

## **Covariate Plots**

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# 1 Purpose

This script picks up after model. Rnw to process bootstrap results and make covariate plots.

## 1.1 Summarize bootstrap models.

## Listing 1:

```
> #wait for bootstraps to finish
> getwd()
```

[1] "/data/project/metrumrg/inst/example/project/script"

## Listing 2:

```
> require(metrumrg)
> boot <- read.csv('../nonmem/1005bootlog.csv',as.is=TRUE)
> head(boot)
```

	Χ	tool	run	parameter	moment	value
1	1	nm7	1	ofv	minimum	2467.30236668031
2	2	nm7	1	THETA1	estimate	10.2175
3	3	nm7	1	THETA1	prse	<na></na>
4	4	nm7	1	THETA1	se	<na></na>
5	5	nm7	1	THETA2	estimate	24.3171
6	6	nm7	1	THETA2	prse	<na></na>

## Listing 3:

> unique(boot\$parameter)



```
[1] "ofv"
                "THETA1"
                                     "THETA3" "THETA4"
                                                           "THETA5"
                           "THETA2"
[7] "THETA6"
                "THETA7"
                           "OMEGA1.1" "OMEGA2.1" "OMEGA2.2" "OMEGA3.1"
[13] "OMEGA3.2" "OMEGA3.3" "SIGMA1.1" "SIGMA2.1" "SIGMA2.2" "cov"
[19] "prob"
                "min"
                           "data"
                                                     Listing 4:
> text2decimal(unique(boot$parameter))
[1] NA 1.0 2.0 3.0 4.0 5.0 6.0 7.0 1.1 2.1 2.2 3.1 3.2 3.3 1.1 2.1 2.2 NA NA
[20] NA NA
                                                     Listing 5:
> boot$X <- NULL
```

It looks like we have 14 estimated parameters. We will map them to the original control stream.

## Listing 6:

```
> boot <- boot[!is.na(text2decimal(boot$parameter)),]</pre>
> head(boot)
 tool run parameter
                                value
                       moment
2 nm7
              THETA1 estimate 10.2175
3 nm7
              THETA1
                         prse
                                 <NA>
4 nm7
             THETA1
                                 <NA>
5 nm7
             THETA2 estimate 24.3171
6 nm7
             THETA2
                         prse
                                 <NA>
7 nm7
              THETA2
                                 <NA>
```

## Listing 7:

#### > unique(boot\$moment)

[1] "estimate" "prse" "se"



```
Listing 8:
> unique(boot$value[boot$moment=='prse'])
[1] NA
prse, and therefore moment, is noninformative for these bootstraps.
                                                      Listing 9:
> boot <- boot[boot$moment=='estimate',]</pre>
> boot$moment <- NULL
> unique(boot$tool)
[1] "nm7"
                                                     Listing 10:
> boot$tool <- NULL
> head(boot)
   run parameter
                    value
2
   1
         THETA1
                 10.2175
5
   1
         THETA2 24.3171
8
   1 THETA3 0.0689622
11
   1 THETA4 3.75759
14
   1
         THETA5 180.927
17 1
         THETA6 0.972631
                                                     Listing 11:
> unique(boot$value[boot$parameter %in% c('OMEGA2.1','OMEGA3.1','OMEGA3.2')])
 [1] "0.119051"
                     "-0.000180592" "-0.0351459"
                                                   "0.160918"
                                                                  "-0.0468652"
 [6] "-0.0247546"
                     "0.233729"
                                    "0.00135439"
                                                   "-0.0240276"
                                                                  "0.122195"
 [11] "-0.0131397"
                     "-0.0437089" "0.171962"
                                                   "-0.0349359"
                                                                  "-0.0448369"
```



[16]	"0.107582"	"-0.0563908"	"-0.046028"	"0.0682629"	"-0.0383106"
[21]	"-0.0297646"	"0.122878"	"-0.0100309"	"-0.033563"	"0.12321"
[26]	<b>"</b> -0.0322801 <b>"</b>	"-0.0500608"	"0.152055"	"-0.00892538"	<b>"</b> -0.00387561 <b>"</b>
[31]	"0.0923754"	"-0.00999975"	"-0.0436539"	"0.0918378"	"-0.0620811"
[36]	"-0.0579281"	"0.112107"	"0.000269946"	"-0.0344167"	"0.108072"
[41]	"-0.013151"	"-0.0477776"	"0.135537"	<b>"</b> -0.00999128 <b>"</b>	"-0.0505017"
[46]	"0.125247"	"-0.0339363"	<b>"</b> -0.0527939 <b>"</b>	"0.0978788"	"-0.0479414"
[51]	"-0.0589469"	"0.112061"	"0.00413274"	"-0.00811303"	"0.148301"
[56]	"-0.0414546"	"-0.0389744"	"0.118716"	"-0.0191499"	"-0.0375006 <b>"</b>
[61]	"0.119471"	"0.0143039"	"-0.0213005 <b>"</b>	"0.0846409"	<b>"</b> -0.0346299 <b>"</b>
[66]	"-0.0494923"	"0.125292"	<b>"</b> -0.0780693 <b>"</b>	"-0.0554245"	"0.12932"
[71]	<b>"</b> -0.020177 <b>"</b>	"-0.0404945"	"0.101297"	"0.0223134"	<b>"</b> -0.0369759 <b>"</b>
[76]	"0.148803"	"-0.00290912"	"-0.0374595"	"0.167643"	"0.0119986"
[81]	"-0.0133665"	"0.120326"	"-0.0184556"	<b>"</b> -0.0379953 <b>"</b>	"0.0567403"
[86]	"0.0217977"	"-0.0363667"	"0.0503781"	<b>"-0.0292836"</b>	"-0.0384853"
[91]	"0.1023"	<b>"</b> -0.0389275 <b>"</b>	"-0.0368114"	"0.174382"	"-0.0260395"
[96]	"-0.0307639"	"0.165545"	"-0.0301535"	"-0.0435811"	"0.046039"
[101]	<b>"</b> -0.0333873 <b>"</b>	"-0.0582988"	"0.103495"	"-0.016847"	"-0.0275739"
[106]	"0.158218"	"-0.0164931"	"-0.0412208"	"0.0630831"	"-0.0353153"
[111]	"-0.0575685"	"0.098713"	<b>"</b> -0.0669281 <b>"</b>	<b>"</b> -0.0636005 <b>"</b>	"0.150992"
[116]	"-0.0553599"	"-0.05384"	"0.128492"	"0.0184929"	<b>"</b> -0.0213927 <b>"</b>
[121]	"0.0890435"	"-0.0427296"	<b>"</b> -0.0452522 <b>"</b>	"0.09416"	"-0.00426671"
[126]	"-0.0586933"	"0.111846"	"-0.0134841"	"-0.0435239"	"0.205476"
[131]	"0.0327581"	"-0.00748341"	"0.0647775"	<b>"</b> -0.0227439 <b>"</b>	"-0.0480752"
[136]	"0.0836974"	"-0.0121487"	"-0.0572991"	"0.0912959"	"-0.0436056"
[141]	"-0.0359514"	"0.0770188"	"-0.0241433"	<b>"</b> -0.0390269 <b>"</b>	"0.0862018"
[146]	"-0.0040588"	"-0.0532202 <b>"</b>	"0.0999502"	"-0.0253497"	<b>"</b> -0.0428425 <b>"</b>
[151]	"0.12044"	"-0.00615923"	<b>"</b> -0.0264054 <b>"</b>	"0.128415"	<b>"</b> -0.04583 <b>"</b>
[156]	"-0.0505547"	"0.0769227"	"-0.00728049"	<b>"</b> -0.0386362 <b>"</b>	"0.111309"
[161]	"0.00815661"	"-0.0123266"	"0.0565713"	<b>"</b> -0.039307 <b>"</b>	"-0.0433977"
[166]	"0.122463"	"-0.017611"	"-0.0427158"	"0.0914727"	<b>"</b> -0.0373163 <b>"</b>
[171]	"-0.0428836"	"0.115118"	<b>"</b> -0.00756888 <b>"</b>	<b>"</b> -0.00727903 <b>"</b>	"0.125168"
[176]	"-0.023686"	"-0.0423907"	"0.132452"	<b>"</b> -0.00273136 <b>"</b>	"-0.0309037"
[181]	"0.116617"	"0.0108582"	"-0.0306744"	"0.116024"	"0.00874218"



[186]	"-0.0296331"	"0.138759"	"-0.0683127"	"-0.0438555"	"0.189366"
[191]	"0.0151989"	"-0.00926847"	"0.121471"	"-0.0239017"	"-0.0398277"
[191]	"0.09268"	"0.0039945"	"-0.0193032"	"0.0591578"	"-0.0398277"
[201]	"-0.044323"	"0.146896"	"-0.0324002"	"-0.0402981"	"0.110027"
	"-0.0192553"	"-0.0548452"	"0.132528"	"-0.0207119"	"-0.0277938"
[206] [211]	"0.127069"	"0.0105913"	"-0.0239616"	"0.126773"	"-0.0387041"
[211]	"-0.035095"	"0.0905951"	"0.00257814"	"-0.0266208"	"0.124992"
	"0.00727043"	"-0.0131874"	"0.0996276"	"-0.0208238"	"-0.039991"
[221]	"0.118728"	"-0.0131874"	"-0.00711044"	"0.102443"	"-0.039991"
[226]				"-0.0275259"	
[231]	"-0.0618831"	"0.120803"	"0.00425309"		"0.119351"
[236]	"0.015113"	"-0.0294246"	"0.0731433"	"-0.0345354"	"-0.0409155"
[241]	"0.0950186"	"-0.00192872"	"-0.0281212"	"0.106594"	"-0.00635315"
[246]	"-0.018829"	"0.121685"	"0.0171865"	"-0.0266126"	"0.113849"
[251]	"-0.000574062"	"-0.0178876"	"0.120099"	"-0.0232324"	"-0.0536901"
[256]	"0.0900706"	"0.00933255"	"-0.0195814"	"0.084177"	"0.00453573"
[261]	"-0.0260064"	"0.119259"	"-0.0402363"	"-0.0439391"	"0.056326"
[266]	"-0.0265285"	"-0.0306197"	"0.111643"	"-0.0265237"	"-0.0339386"
[271]	"0.153309"	"-0.0192626"	"-0.0466527"	"0.11408"	"0.0223671"
[276]	"-0.0241304"	"0.128141"	"0.0239277"	"-0.0118655"	"0.164084"
[281]	"-0.00478854"	"-0.0269591"	"0.114523"	"-0.00688562"	"-0.0250792"
[286]	"0.097906"	"-0.00513483"	"-0.0372698"	"0.0770277"	"-0.0126065"
[291]	"-0.03349"	"0.106434"	"-0.00622938"	"-0.0176153"	"0.099618"
[296]	"-0.0360498"	"-0.0396552"	"0.0794731"	"-0.0469355"	"-0.0416642"
[301]	"0.0887753"	"0.0154474"	"-0.0309217"	"0.0803378"	"0.00526525"
[306]	"-0.0396822"	"0.141655"	"-0.0505842"	"-0.0425454"	"0.0778128"
[311]	"-0.0200901"	"-0.0442403"	"0.100253"	"-0.0195989"	"-0.0382479"
[316]	"0.113288"	"-0.0183501"	"-0.0251172"	"0.153398"	"-0.0166292"
[321]	"-0.0473002"	"0.0935705"	"-0.0469584"	"-0.0539268"	"0.166873"
[326]	"0.00194385"	<b>"</b> -0.0332657 <b>"</b>	"0.138673"	"0.00829756"	"-0.0284688"
[331]	"0.175101"	"0.00132006"	"-0.013095"	"0.107681"	"-0.0258877"
[336]	"-0.0246556"	"0.0866981"	"-0.0223248"	"-0.0393533"	"0.167534"
[341]	"-0.00549327"	"-0.0321292"	"0.106566"	"-0.00954148"	"-0.0403308"
[346]	"0.154392"	"-0.00321983"	"-0.0372449"	"0.0917156"	"0.013052"
[351]	"-0.0337191"	"0.0539502"	"-0.0241872"	"-0.0341665"	"0.12145"



[356] [361] [366] [371] [376]	"0.024811" "0.168735" "-0.0402121" "-0.00623269" "0.196902"	"-0.00789897" "-0.0122592" "0.121078" "-0.0412824" "-0.0117792"	"0.102479" "-0.0239245" "0.0188064" "0.141397" "-0.0246135"	"-0.00375084" "0.105811" "-0.0104297" "-0.0100839" "0.103343"	"-0.0268973" "-0.0100921" "0.125318" "-0.0394641" "-0.0192354"
[381] [386] [391]	"-0.0342719" "-0.00182089" "0.078967"	"0.119019" "-0.00852011" "-0.0263966"	"-0.00377079" "0.108921" "-0.0647335"	"-0.0428051" "0.0308685" "0.149222"	"0.212707" "-0.0181617" "-0.00466303"
[396] [401] [406]	"-0.0315204" "-0.0170873" "0.167097"	"0.166565" "-0.00149147" "-0.00449225"	"0.00174848" "0.0996214" "-0.0290761"	"-0.0275089" "-0.0171483" "0.111971"	"0.11657" "-0.0473605" "0.0118674"
[411] [416]	"-0.028269" "0.0184022"	"0.183087" "-0.0227506"	"-0.00310802" "0.100862"	"-0.0281029" "-0.0367313"	"0.205429" "-0.0382668"
[421] [426] [431]	"0.0914832" "-0.0158685" "0.00404428"	"-0.0256853" "0.127771" "-0.0306099"	"-0.033501" "1.22118e-05" "0.0874249"	"0.143749" "-0.0219342" "0.00708025"	"-0.00746803" "0.121675" "-0.0444552"
[436] [441] [446]	"0.0762115" "-0.00021218" "-0.00510198"	"-0.0260912" "0.145266" "-0.0162865"	"-0.0490801" "-0.0300578" "0.0565924"	"0.147446" "-0.0412663" "-0.029033"	"0.0143244" "0.0938826" "-0.0437357"
[451] [456] [461]	"0.130052" "-0.0485005" "-0.0396236"	"-0.0438933" "0.0714602" "-0.0315442"	"-0.04623" "-0.0458659" "0.159601"	"0.0815868" "-0.0417598" "0.000628593"	"-0.00845643" "0.127839" "-0.0205316"
[466] [471] [476]	"0.113267" "-0.0331347" "-0.0189191"	"-0.0671687" "0.142631" "-0.0317327"	"-0.0569785" "-0.0243046" "0.121122"	"0.115182" "-0.0259693" "-0.0271371"	"-0.00734051" "0.128869" "-0.0356392"
[481] [486] [491]	"0.120737" "-0.0207366" "-0.0217894"	"0.0220296" "0.0859358" "-0.0476644"	"-0.0286796" "0.0242897" "0.141661"	"0.120278" "-0.0305029" "0.0113669"	"-0.0102112" "0.0977561" "-0.00318492"
[496] [501] [506]	"0.15114" "-0.0590268" "-0.0202765"	"0.0161736" "0.0480405" "-0.0334601"	"-0.0141236" "-0.0110037" "0.136846"	"-0.0535986" "-0.00992388"	"-0.0504549" "0.169312" "-0.0239469"
[511] [516] [521]	"0.144067" "-0.0653104" "-0.0341801"	"0.0236586" "0.113578" "-0.0568593"	"-0.0173407" "-0.00930896" "0.0832939"	"0.0711178" "-0.0216874" "0.0224872"	"-0.075803" "0.103513" "-0.0399623"



[526]	"0.0859065"	"0.00715787"	"-0.0486096"	"0.12984"	"-0.0424162"
[531]	"-0.0489495"	"0.124499"	"0.0104711"	<b>"</b> -0.025529 <b>"</b>	"0.0602257"
[536]	"0.00874295"	"-0.0406506"	"0.165542"	"-0.0204549"	"-0.0496066"
[541]	"0.0745452"	"-0.0265083"	"-0.053669"	"0.154701"	"0.0025018"
[546]	"-0.0195319"	"0.123926"	"-0.0250167 <b>"</b>	"-0.0199301"	"0.110462"
[551]	<b>"</b> -0.00972275 <b>"</b>	<b>"</b> -0.0377979 <b>"</b>	"0.0939223"	<b>"</b> -0.0694852 <b>"</b>	"-0.0596595"
[556]	"0.121445"	"0.028588"	"-0.00765232"	"0.12779"	"-0.0123621"
[561]	"-0.0288411"	"0.181718"	"-0.00689684"	"-0.0208526"	"0.0992612"
[566]	"-0.00203196"	<b>"</b> -0.023401 <b>"</b>	"0.202127"	"-0.0520711"	<b>"</b> -0.052738 <b>"</b>
[571]	"0.101145"	<b>"</b> -0.00782279 <b>"</b>	<b>"</b> -0.0382739 <b>"</b>	"0.133395"	"-0.0305058"
[576]	"-0.0466035"	"0.167235"	"-0.0150321"	"-0.0213539"	"0.0938163"
[581]	"0.009329"	"-0.0416772"	"0.117827"	"-0.0139281"	"-0.0343238"
[586]	"0.093711"	"-0.0190713"	"-0.0612229 <b>"</b>	"0.125046"	"0.0120298"
[591]	"-0.0316022 <b>"</b>	"0.163622"	"-0.000561501"	"-0.019679 <b>"</b>	"0.0800932"
[596]	"0.0237109"	"-0.0406148"	"0.0747374"	"-0.0255327"	<b>"</b> -0.041617 <b>"</b>
[601]	"0.0997792"	"0.0225686"	<b>"</b> -0.0249263 <b>"</b>	"0.122458"	<b>"</b> -0.0095075 <b>"</b>
[606]	<b>"</b> -0.0389327 <b>"</b>	"0.119309"	<b>"</b> -0.0175739 <b>"</b>	"-0.0205478"	"0.151788"
[611]	"0.0106983"	"-0.0187007"	"0.125639"	"-0.0177143"	"-0.0334653"
[616]	"0.137314"	"0.00735405"	"-0.0215206 <b>"</b>	"0.19345"	"-0.00584656"
[621]	"-0.0135711"	"0.170215"	"-0.0107052 <b>"</b>	"-0.0413287"	"0.101739"
[626]	"-0.032947"	"-0.0442447"	"0.0799393"	"-0.00660673"	"-0.0242625"
[631]	"0.0842766"	"-0.0487907"	"-0.0524578"	"0.110874"	"-0.01377"
[636]	"-0.0408812"	"0.132308"	"-0.00921443"	<b>"</b> -0.0340802 <b>"</b>	"0.0931245"
[641]	"-0.00248746"	"-0.0286588"	"0.111315"	<b>"</b> -0.0120779 <b>"</b>	"-0.0252895"
[646]	"0.123242"	"-0.0615834"	"-0.0468585"	"0.125662"	<b>"</b> -0.0269262 <b>"</b>
[651]	"-0.0453195"	"0.115024"	"-0.0112525 <b>"</b>	"-0.0375151"	"0.0684176"
[656]	"-0.00333729"	"-0.0485283"	"0.112122"	"-0.0254754"	"-0.0420037"
[661]	"0.117305"	"-0.00606851"	<b>"</b> -0.0283436 <b>"</b>	"0.134787"	"0.0177798"
[666]	"-0.0195284"	"0.0892367"	"-0.0414485"	"-0.0486363"	"0.154688"
[671]	"0.0199821"	"-0.00463761"	"0.094692"	"-0.0385498"	"-0.0498494"
[676]	"0.107747"	"-0.0440315"	"-0.0518639"	"0.114158"	"-5.7712e-05"
[681]	"-0.0447193"	"0.0749854"	"-0.0298321"	"-0.0160654"	"0.149517"
[686]	"-0.00102999"	<b>"</b> -0.00897201 <b>"</b>	"0.0967314"	"-0.00996676"	"-0.0279194"
[691]	"0.110555"	"0.00425955"	"-0.0461396"	"0.0824248"	"-0.0138764"



[696] [701] [706] [711] [716] [721] [726] [731] [736] [741] [756] [761] [776] [776] [786] [791] [796] [801] [806] [811]	"-0.0399555" "-0.00847989" "0.140781" "-0.022929" "-0.030182" "0.101942" "-0.0161832" "0.128617" "-0.0310049" "-0.0336232" "0.151611" "-0.00507787" "-0.015931" "0.0753223" "-0.0456321" "0.0302677" "0.134473" "-0.0527107" "-0.0388245" "0.11592" "-0.0481817" "-0.0330126" "0.0856974"	"0.131041" "-0.0339069" "-0.031946" "0.155953" "-0.0465635" "-0.0286605" "0.0939071" "-0.0306775" "0.09409679" "0.0920424" "-0.0435206" "-0.0251462" "0.0745763" "-0.0358218" "0.00919663" "0.101281" "0.00794933" "-0.00920211" "0.0797545" "-0.0393543" "-0.00343729" "0.118091" "-0.0403231" "-0.0150332"	"-0.0533527" "0.123183" "-0.0263124" "0.0161524" "0.0879679" "-0.0328508" "-0.0120504" "0.174188" "-0.0203337" "-0.0317739" "0.0908226" "-0.0392605" "-0.0413064" "0.155282" "-0.0285469" "-0.0577684" "0.124703" "-0.0361238" "0.000304411" "0.0781255" "-0.0497574" "-0.0344291" "0.0988183" "-0.0376421"	"-0.0523496" "0.0180261" "0.172881" "0.0034478" "0.0232893" "0.110715" "-0.0335866" "0.00767122" "0.14788" "-0.0508649" "0.0141227" "0.148354" "-0.0343446" "-0.0081873" "0.0838528" "-0.0578549" "0.00780066" "0.1327" "-0.0260952" "-0.00640155" "0.0966432" "-0.0376505" "-0.00400863" "0.0835704"	"0.132381" "-0.0153281" "-0.0218296" "0.13212" "-0.0219862" "-0.0216954" "0.0785833" "-0.0168081" "0.0141352" "0.113691" "-0.0356563" "0.0193436" "0.137556" "-0.0175252" "-0.0245324" "0.132731" "-0.0108088" "-0.0686589" "0.0853618" "-0.0413997" "-0.00642743" "0.0514939" "-0.0478751" "0.00803595"
-					
[841] [846] [851] [856] [861]	"0.105196" "-0.0505706" "-0.0328788" "0.0855845" "-0.0450452"	"-0.0459898" "0.154361" "-0.0486597" "-0.0460008" "0.144031"	"-0.0436156" "0.0160661" "0.127745" "-0.068768" "-0.0257264"	"0.104471" "-0.0085245" "-0.0355985" "0.143131" "-0.0512494"	"-0.00655441" "0.123968" "-0.0396566" "-0.0150595" "0.0906441"



```
[866] "-0.0559069"
                     "-0.0388699"
                                   "0.0754001"
                                                  "-0.0187794"
                                                                 "-0.0305177"
[871] "0.148891"
                     "-0.000973053" "-0.0249487"
                                                  "0.140169"
                                                                 "-0.0317729"
[876] "-0.0439059"
                     "0.0988978"
                                   "-0.0247639"
                                                  "-0.0487974"
                                                                 "0.130069"
[881] "-0.0271039"
                     "-0.0350573"
                                  "0.15454"
                                                  "0.0134436"
                                                                 "-0.0141455"
[886] "0.14081"
                     "-0.0311889"
                                  "-0.0621757"
                                                  "0.103084"
                                                                 "-0.0068436"
[891] "-0.0129621"
                    "0.107912"
                                   "-0.0140241"
                                                  "-0.0316433"
                                                                 "0.188295"
                     "-0.00150471" "0.0996349"
                                                  "0.00831133"
[896] "0.0206126"
                                                                 "-0.0446597"
```

#### Listing 12:

```
> unique(boot$parameter[boot$value=='0'])
```

#### [1] "SIGMA2.1"

Off-diagonals (and only off-diagonals) are noninformative.

#### Listing 13:

```
> boot <- boot[!boot$value=='0',]
> any(is.na(as.numeric(boot$value)))
```

#### [1] FALSE

#### Listing 14:

```
> boot$value <- as.numeric(boot$value)
> head(boot)
```

```
run parameter
                     value
2
    1
         THETA1 10.2175000
5
   1
         THETA2 24.3171000
        THETA3 0.0689622
11
         THETA4
                 3.7575900
14
         THETA5 180.9270000
17
   1
         THETA6 0.9726310
```



## 1.2 Restrict data to 95 percentiles.

We did 300 runs. Min and max are strongly dependent on number of runs, since with an unbounded distribution, (almost) any value is possible with enough sampling. We clip to the 95 percentiles, to give distributions that are somewhat more scale independent.

## Listing 15:

```
> boot <- inner(</pre>
        boot,
        preserve='run',
        id.var='parameter',
        measure.var='value'
> head(boot)
  run parameter
                      value
         THETA1 10.2175000
        THETA2 24.3171000
3
       THETA3 0.0689622
  1
        THETA4 3.7575900
        THETA5 180.9270000
        THETA6 0.9726310
                                                      Listing 16:
> any(is.na(boot$value))
[1] TRUE
                                                      Listing 17:
> boot <- boot[!is.na(boot$value),]</pre>
```



## 1.3 Recover parameter metadata from a specially-marked control stream.

We want meaningful names for our parameters. Harvest these from a reviewed control stream.

#### Listing 18:

```
> wiki <- wikitab(1005,'../nonmem')</pre>
> wiki
   parameter
                                                description
      THETA1
                                   apparent oral clearance
1
2
      THETA2
                            central volume of distribution
3
     THETA3
                                   absorption rate constant
4
     THETA4
                              intercompartmental clearance
5
     THETA5
                         peripheral volume of distribution
6
     THETA6
                                  male effect on clearance
7
    THETA7
                                weight effect on clearance
8
   OMEGA1.1
                  interindividual variability of clearance
9
    OMEGA2.1
               interindividual clearance-volume covariance
10 OMEGA2.2 interindividual variability of central volume
11 OMEGA3.1
                   interindividual clearance-Ka covariance
12 OMEGA3.2
                      interindividual volume-Ka covariance
13 OMEGA3.3
                         interindividual variability of Ka
14 SIGMA1.1
                                         proportional error
                                             additive error
15 SIGMA2.2
                                                                 model tool run
   CL/F (L/h) ~ theta_1 * theta_6 ^MALE * (WT/70) ^theta_7 * e^eta_1 nm7 1005
2
                           V_c /F (L) \sim theta_2 * (WT/70)^1 * e^eta_2 nm7 1005
3
                                      K_a (h^-1) \sim theta_3 * e^-eta_3 nm7 1005
4
                                                   Q/F (L/h) ~ theta_4 nm7 1005
5
                                                  V_p /F (L) \sim theta_5 nm7 1005
6
                                                  MALE_CL/F ~ theta_6 nm7 1005
7
                                                     WT_CL/F \sim theta_7 nm7 1005
8
                                                  IIV_CL/F \sim Omega_1.1 nm7 1005
9
                                                  cov_CL, V ~ Omega_2.1 nm7 1005
```



> unique(boot\$parameter)

```
10
                                              IIV_V_c /F ~ Omega_2.2 nm7 1005
11
                                              cov_CL, Ka ~ Omega_3.1 nm7 1005
12
                                               cov_V, Ka ~ Omega_3.2 nm7 1005
13
                                                IIV_K_a \sim Omega_3.3 nm7 1005
14
                                                err_prop ~ Sigma_1.1 nm7 1005
15
                                                 err_add ~ Sigma_2.2 nm7 1005
    estimate prse
1
    9.50754 9.84
                    0.935942
2
     22.7907 9.56
                    2.17864
   0.0714314 7.35 0.00525212
    3.47438 15.4 0.535659
5
    113.269 21
                     23.793
6
   1.02439 11.2 0.114304
    1.19226 28.4 0.338587
    0.213813 22.8 0.0488382
9
    0.120739 26.4 0.0319111
10 0.0945275 33.2 0.0313504
11 -0.0116063 173 0.0200793
12 -0.0371985 36.1 0.013426
13 0.0465611 34.7 0.0161799
14 0.0491683 10.9 0.00538067
15 0.201814 33.5 0.0676412
                                                    Listing 19:
> wiki$name <- wiki2label(wiki$model)</pre>
> wiki$estimate <- as.numeric(wiki$estimate)</pre>
> unique(wiki$parameter)
[1] "THETA1"
                "THETA2"
                          "THETA3"
                                     "THETA4"
                                                "THETA5"
[7] "THETA7"
                "OMEGA1.1" "OMEGA2.1" "OMEGA2.2" "OMEGA3.1" "OMEGA3.2"
[13] "OMEGA3.3" "SIGMA1.1" "SIGMA2.2"
                                                    Listing 20:
```



```
"THETA3" "THETA4" "THETA5"
[1] "THETA1"
                "THETA2"
[7] "THETA7"
               "OMEGA1.1" "OMEGA2.1" "OMEGA2.2" "OMEGA3.1" "OMEGA3.2"
[13] "OMEGA3.3" "SIGMA1.1" "SIGMA2.2"
                                                    Listing 21:
> boot <- stableMerge(boot, wiki[,c('parameter','name')])</pre>
> head(boot)
 run parameter
                      value
                                name
        THETA1 10.2175000
                                CL/F
2
        THETA2 24.3171000
                               V_c/F
3
        THETA3 0.0689622
                                 Ka
        THETA4 3.7575900
                                 Q/F
5
        THETA5 180.9270000
                               V_p/F
```

## 1.4 Create covariate plot.

Now we make a covariate plot for clearance. We will normalize clearance by its median (we also could have used the model estimate). We need to take cuts of weight, since we can only really show categorically-constrained distributions. Male effect is already categorical. I.e, the reference individual has median clearance, is female, and has median weight.

## 1.4.1 Recover original covariates for guidance.

THETA6 0.9726310 MALE CL/F

```
Listing 22:
```

```
> covariates <- read.csv('../data/derived/phase1.csv',na.strings='.')
> head(covariates)
```



```
C ID TIME SEQ EVID AMT
                               DV SUBJ HOUR TAFD TAD LDOS MDV HEIGHT WEIGHT
    C 1 0.00
                     0
                         NA 0.000
                                    1 0.00 0.00
                                                  NA
                                                       NA
                                                                 174
                                                                       74.2
2 <NA>
      1 0.00
                     1 1000
                              NA
                                    1 0.00 0.00 0.00 1000
                                                                 174
                                                                       74.2
3 <NA>
      1 0.25
                     0
                        NA 0.363
                                    1 0.25 0.25 0.25 1000
                                                                 174
                                                                      74.2
       1 0.50
                         NA 0.914
                                    1 0.50 0.50 0.50 1000
                                                                 174
                                                                      74.2
4 <NA>
      1 1.00
                        NA 1.120
5 <NA>
                     0
                                    1 1.00 1.00 1.00 1000
                                                                174
                                                                      74.2
6 <NA> 1 2.00
                        NA 2.280
               0
                     0
                                    1 2.00 2.00 2.00 1000
                                                                 174
                                                                      74.2
 SEX AGE DOSE FED SMK DS CRCN predose zerodv
  0 29.1 1000 1
                     0
                        0 83.5
   0 29.1 1000
                     0 0 83.5
                                    0
                                           0
   0 29.1 1000
                     0 0 83.5
                                           0
   0 29.1 1000
                     0 0 83.5
                                    0
                                           0
   0 29.1 1000
                     0 0 83.5
                                    0
                                           0
   0 29.1 1000
                     0 0 83.5
                                           0
```

## Listing 23:

#### > with(covariates,constant(WEIGHT,within=ID))

[1] TRUE

## Listing 24:

```
> covariates <- unique(covariates[,c('ID','WEIGHT')])
> head(covariates)
```

```
ID WEIGHT
1 1 74.2
16 2 80.3
31 3 94.2
46 4 85.2
61 5 82.8
76 6 63.9
```



```
Listing 25:

> covariates$WT <- as.numeric(covariates$WEIGHT)
> wt <- median(covariates$WT)
> wt

[1] 81

Listing 26:

> range(covariates$WT)
```

[1] 61 117

## 1.4.2 Reproduce the control stream submodel for selective cuts of a continuous covariate.

In the model we normalized by 70 kg, so that cut will have null effect. Let's try 65, 75, and 85 kg. We have to make a separate column for each cut, which is a bit of work. Basically, we make two more copies of our weight effect columns, and raise our normalized cuts to those powers, effectively reproducing the submodel from the control stream.

## Listing 27:

#### > head(boot) run parameter value name THETA1 10.2175000 CL/F 2 1 THETA2 24.3171000 $V_c/F$ 3 THETA3 0.0689622 K\_a 4 1 THETA4 3.7575900 Q/F THETA5 180.9270000 V\_p/F THETA6 0.9726310 MALE\_CL/F Listing 28: > unique(boot\$name)



```
[1] "CL/F"
                "V_c/F"
                            "K_a"
                                        "Q/F"
                                                   "V_p/F"
                                                               "MALE_CL/F"
[7] "WT CL/F"
                "IIV CL/F" "cov CL,V"
                                       "IIV_V_c/F" "cov_CL, Ka" "cov_V, Ka"
[13] "IIV_K_a"
                "err_prop" "err_add"
                                                   Listing 29:
> clearance <- boot[boot$name %in% c('CL/F','WT_CL/F','MALE_CL/F'),]</pre>
> head(clearance)
  run parameter
                    value
                               name
        THETA1 10.217500
                               CL/F
  1 THETA6 0.972631 MALE_CL/F
6
   1 THETA7 1.441780 WT_CL/F
16 2 THETA1 8.655780
                               CL/F
21 2 THETA6 1.106340 MALE CL/F
22 2 THETA7 0.944065 WT_CL/F
                                                   Listing 30:
> frozen <- data.frame(cast(clearance,run ~ name),check.names=FALSE)</pre>
> head(frozen)
         CL/F MALE_CL/F WT_CL/F
1 1 10.21750 0.972631 1.441780
2 2 8.65578 1.106340 0.944065
3 8.54538 1.084290 0.984631
4 4 9.74759 0.870490 1.522740
5 9.27924 1.060020 1.185630
6 6 8.68753 1.039070 1.179110
                                                   Listing 31:
> frozen$`WT_CL/F:65` <- (65/70)**frozen$`WT_CL/F`
> frozen$`WT_CL/F:75` <- (75/70)**frozen$`WT_CL/F`</pre>
> frozen$`WT_CL/F:85` <- (85/70)**frozen$`WT_CL/F`
```



#### 1.4.3 Normalize key parameter

## Listing 32:

```
> #cl <- median(boot$value[boot$name=='CL/F'])
> cl <- with(wiki, estimate[name=='CL/F'])
> cl
```

[1] 9.50754

#### Listing 33:

#### > head(frozen)

```
CL/F MALE_CL/F WT_CL/F:65 WT_CL/F:75 WT_CL/F:85
1 10.21750 0.972631 1.441780 0.8986628
                                        1.104588
                                                1.323038
 2 8.65578 1.106340 0.944065 0.9324286
                                        1.067302
                                                1.201170
 3 8.54538 1.084290 0.984631 0.9296296
                                        1.070293 1.210668
4 9.74759 0.870490 1.522740 0.8932872
                                        1.110775 1.343999
5 9.27924 1.060020 1.185630 0.9158848
                                        1.085239
                                                 1.258848
 6 8.68753 1.039070 1.179110 0.9163275
                                        1.084751 1.257256
```

#### Listing 34:

```
> frozen[['CL/F']] <- frozen[['CL/F']]/cl
> head(frozen)
```

```
CL/F MALE_CL/F WT_CL/F:65 WT_CL/F:75 WT_CL/F:85
1 1.0746734 0.972631 1.441780 0.8986628
                                           1.104588
                                                     1.323038
  2 0.9104122 1.106340 0.944065 0.9324286
                                           1.067302
                                                      1.201170
  3 0.8988003 1.084290 0.984631 0.9296296
                                                     1.210668
                                           1.070293
  4 1.0252484 0.870490 1.522740 0.8932872
                                           1.110775
                                                      1.343999
5 5 0.9759875 1.060020 1.185630 0.9158848
                                           1.085239
                                                     1.258848
6 6 0.9137516 1.039070 1.179110 0.9163275
                                           1.084751
                                                     1.257256
```



## Listing 35:

```
> frozen$`WT_CL/F` <- NULL</pre>
> molten <- melt(frozen,id.var='run',na.rm=TRUE)</pre>
> head(molten)
 run variable
                  value
         CL/F 1.0746734
1 1
2
  2
        CL/F 0.9104122
3
      CL/F 0.8988003
4
  4 CL/F 1.0252484
5
      CL/F 0.9759875
      CL/F 0.9137516
```

#### 1.4.4 Plot.

Now we plot. We reverse the variable factor to give us top-down layout of strips.

#### Listing 36:

```
> levels (molten$variable)

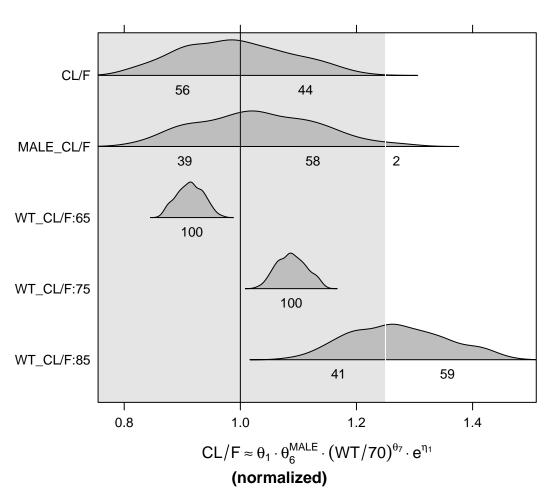
[1] "CL/F" "MALE_CL/F" "WT_CL/F:65" "WT_CL/F:75" "WT_CL/F:85"

Listing 37:
> molten$variable <- factor(molten$variable,levels=rev(levels(molten$variable)))
> print(
+ stripplot(
+ variable ~ value,
+ data=molten,
+ panel=panel.covplot,
+ xlab=parse(text=with(wiki,wiki2plotmath(noUnits(model[name=='CL/F'])))),
+ main=with(wiki,description[name=='CL/F']),
+ sub=('(normalized)\n\n\n')
+ )
+ )
```





# apparent oral clearance



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## 1.4.5 Summarize

We see that clearance is estimated with good precision. Ignoring outliers, there is not much effect on clearance of being male, relative to female. Increasing weight is associated with increasing clearance. There is a 93 percent probability that an 85 kg person will have at least 25 percent greater clearance than a 70 kg person.