

# Search Costs vs. User Satisfaction on Mobile

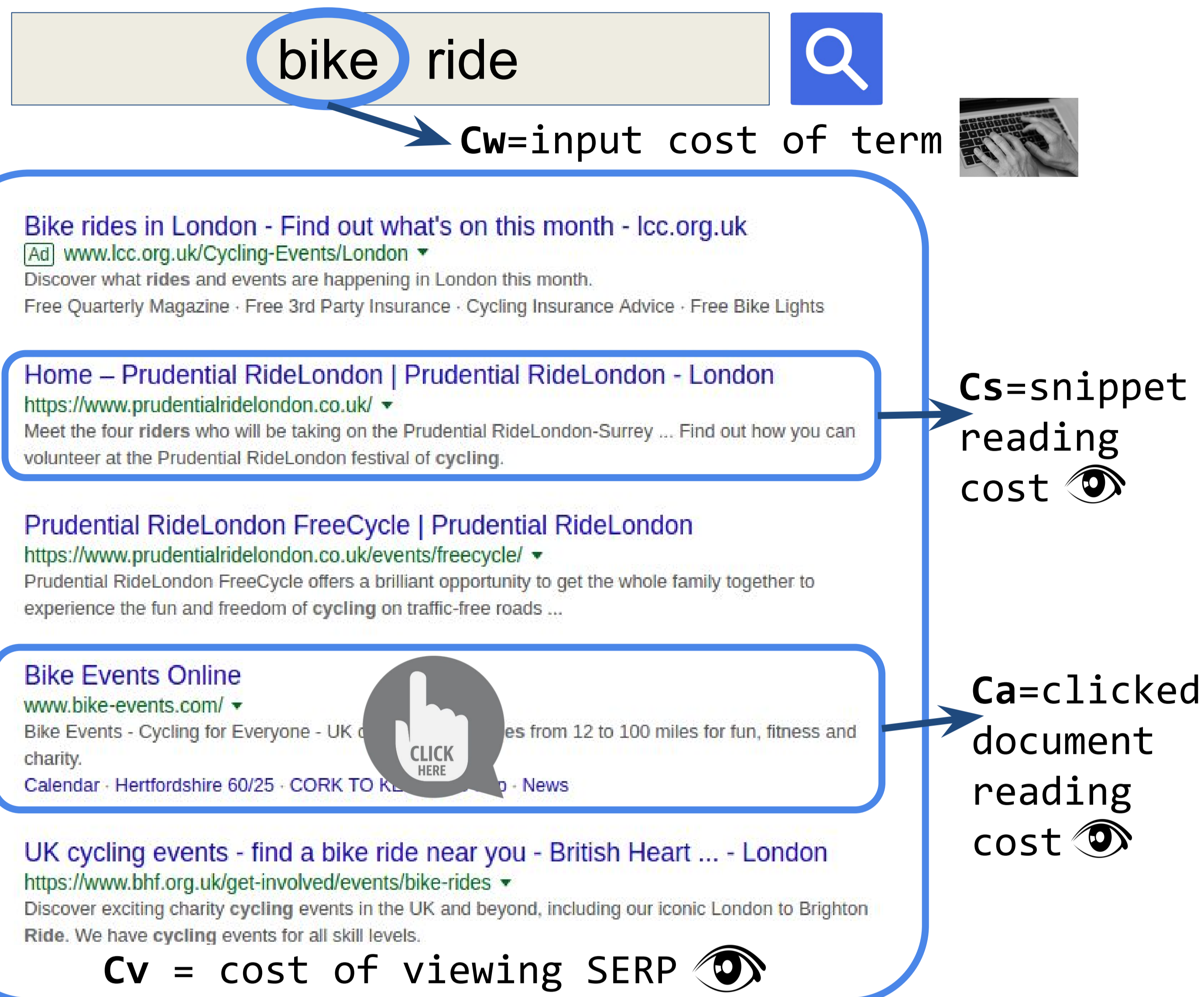
Manisha Verma, [m.verma@cs.ucl.ac.uk](mailto:m.verma@cs.ucl.ac.uk)

Emine Yilmaz, [e.yilmaz@cs.ucl.ac.uk](mailto:e.yilmaz@cs.ucl.ac.uk)

University College London



## COST BENEFIT MODELS 101 [1][2]



### Other Variables

- $W$  = Number of words in query
- $Q$  = Number of queries input by user
- $A$  = Number clicked documents
- $S$  = Number of viewed snippets
- $V$  = Number of SERPs viewed per query

## Query Cost-Benefit Model [1]

$$\begin{aligned} \text{Total Cost } C(W) &= W \cdot C_w \\ \text{Total Benefit } B(W) &= k \cdot \log_{\alpha}(W + 1) \\ \text{NET PROFIT } \pi(W) &= B(W) - C(W) \end{aligned}$$

Where  $k$  is a scaling factor and  $\alpha$  is diminishing returns of typing subsequent words

## Search Cost-Benefit Model [2]

$$\begin{aligned} \text{Total Cost } C(Q, V, S, A) &= (C_w + C_v \cdot V + C_s \cdot S + C_a \cdot A) \cdot Q \\ \text{Total Benefit } B(Q, A) &= k \cdot Q^{\alpha} \cdot A^{\beta} \\ \text{NET PROFIT } \pi(W) &= B(Q, A) - C(Q, V, S, A) \end{aligned}$$

Where  $k$  is a scaling factor,  $\alpha$  and  $\beta$  are user's frequency of issuing multiple queries and reading multiple documents respectively.

## RESEARCH QUESTIONS AND CONTRIBUTIONS

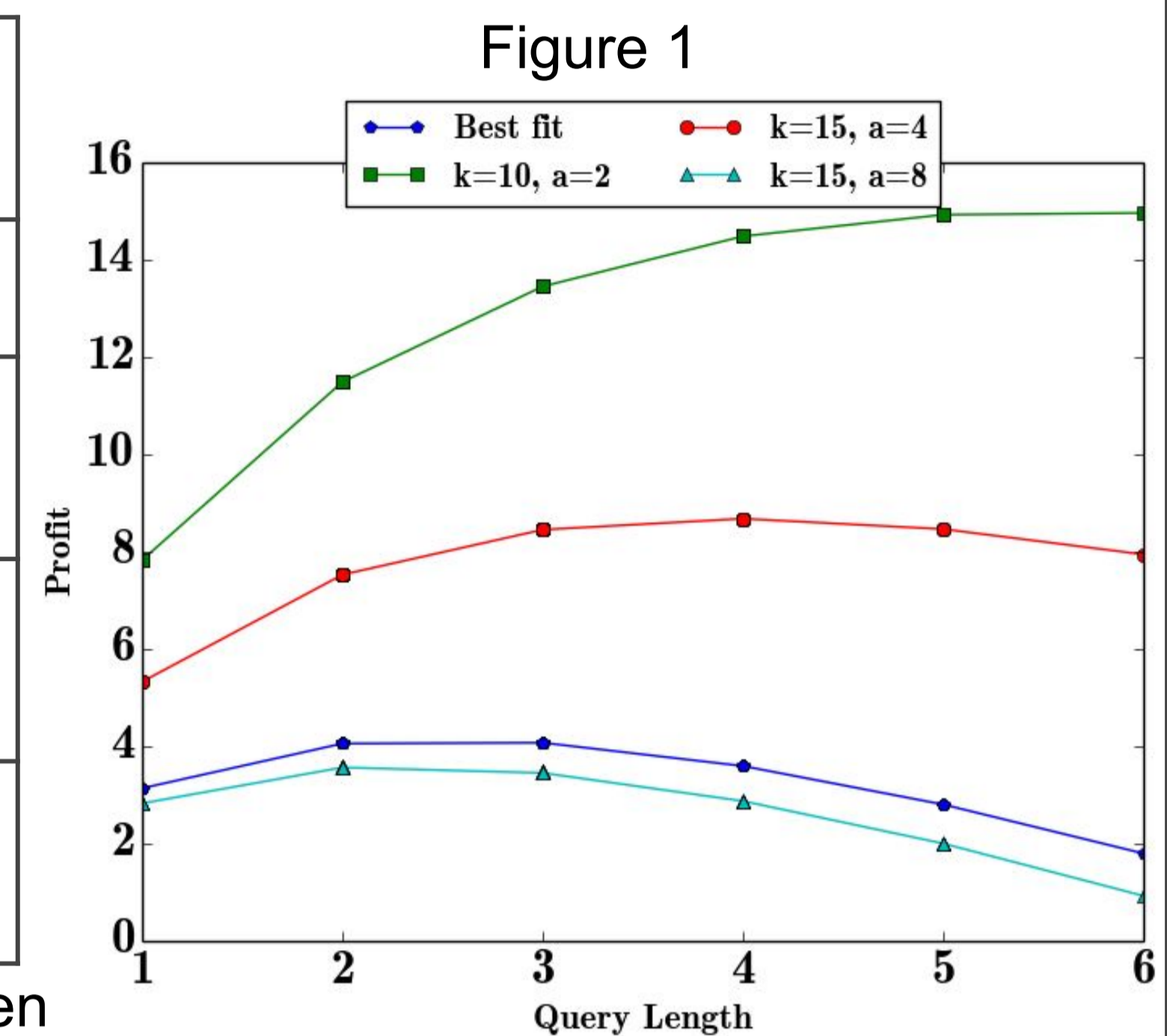
- How is net benefit for above models correlated with user satisfaction? Does higher net benefit always yield a satisfied user.
  - While query cost-benefit models are strongly correlated with user satisfaction, search cost-benefit models have weaker correlation.
- How do the coefficients in above models vary for search sessions on mobile? At present, coefficients are determined from desktop based user studies.
  - Coefficients for mobile differ from desktop, more for query cost benefit models than search cost-benefit models.

## RESULTS

### Query Cost-Benefit Model

$k \rightarrow$	10	15	20
$\alpha \downarrow$			
2	-0.10	-0.14	-0.15
4	0.312*	-0.009	-0.10
6	0.271*	0.27*	-0.02
8	0.256*	0.312*	-0.09

Table 1: Pearson Correlation between net profit and satisfaction for different values of  $k$  and  $\alpha$

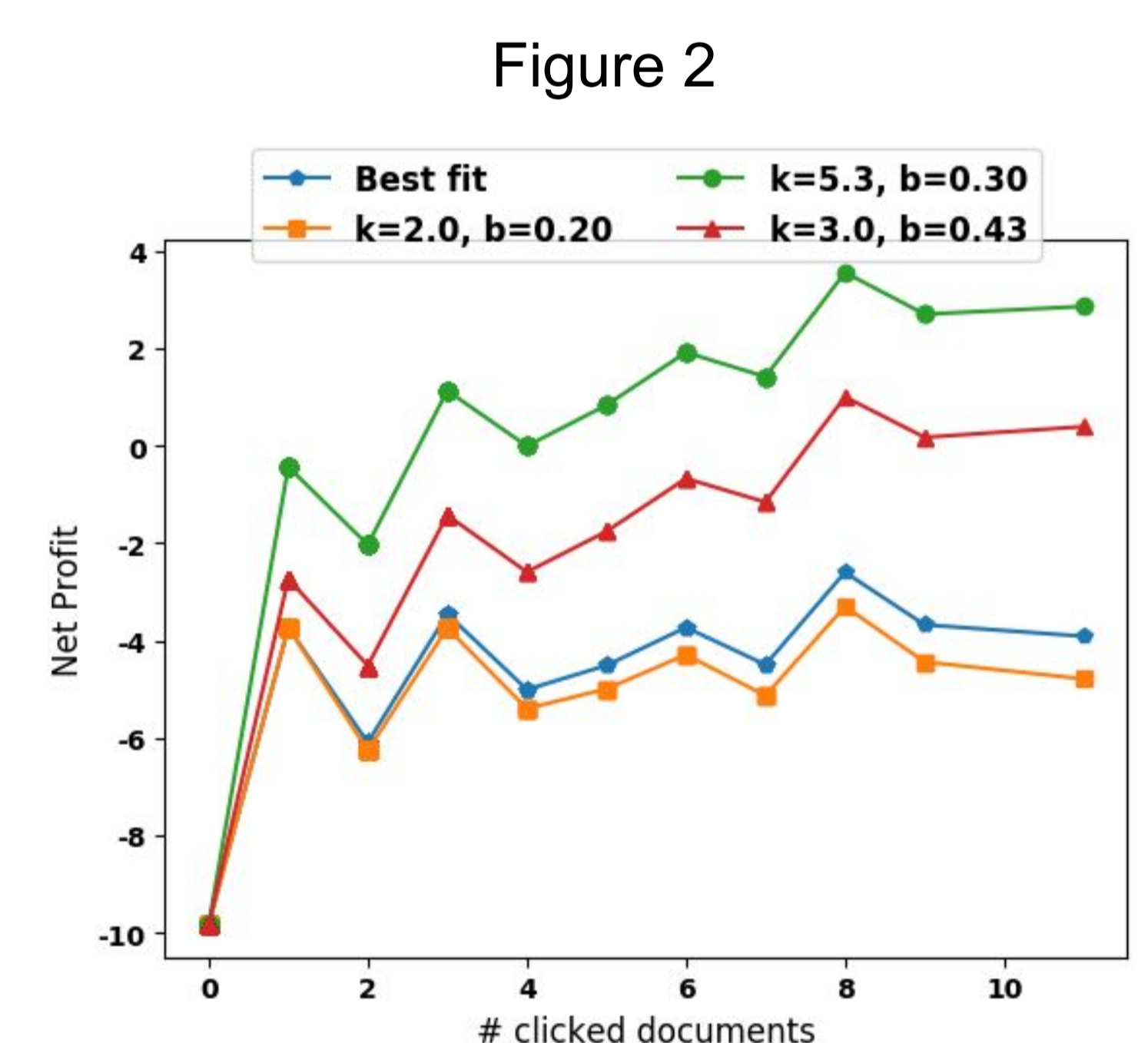


- We can estimate parameters  $k$  and  $\alpha$  by minimizing squared loss between satisfaction labels obtained from a lab study and net profit.
- Figure 1 is the distribution of Net Profit for different query lengths with different values of  $k$  and  $\alpha$ .
- Parameter values  $C_w = 2.18$ ,  $k = 8.5$  and  $\alpha = 3.0$  yield best fit on our data and are highly correlated with SERP level satisfaction labels.

### Search Cost-Benefit Model

$k \rightarrow$	2	5	10
$\beta \downarrow$			
0.03	0.16*	0.14*	0.10*
0.30	0.17*	0.13*	0.09*
0.43	0.16*	0.12	0.08
1.00	0.11	0.08	0.07

Table 2: Pearson Correlation between net profit and satisfaction for different values of  $k$  and  $\beta$



- Figure 2 is the distribution of Net Profit with number of clicked documents for different values of  $k$  and  $\beta$ .
- On minimizing the squared difference between satisfaction and net profit, we obtain  $k = 2.0$  and  $\beta = 0.30$ .
- Pearson Correlation between SERP satisfaction labels and net profit obtained by search cost-benefit model is lower than query cost-benefit model.

## REFERENCES

1. L. Azzopardi and G. Zuccon. An analysis of the cost and benefit of search interactions. In Proc. ICTIR, pages 59-68. ACM, 2016
2. L. Azzopardi. Modelling interaction with economic models of search. In Proc. SIGIR. ACM, 2014