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## Pharmacokinetic and pharmacodynamic analysis in anesthesia : a modeling odyssey

Olofsen, E.

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*A Modeling Odyssey*

Erik Olofson

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Erik Olofsen  
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Promotor: prof. dr. A. Dahan

Copromotor: dr. M. Niesters

Promotiecommissie: prof. dr. L.P.H.J. Aarts  
prof. dr. ing. P.H.C. Eilers (Erasmus MC, Rotterdam)  
prof. dr. J.M.A. van Gerven  
prof. dr. H.-J. Guchelaar  
prof. dr. C.A.J. Knibbe (St. Antonius Hospital, Nieuwegein)  
prof. dr. T.W. Schnider (Kantonsspital St. Gallen, Switzerland)  
dr. E.Y. Sarton  
dr. M. van Velzen

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<sup>†</sup> E Olofsen, A Dahan, *F1000Research* 2015; 2:71

<sup>‡</sup> A E Olesen, E Olofsen, T Andresen, C Graversen, A M Drewes, A Dahan, *Anesth Analg* 2015; 121:1165-1175

<sup>§</sup> Parts have been published in E Olofsen, J W Sleight, A Dahan, *Br J Anaesth* 2008; 101:810-821, 2008, and E Olofsen, *PAGE* 2011: Abstract #2202



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<sup>¶</sup> E Olofsen, R Mooren, E van Dorp, L Aarts, T Smith, J den Hartigh, A Dahan, *Anesth Analg* 2010; 111:626-632

<sup>||</sup> Adapted quote of HAL (<http://www.imdb.com/title/tt0062622/quotes>)

