The Paper Mill challenge

Dr Lisa Parker

Faculty of Medicine & Health, Charles Perkins Centre,

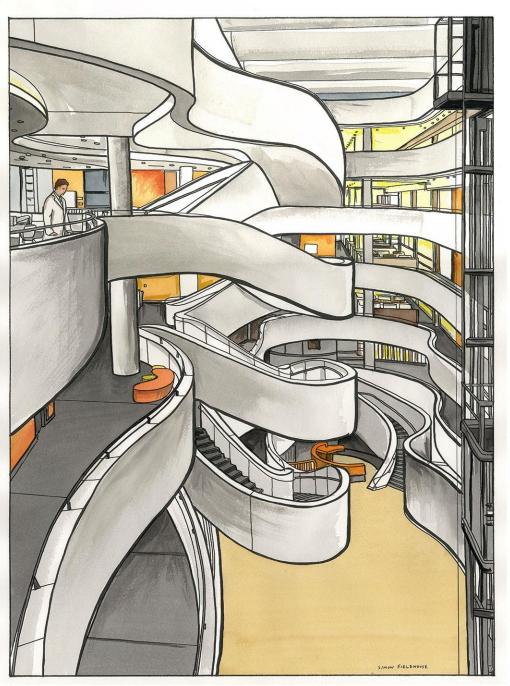
University of Sydney, Australia



Charles Perkins Centre







Charles Perkins Centre - University of Sydney

- This talk is informed by a study funded by the National Health and Medical Research Council (NHMRC) of Australia, APP1139997.
- Thanks to my colleagues
 Stephanie Boughton
 Rosa Lawrence
 Lisa Bero
- Lisa Bero is Senior Research Integrity Editor, Cochrane, for which the University of Colorado receives remuneration.
- Stephanie Boughton is employed by Cochrane as Research Integrity Editor.



A short history of (what we know about) paper mills

Early 2010s

- Recognition of large-scale manipulation of the peer review process:
 - The submitting author suggested peer reviewers who were made-up people or real people with false emails
 - "Peer Review mills"
- Solutions:
 - Some journals removed the 'suggest peer reviewer' function
 - Other journals added vetting policies to confirm peer reviewer identity and email addresses



A short history of (what we know about) paper mills

Mid - late 2010s

- Recognition of groups of fake papers submitted for publication, each group seemingly from a single origin
 - Similar topics eg an obscure cancer gene [Byrne, 2019, Biomarker Insights]
 - Similar manipulated images eg same Western Blot images flipped, cropped, repeated [Bik, 2020, blog]
 - "Paper mills"
- Solutions:
 - Publishers started requesting raw data
 - Publishers developed Research Integrity support teams
 - Publishers using AI tools aimed at detecting paper mill activity



A short history of (what we know about) paper mills

2024

- Editor bribery activity uncovered
 - Journal editors being offered cash to publish paper mill papers, to increase likelihood of paper being published



Joelving & Retraction Watch, 2024

Who are the main players?

Consumers

- Worried medical professional
- Overburdened academic

Organised Crime Syndicates

- Peer review mill
- Paper mill

Detectives

• Editor

- Data Sleuths
- Editor in Chief
- Publisher 'integrity squad'



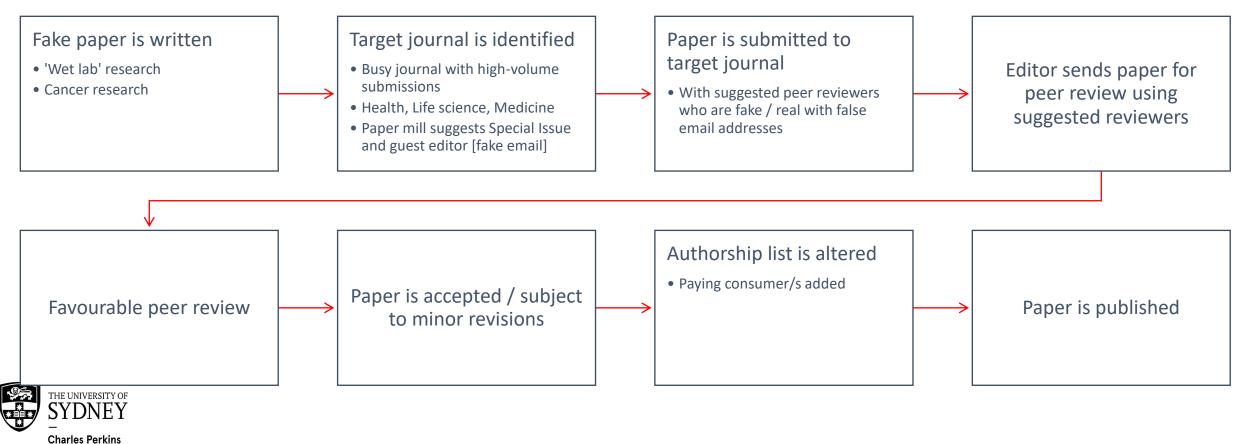
Consumers

- Hospital doctor in China
 - Needs an international publication in order to progress
 - Doesn't speak English
 - Doesn't have access to research lab
 - Doesn't have time
- Other local hotspots: Russian, Iranian researchers
- Sees a Facebook or WhatsApp advertisement to purchase a scientific paper (accepted for publication)



| 0 | |
|---|--|

Organised crime syndicate



Centre

Detectives

- Journal Editor recognises that something looks 'off' in a pattern of submissions
 - Spike in similar submissions (similar topic / similar country)
 - Repeated paper/different title

OR

 A Data Sleuth recognises image manipulation in published paper & contacts editor or authors' research institution





Detectives

- Journal Editor recognises that something looks 'off' in a pattern of submissions
 - Spike in similar submissions (similar topic / similar country)
 - Repeated paper/different title

OR

- A Data Sleuth recognises image manipulation in published paper & contacts editor or authors' research institution
- The Editor in Chief is alerted
- (If available) Publisher's in-house 'integrity squad' is informed





Integrity squad investigation of a possible paper mill

- Examine target paper
 - \circ The suspicious manuscript is given a tracking number
 - $\,\circ\,$ Integrity squad supports and guides Editor/EIC investigation
 - Tasks: ask authors for raw data, check peer review process, scrutinise manuscript

Identify linked papers

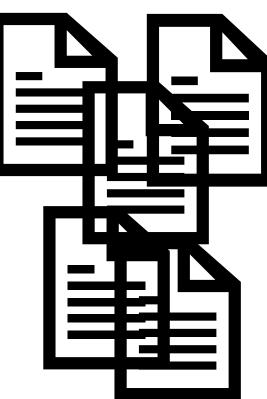
- Check authors' other submissions, publications
- Check other papers reviewed by same peer reviewers
- Check for similar manuscripts in the same journal
 - similar topic
 - similar format
 - repeated keywords
- Screen all those papers for signs of paper mill origin



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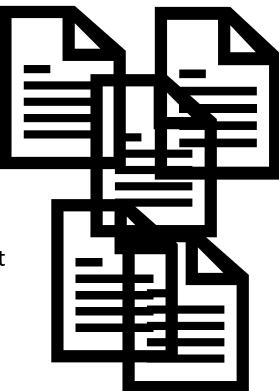


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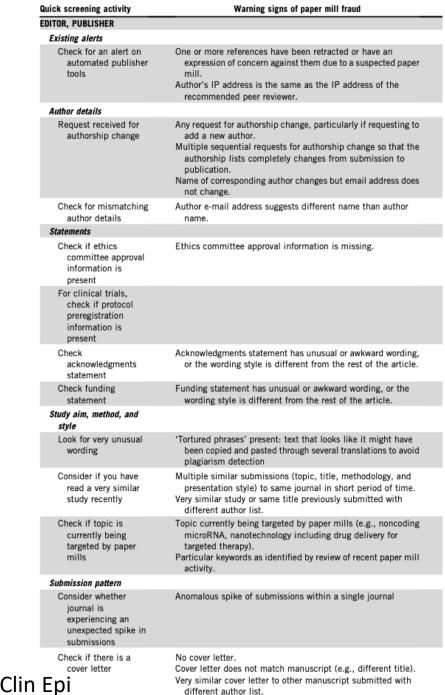
- Check authors' other submissions, publications
- Check other papers reviewed by same peer reviewers
- Check for similar manuscripts in the same journal
 - similar topic
 - similar format
 - repeated keywords





Back end / publisher-only information

 \circ No cover letter





Parker et al, 2022, J Clin Epi

Back end / publisher-only information

- \circ No cover letter
- \circ Suspicious author matters
 - Request to add new authors after acceptance
 - Submitting author has multiple user accounts in the same journal
 - Multiple submissions from author at same time
 - Response to requests for raw data are absent OR similar in tone or content to responses from other suspected / known paper mill papers eg supplies lots of poorly labelled files

| | Quick screening activity | Warning signs of paper mill fraud |
|--------------------------------|---|---|
| | EDITOR, PUBLISHER | |
| | Existing alerts | |
| paper | Check for an alert on automated publisher tools | One or more references have been retracted or have an expression of concern against them due to a suspected paper mill. Author's IP address is the same as the IP address of the recommended peer reviewer. |
| | Author details | |
| | Request received for authorship change | Any request for authorship change, particularly if requesting to add a new author. Multiple sequential requests for authorship change so that the authorship lists completely changes from submission to publication. Name of corresponding author changes but email address does not change. |
| | Check for mismatching author details | Author e-mail address suggests different name than author name. |
| | Statements | |
| | Check if ethics committee approval information is present | Ethics committee approval information is missing. |
| in the same | For clinical trials, check if protocol preregistration information is present | |
| e | Check acknowledgments statement | Acknowledgments statement has unusual or awkward wording, or the wording style is different from the rest of the article. |
| OR similar in tone | Check funding statement | Funding statement has unusual or awkward wording, or the wording style is different from the rest of the article. |
| / known paper iles | Study aim, method, and style | |
| | Look for very unusual wording | 'Tortured phrases' present: text that looks like it might have been copied and pasted through several translations to avoid plagiarism detection |
| | Consider if you have read a very similar study recently | Multiple similar submissions (topic, title, methodology, and presentation style) to same journal in short period of time. Very similar study or same title previously submitted with different author list. |
| | Check if topic is currently being targeted by paper mills | Topic currently being targeted by paper mills (e.g., noncoding microRNA, nanotechnology including drug delivery for targeted therapy). Particular keywords as identified by review of recent paper mill activity. |
| | Submission pattern | |
| | Consider whether journal is experiencing an unexpected spike in submissions | Anomalous spike of submissions within a single journal |
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- Suspicious peer reviewer matters
 - Peer review very rapid, superficial
 - Peer reviewer email addresses do not conform to institutional format
 - IP address of submitting author is the same as peer reviewer

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| Author details | |
| Request received for authorship change | Any request for authorship change, particularly if requesting to add a new author. Multiple sequential requests for authorship change so that the authorship lists completely changes from submission to publication. Name of corresponding author changes but email address does not change. |
| Check for mismatching author details | Author e-mail address suggests different name than author name. |
| Statements | |
| Check if ethics committee approval information is present | Ethics committee approval information is missing. |
| For clinical trials, check if protocol preregistration information is present | |
| Check acknowledgments statement | Acknowledgments statement has unusual or awkward wording, or the wording style is different from the rest of the article. |
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Parker et al, 2022, J Clin Epi

Suspicious manuscript matters

Text anomalies

- Variable writing style / phrasing
- Tortured phrases

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| | Author details | |
| | Request received for authorship change | Any request for authorship change, particularly if requesting to add a new author. Multiple sequential requests for authorship change so that the authorship lists completely changes from submission to publication. Name of corresponding author changes but email address does not change. |
| | Check for mismatching author details | Author e-mail address suggests different name than author name. |
| | Statements | |
| | Check if ethics committee approval information is present | Ethics committee approval information is missing. |
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Tortured phrases

| Tortured phrase | Likely original |
|----------------------------------|------------------|
| Versatile organization | Mobile network |
| Huge information | Big data |
| Face acknowledgement | Face recognition |
| Arbitrary get rite of passage to | Random access |
| Subterranean insect | Ant colony |

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- ✤Image anomalies

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| | Author details | |
| | Request received for authorship change | Any request for authorship change, particularly if requesting to add a new author. Multiple sequential requests for authorship change so that the authorship lists completely changes from submission to publication. Name of corresponding author changes but email address does not change. |
| | Check for mismatching author details | Author e-mail address suggests different name than author name. |
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- ✤Image anomalies
 - Especially Western Blot, histopathology, flow cytometry
 - Manipulation/photo shopping: Image cropped, flipped, repeated
 - Stock images: clean background; unlabelled blot plots, scatter plots too perfect

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| | Check for mismatching author details | Author e-mail address suggests different name than author name. |
| | Statements | |
| | Check if ethics committee approval information is present | Ethics committee approval information is missing. |
| | For clinical trials, check if protocol preregistration information is present | |
| ytometry , flipped, repeated | Check acknowledgments statement | Acknowledgments statement has unusual or awkward wording, or the wording style is different from the rest of the article. |
| ot plots, scatter | Check funding statement | Funding statement has unusual or awkward wording, or the wording style is different from the rest of the article. |
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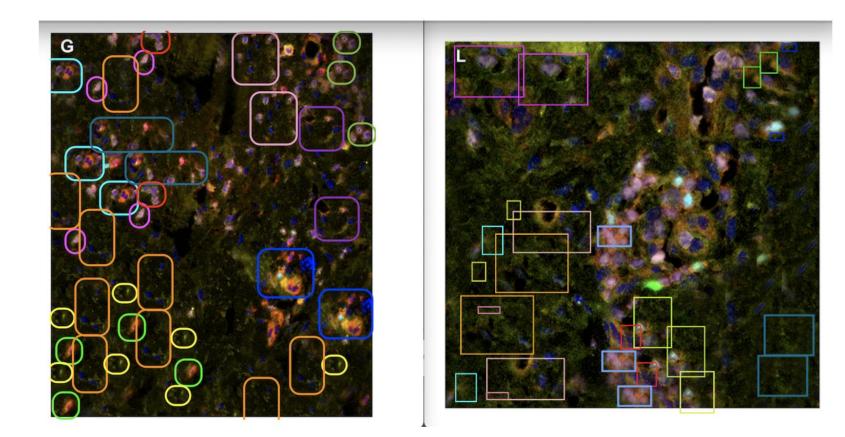




Image Concerns, Large

As I was doing a reverse-image search online on a set of papers, I saw an unrelated photo of a skin biopsy that appeared to contain repetitive areas. Even in the small Google Image Search thumbnail it was clear to me that something unexpected was going on in this image.

https://scienceintegritydigest.com/

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Parker et al, 2022, J

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- Associated data

| Quick screening activity EDITOR, PUBLISHER | Warning signs of paper mill fraud |
|---|---|
| | |
| Existing alerts Check for an alert on automated publisher tools | One or more references have been retracted or have an expression of concern against them due to a suspected paper mill. Author's IP address is the same as the IP address of the recommended peer reviewer. |
| Author details | recommended peer reviewer. |
| Request received for authorship change | Any request for authorship change, particularly if requesting to add a new author. Multiple sequential requests for authorship change so that the authorship lists completely changes from submission to publication. Name of corresponding author changes but email address does not change. |
| Check for mismatching | Author e-mail address suggests different name than author |
| author details Statements | name. |
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| Check for mismatching author details | Author e-mail address suggests different name than author |
| Statements | name. |
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Charles Perkins

Centre

- Email address of authors do not conform to institutional format
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"It can take years"

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| | | |

What happens next?



- During the process of investigation the journal might publish an Editor's note
 - Appears on journal website with the paper
 - Not permanent
 - No doi number, not linked by indexing agents so readers might not see unless they are on the journal website
- After paper mill acivity is confirmed, the journal may issue a **Retraction Notice**
 - Permanent
 - Has its own doi number, indexed and (hopefully) linked to the paper



Problems / barriers

- Some publishers are poorly resourced / editors are not trained
- Paper mills adapt in response to publisher attempts to identify them: "It's like an arms race"
- Al images may be harder to identify fraud
- Legal issues
 - Paper mills are litigious and may threaten legal action if their papers are pulled
 - Publishers may be worried about sharing lists of authors, peer reviewers identified as paper mill
- Publisher fear of reputational damage
- Competition amongst publishing houses proprietary tools might give them a market advantage

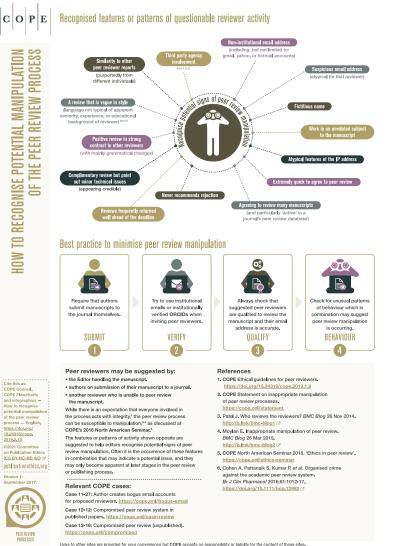




"How do we get the trust back?"

Publishers

- Education and support for editors how to identify paper mill activity at submission / prior to publication
- Automated tools identify submission anomalies / patterns (STM)
- Open peer review (pros and cons)
- Mandate raw data submission with all papers





"How do we get the trust back?"

Researchers and readers

- Increase awareness that paper mills exist
- Education on research misconduct
- Use and fund our watchdogs
 - Retraction Watch, PubPeer





"How do we get the trust back?"



Institutions

- Change the research environment – eg amongst hospital doctors in China
- Institutional review of papers before submission
- Preference reputable journals eg those in indexing houses (minimum journal standards)

Lisa.Parker@sydney.edu.au

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Acknowledgements

Adrian Barnett, Ana Marusic, Andrew Grey, Anna Gilmore, Ben Mol, Boris Barbour, "Cheshire", Elisabeth Bik, Ivan Oransky, Jack Wilkinson, Jennifer Byrne, Jigisha Patel, Jill Hayden, Kyle Sheldrick, Kylie Hunter, Lindsey Matthews, Lyn Horn, Meenu Singh, Michael Makanga, Neil O'Connell, Peter Adams, Sabina Alam, "Smut Clyde", Sowmya Swaminathan, Tamara Welschot and many others

