

# The Economics of Citation

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# The Questions

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- ▶ Become more convincing by citing respected authors
- ▶ Cater to editors and potential referees
- ▶ Look more competent than cited authors

# The Effects

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Correlation effect

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Reputation effect



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Cite authors ranked higher

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# Data used

- ▶ Authors with references

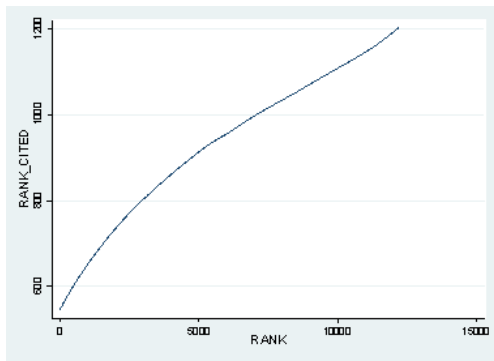
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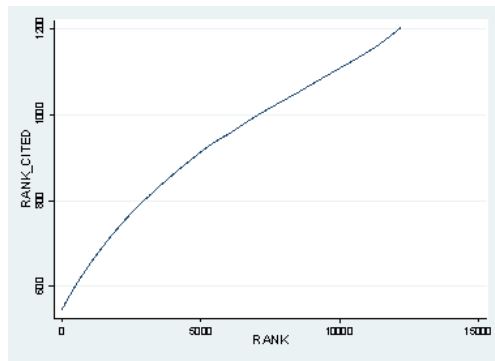
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# Correlation effect

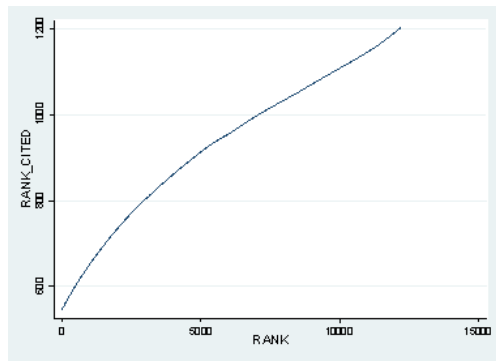


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$$RANK\_CITED = \beta_0 + 0.05 RANK + e$$

(0.002)

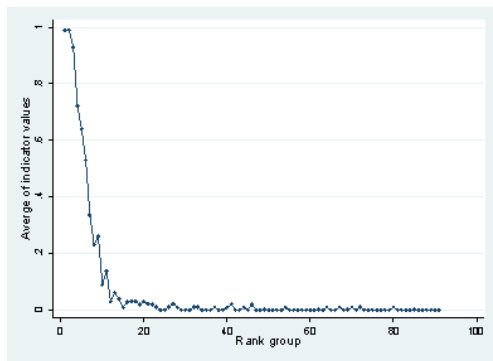
# Reputation effect I

$$P(RANK\_CITED > RANK)$$



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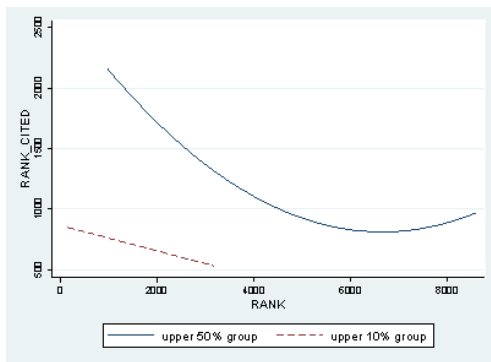
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Var.	Coeff	St. Err.	T
RANK_NW	-0.00066	0.00001	-60.76
EUROPE	-0.438	0.0648	-6.76
OTHERS	-0.452	0.105	-4.29



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3. North-American bias