SELF-ADAPTIVE SYSTEMS RELY ON SUFFICIENT SELF-MONITORING TO DRIVE STATISTICAL INFERENCE ALGORITHMS, WHILE MONITORING SHOULD BE AS MINIMALLY INVASIVE AS POSSIBLE.

of requests per second went from 462 to 782. This gain is possible because the number of heavy requests (those correlated with the bottleneck) allowed per unit time is reduced. Therefore, it will take longer to search for a series of several items. This is highlighted in the longer average session time (872 seconds vs. 670 seconds), as each session consists of a set of subsequent searches, among other operations. As demonstrated by the positive effect on the number of requests per second and the maximum request time, such a reduction provides a great benefit for many visitors of the Web site.

CONCLUSION

We have proposed an approach to building selfadaptive Web services based on four design mechanisms: simple statistical techniques for uncovering request effects in multi-tier systems; a black-box approach to component monitoring; a visualization tool for summarizing statistical findings; and efficient techniques for invoking admission control decisions. We are in the process of building an auction Web service embodying these mechanisms, and preliminary results are promising: we achieved a 70% increase in the number of pages served per second, and a 78% decrease in the maximum latency seen by users accessing the Web site. We are encouraged by these results, as they show the promise in building and deploying more self-adaptive Web services.

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