## COMPETITIVE QUERY STRATEGIES FOR MINIMISING THE PLY OF THE POTENTIAL LOCATIONS OF MOVING POINTS

Will Evans<br>David Kirkpatrick<br>Frank Staals<br>Maarten Löffler

A BRIEF ELUCIDATION OF THE TITLE
"MOVING POINTS"
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- Location-aware mobile devices
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- Location-aware mobile devices
- GPS systems


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OBSERVATION:If we knew where $p$ was $t$ time ago, we know it is now somewhere in a disk of radius td



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POSTULATION:Low ply is good!
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- Performance measure for online algorithms
- Cost of online algorithm divided by cost of best possible offline algorithm


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- Competitive analysis
- Compare against adversary that knows the full trajectories of the points in advance

TECHNICAL STUFF

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- Projected regions never grow, and they shrink to radius $t^{*}-t$ when we query them
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CLAIM: Resulting ply $\Delta$ is within a constant factor of optimal!

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## THANK YOU!



