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Mixed models for correlated compositional data: applied to microbiome studies in Indonesia

Martin, I.

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Ivonne Martin

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Leden promotiecommissie:	Prof. Dr. E. J. Kuijper
	Prof. Dr. M. Luz Calle
	· *University of Vic, Spain*
	Prof. Dr. M. J. C. Eijkemans
	· *University Medical Centre Utrecht, Utrecht*

We may encounter many defeats but we must not be defeated.

—Maya Angelou, *The Art of Fiction no 119, The Paris Review*, 1990

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