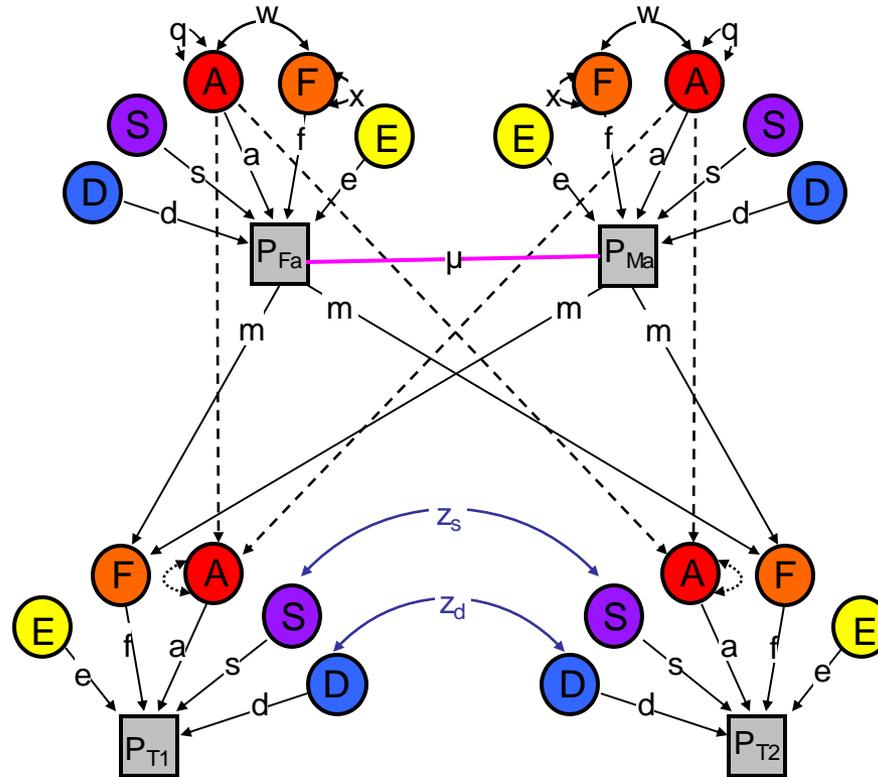


Note:  $m$  estimated  
and  $f$  fixed to 1

# On average across 38 traits CTD vs. ETFD results\*

- $\hat{V}_A$  65% higher in CTD
  - $\hat{V}_D$  43% lower in CTD
  - $\hat{V}_C$  45% lower in CTD when  $r(\text{spouse}) \sim 0$
  - $\hat{V}_C$  100% higher in CTD when  $r(\text{spouse}) > 0$
- }  $\hat{V}_G$  18% higher in CTD
- ETFD results are not perfect, but theory and simulation suggest they are, on average, much more accurate than CTD results.
    - Accuracy across all sims: CTD=.14; NTF=.07; ETFD=.045

# Nuclear Twin Family Design (NTFD)



Note:  $m$  estimated and  $f$  fixed to 1

## Assumptions:

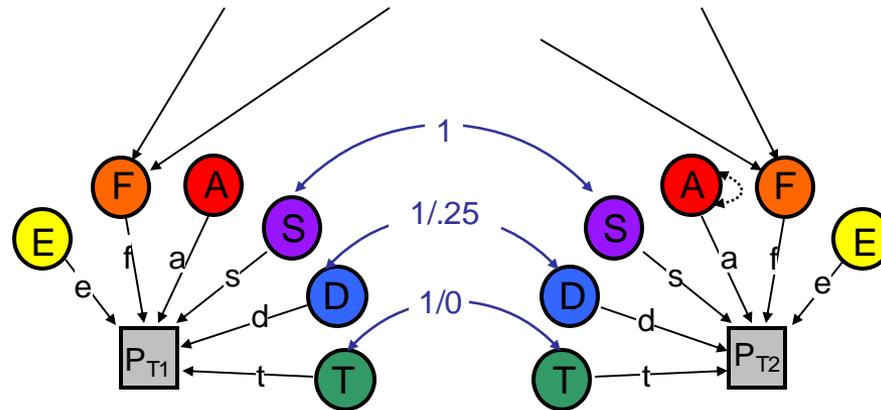
- Only can estimate 3 of 4:  $V_A, V_D, V_S, V_F$  (bias is variable)
- Assortative mating due to primary phenotypic assortment (bias is variable)

# *Stealth*

- Include twins and their sibs, parents, spouses, and offspring...
  - Gives 17 unique covariances (MZ, DZ, Sib, P-O, Spousal, MZ avunc, DZ avunc, MZ cous, DZ cous, GP-GO, and 7 in-laws)
  - 88 covariances with sex effects

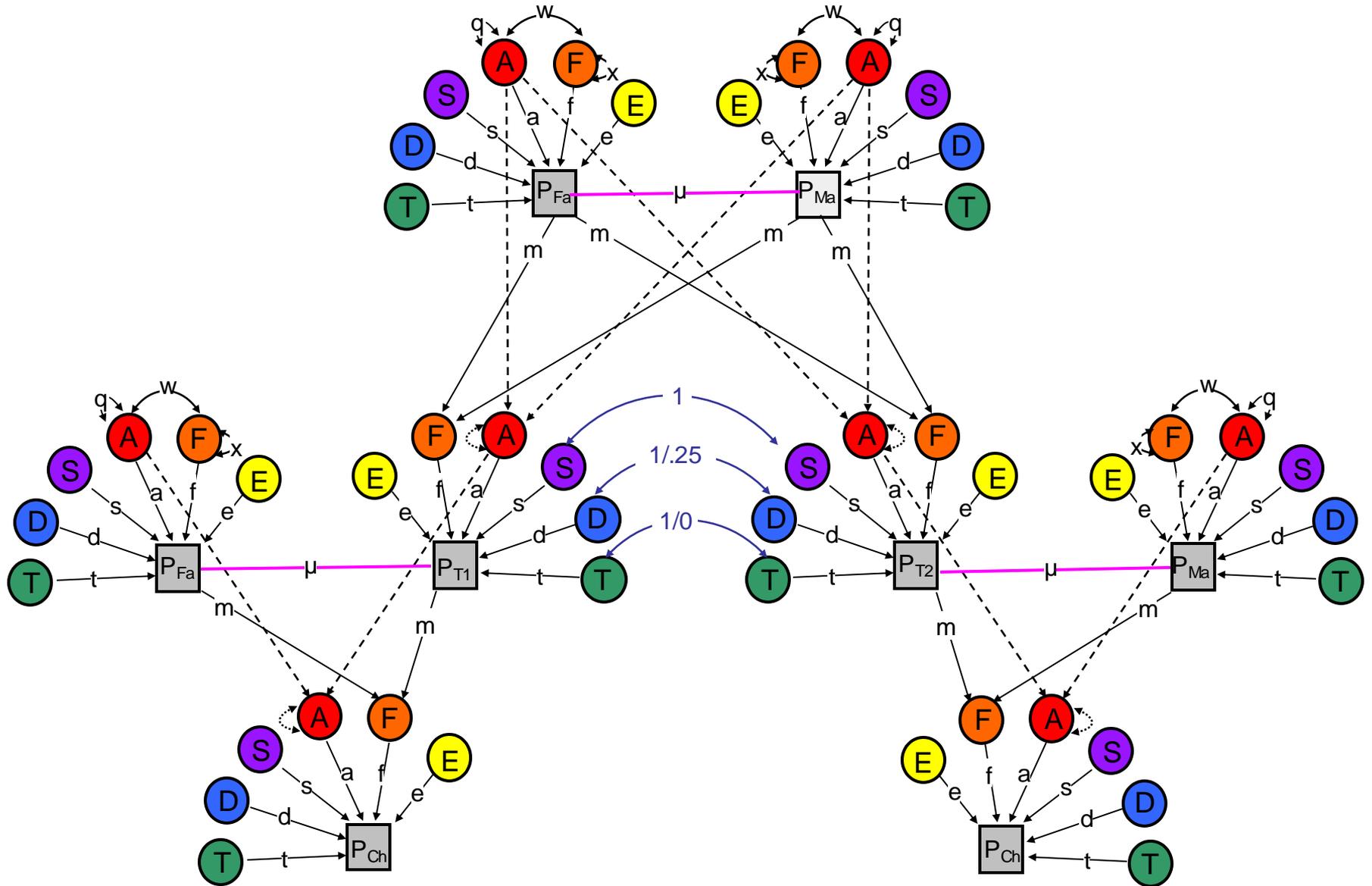
# Additional obs. covs with *Stealth* allow estimation of $V_A$ , $V_S$ , $V_D$ , $V_F$ , $V_T$

**A** **S** **F** **D** **T** can be estimated simultaneously  
**T** = env. factors shared only between **twins**



(Remember: we're not just estimating more effects. More importantly, we're reducing the bias in estimated effects – although perhaps at the expense of more variance in estimates)

# Stealth



# Stealth

■ <u>Assumption</u>	<u>biased up</u>	<u>biased down</u>
Primary assortative mating	$\hat{V}_A, \hat{V}_D, \hat{V}_F$	$\hat{V}_A, \hat{V}_D, \hat{V}_F$
No epistasis	$\hat{V}_A, \hat{V}_D$	$\hat{V}_S$
No AxAge	$\hat{V}_D, \hat{V}_S$	$\hat{V}_A$

# Stealth

- | <u>Assumption</u>          | <u>biased up</u>                  | <u>biased down</u>                |
|----------------------------|-----------------------------------|-----------------------------------|
| Primary assortative mating | $\hat{V}_A, \hat{V}_D, \hat{V}_F$ | $\hat{V}_A, \hat{V}_D, \hat{V}_F$ |
| No epistasis               | $\hat{V}_A, \hat{V}_D$            | $\hat{V}_S$                       |
| No AxAge                   | $\hat{V}_D, \hat{V}_S$            | $\hat{V}_A$                       |
- Phenotypic homogamy (primary AM): matching based on phenotypic similarity
  - Social homogamy: matching based on environmental similarity (e.g., religion)
  - Convergence: mates become more similar to each other (e.g., becoming more conservative when dating a conservative)



# Simulation program: GeneEvolve

GeneEvolve

http://matthewckeller.com/html/geneevolve.html

Google Gmail GHome GScholar CU CU-Psych CULink CULib CUTravel TA LearR AromaAffy mtype Pandora PAH MyMacPro

**GeneEvolve**

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Mx-R  
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*GeneEvolve...*

*yours to command*

**True or Estimated Standardized Variance Components**

Component	First Generation (G)	First Generation (T0)	In-Dataset	CTD Estimates	Smooth Estimates
A	0.30	0.30	0.30	0.30	0.30
A*A	0.10	0.10	0.10	0.10	0.10
D	0.05	0.05	0.05	0.05	0.05
C	0.15	0.15	0.15	0.15	0.15
E	0.10	0.10	0.10	0.10	0.10
Age	0.05	0.05	0.05	0.05	0.05
Age*A	0.05	0.05	0.05	0.05	0.05
Cov's	0.10	0.10	0.10	0.10	0.10
%VT	0.10	0.10	0.10	0.10	0.10
AM	0.10	0.10	0.10	0.10	0.10

**Change in Variance Components Across Generations**

Component	Start	End								
A	0.30	0.30	0.30	0.30	0.30	0.30	0.30	0.30	0.30	0.30
A*A	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10
D	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05
C	0.15	0.15	0.15	0.15	0.15	0.15	0.15	0.15	0.15	0.15
E	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10
Age	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05
Age*A	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05	0.05
COV	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10
%VT	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10
AM	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.10

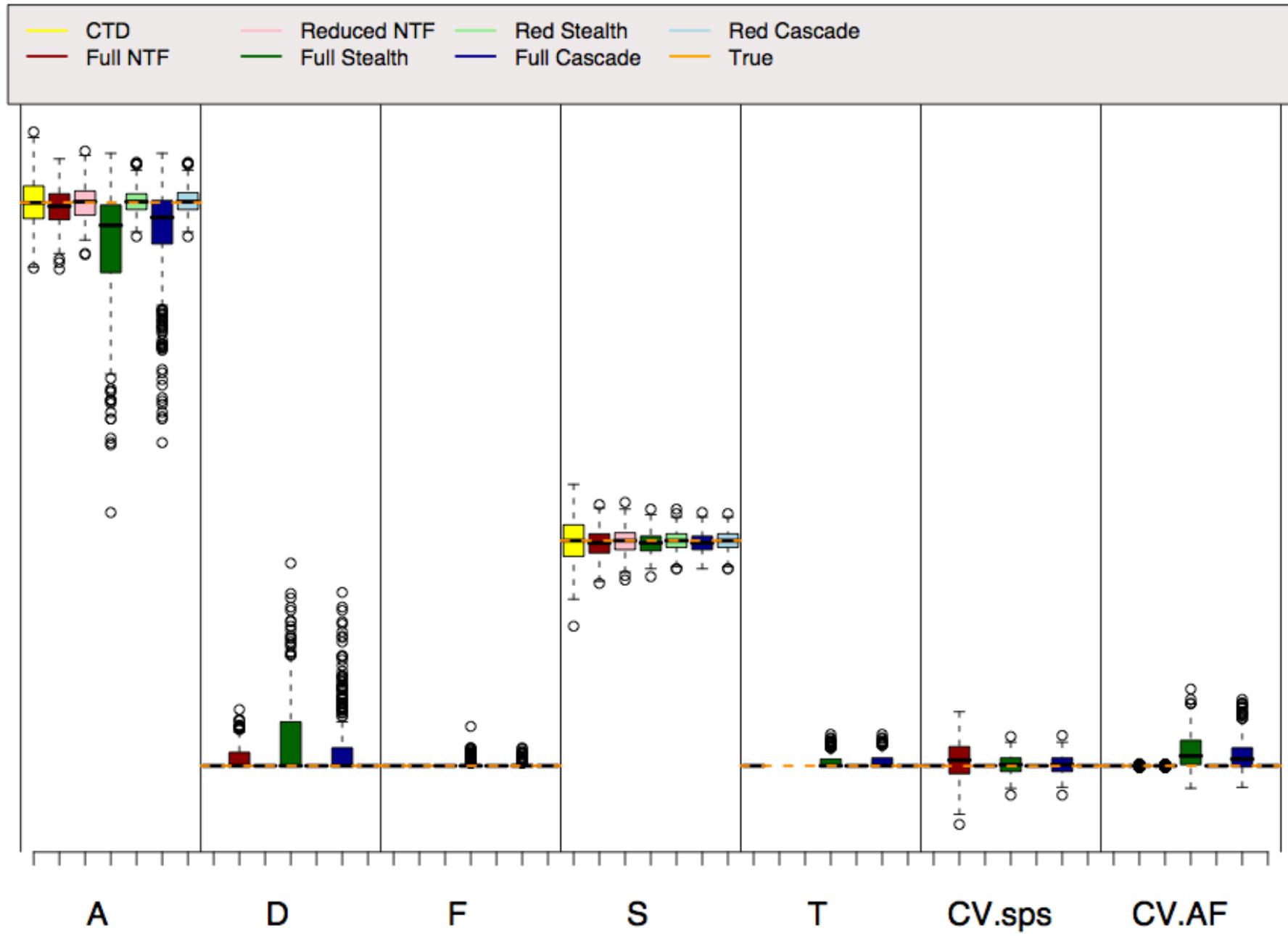
## Get GeneEvolve:

- [GeneEvolve65.zip](#)

**Note:** *GeneEvolve* is still a 'beta-version'. **Breakdowns are likely!** You can help by



# Reality: $V_A = .5$ , $V_S = .2$

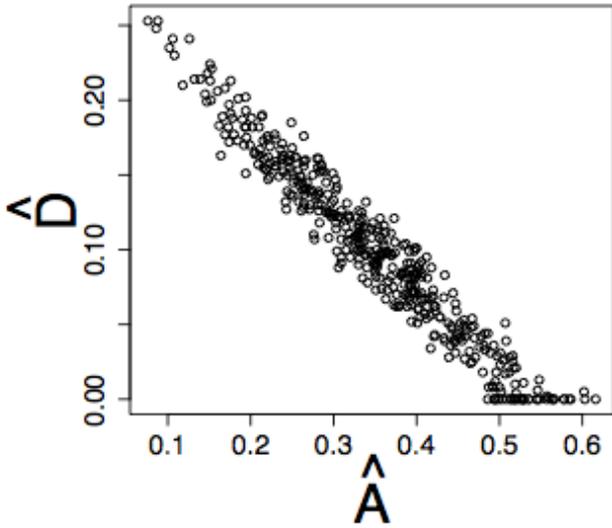




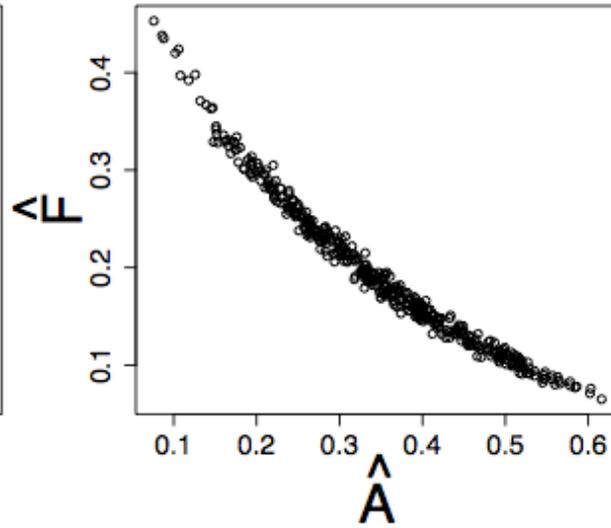


# $V_A, V_D, V_F$ estimates are highly correlated in Stealth & Cascade

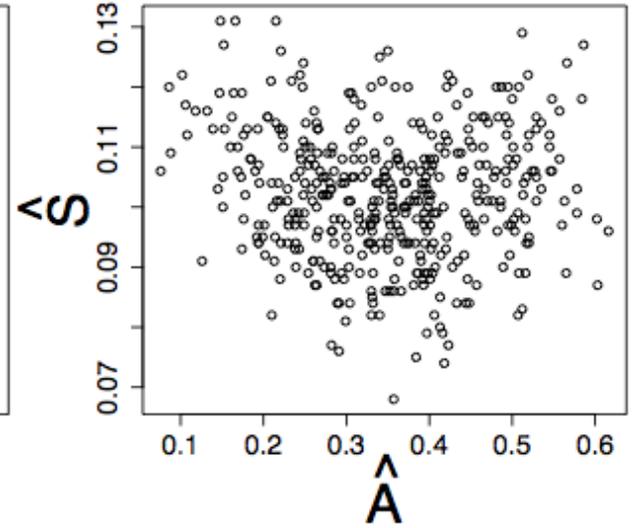
$r = -0.97$



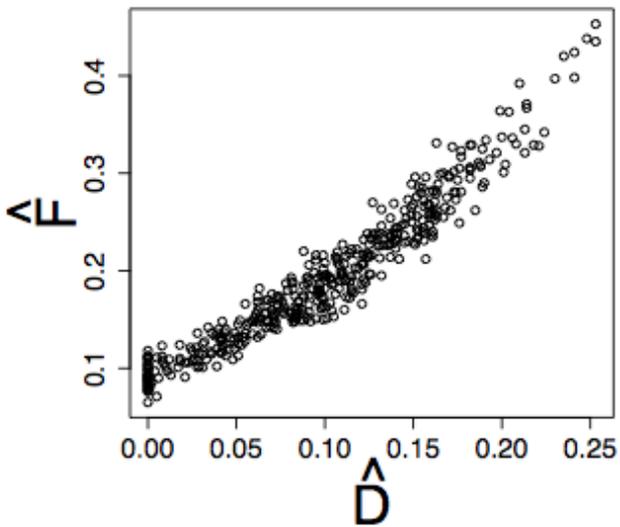
$r = -0.98$



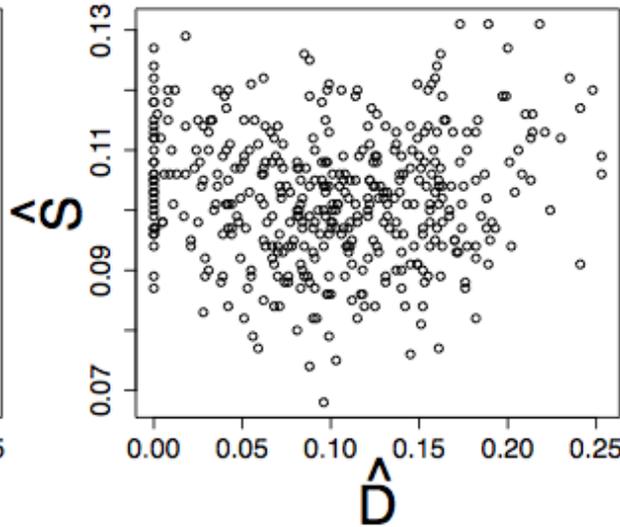
$r = -0.07$



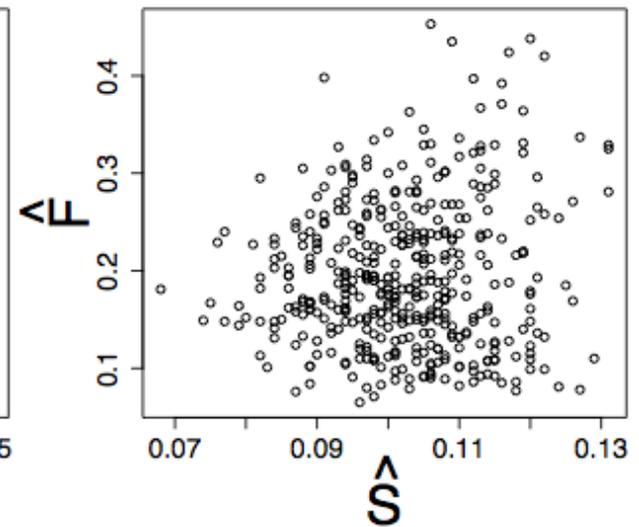
$r = 0.96$



$r = 0$

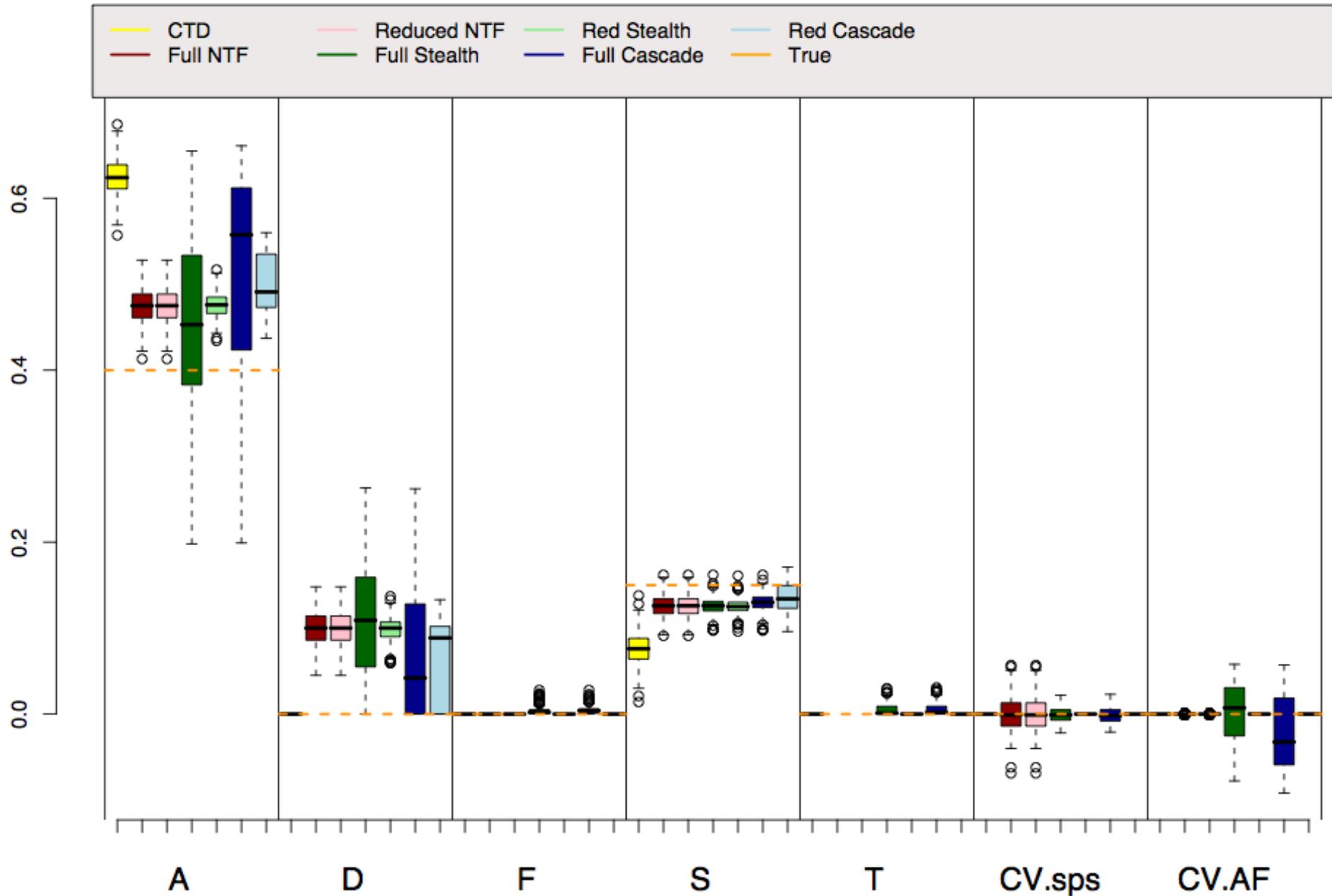


$r = 0.09$

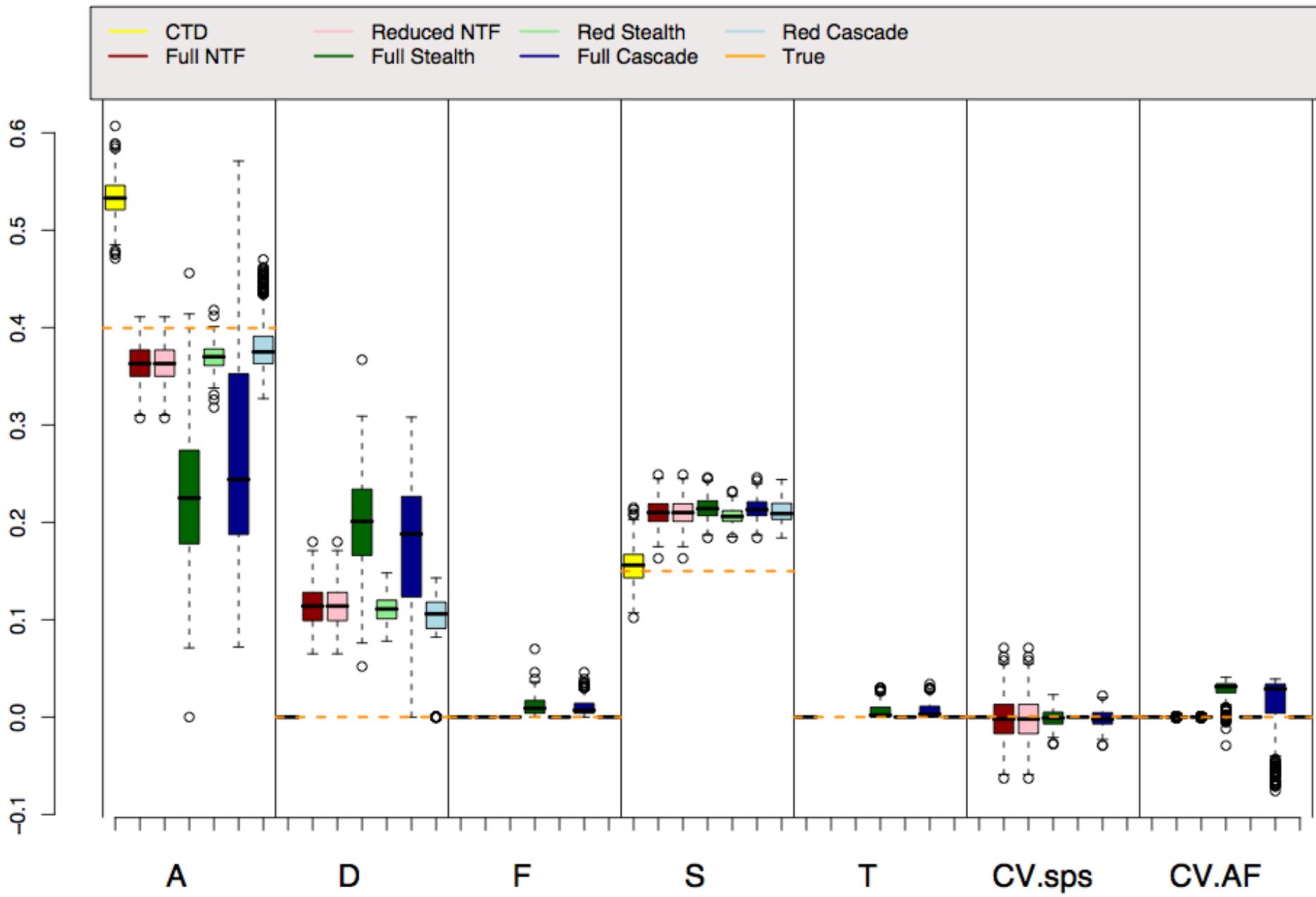




Reality:  $V_A=.4$ ,  $V_{A \times A}=.15$ ,  $V_S=.15$



Reality:  $V_A=.4$ ,  $V_{A \times Age}=.15$ ,  $V_S=.15$



# Conclusions

- All models require assumptions. More assumptions = more biased estimates on average
- Simulations provide assessments of NTFD, *Stealth*, and *Cascade*. These complicated models work as designed and are less biased and provide more nuanced understanding than CTDs
- But ETFDs have drawbacks:
  - Complicated; easy to make mistakes
  - Require large datasets (e.g.,  $n > 20k$  individuals) that are rarely collected
  - Require many assumptions (but fewer than CTD)

# Further reading on this lecture

- ▶ Eaves LJ, Last KA, Young PA, Martin NG (1978) Model-fitting approaches to the analysis of human behaviour. *Heredity* 41:249-320
- ▶ Fulker DW (1982) Extensions of the classical twin method. Human Genetics. Part A: The Unfolding Genome (Progress in Clinical and Biological Research Vol 103A). p. 395-406
- ▶ Fulker DW (1988) Genetic and cultural transmission in human behavior. Proceedings of the Second International conference on Quantitative Genetics
- ▶ Eaves LJ, Heath AC, Martin NG, Neale MC, Meyer JM, Silberg JL, Corey LA, Truett K, Walter E (1999) Comparing the biological and cultural inheritance of stature and conservatism in the kinships of monozygotic and dizygotic twins. In: Cloninger CR (Ed) Proceedings of 1994 APPA Conference. p. 269-308
- ▶ Keller MC & Coventry WL (2005). Quantifying and addressing parameter indeterminacy in the classical twin design. *Twin Research and Human Genetics*, 8, 201-213
- ▶ Keller MC, Medland SE, Duncan LE, Hatemi PK, Neale MC, Maes HHM, Eaves LJ. Modeling extended twin family data I: Description of the Cascade Model. *Twin Research and Human Genetics*, 29, 8-18.
- ▶ Keller MC, Medland SE, & Duncan LE (2010). Are extended twin family designs worth the trouble? A comparison of the bias, precision, and accuracy of parameters estimated in four twin family models. *Behavior Genetics*.