

# **First report on the assessment of maximum acceptable daily intake (MADI) of pesticides for humans using intelligent consensus predictions**

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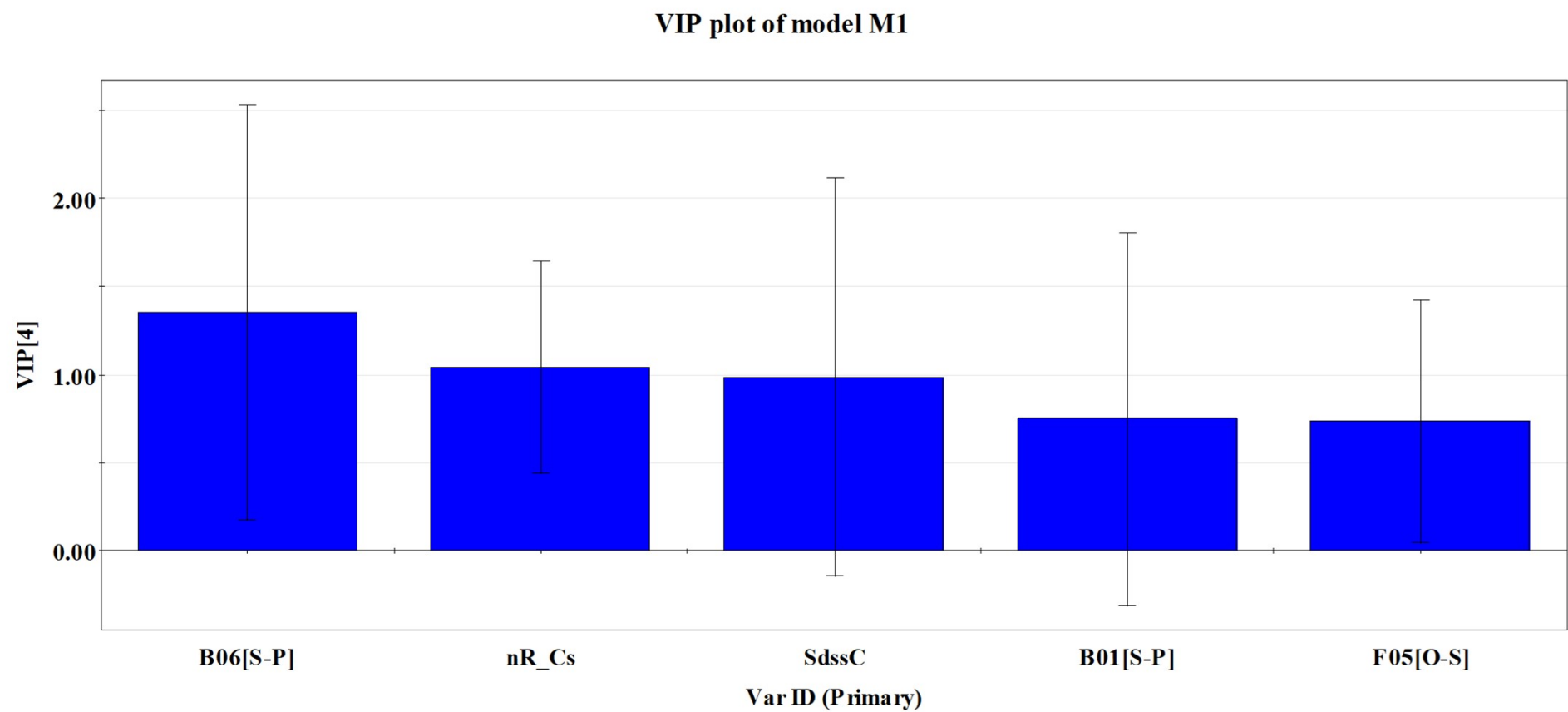
Department of Pharmaceutical Technology, Jadavpur University,

Kolkata 700032, India

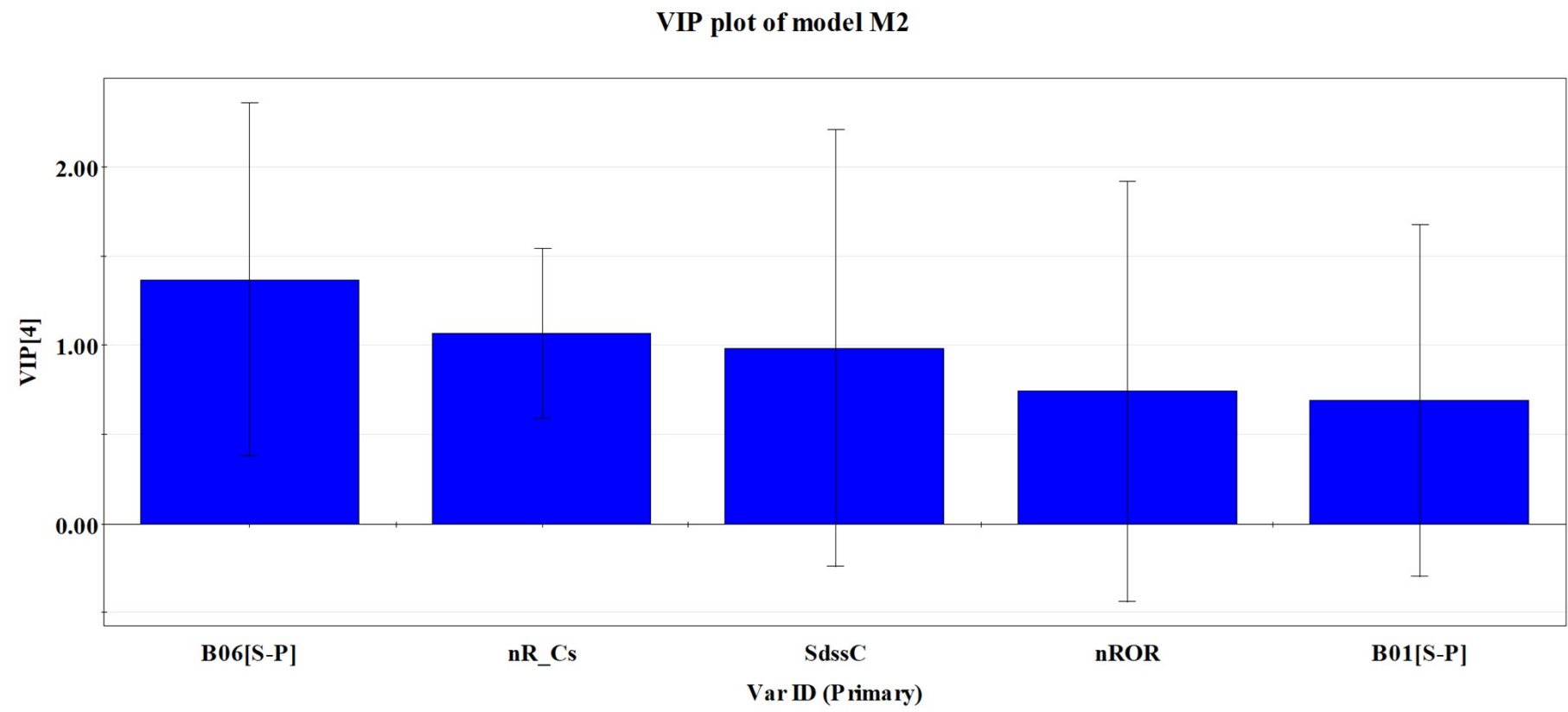
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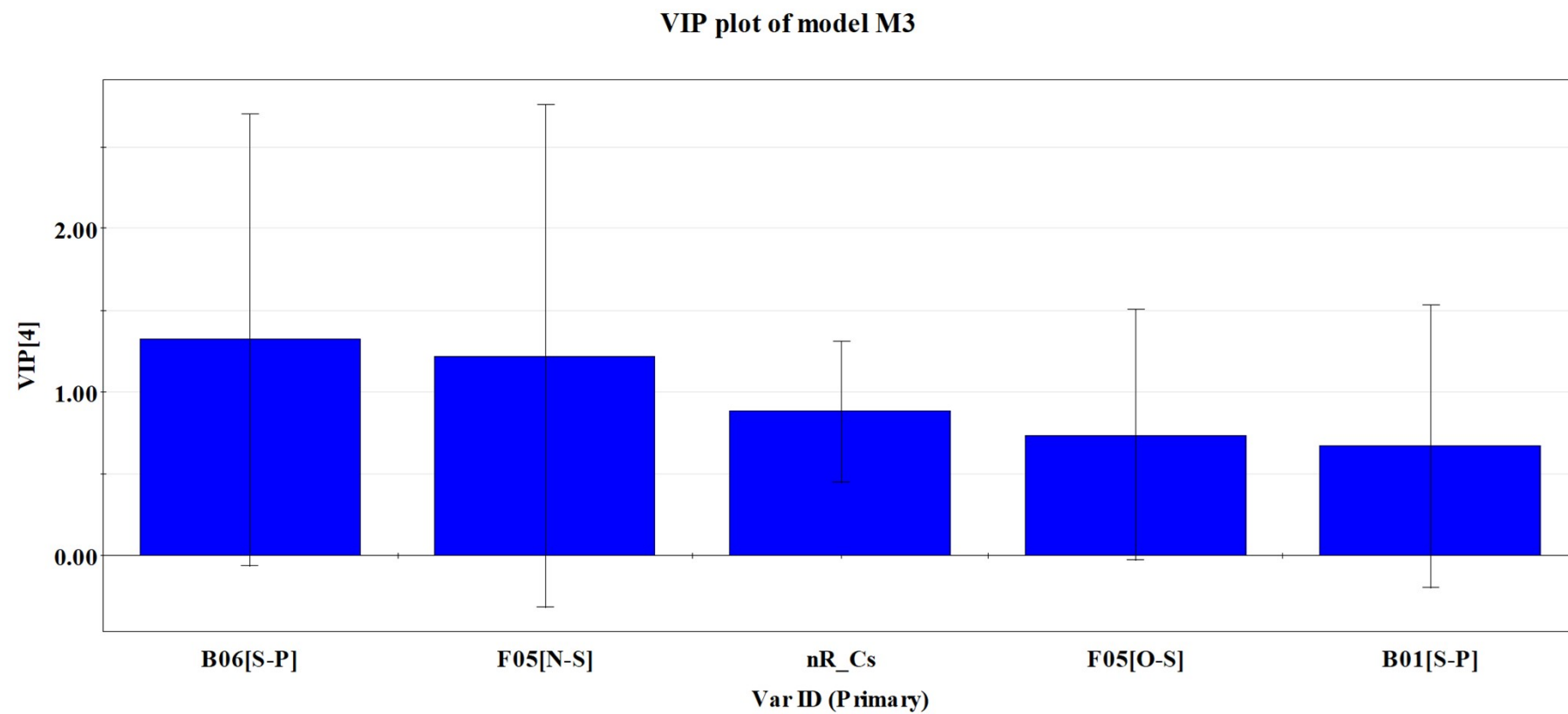
**Fig.S1. VIP plot of model M1**



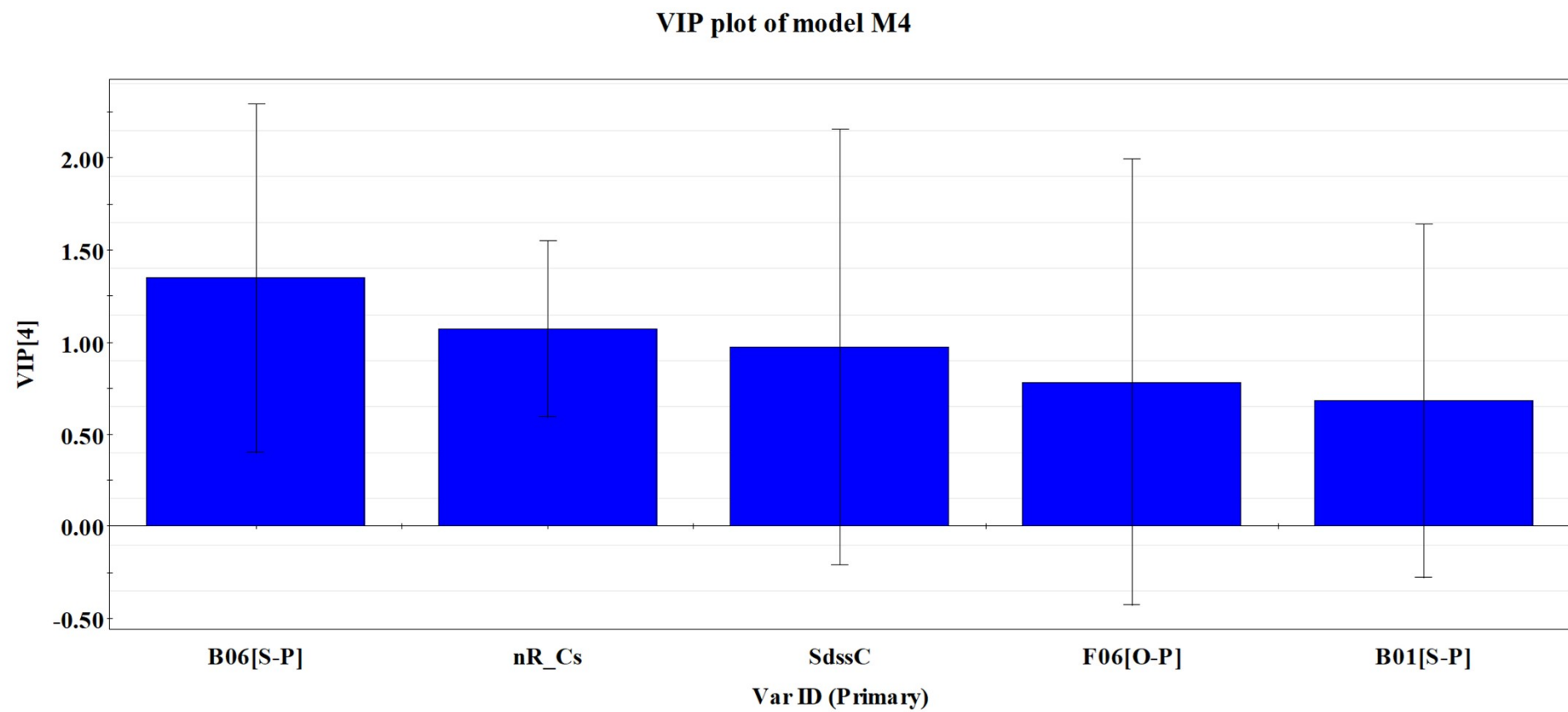
**Fig.S2. VIP plot of model M2**



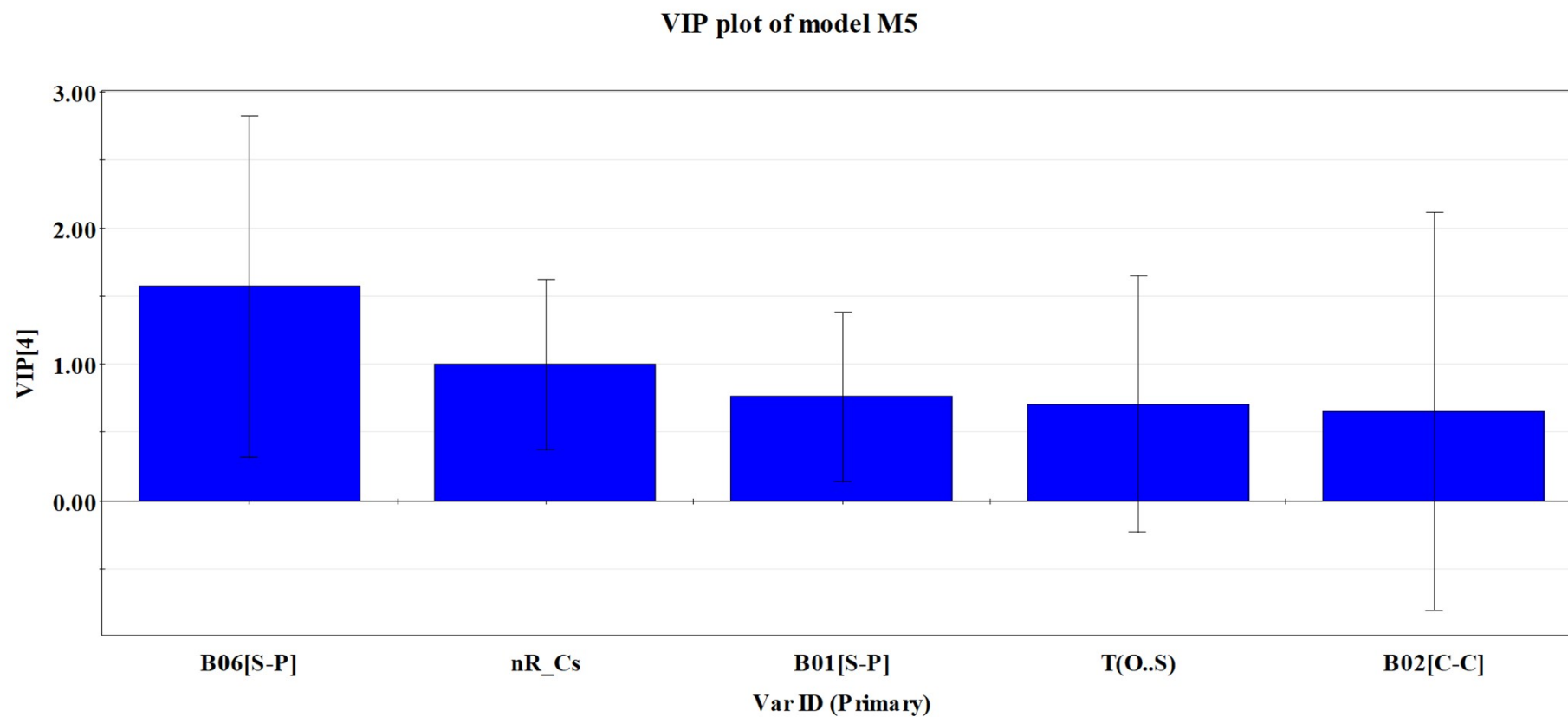
**Fig.S3. VIP plot of model M3**



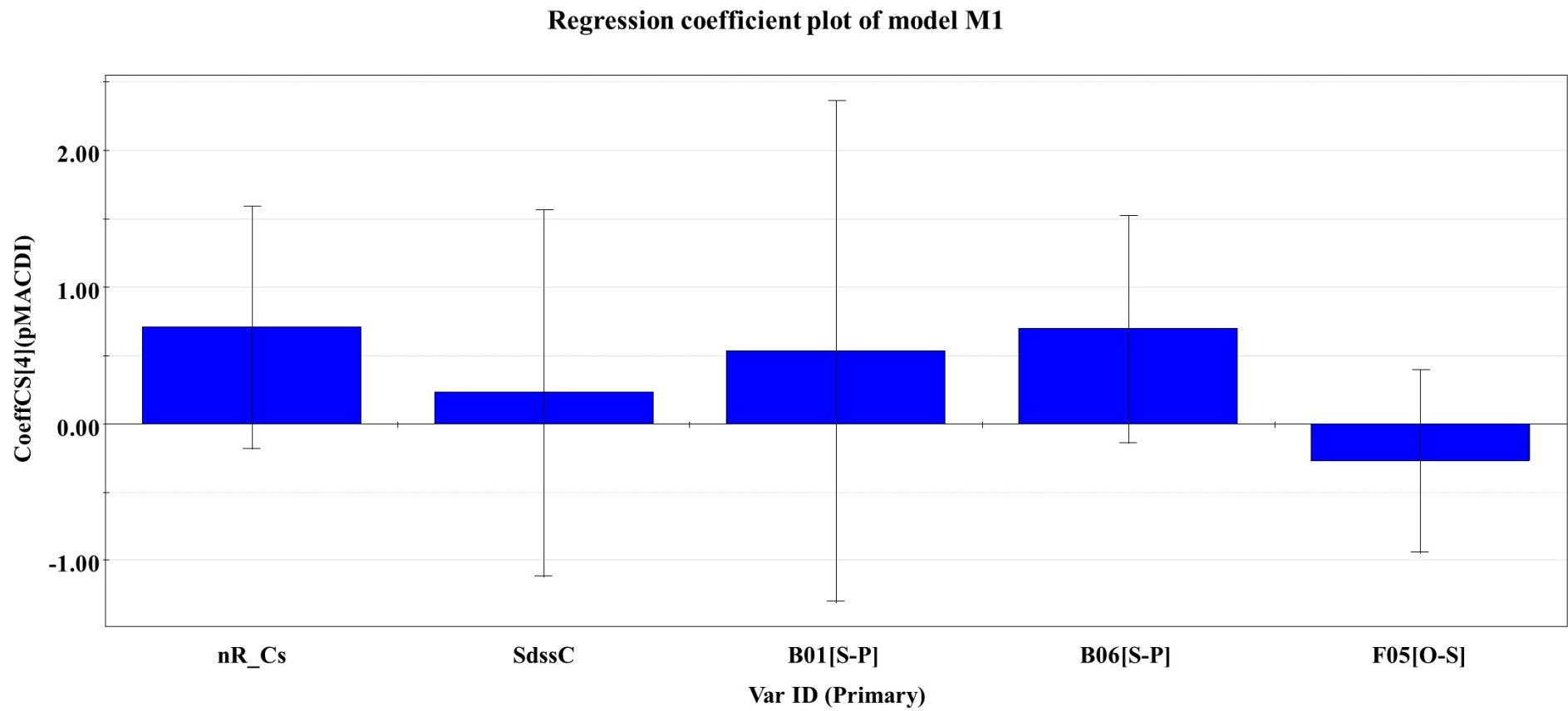
**Fig.S4. VIP plot of model M4**



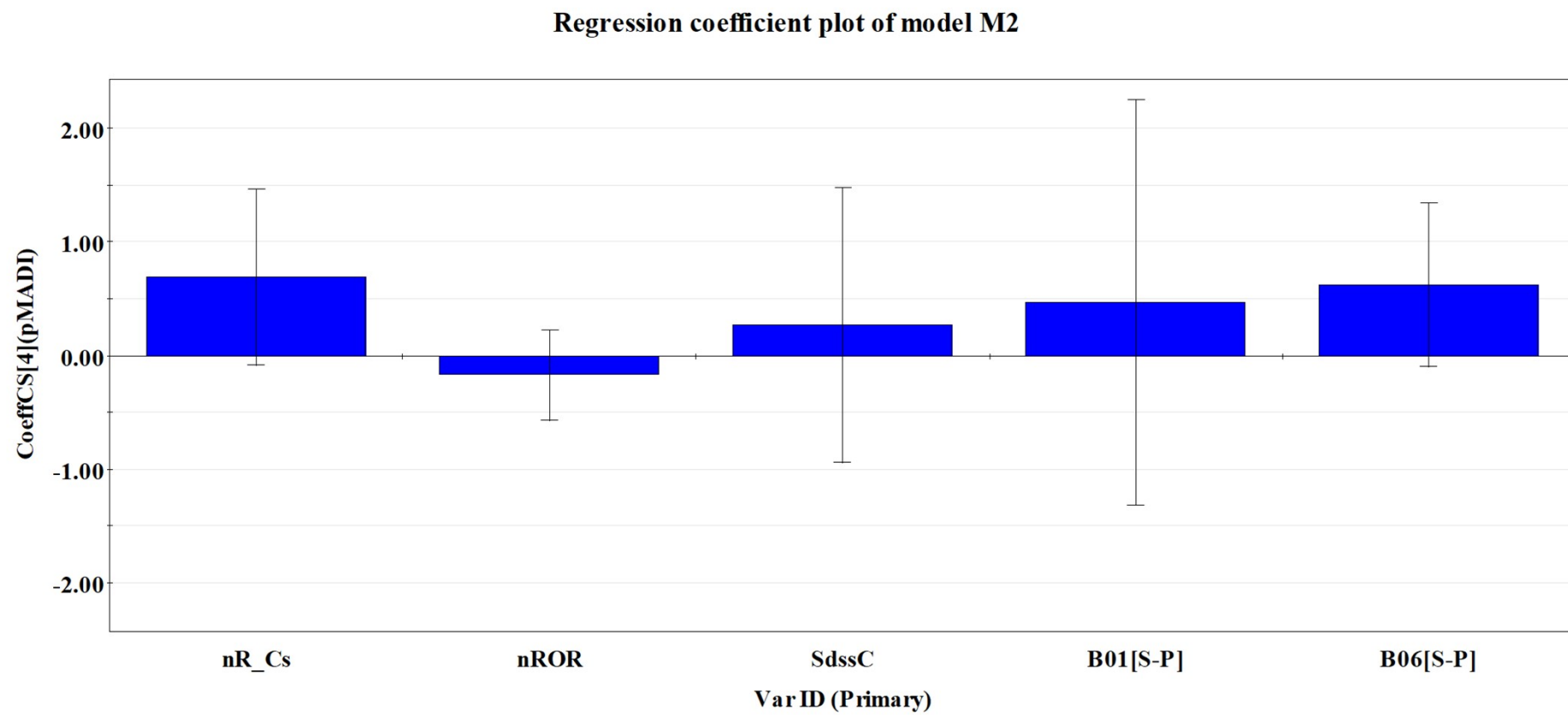
**Fig.S5. VIP plot of model M5**



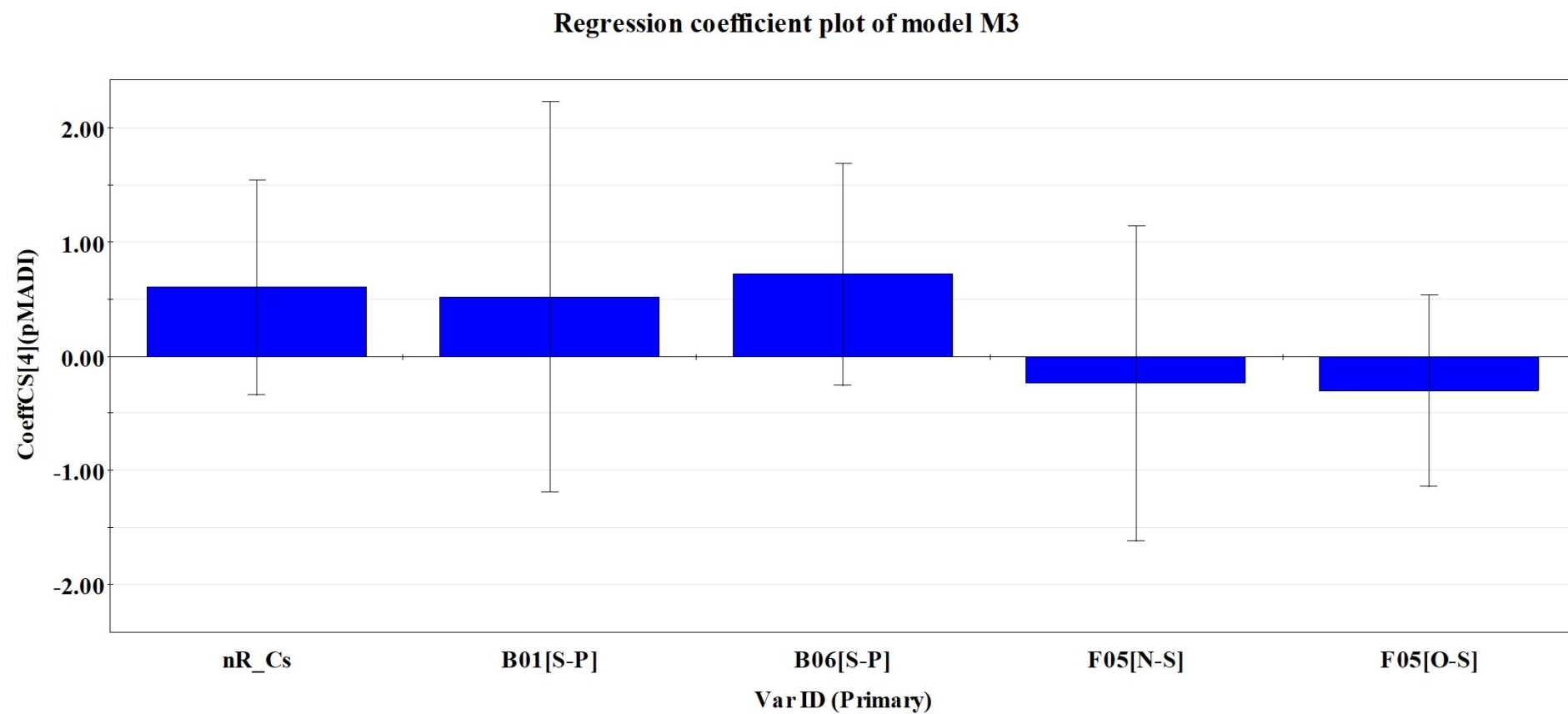
**Fig.S6. Regression coefficient plot of model M1**



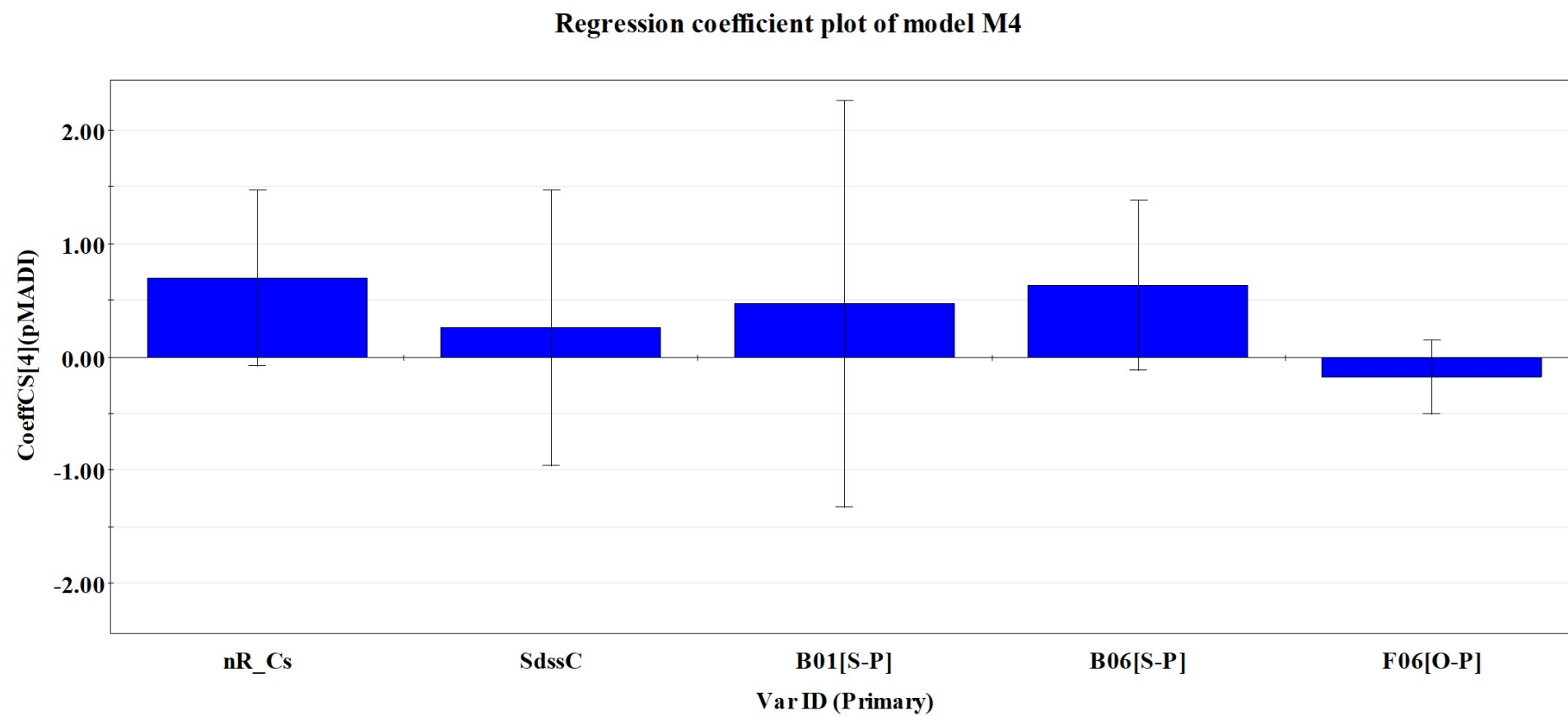
**Fig.S7. Regression coefficient plot of model M2**



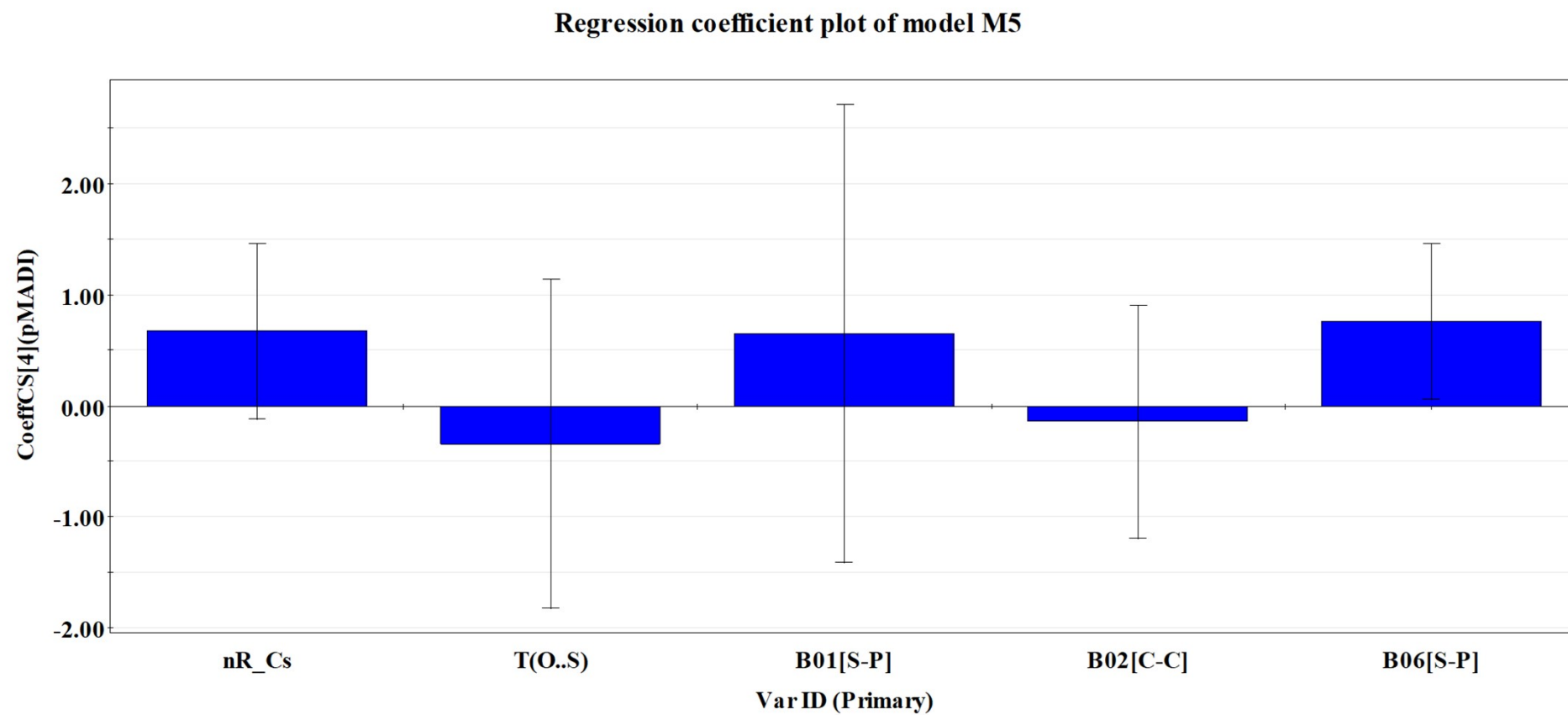
**Fig.S8. Regression coefficient plot of model M3**



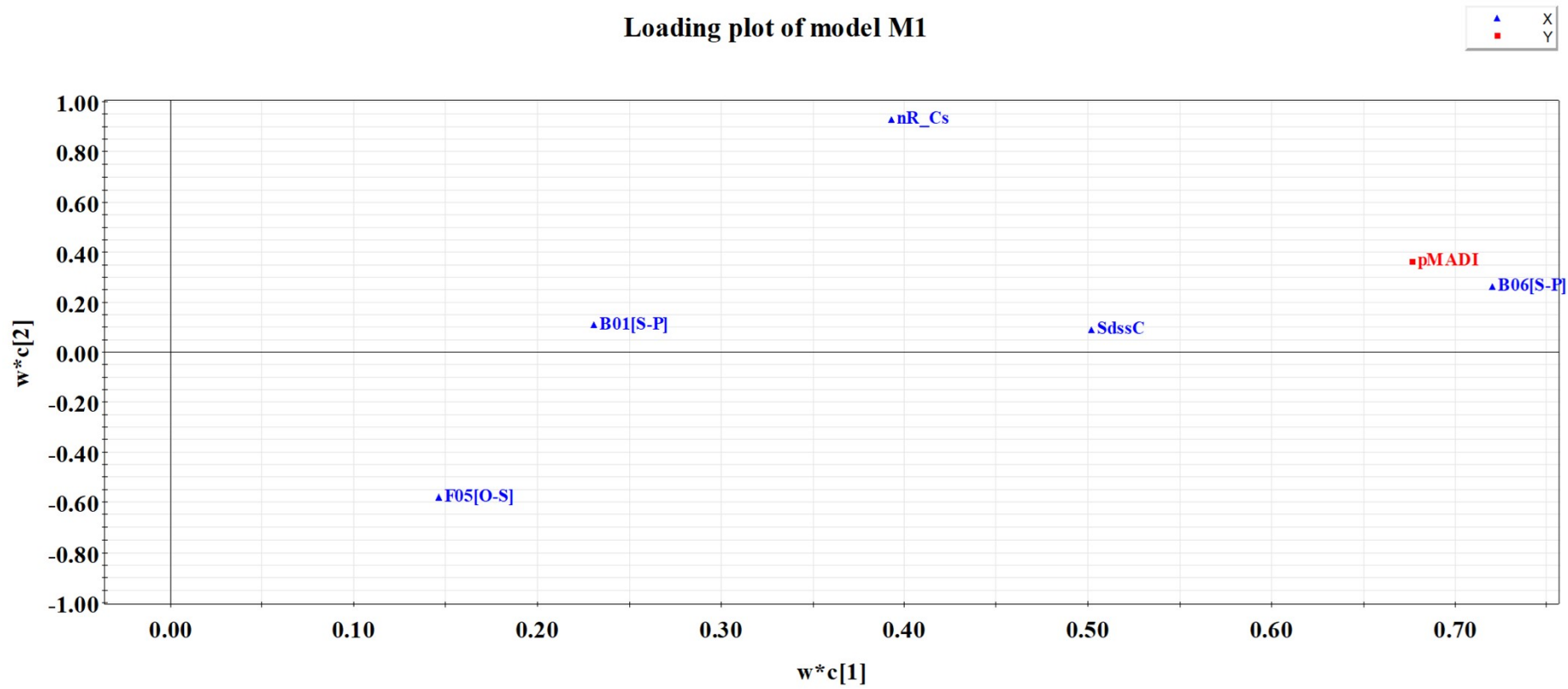
**Fig.S9. Regression coefficient plot of model M4**



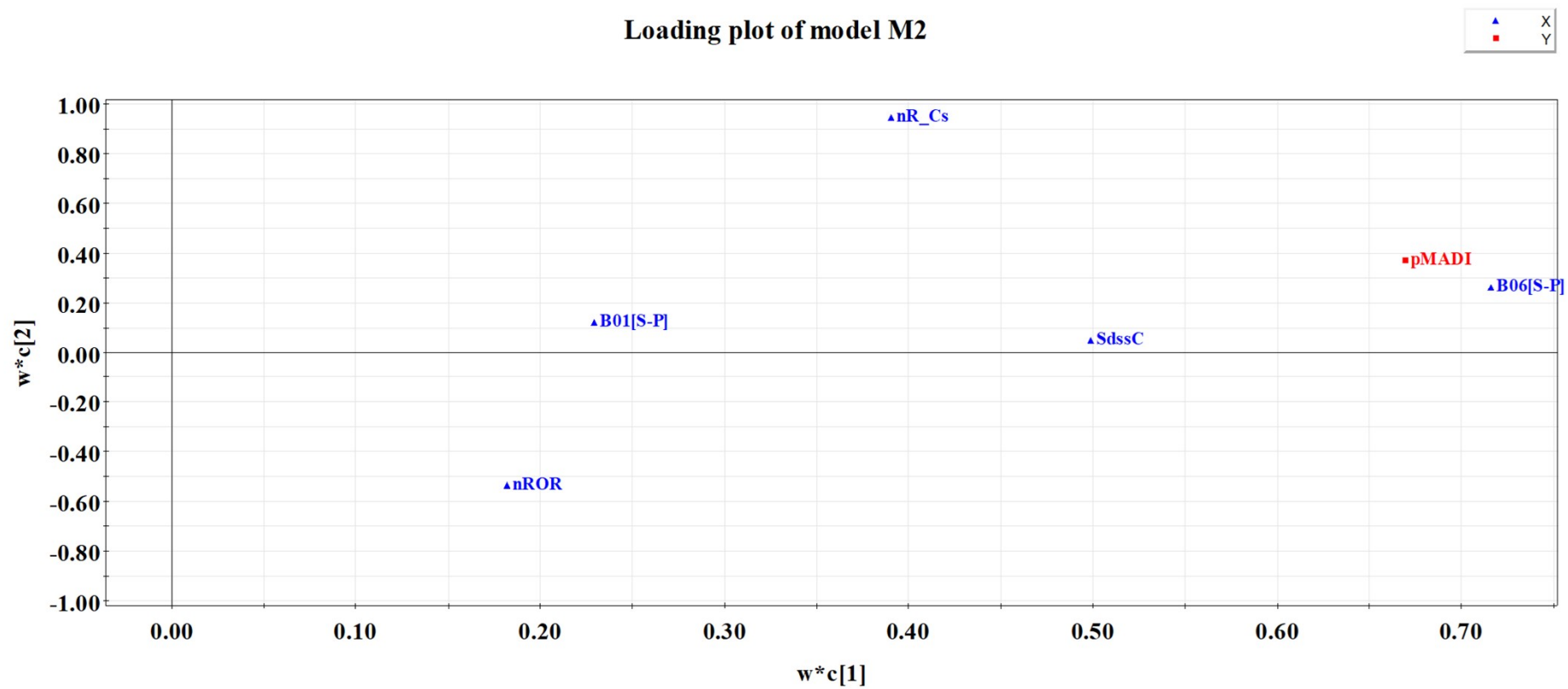
**Fig.S10. Regression coefficient plot of model M5**



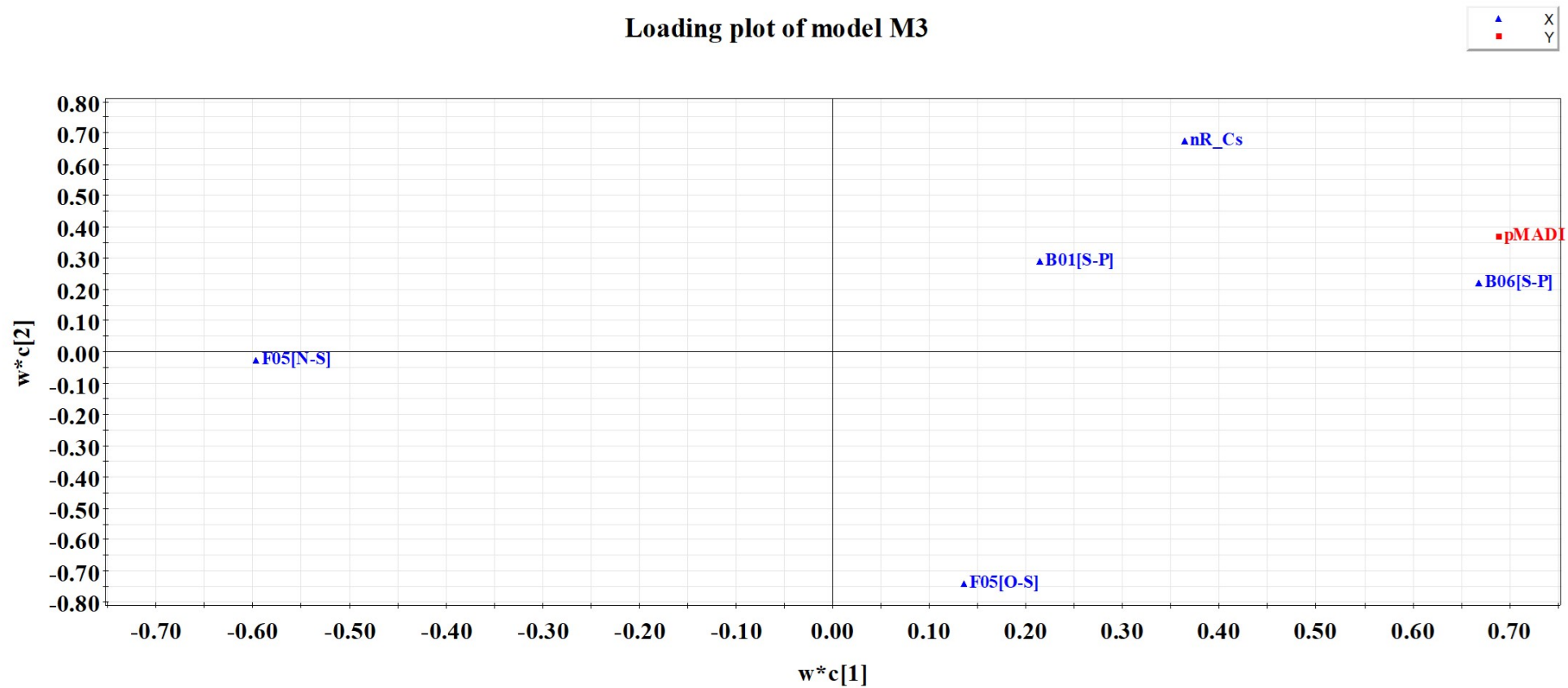
**Fig.S11. Loading plot of model M1**



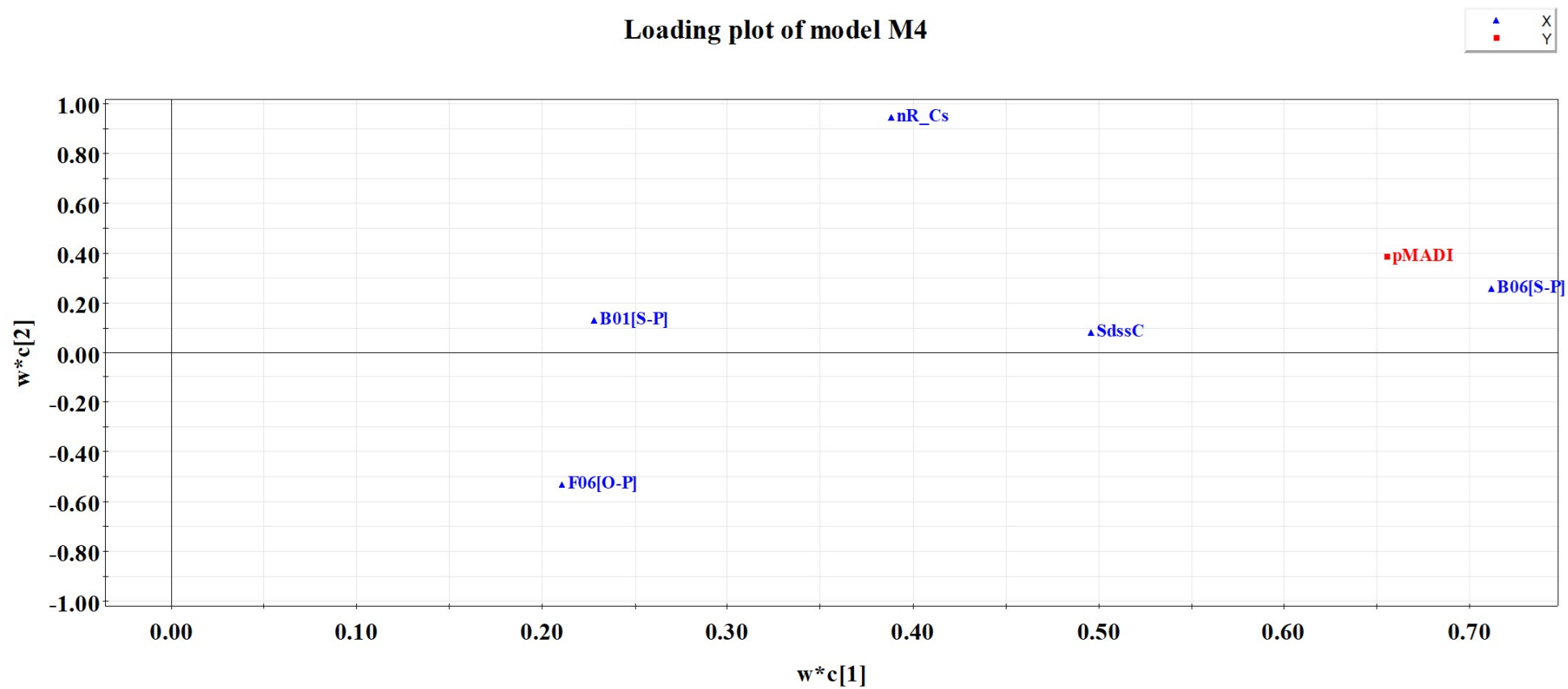
**Fig.S12. Loading plot of model M2**



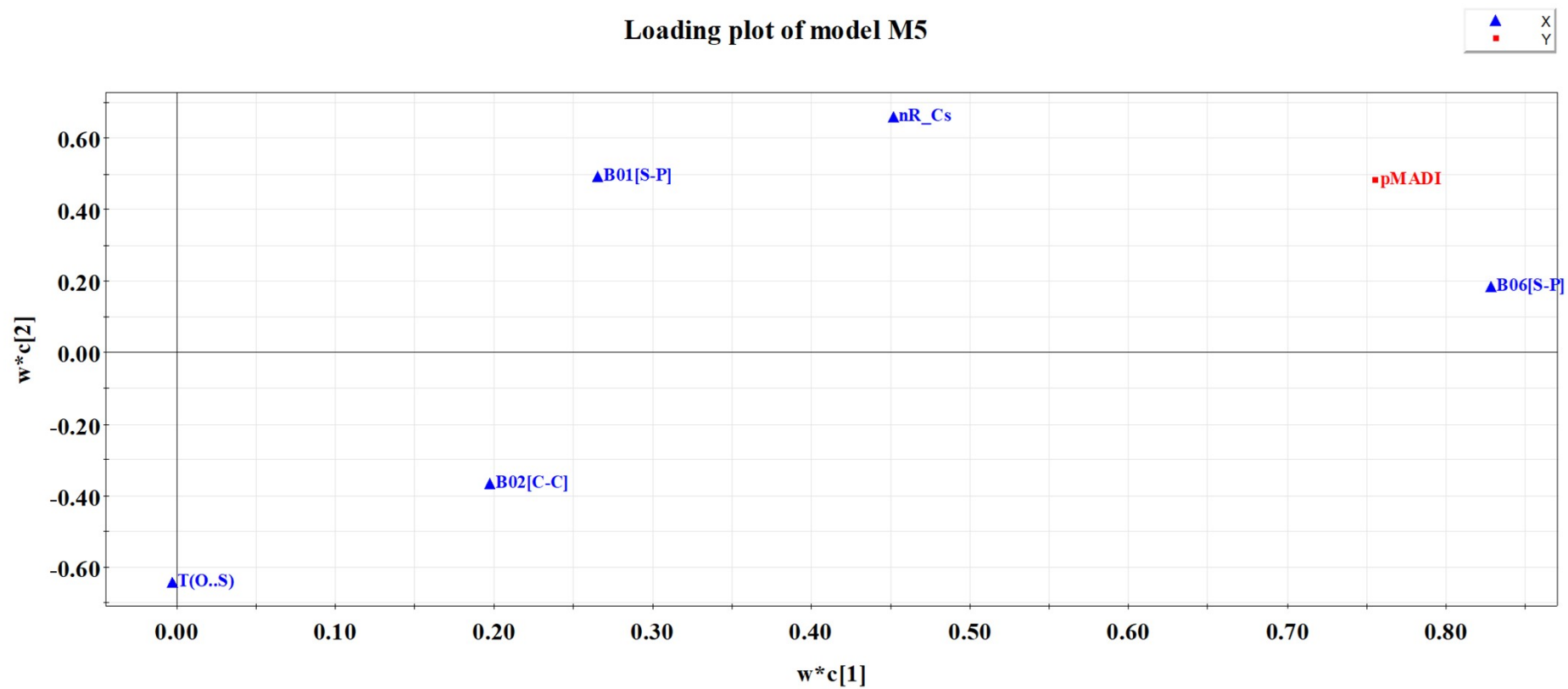
**Fig.S13. Loading plot of model M3**



**Fig.S14. Loading plot of model M4**

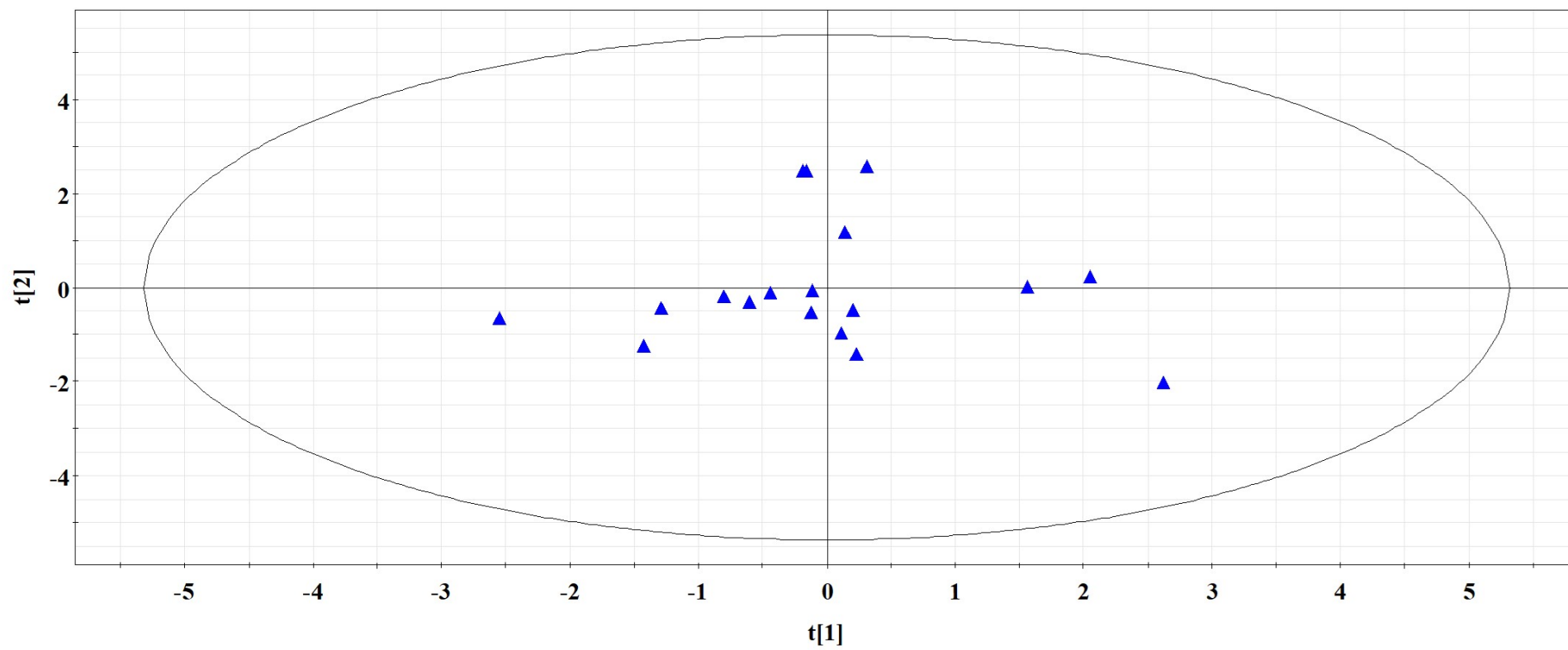


**Fig.S15. Loading plot of model M5**



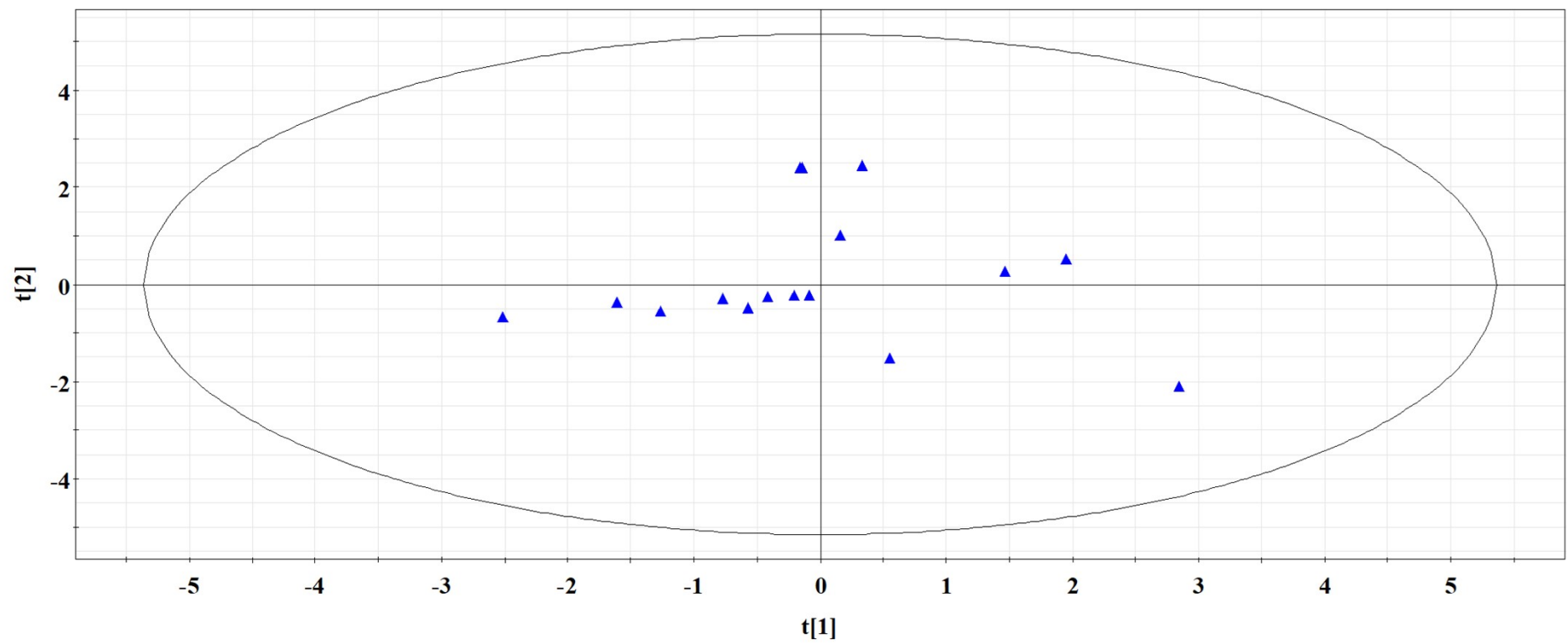
**Fig.S16. Score plot of model M1**

**Score plot of model M1**



**Fig.S17. Loading plot of model M2**

**Score plot of model M2**



**Fig.S18. Loading plot of model M3**

Score plot of model M3

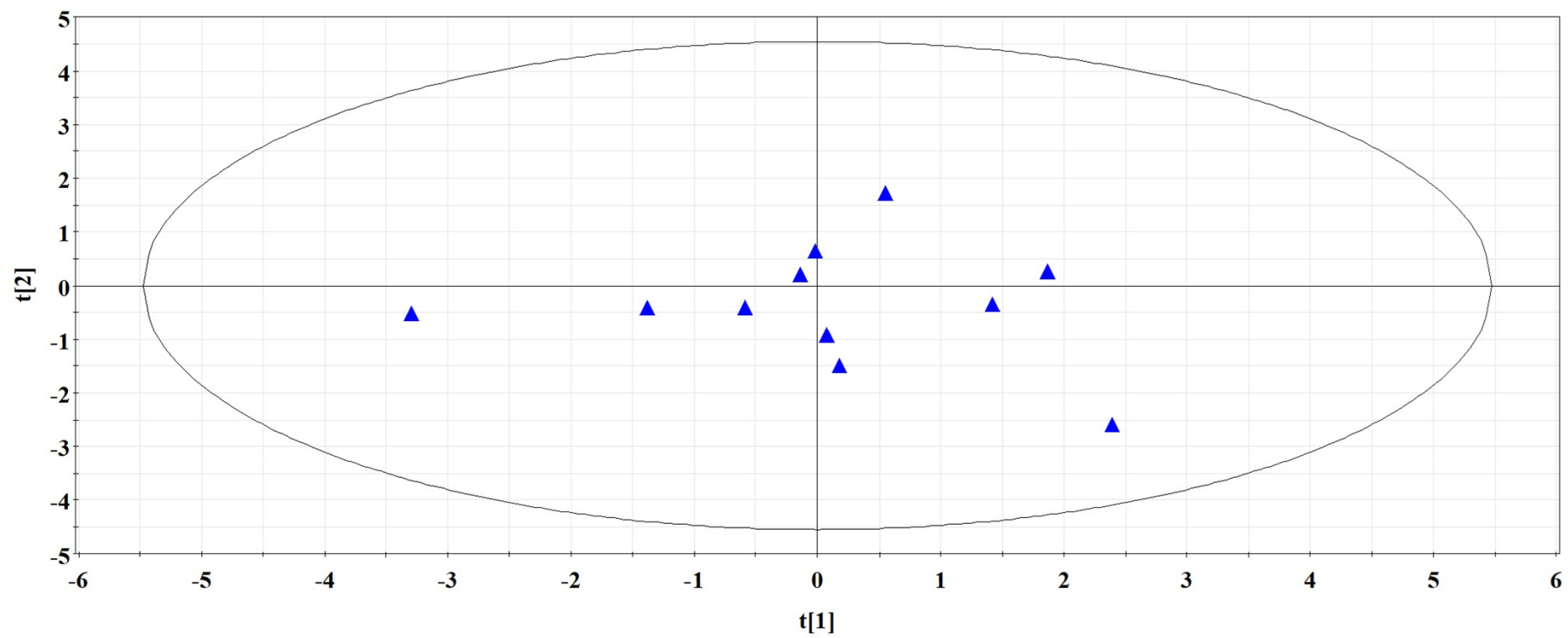


Fig.S19. Loading plot of model M4

Score plot of model M4

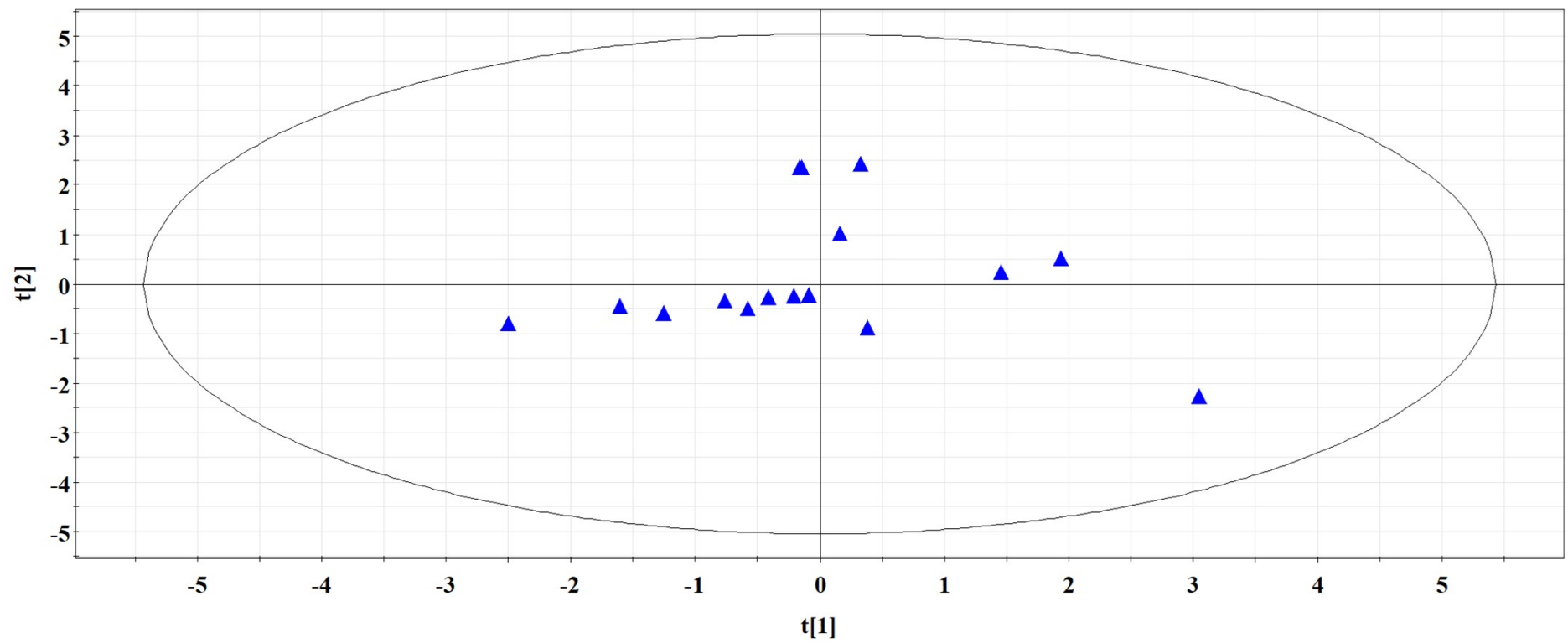
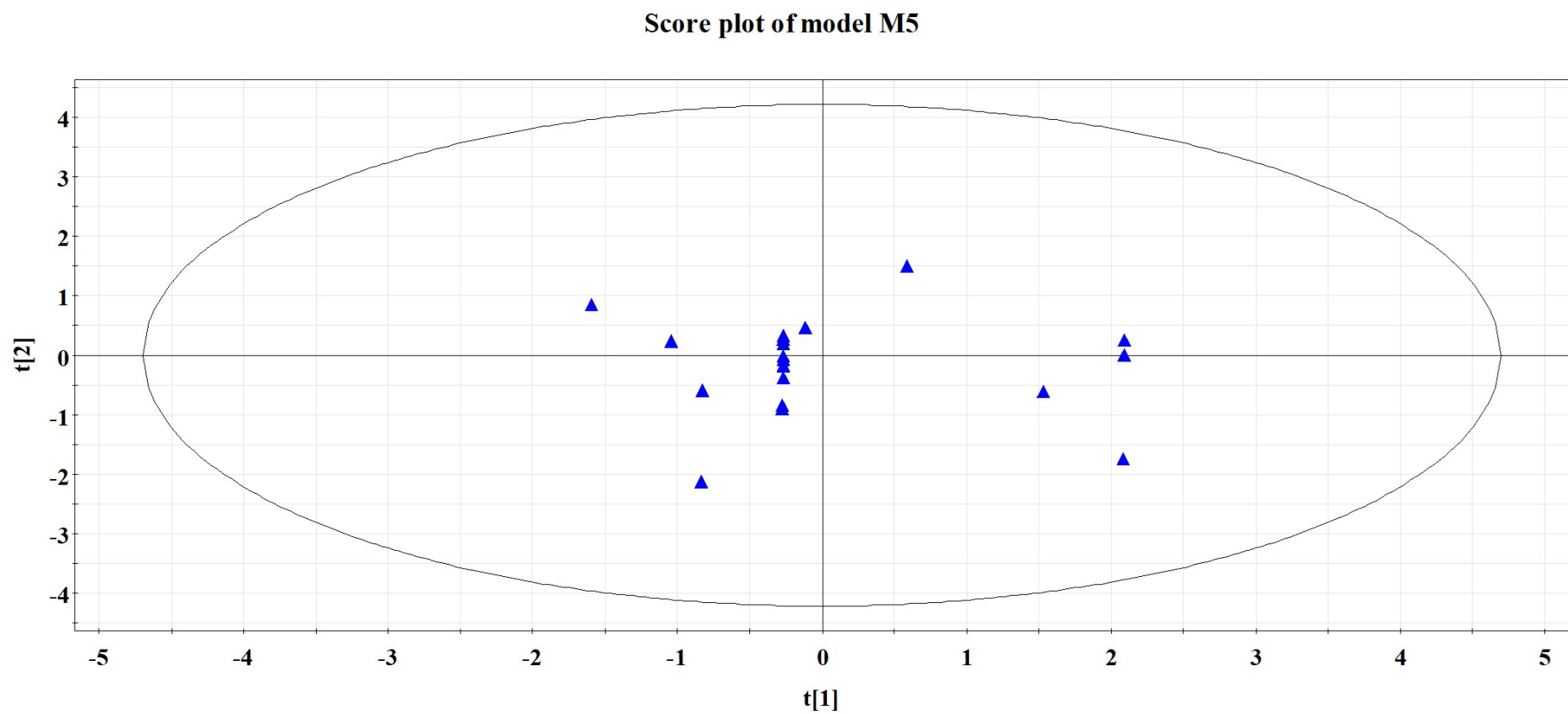
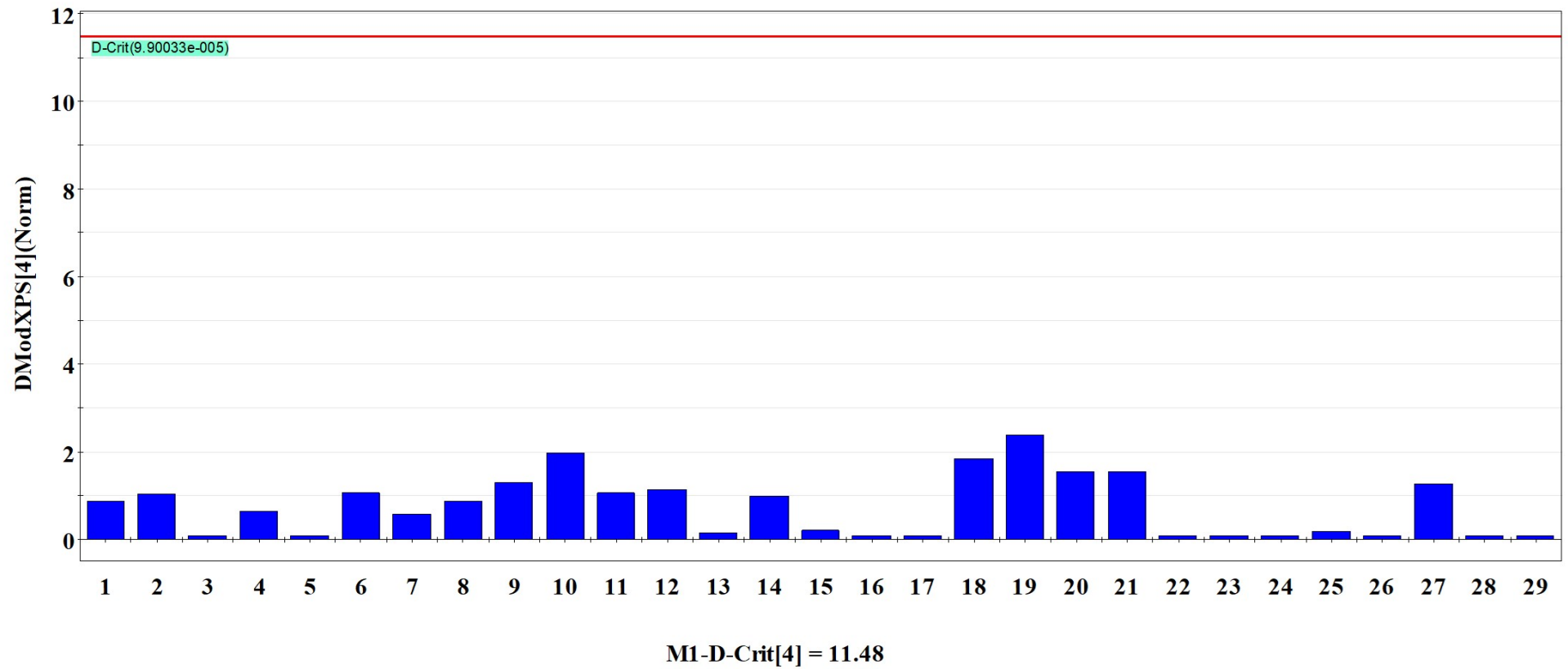


Fig.S20. Loading plot of model M5

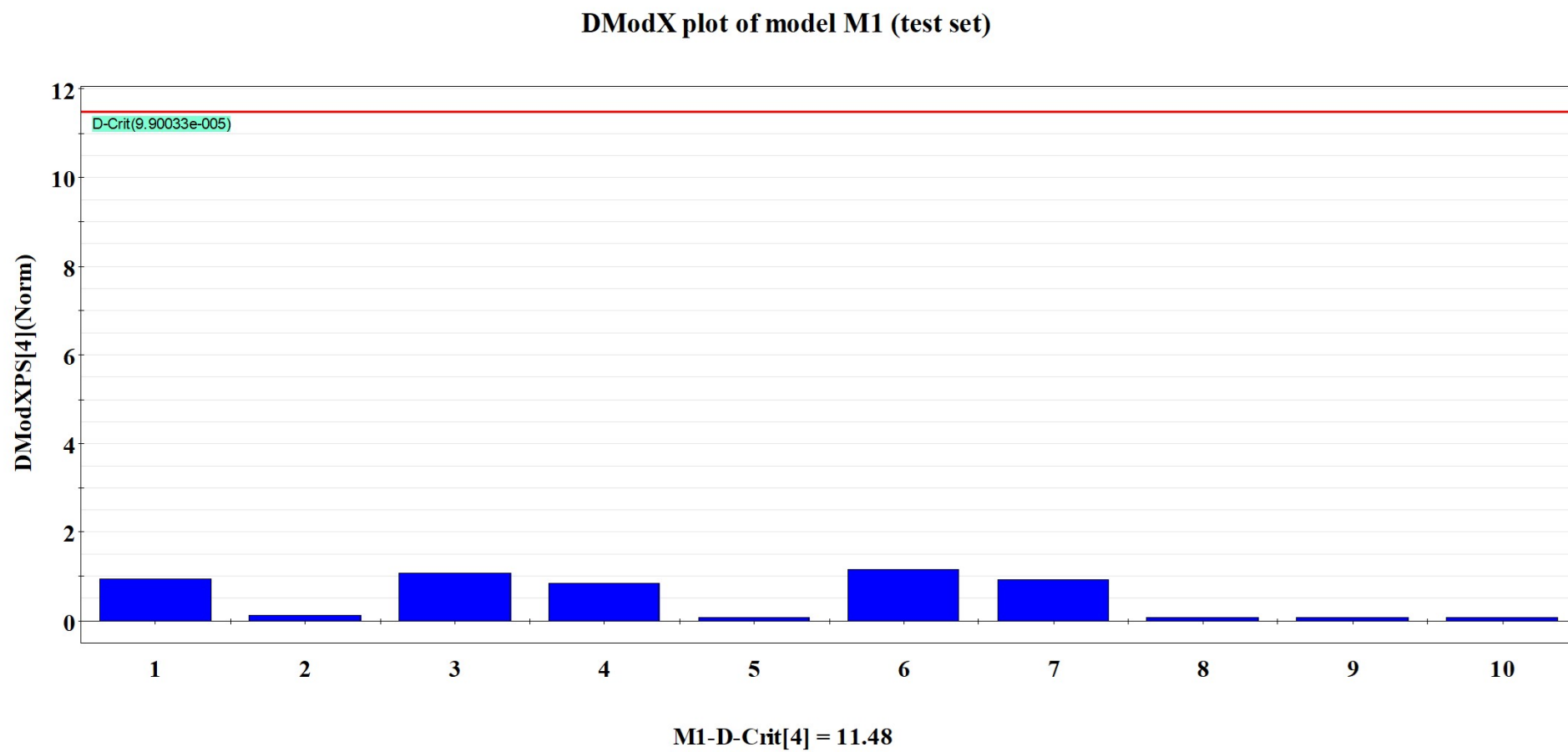


**Fig.S21. DModx plot (training set) of model M1**

**DModX plot of model M1 (training set)**

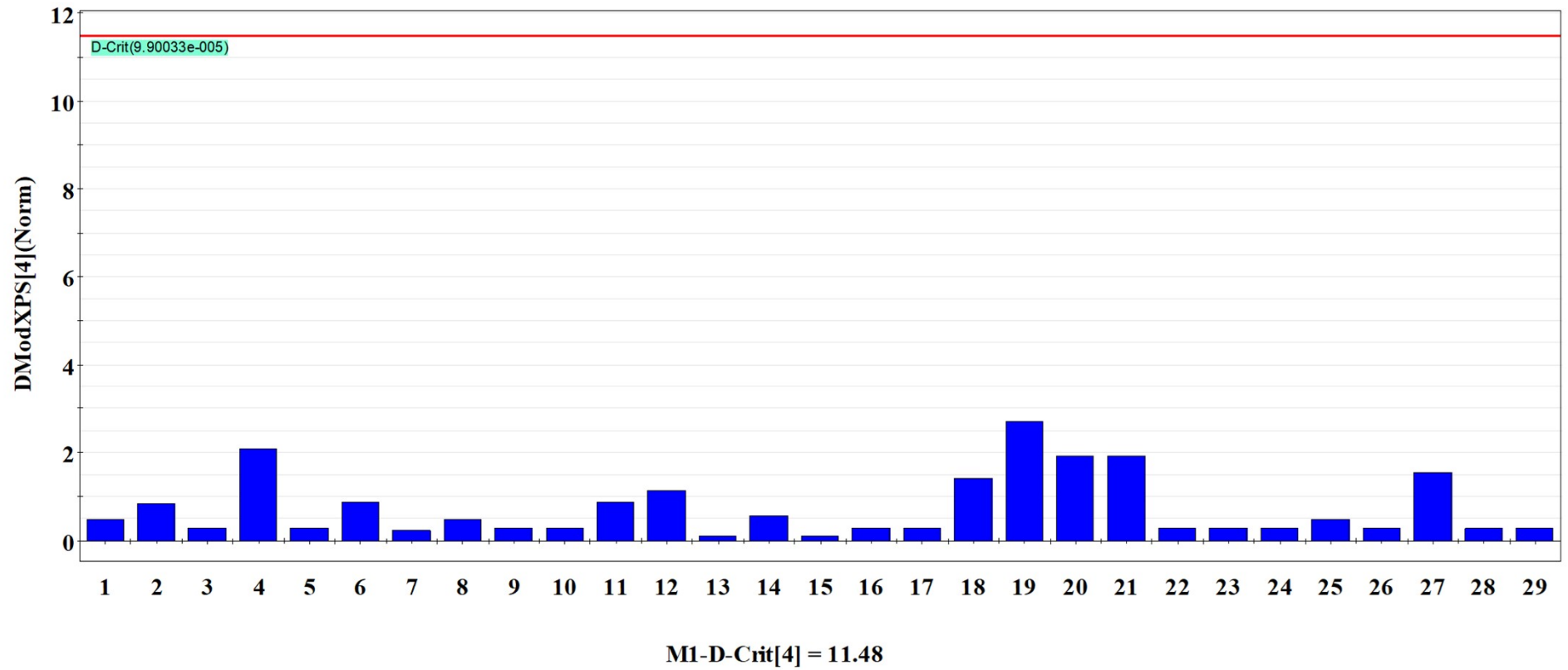


**Fig.S22. DModx plot (test set) of model M1**

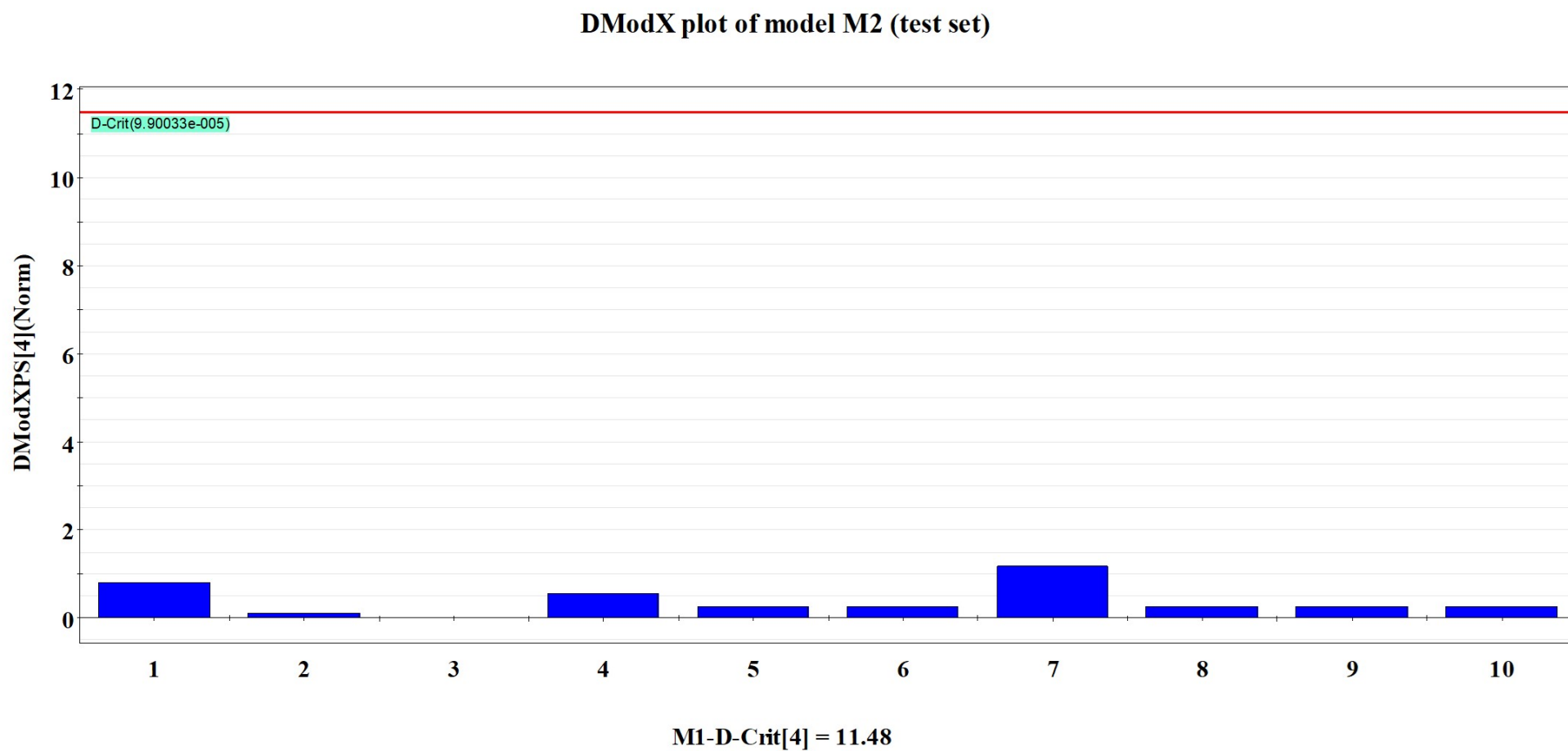


**Fig.S23. DModx plot (training set) of model M2**

**DModX plot of model M2 (training set)**

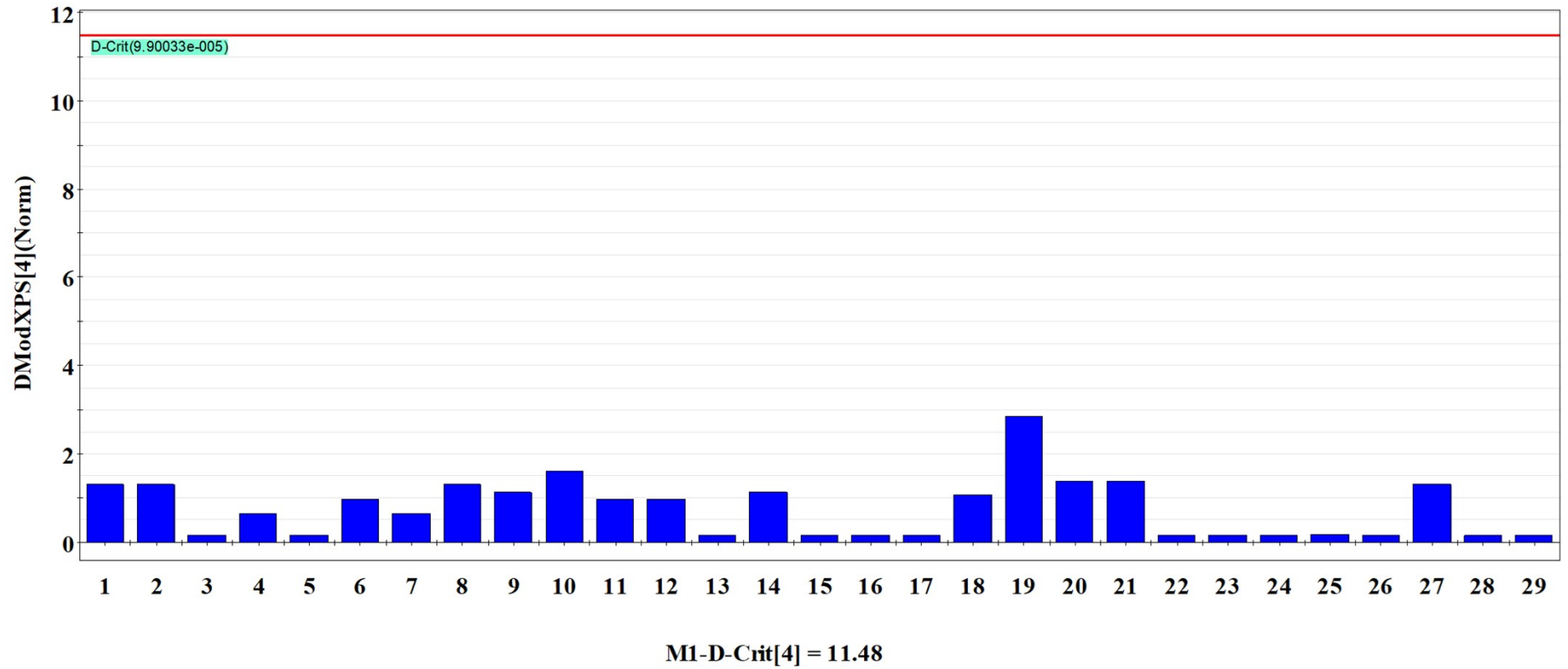


**Fig.S24. DModx plot (test set) of model M2**

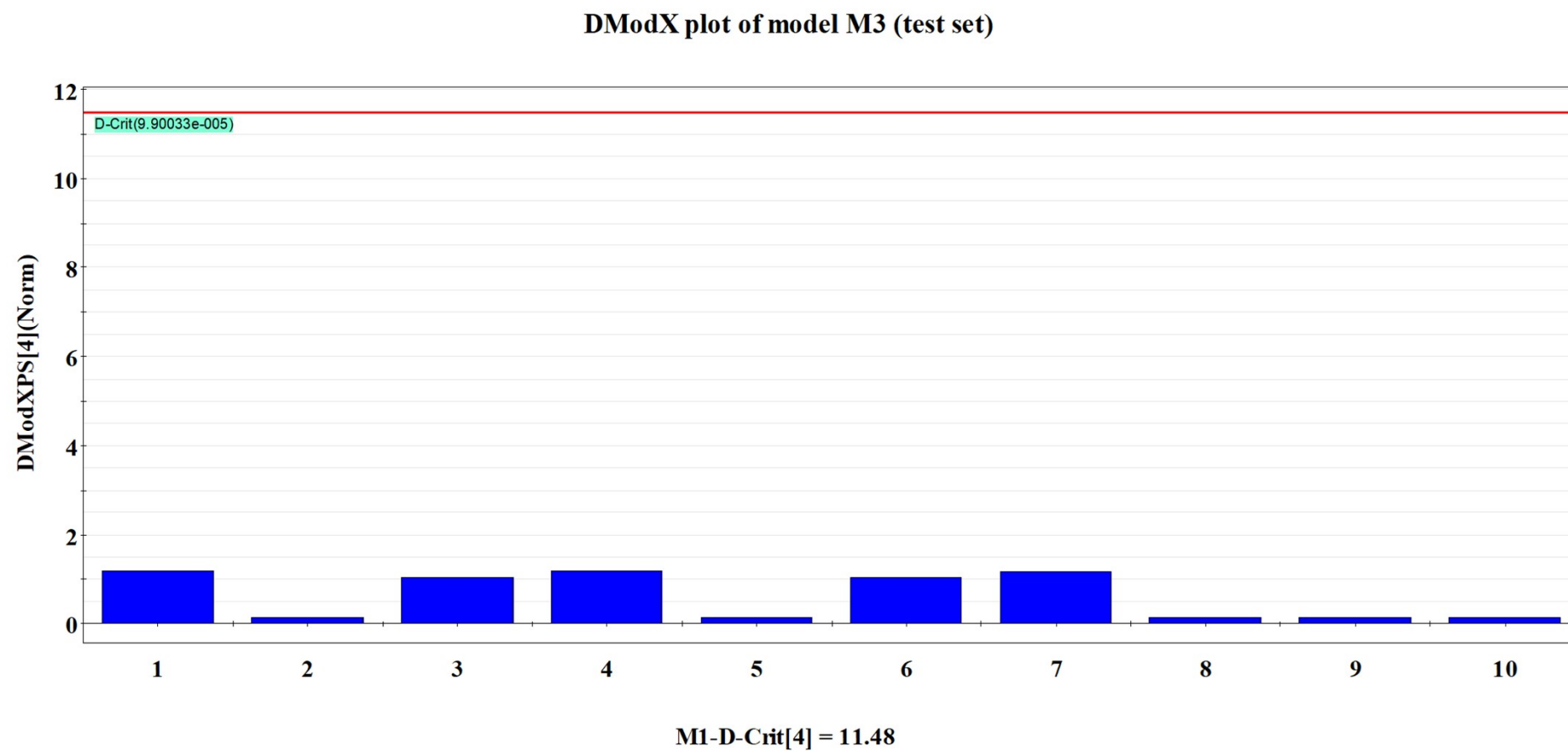


**Fig.S25. DModx plot (training set) of model M3**

**DModX plot of model M3 (training set)**

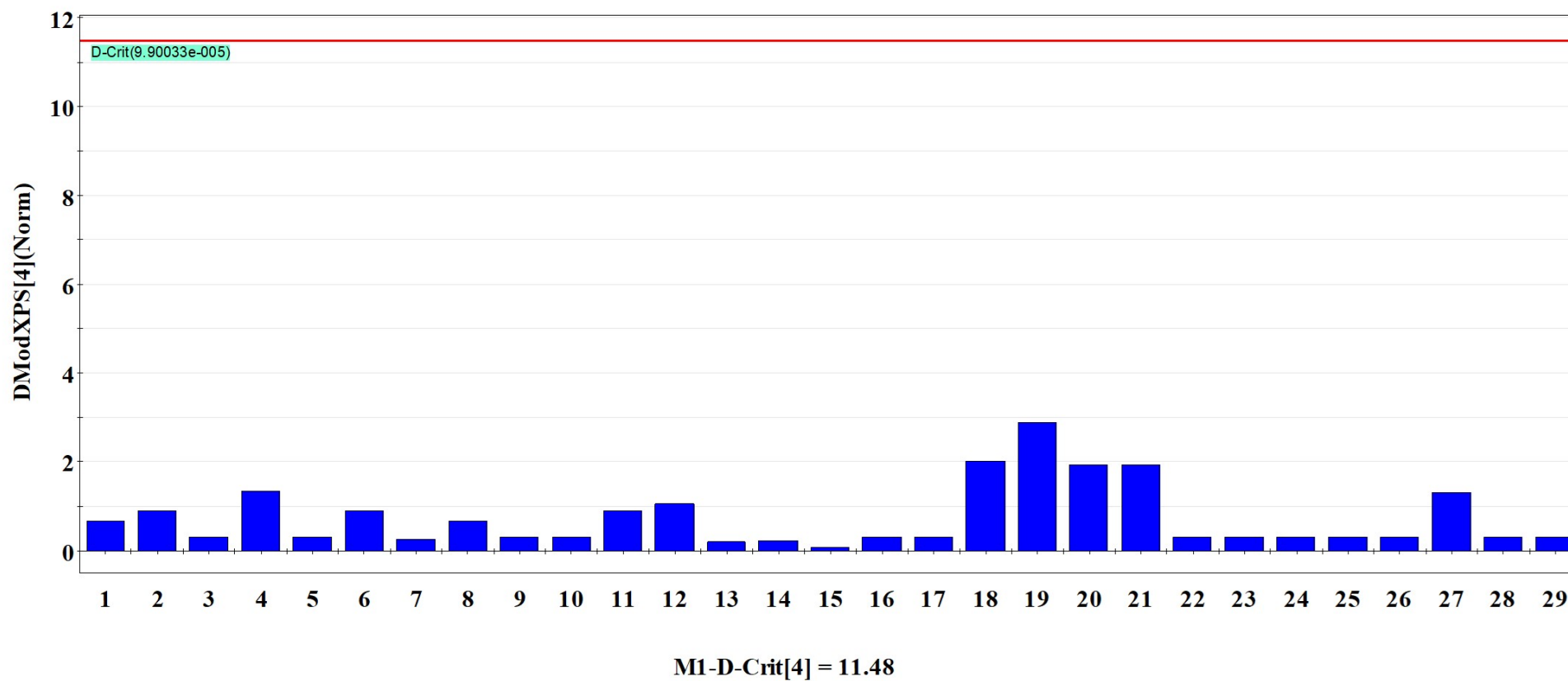


**Fig.S26. DModx plot (test set) of model M3**

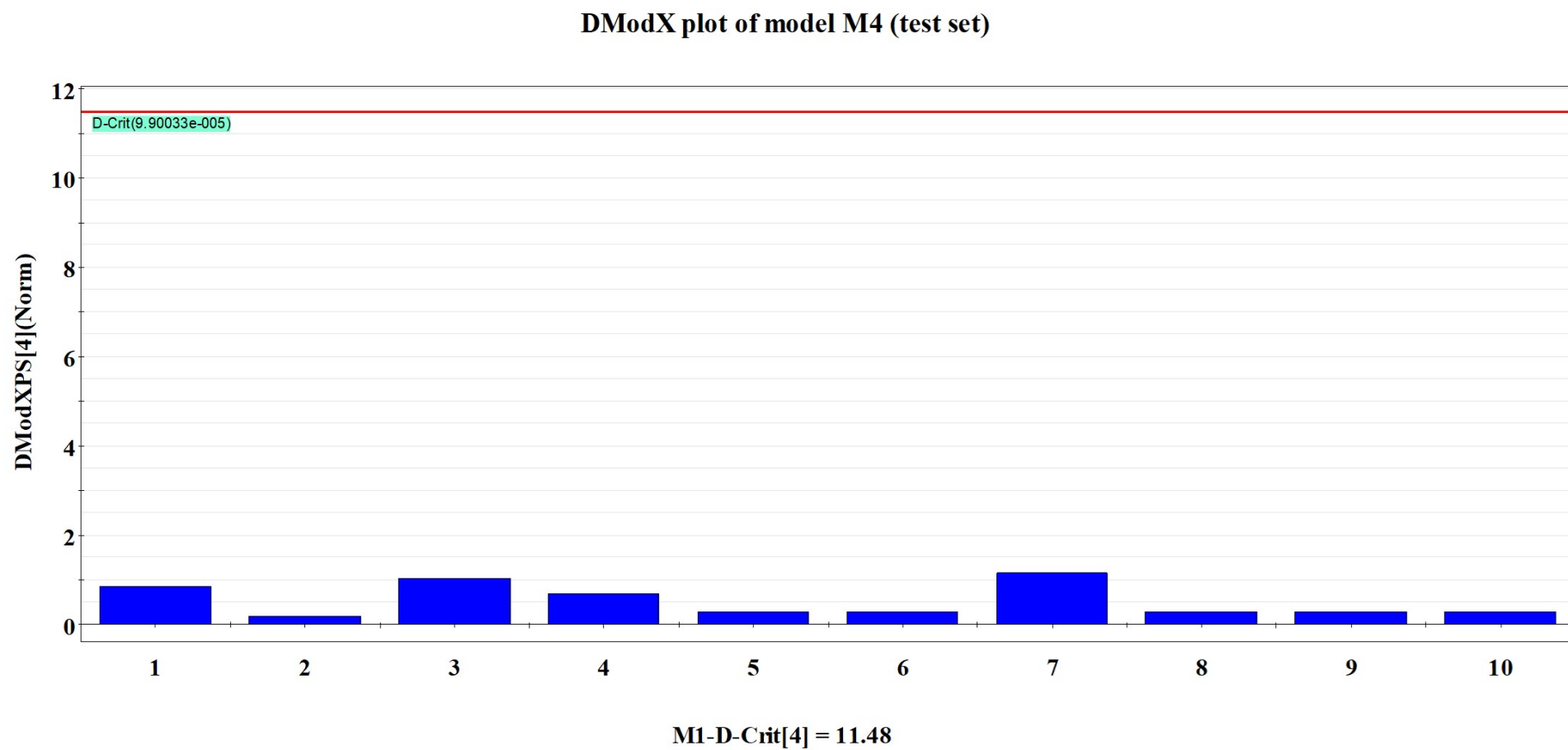


**Fig.S27. DModx plot (training set) of model M4**

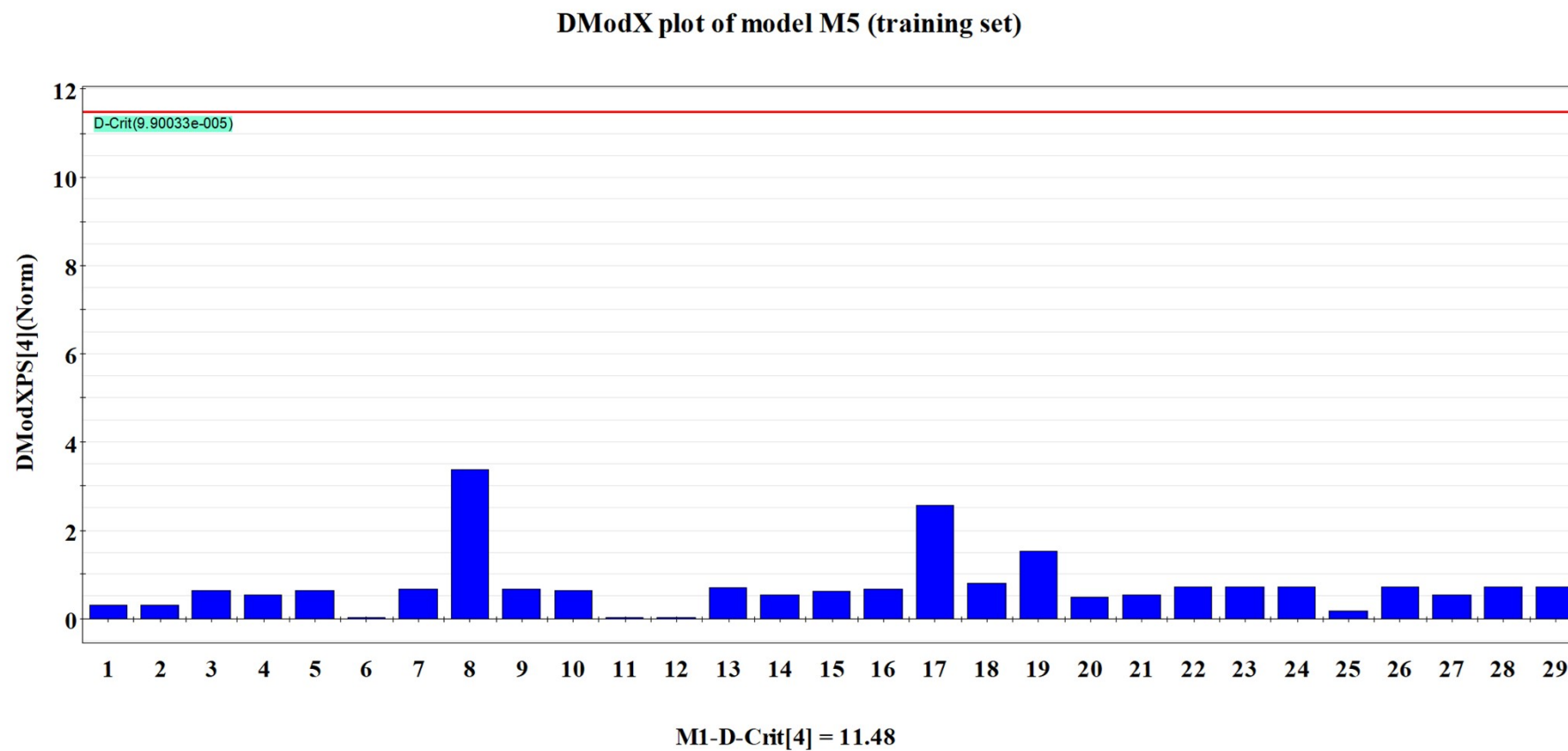
**DModX plot of model M4 (training set)**



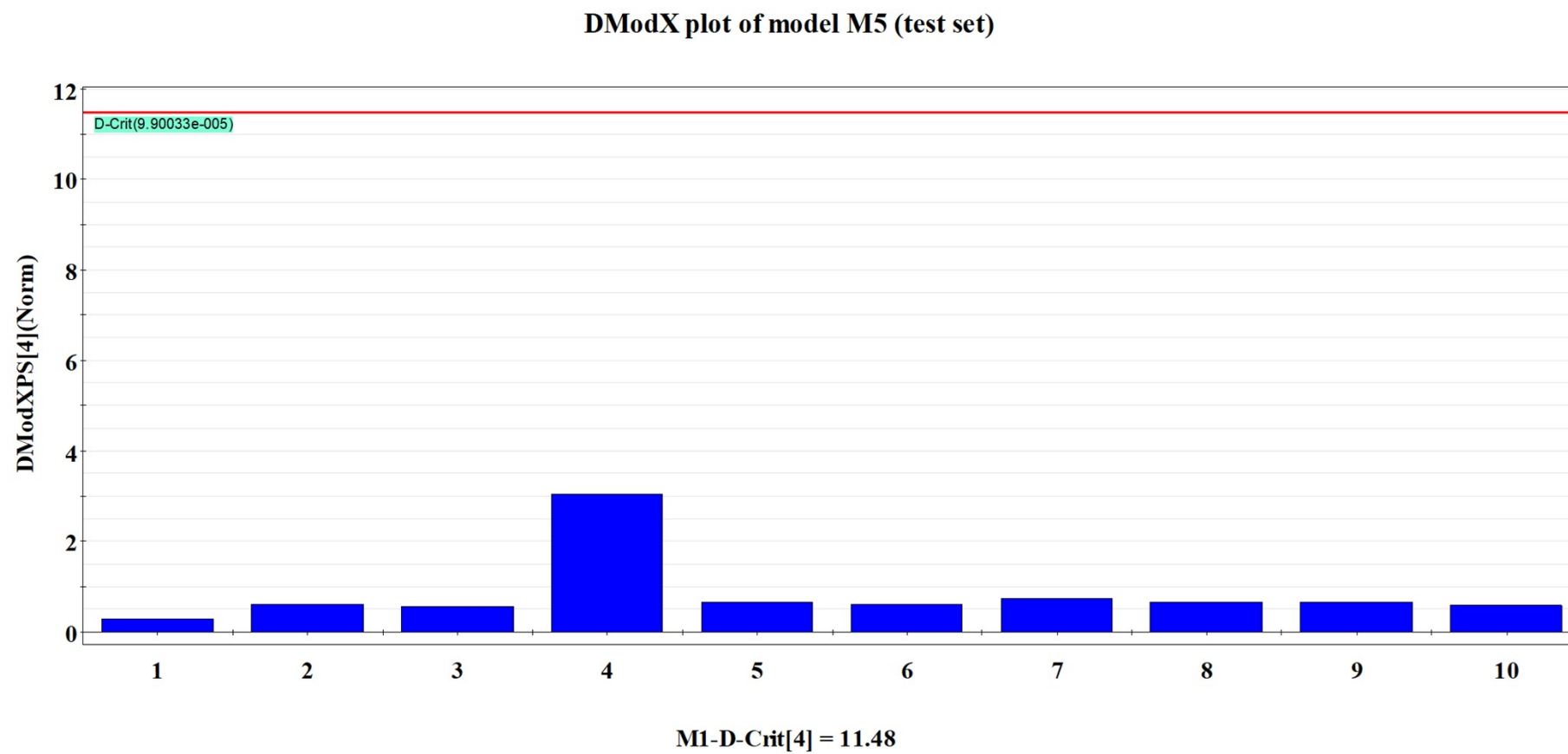
**Fig.S28. DModx plot (test set) of model M4**



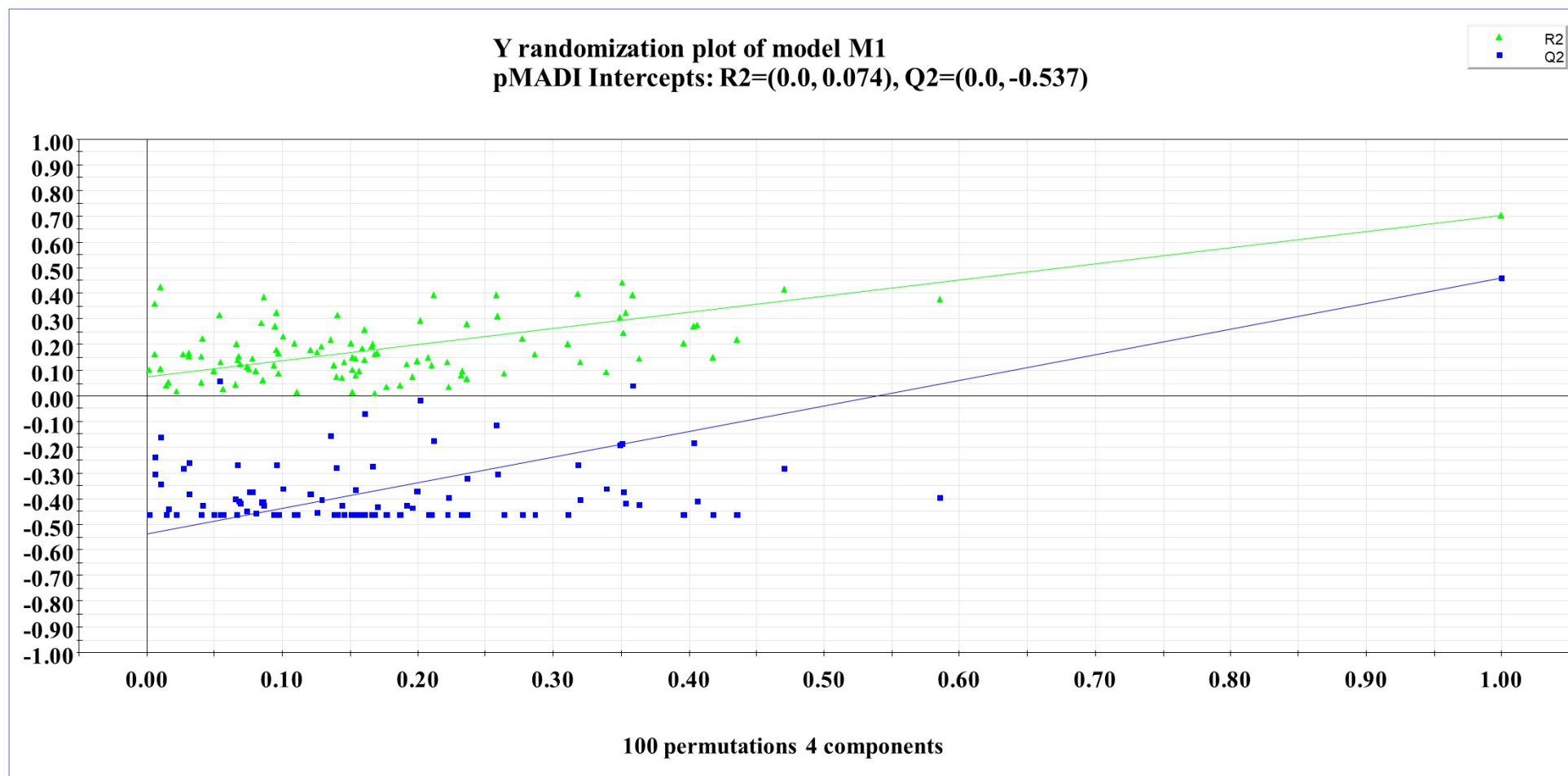
**Fig.S29. DModx plot (training set) of model M5**



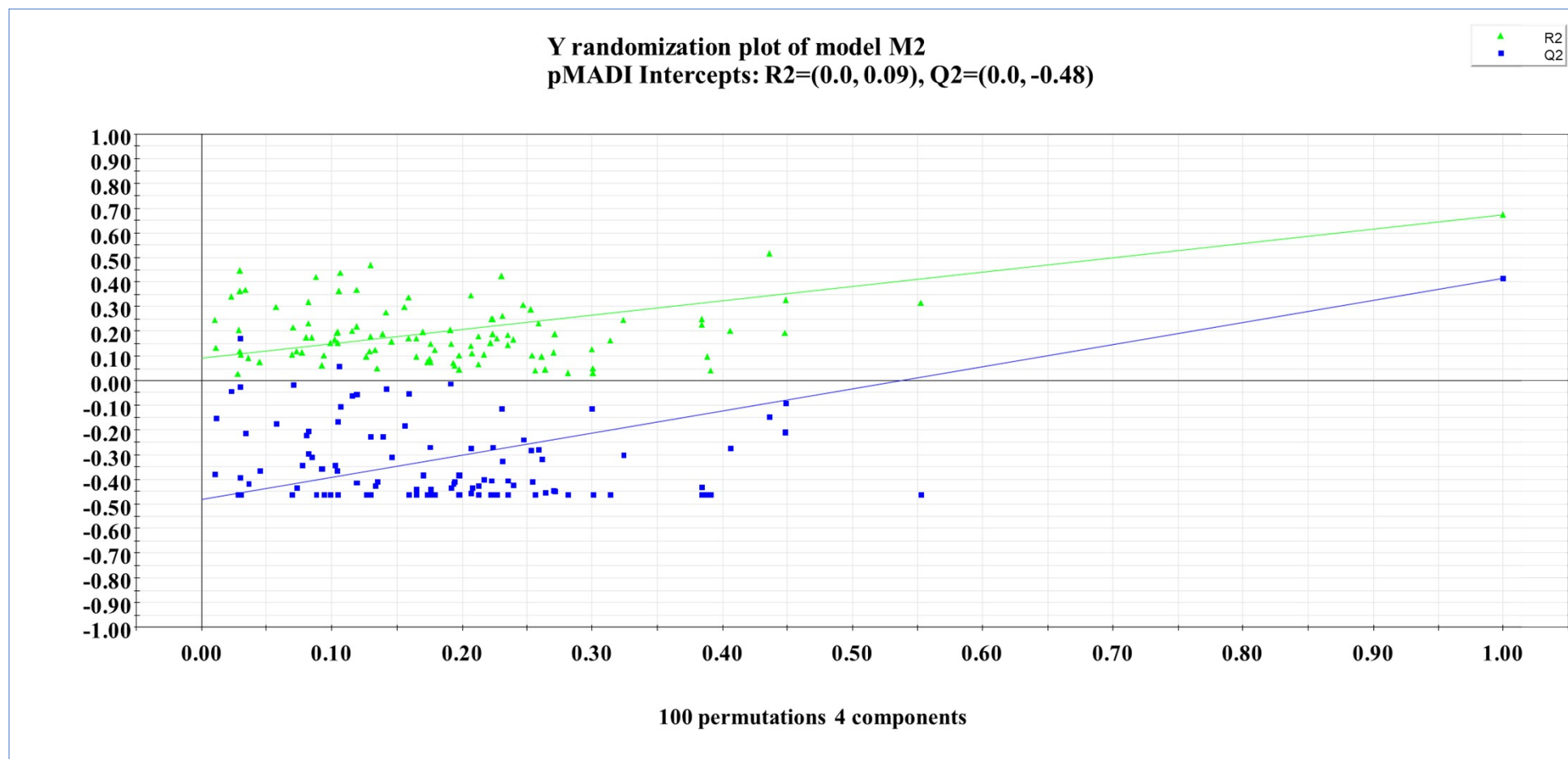
**Fig.S30. DModx plot (test set) of model M5**



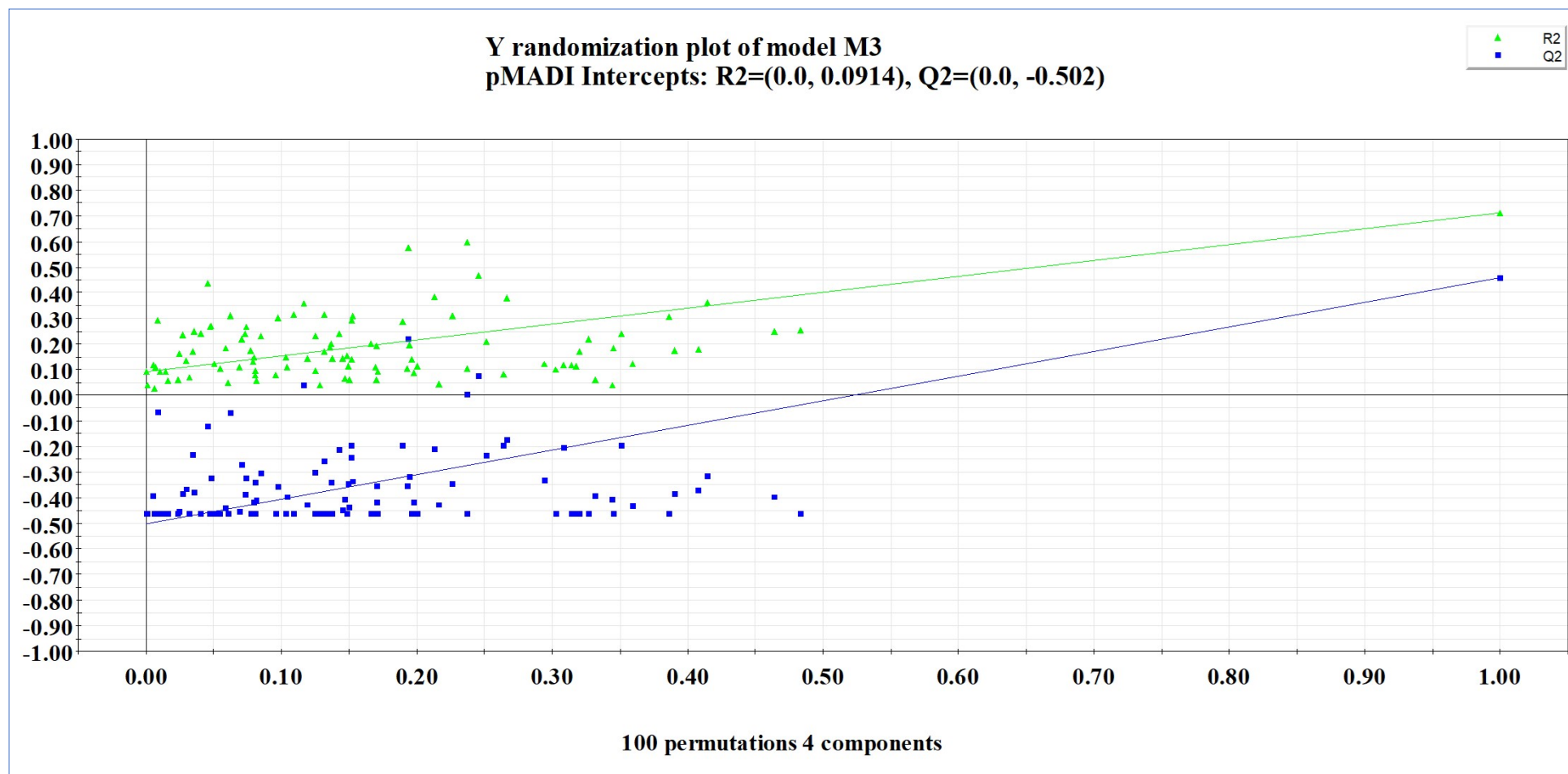
**Fig.S31. Y randomization plot of model M1**



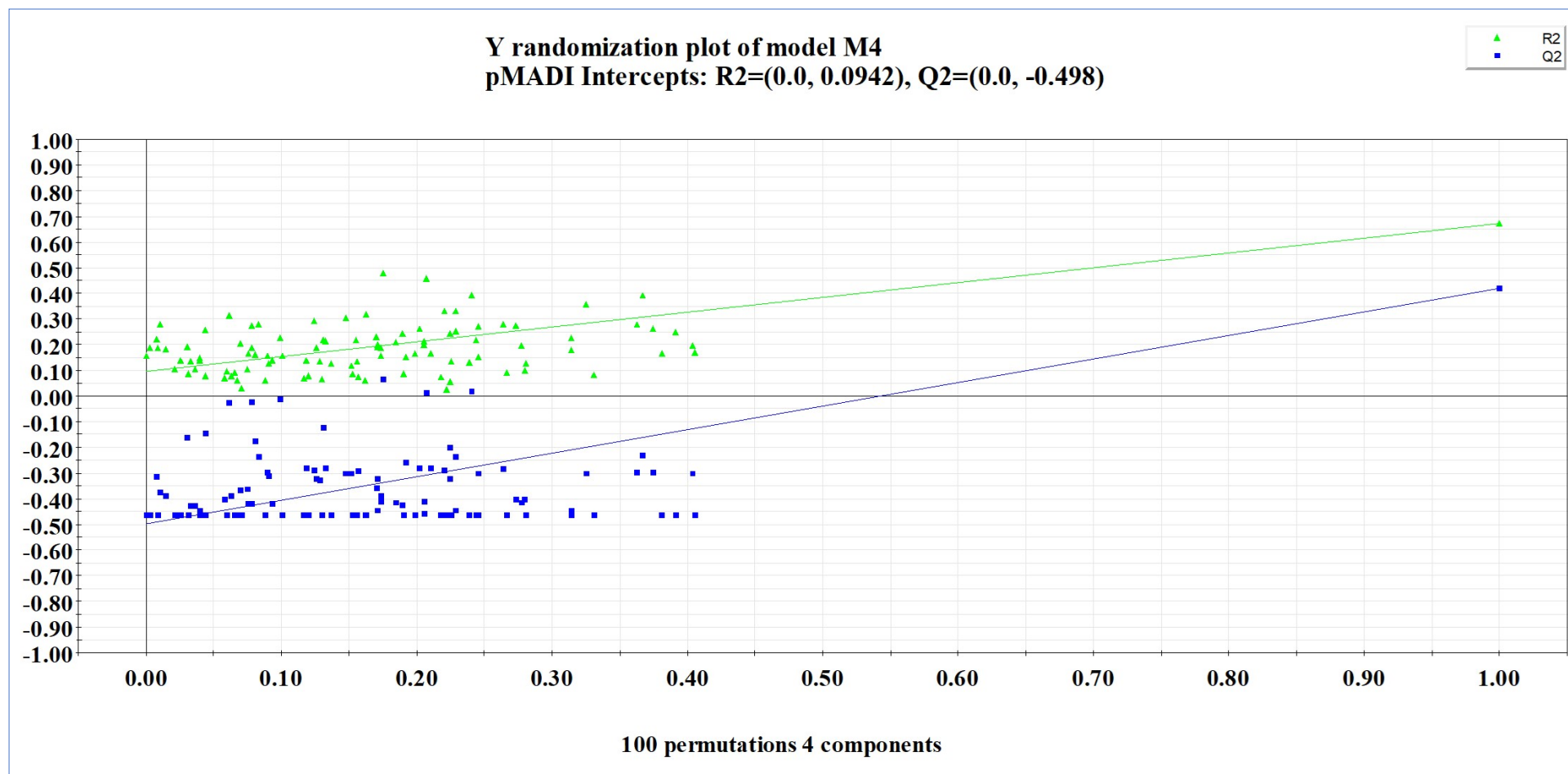
**Fig.S32. Y randomization plot of model M2**



**Fig.S33. Y randomization plot of model M3**



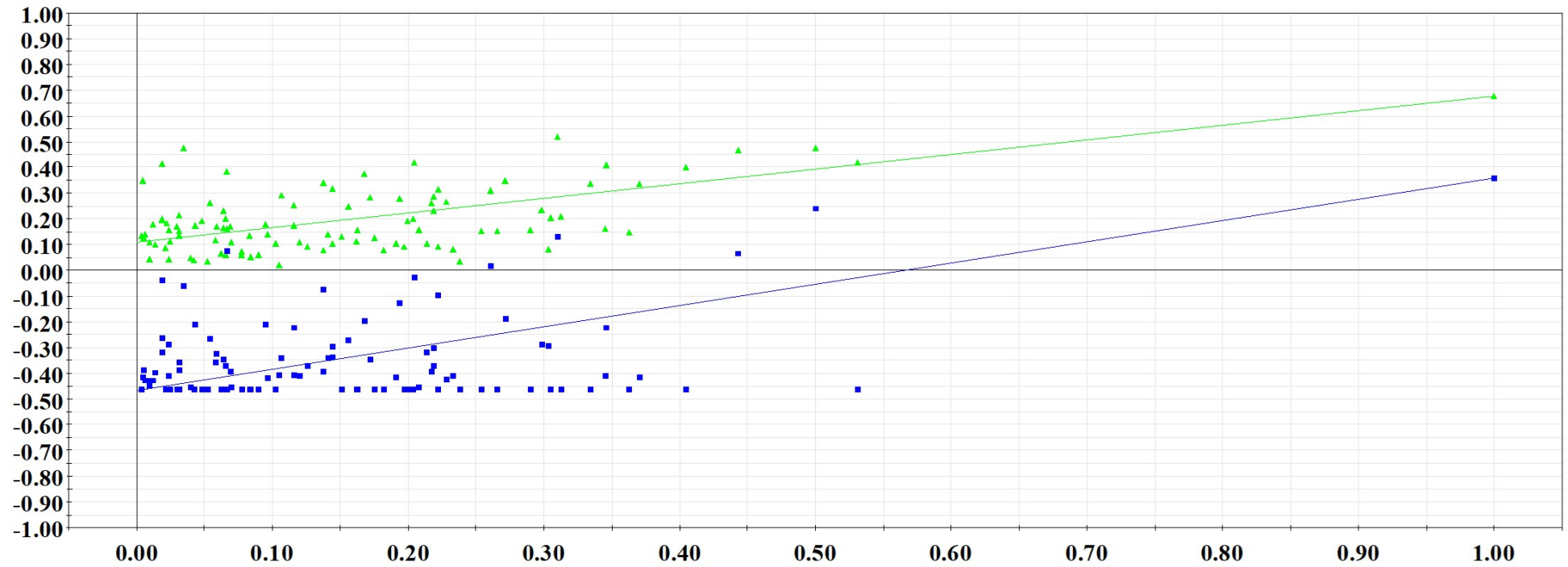
**Fig.S34. Y randomization plot of model M4**



**Fig.S35. Y randomization plot of model M5**

Y randomization plot of model M5  
pMADI Intercepts: R2=(0.0, 0.111), Q2=(0.0, -0.468)

▲ R2  
■ Q2



100 permutations 4 components

**Table S1.** List of top 20 and least 20 toxic pesticides according to the developed models.

| S.n<br>o.                           | chemical           | Smile                                                            | Safety and hazardous                                                                      |
|-------------------------------------|--------------------|------------------------------------------------------------------|-------------------------------------------------------------------------------------------|
| <b>Top 20 most toxic pesticides</b> |                    |                                                                  |                                                                                           |
| 1                                   | Propetamphos       | <chem>CCNP(=S)(OC)OC(=CC(=O)OC(C)C)C</chem>                      | Acute toxic, Environmental hazards <sup>1</sup>                                           |
| 2                                   | Pyridafenthion     | <chem>CCOP(=S)(OCC)OC1=NN(C(=O)C=C1)C2=CC=CC=C2</chem>           | Irritant <sup>1</sup>                                                                     |
| 3                                   |                    |                                                                  | Human health and protection; High Cramer Class : (class III)                              |
|                                     | Amidothioate       | <chem>CCNP(=S)(OC)OC1=C(C=C(C=C1)SC)Cl</chem>                    | <a href="https://sitem.herts.ac.uk/aeru/ppdb/">[https://sitem.herts.ac.uk/aeru/ppdb/]</a> |
| 4                                   | Sulprofos          | <chem>CCCSP(=S)(OCC)OC1=CC=C(C=C1)SC</chem>                      | Acute toxic, Environmental hazards <sup>1</sup>                                           |
| 5                                   |                    |                                                                  | Acute toxic, health hazards environmental hazards <sup>1</sup>                            |
|                                     | Fenthion           | <chem>CC1=C(C=CC(=C1)OP(=S)(OC)OC)SC</chem>                      |                                                                                           |
| 6                                   | Fenthion-ethyl     | <chem>CCOP(=S)(OCC)OC1=CC(=C(C=C1)SC)C</chem>                    | Acute toxic, Environmental hazards <sup>1</sup>                                           |
| 7                                   | Fensulfothion      | <chem>CCOP(=S)(OCC)OC1=CC=C(C=C1)S(=O)C</chem>                   | Acute toxic, Environmental hazards <sup>1</sup>                                           |
| 8                                   | Fenthion sulfoxide | <chem>CC1=C(C=CC(=C1)OP(=S)(OC)OC)S(=O)C</chem>                  | Acute toxic <sup>1</sup>                                                                  |
| 9                                   | Pyridaben          | <chem>CC(C)(C)C1=CC=C(C=C1)CSC2=C(C(=O)N(N=C2)C(C)(C)C)Cl</chem> | Acute toxic, Environmental hazards <sup>1</sup>                                           |
| 10                                  | Uniconazole        | <chem>CC(C)(C)C(C(=CC1=CC=C(C=C1)Cl)N2C=NC=N2)O</chem>           | Irritant <sup>1</sup>                                                                     |
| 11                                  |                    |                                                                  | Human health and protection; High Cramer Class : (class III)                              |
|                                     | Cloproxydim        | <chem>CCCC(=C1C(=O)CC(CC1=O)CC(C)SCC)NOCC=CCl</chem>             | <a href="https://sitem.herts.ac.uk/aeru/ppdb/">[https://sitem.herts.ac.uk/aeru/ppdb/]</a> |
| 12                                  | Diniconazole       | <chem>CC(C)(C)C(C(=CC1=C(C=C(C=C1)Cl)Cl)N2C=NC=N2)O</chem>       | Irritant, Environmental hazards <sup>1</sup>                                              |
| 13                                  | Diniconazole-M     | <chem>CC(C)(C)C(C(=CC1=C(C=C(C=C1)Cl)Cl)N2C=NC=N2)O</chem>       | Irritant, health hazards, Environmental hazards <sup>1</sup>                              |
| 14                                  | Clethodim          | <chem>CCC(=C1C(=O)CC(CC1=O)CC(C)SCC)NOCC=CCl</chem>              | Irritant <sup>1</sup>                                                                     |
| 15                                  | Bromocyclen        | <chem>C1C(C2(C(=C(C1(C2(Cl)Cl)Cl)Cl)Cl)Cl)CBr</chem>             | Suspected poison                                                                          |
| 16                                  | Tepraloxym         | <chem>CCC(=C1C(=O)CC(CC1=O)C2CCOCC2)NOCC=CCl</chem>              | Health hazards <sup>2</sup>                                                               |
| 17                                  | Dieldrin           | <chem>C1C2C3C(C1C4C2O4)C5(C(=C(C3(C5(Cl)Cl)Cl)Cl)Cl)Cl</chem>    | Acute toxic, health hazards, Environmental <sup>1</sup>                                   |
| 18                                  | Endrin             | <chem>C1C2C3C(C1C4C2O4)C5(C(=C(C3(C5(Cl)Cl)Cl)Cl)Cl)Cl</chem>    | Acute toxic, Environmental hazards <sup>1</sup>                                           |
| 19                                  |                    |                                                                  | Corrosive, Irritant, health hazards, Environmental hazards <sup>1</sup>                   |
|                                     | Hymexazol          | <chem>CC1=CC(=O)NO1</chem>                                       |                                                                                           |
| 20                                  | Fenaminstrobi      | <chem>CC(=NOCC1=CC=CC=C1C(=NOC)C(=O)NC)C=CC2=C(C=CC=C2Cl)</chem> | Irritant <sup>1</sup>                                                                     |

| n  | Cl                         | Least 20 toxic pesticides                                                                                                                                                                                   |
|----|----------------------------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| 1  | Metcamifen                 | <chem>CNC(=O)NC1=CC=C(C=C1)S(=O)(=O)NC(=O)C2=CC=CC=C2OC</chem><br>Very low acute toxicity<br><a href="https://www.tga.gov.au/">[https://www.tga.gov.au/]</a>                                                |
| 2  | Tripyrasulfone             | <chem>CC1=CC(=NN1CC2=C(C=CC(=C2Cl)C(=O)C3=C(N(N=C3C)C)OC(=O)C4=CN(N=C4C)C)S(=O)(=O)C)C</chem><br>Low acute toxicity<br><a href="https://www.apvma.gov.au/">[https://www.apvma.gov.au/]</a>                  |
| 3  | Fomesafen                  | <chem>CS(=O)(=O)NC(=O)C1=C(C=CC(=C1)OC2=C(C=C(C=C2)C(F)(F)F)Cl)[N+](=O)[O-]</chem><br>Low order of acute toxicity<br><a href="https://www3.epa.gov/pesticides/">[https://www3.epa.gov/pesticides/]</a>      |
| 4  | Mecarbinzid                | <chem>COC(=O)NC1=NC2=CC=CC=C2N1C(=O)NCCSC</chem><br>No indication of carcinogenicity in humans<br>(not listed by IARC) <sup>1</sup>                                                                         |
| 5  | Triafamone                 | <chem>CN(C1=C(C=CC=C1F)C(=O)C2=NC(=NC(=N2)OC)OC)S(=O)(=O)C(F)F</chem><br>Low-toxic <sup>1</sup>                                                                                                             |
| 6  | Asulam                     | <chem>COC(=O)NS(=O)(=O)C1=CC=C(C=C1)N</chem><br>Low acute toxicity<br><a href="https://www3.epa.gov/pesticides/">[https://www3.epa.gov/pesticides/]</a>                                                     |
| 7  | Cyprosulfamid e            | <chem>COC1=CC=CC=C1C(=O)NS(=O)(=O)C2=CC=C(C=C2)C(=O)NC3CC3</chem><br>Low toxicity in acute toxicity<br><a href="https://www.federalregister.gov/">[https://www.federalregister.gov/]</a>                    |
| 8  | Benthiavalicar b-isopropyl | <chem>CC(C)C(C(=O)NC(C)C1=NC2=C(S1)C=C(C=C2)F)NC(=O)OC(C)C</chem><br>Low mammalian oral toxicity<br><a href="http://sitem.herts.ac.uk/aeru/ppdb/">[http://sitem.herts.ac.uk/aeru/ppdb/]</a>                 |
| 9  | Bispyribac                 | <chem>COC1=CC(=NC(=N1)OC2=C(C(=CC=C2)OC3=NC(=CC(=N3)OC)OC)C(=O)O)OC</chem><br>Low acute toxicity<br><a href="https://www.federalregister.gov/d/2011-2266">[https://www.federalregister.gov/d/2011-2266]</a> |
| 10 | Picloram                   | <chem>C1(=C(C(=NC(=C1Cl)Cl)C(=O)O)Cl)N</chem><br>Slightly toxic<br><a href="https://www3.epa.gov/pesticides/">[https://www3.epa.gov/pesticides/]</a>                                                        |
| 11 | Chlorflurenol              | <chem>C1=CC=C2C(=C1)C3=C(C2(C(=O)O)O)C=C(C=C3)Cl</chem><br>Low mammalian oral toxicity<br><a href="https://sitem.herts.ac.uk/aeru/ppdb/">[https://sitem.herts.ac.uk/aeru/ppdb/]</a>                         |
| 12 | Aminopyralid               | <chem>NC1=CC(Cl)=NC(C(O)=O)=C1Cl</chem><br>Low to moderate toxicity<br><a href="https://sitem.herts.ac.uk/aeru/ppdb/">[https://sitem.herts.ac.uk/aeru/ppdb/]</a>                                            |
| 13 | Aminopyralid               | <chem>C1=C(C(=C(N=C1Cl)C(=O)O)Cl)N</chem><br>Non-toxic to mammals<br><a href="https://wsdot.wa.gov/">[https://wsdot.wa.gov/]</a>                                                                            |
| 14 | Fluroxypyr                 | <chem>C(C(=O)O)OC1=NC(=C(C(=C1Cl)N)Cl)F</chem><br>Low toxicity <a href="https://wsdot.wa.gov/">[https://wsdot.wa.gov/]</a>                                                                                  |
| 15 | Tricamba                   | <chem>COc1c(Cl)cc(Cl)c(Cl)c1C(=O)O</chem><br>Low for aquatic organisms, mammals<br><a href="https://www.mda.state.mn.us/">[https://www.mda.state.mn.us/]</a>                                                |
| 16 | Daminozide                 | <chem>CN(C)NC(=O)CCC(=O)O</chem><br>Practically non-toxic to mammals<br><a href="https://www3.epa.gov/pesticides/">[https://www3.epa.gov/pesticides/]</a>                                                   |
| 17 | Famoxadone                 | <chem>CC1(C(=O)N(C(=O)O1)NC2=CC=CC=C2)C3=CC=C(C=C3)OC4=CC=</chem><br>Minimal to moderate acute toxicity                                                                                                     |

|    |                 |                                                                                                            |                                                                                                                                                                           |
|----|-----------------|------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| 18 | Fluoxapiprolin  | <chem>CC=C4CS(=O)(=O)OC1=C(C(=CC=C1)Cl)C2CC(=NO2)C3=CSC(=N3)C4CCN(CC4)C(=O)CN5C(=CC(=N5)C(F)F)C(F)F</chem> | [ <a href="https://www3.epa.gov/pesticides/">https://www3.epa.gov/pesticides/</a> ]<br>Low toxicity [ <a href="https://www.apvma.gov.au/">https://www.apvma.gov.au/</a> ] |
| 19 | Benazolin-ethyl | <chem>CCOC(=O)CN1C2=C(C(=CC=C2Cl)SC1=O</chem>                                                              | Slightly toxic by oral exposure.<br>[ <a href="http://extoxnet.orst.edu/pips/quizalof.htm">http://extoxnet.orst.edu/pips/quizalof.htm</a> .]                              |
| 20 | Thifluzamide    | <chem>CC1=NC(=C(S1)C(=O)NC2=C(C=C(C=C2Br)OC(F)(F)F)Br)C(F)(F)F</chem>                                      | Might cause a potential toxicity for the earthworm ( <i>Eisenia fetida</i> ) <sup>3</sup> .                                                                               |

#### References:

1. S. Kim, J. Chen, T. Cheng, A. Gindulyte, J. He, S. He, Q. Li, B. A. Shoemaker, P. A. Thiessen, B. Yu, L. Zaslavsky, J. Zhang, & E. E. Bolton, PubChem 2023 update, *Nucleic Acids Res.*, 2023, **51**, D1373–D1380, DOI: 10.1093/nar/gkac956. Available from <https://pubchem.ncbi.nlm.nih.gov/>.
2. MP. Quick, Suspected cases of bromocyclen poisoning., *Vet. Hum. Toxicol.* 1992, **34**, 455-457. PMID: 1455619.
3. X. Yao, F. Zhang, Z. Qiao, H. Yu, S. Sun, X. Li, J. Zhang, and X. Jiang, Toxicity of thifluzamide in earthworm (*Eisenia fetida*), *Ecotoxicol. Environ. Saf.*, 2020, **188**, 109880, DOI: [10.1016/j.ecoenv.2019.109880](https://doi.org/10.1016/j.ecoenv.2019.109880).

**Table S2: Comparative statistical results of the developed models with other models developed using different dataset ratio.**

| Dataset division ratio                             | Model | LVs | $N_{\text{train}}/N_{\text{test}}$ | descriptors | Training set |             |                      |             | Test set     |              |                     |
|----------------------------------------------------|-------|-----|------------------------------------|-------------|--------------|-------------|----------------------|-------------|--------------|--------------|---------------------|
|                                                    |       |     |                                    |             | $R^2$        | $Q_{LOO}^2$ | $MAE_{\text{TRAIN}}$ | $MAE_{LOO}$ | $Q_{(F1)}^2$ | $Q_{(F2)}^2$ | $MAE_{\text{TEST}}$ |
| Present study<br>Training: test=75:25<br>(approx.) | M1    | 4   | 29/10                              | 5           | 0.704        | 0.580       | 0.248                | 0.303       | 0.576        | 0.564        | 0.306               |
|                                                    | M2    | 4   | 29/10                              | 5           | 0.674        | 0.553       | 0.255                | 0.306       | 0.557        | 0.544        | 0.302               |
|                                                    | M3    | 4   | 29/10                              | 5           | 0.712        | 0.568       | 0.263                | 0.327       | 0.544        | 0.531        | 0.342               |
|                                                    | M4    | 4   | 29/10                              | 5           | 0.674        | 0.544       | 0.255                | 0.314       | 0.611        | 0.599        | 0.288               |
|                                                    | M5    | 4   | 29/10                              | 5           | 0.676        | 0.546       | 0.261                | 0.318       | 0.593        | 0.581        | 0.301               |
| Training: test=65:35<br>(approx.)                  | M1    | 4   | 31/8                               | 5           | 0.696        | 0.523       | 0.279                | 0.347       | 0.531        | 0.505        | 0.215               |
|                                                    | M2    | 4   | 31/8                               | 5           | 0.677        | -           | 0.278                | -           | 0.432        | 0.420        | 0.222               |
|                                                    | M3    | 4   | 31/8                               | 5           | 0.689        | 0.527       | 0.301                | 0.373       | 0.463        | 0.432        | 0.300               |
|                                                    | M4    | 4   | 31/8                               | 5           | 0.711        | -           | 0.268                | -           | -2.19        | -3.13        | 0.538               |
|                                                    | M5    | 4   | 31/8                               | 5           | 0.700        | 0.562       | 0.280                | 0.346       | 0.501        | 0.261        | 0.285               |
| Training: test=80:20<br>(approx.)                  | M1    | 4   | 25/14                              | 5           | 0.542        | 0.303       | 0.262                | 0.337       | 0.684        | 0.461        | 0.370               |
|                                                    | M2    | 4   | 25/14                              | 5           | -            | -           | -                    | -           | -            | -            | -                   |
|                                                    | M3    | 4   | 25/14                              | 5           | 0.736        | 0.530       | 0.306                | 0.403       | -0.06        | -0.367       | 0.344               |
|                                                    | M4    | 4   | 25/14                              | 5           | 0.771        | -           | 0.259                | -           | -2.97        | -4.49        | 0.513               |
|                                                    | M5    | 4   | 25/14                              | 5           | 0.546        | 0.105       | 0.260                | 0.371       | 0.632        | 0.373        | 0.419               |