

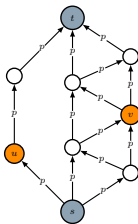
applications **science**

introduction to **network analysis in Python** (**NetPy**)

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# science historiography

- **algorithmic historiography** tracks evolution of field
- relying on **citations** between scientific **publications**



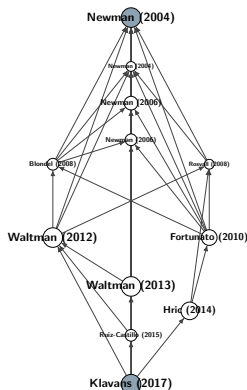
(**input**) selected **source** & **target** publications **s** & **t**

(**method**) each citation is relevant/active with **probability p**

(**output**) **importance** is **probability of path from s to t through u**

(**target**) Newman & Girvan (2004), **Finding and evaluating community...**, *Phys. Rev. E* **69**(2), 026113.

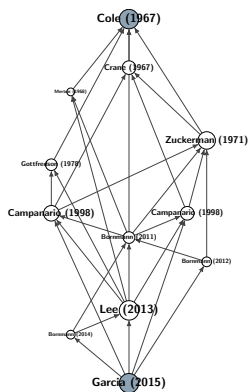
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Lovro Šubelj, Ludo Waltman, Vincent Traag, and Nees Jan van Eck.  
Intermediacy of publications.  
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