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How Humans Judge Machines

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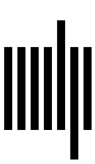

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César A. Hidalgo
Data Analysis and Visualization by
César A. Hidalgo
Experimental Design by
Diana Orghian, Filipa de Almeida, Natalia Martin, Jordi Albo-Canals, and César A. Hidalgo
Data Collection by
Diana Orghian and Filipa de Almeida
Illustrations by
Maria Venegas and Mauricio Salfate
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