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On the emergence of the energy transition

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Citation

Kraan, O. D. E. (2019, April 25). *On the emergence of the energy transition*. Retrieved from <https://hdl.handle.net/1887/71807>

Version: Not Applicable (or Unknown)

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<http://hdl.handle.net/1887/71807>

Author: Kraan, O.D.E.

Title: On the emergence of the energy transition

Issue Date: 2019-04-25

Acknowledgements

This dissertation is the result of four years of inspiring discussions and dedicated research at several institutes in The Netherlands. I would like to thank Royal Dutch Shell for the financial support of this PhD.

Gert Jan Kramer It has been a great pleasure to work with you, Gert Jan. You were an excellent supervisor, generous with your time and always giving me the freedom to follow my own ideas. From the first discussions we had during my bachelor thesis project to one of our last in Wageningen I always felt privileged to be able to work you.

Igor Nikolic It was a pleasant surprise that from the second year of my PhD onward I was able to start working with you, Igor. Coming from a different perspective to modelling, we had very interesting discussions around agent-based modelling and the value of modelling in general. Thanks for all your time and effort.

Vinzenz Koning Vinzenz, your constructive feedback and advice in the last phases of my PhD were greatly appreciated. I am more than happy you will take the subject under your responsibility and wish you all the best to advance it.

Shell colleagues Within Shell I had the pleasure to work together with a wide variety of people and the many discussions we have will stay close to me. Martin, your precision, dedication and of course, your British sense of humour I truly valued and I was happy with the chance to work together. Chris, thanks you very much for all your support. I would also like to thank the energy futures team for the warm welcome: Burkard, Shoba, Angelika, Alexander and Maaike; the scenarios team, especially Jeremy and Wim for their guidance and the trust they had in me and the colleagues from Project & Technology and New Energies especially Anne-Sjoerd, Lisette, Arian, Quirine, Jeff, Arnoud, Ingmar, Joep, Mark, Tatiana, Jeff, Andreas, Katharina, Jonathan, Erik, and Edwin: Thank you!

Utrecht Halfway my PhD I joined Utrecht University and I am happy to have gotten this opportunity. I would like to thank the various (PhD)-colleagues who handed out ice creams when our brains overheat, with whom I shared a nice drink after a colloquium and the various colleagues I shared offices with.

Delft I am happy to have shared memorable moments with various colleagues at Delft University of Technology. Emile, our conversations about our modelling work, the energy transition or about life outside of academia, will always stay close to me. Telli, I was happy to share an eye-opening trip to Saudi Arabia with you, the dinner (with accompanying dress code) we had with our Saudi colleagues was very special. Gerben, your expertise in the use of various software tools was indispensable and I am very grateful for all your patience and help.

Leiden In the first years of my PhD I was lucky to share a room with three great personalities, Benjamin, Coen and Laura, thank you for a great time in the office. Gjalt, thanks for the inspiring conversations we had. A special thanks to Susanna with whom I shared various Kafkaesque situations battling bureaucracy. Arnold thanks for your guidance throughout my PhD and your time and effort to help me comply to all set rules and regulations.

Friends During my PhD I enjoyed the support of some great friends. With Edwin I could have long evening discussions about life or squash out any frustration. Jelle always has been a great friend, I am sure he will inspire many young scientists. Although far away Stephanie is always close to my heart, fantastic we still see each other regularly. In Li Lan I recognise the drive to make the world a better place. Let's keep on pushing Li Lan! With Florentien I share the passion for swing music & dance, she is simply the sweetest friend I have. Pieter, Renske, Jelle; I hope we will keep on eating pancakes once in a while. Dennis, Samantha, Paul, Cynthia, Étienne, Anneke, Pauline, Patricia and Aleksandra, thanks for great moments we have shared on the dance floor.

Family Of course I could not have finished this PhD without the support of my family. My dear mother gave me the feeling any decision I would make she would support, thank you for love and care. My father stimulated me with the thousands of books that surrounded me since I was young and from whom I inherited that same love for books and the interest in a wide variety of topics.

Leanne Of all people, I most grateful for the support Leanne has given me throughout my PhD. Thank you, my lovely Leanne, for all your encouragement, patience, for sharing the passion for dancing, but most of all for your love.

Oscar Kraan – October 2018

About the author

Oscar Kraan was born on the 9th of December 1985 in The Hague, The Netherlands. After graduating in 2004 from the Gymnasium Haganum in The Hague, he went to Leiden to study physics. During his studies in physics Oscar got interested in the energy transition and was invited for two honours programs related to the energy transition. In this period, he also served in various committees of his study, student and sport association. He finished his Bachelor's studies in 2012 with a bachelor thesis



in which he compared the potential of wind and wave energy. He then continued his studies with an M.Sc. in Energy Science at Utrecht University which he obtained in 2013. He graduated with a combined internship and master thesis on agent-based modelling of space heating in the built environment, conducted at and in collaboration with Shell.

After graduating Oscar continued to work on the energy transition and started his PhD which was Shell sponsored and conducted in collaboration with Leiden University, Utrecht University and Delft University of Technology. In the last five years he conducted research on energy scenarios and the simulation of the evolution of energy system focusing on the dynamics between individual incentives and collective behaviour. This work has resulted in five scientific articles, several opinion articles in Dutch media and strategic insights for various stakeholders. In addition, Oscar supervised Master student thesis projects at various Universities in The Netherlands. Next to his scientific work Oscar collaborated with Shell's scenario team on the *Net Zero Emission outlook* as well as Shell latest scenario *Sky*. From November first 2018 Oscar will be working at Deloitte as Senior Strategy Consultant for energy related industries.

Publications

Scientific publications

Kraan, O., Kramer, G.J., Haigh, M, Laurens, C.. *The Energy Transition: A reliance on technology alone ultimately leads to a bet on Solar Fuels*, to be submitted.

Kraan, O., Chappin, E., Kramer, G.J., Nikolic, I.. *The influence of the energy transition on the significance of key energy metrics*, under review at Renewable and Sustainable Energy Reviews.

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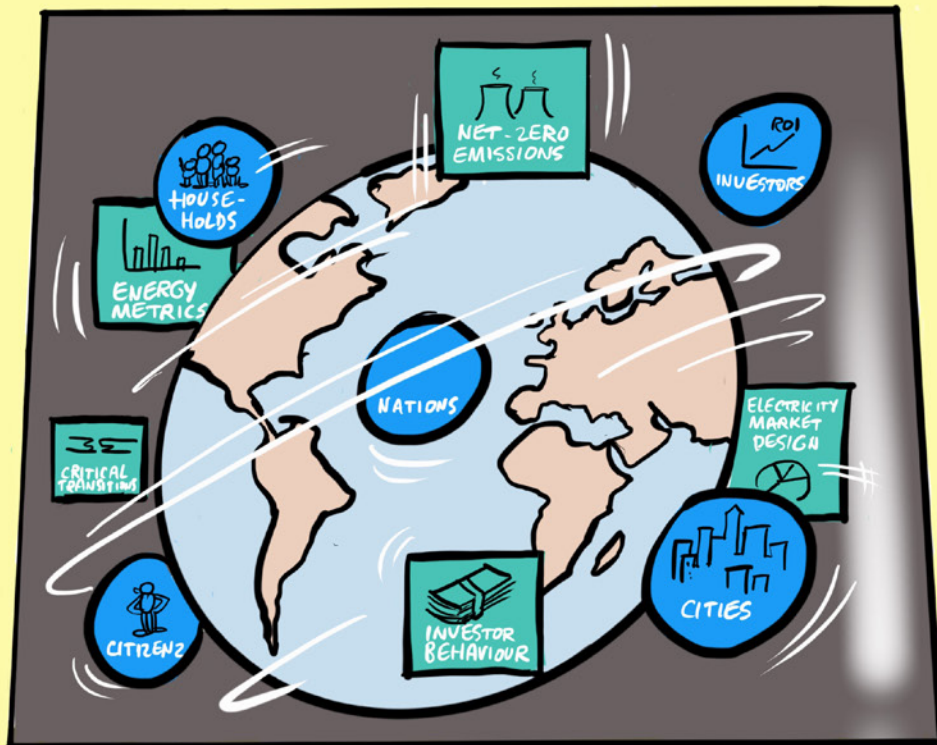
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ON THE
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SO... WHAT
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OF THE
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WELL...
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