

Effects of Competition on Advertising Behavior and Content

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Motivation



Competitors advertise in-sync

- Ad pulsing (systematic on/off switching) is the dominant form of advertising incidence (theoretically Freimer & Horsky, 2012; Dubé et al. 2005; empirically Gijsenberg & Nijs, 2019)
- Concerning the timing of advertisements, in-sync is more common (Gijsenberg & Nijs, 2019) and profitable (Freimer & Horsky, 2012) than out-of-sync for competitors



- Generally, **competition only plays minor role** in marketing decisions compared to internal factors (Gijsenberg & Nijs, 2019)
 - Advertising schedules for different brands are largely uncorrelated (Dubé et al. 2005)



Motivation

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Competitors imitate their ad style and content







Research on ad imitation of competitors goes back to 1923



Research Questions



How does competition intensity affect the advertising behavior of firms?



2

Is the competition intensity reflected in industry ad design?

Data



Print ads

- -1950-2000
- Nearly 280.000 total ads of more than 20.000 different brands
- Airline industry: over 6000 ads of nearly 170 brands

Measuring Competition

Herfindahl-Hirschman index (HHI) for market concentration

$$HHI_t = \sum_{i=1}^{N_t} S_{it}^2$$

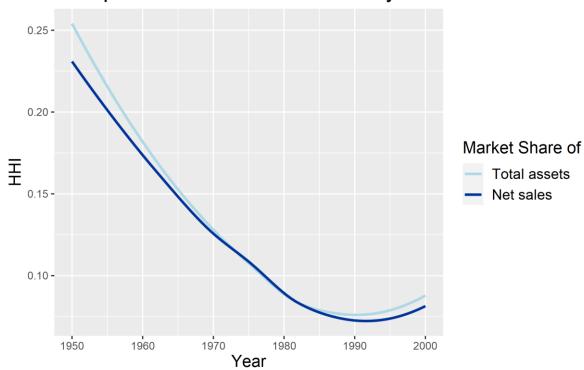
 Using firm sales from the Compustat database to compute market shares from 1950 – 2000 (following e.g., Giroud & Mueller, 2010)



Competition is generally decreasing over time



Competition in the Airline Industry



Data Preprocessing of the Original Data





- 1) Create a training dataset
 - 3) Parameter optimization & test
 - 5) Check results and handle exceptions
 - 2) Train a Faster R-CNN (ResNet-101)
 - 4) Process all pages



Data Preprocessing of Print Ads



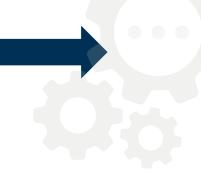


Natural Language Processing

- Brand detection
- Sentiment analysis
- Text categorization
- Text readability

Computer Vision

- OCR
- Face detection
- Color analysis
- Feature complexity
- Object detection
- Visual similarity of ads





Methods: Visual Similarity of Print Ads



Siamese Neural Network

ResNet50, Triplet Loss, fine tuned with 9000 manually labeled pages







Positive Anchor Negative





Methods: Ad campaign detection



Visual Similarity based

drop in similarity of neighboring ads on timeline



Campaign



Campaign



Not part of campaign



Campaign

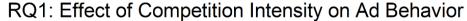


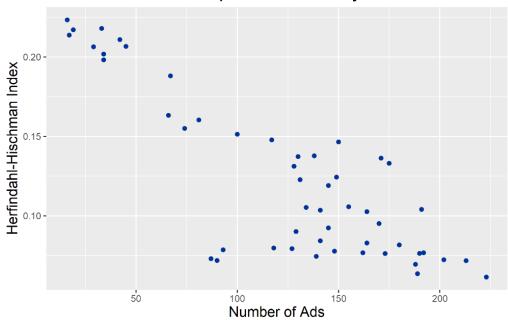


Preliminary Findings RQ 1

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Increasing competition is related to more airline ads





Is this fully accounted for by the increasing number of competing brands?

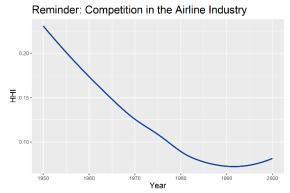


Preliminary Findings RQ 1

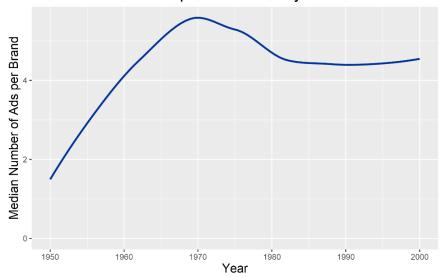
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More frequent pulsing and shorter campaigns drive this increase in airline ads

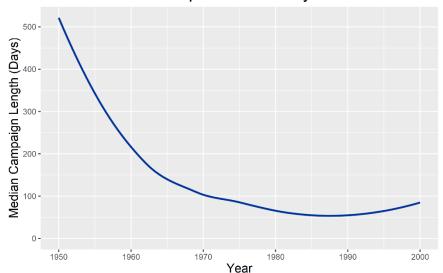
It seems that **firms increase** their **advertising intensity** with competition.



RQ1: Effect of Competition Intensity on Ad Behavior



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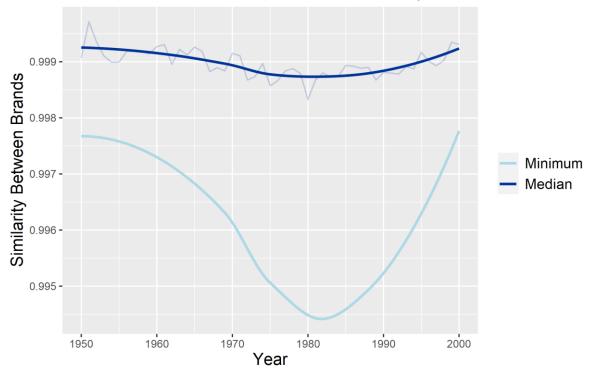


Preliminary Findings RQ 2

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Increasing competition is related to a lower similarity between airline ads

RQ2: Effect of Competition Intensity on Ad Content



Summary and Outlook



Competition intensity is reflected in more frequent pulsing, shorter campaign intervals and higher similarity to ads of other brands.

Watch out in the future for ...

- Robustness check with alternative competition metrics
- Include textual similarity
- More industries



The End



Thank you for your attention!

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