## CDM reading list

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This is an extended reading list originally developed for the Cognitive Diagnosis Modeling class offered by Wenchao Ma at the University of Alabama. This list is by no means complete, but attempts to provide students with some general guidance so that they could better swim in the pool. If you'd like to add any references to the list, pull a request at https://github.com/Wenchao-Ma/CDMreadinglist.

#### **Books, Reviews and General Introduction to CDMs**

- Bolt, D. (2007). The present and future of irt-based cognitive diagnostic models (icdms) and related methods. *Journal of Educational Measurement*, 44(4), 377–383. doi: 10.1111/j.1745-3984.2007.00045.x
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- de la Torre, J., & Minchen, N. (2014). Cognitively diagnostic assessments and the cognitive diagnosis model framework. *Psicología Educativa*, 20(2), 89–97. doi: 10.1016/j.pse.2014.11.001
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- Ma, W., & de la Torre, J. (2019b). Digital module 05: Diagnostic measurement—the g-dina framework https://ncme.elevate.commpartners.com. *Educational Measurement: Issues and Practice*, 38(2), 114–115. doi: 10.1111/emip.12262
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- Stout, W. (2007). Skills diagnosis using irt-based continuous latent trait models. *Journal of Educational Measurement*, 44(4), 313–324. doi: 10.1111/j.1745-3984.2007.00041.x
- Tatsuoka, K. K. (2009). Cognitive assessment: An introduction to the rule space method. London: Routledge Academic.
- von Davier, M., & Lee, Y.-S. (Eds.). (2019). *Hand-book of diagnostic classification models*. Cham: Springer International Publishing. doi: 10.1007/978-3-030-05584-4

# Psychometric Models and Approaches for Cognitive Diagnosis

#### CDMs for dichotomous data

- Bradshaw, L., & Templin, J. (2014). Combining item response theory and diagnostic classification models: a psychometric model for scaling ability and diagnosing misconceptions. *Psychometrika*, 79(3), 403–425. doi: 10.1007/s11336-013-9350-4
- Chen, Y., Li, X., Liu, J., & Ying, Z. (2016). Regularized latent class analysis with application in cognitive diagnosis. *Psychometrika*. doi: 10.1007/s11336-016-9545-6
- de la Torre, J. (2011). The generalized dina model framework. *Psychometrika*, 76(2), 179–199. doi: 10.1007/s11336-011-9207-7
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- Stout, W., Henson, R., DiBello, L., & Shear, B. (2019).
   The reparameterized unified model system: A diagnostic assessment modeling approach. In M. von Davier & Y.-S. Lee (Eds.), *Handbook of diagnostic classification models* (pp. 47–79). Cham: Springer International Publishing. doi: 10.1007/978-3-030-05584-4\_3
- Templin, J. L., & Henson, R. A. (2006). Measurement of psychological disorders using cognitive diagnosis models. *Psychological methods*, 11(3), 287–305. doi: 10.1037/1082-989X.11.3.287
- Templin, J., & Bradshaw, L. (2014). Hierarchical diagnostic classification models: a family of models for estimating and testing attribute hierarchies. *Psychometrika*, 79(2), 317–339. doi: 10.1007/s11336-013-9362-0
- von Davier, M. (2008). A general diagnostic model applied to language testing data. *The British journal of mathematical and statistical psychology*, 61(Pt 2), 287–307. doi: 10.1348/000711007X193957
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## Other approaches for cognitive diagnosis

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- Leighton, J. P., Gierl, M. J., & Hunka, S. M. (2004). The attribute hierarchy method for cognitive assessment: A variation on tatsuoka's rule-space approach. *Journal of Educational Measurement*, *41*(3), 205–237. doi: 10.1111/j.1745-3984.2004.tb01163.x
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## CDMs for polytomous data

- Chen, J., & de la Torre, J. (2018). Introducing the general polytomous diagnosis modeling framework. Frontiers in psychology, 9, 1474. doi: 10.3389/fpsyg.2018.01474
- Chen, J., & Zhou, H. (2017). Test designs and modeling under the general nominal diagnosis model framework. *PloS one*, 12(6), e0180016. doi: 10.1371/journal.pone.0180016
- Culpepper, S. A. (2019). An exploratory diagnostic model for ordinal responses with binary attributes: Identifiability and estimation. *Psychometrika*, 84(4), 921–940. doi: 10.1007/s11336-019-09683-4
- Ma, W. (2019a). A diagnostic tree model for polytomous responses with multiple strategies. The British journal of mathematical and statistical psychology, 72(1), 61–82. doi: 10.1111/bmsp.12137
- Ma, W., & de la Torre, J. (2016). A sequential cognitive diagnosis model for polytomous responses. The British journal of mathematical and statistical psychology, 69(3), 253–275. doi: 10.1111/bmsp.12070
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#### CDMs for polytomous attributes

- Chen, J., & de la Torre, J. (2013). A general cognitive diagnosis model for expert-defined polytomous attributes. *Applied Psychological Measurement*, *37*(6), 419–437. doi: 10.1177/0146621613479818
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- de la Torre, J., & Douglas, J. A. (2008). Model evaluation and multiple strategies in cognitive diagnosis: An analysis of fraction subtraction data. *Psychometrika*, 73(4), 595–624. doi: 10.1007/s11336-008-9063-2
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## **CDMs for options**

- de la Torre, J. (2009a). A cognitive diagnosis model for cognitively based multiple-choice options. *Applied Psychological Measurement*, 33(3), 163–183. doi: 10.1177/0146621608320523
- DiBello, L. V., Henson, R. A., & Stout, W. F. (2015).
   A family of generalized diagnostic classification models for multiple choice option-based scoring. *Applied Psychological Measurement*, 39(1), 62–79. doi: 10.1177/0146621614561315

#### CDMs for longitudinal data

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- Madison, M. J., & Bradshaw, L. P. (2018). Assessing growth in a diagnostic classification model framework.
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   Journal of Educational and Behavioral Statistics,
   44(3), 251–281. doi: 10.3102/1076998619827593

#### Model estimation and identifiability

- Chen, Y., Culpepper, S., & Liang, F. (2020). A sparse latent class model for cognitive diagnosis. *Psychometrika*. doi: 10.1007/s11336-019-09693-2
- da Silva, M. A., de Oliveira, E. S. B., von Davier, A. A., & Bazán, J. L. (2018). Estimating the dina model parameters using the no-u-turn sampler. *Biometrical journal. Biometrische Zeitschrift*, 60(2), 352–368. doi: 10.1002/bimj.201600225
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## Reliability

- Chen, Y., Liu, Y., & Xu, S. (2018). Mutual information reliability for latent class analysis. *Applied Psychological Measurement*, 42(6), 460–477. doi: 10.1177/0146621617748324
- Johnson, M. S., & Sinharay, S. (2018). Measures of agreement to assess attribute-level classification accuracy and consistency for cognitive diagnostic assessments. *Journal of Educational Measurement*, *55*(4), 635–664. doi: 10.1111/jedm.12196
- Wang, W., Song, L., Chen, P., Meng, Y., & DING, S. (2015). Attribute–level and pattern–level classification consistency and accuracy indices for cognitive diagnostic assessment. *Journal of Educational Measurement*, 52(4), 457–476. doi: 10.1111/jedm.12096
- Templin, J., & Bradshaw, L. (2013). Measuring the reliability of diagnostic classification model examinee estimates. *Journal of Classification*, *30*(2), 251–275. doi: 10.1007/s00357-013-9129-4

## Model fit and person fit evaluation

Chen, F., Liu, Y., Xin, T., & Cui, Y. (2018). Applying the m2 statistic to evaluate the fit of diagnostic classification models in the presence of attribute hierarchies. *Frontiers in psychology*, 9, 1875. doi: 10.3389/fpsyg.2018.01875

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- Sen, S., & Bradshaw, L. (2017). Comparison of relative fit indices for diagnostic model selection. *Applied Psychological Measurement*, 41(6), 422–438. doi: 10.1177/0146621617695521
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## Inferential model comparisons

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### **Methods for Q-matrix**

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- Chiu, C.-Y. (2013). Statistical refinement of the q-matrix in cognitive diagnosis. Applied Psychological Measurement, 37(8), 598–618. doi: 10.1177/0146621613488436
- Culpepper, S. A., & Chen, Y. (2019). Development and application of an exploratory reduced reparameterized unified model. *Journal of Educational and Behavioral Statistics*, 44(1), 3–24. doi: 10.3102/1076998618791306
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- Lim, Y. S., & Drasgow, F. (2017). Nonparametric calibration of item-by-attribute matrix in cognitive diagnosis. *Multivariate behavioral research*, *52*(5), 562–575. doi: 10.1080/00273171.2017.1341829
- Ma, W., & de La Torre, J. (2020). An empirical q-matrix validation method for the sequential generalized dina model. *The British journal of mathematical and statistical psychology*, 73(1), 142–163. doi: 10.1111/bmsp.12156
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#### **CD-CAT**

- Cheng, Y. (2009). When cognitive diagnosis meets computerized adaptive testing: Cd-cat. *Psychometrika*, 74(4), 619–632. doi: 10.1007/s11336-009-9123-2
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- Kaplan, M., de La Torre, J., & Barrada, J. R. (2015). New item selection methods for cognitive diagnosis computerized adaptive testing. *Applied Psychological Measurement*, 39(3), 167–188. doi: 10.1177/0146621614554650
- Wang, C., Chang, H.-H., & Douglas, J. (2012). Combining cat with cognitive diagnosis: a weighted item selection approach. *Behavior research methods*, 44(1), 95–109. doi: 10.3758/s13428-011-0143-3
- Wang, C., Zheng, C., & Chang, H.-H. (2014). An enhanced approach to combine item response theory with cognitive diagnosis in adaptive testing. *Journal of Educational Measurement*, *51*(4), 358–380. doi: 10.1111/jedm.12057

- Xu, G., Wang, C., & Shang, Z. (2016). On initial item selection in cognitive diagnostic computerized adaptive testing. *The British journal of mathematical and statistical psychology*, 69(3), 291–315. doi: 10.1111/bmsp.12072
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## **Applications**

- Aryadoust, V. (2018). A cognitive diagnostic assessment study of the listening test of the singapore–cambridge general certificate of education o-level: Application of dina, dino, g-dina, ho-dina, and rrum. *International Journal of Listening*, 63(2), 1–24. doi: 10.1080/10904018.2018.1500915
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