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

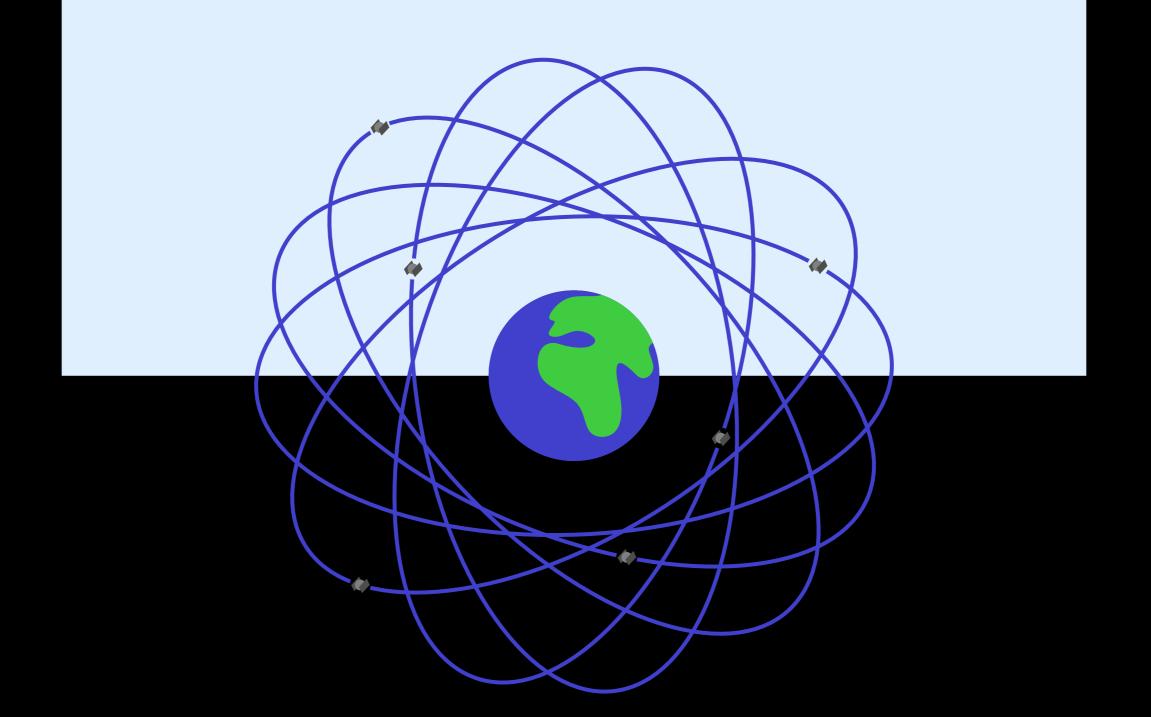
> Will Evans David Kirkpatrick Frank Staals Maarten Löffler

A BRIEF ELUCIDATION OF THE TITLE

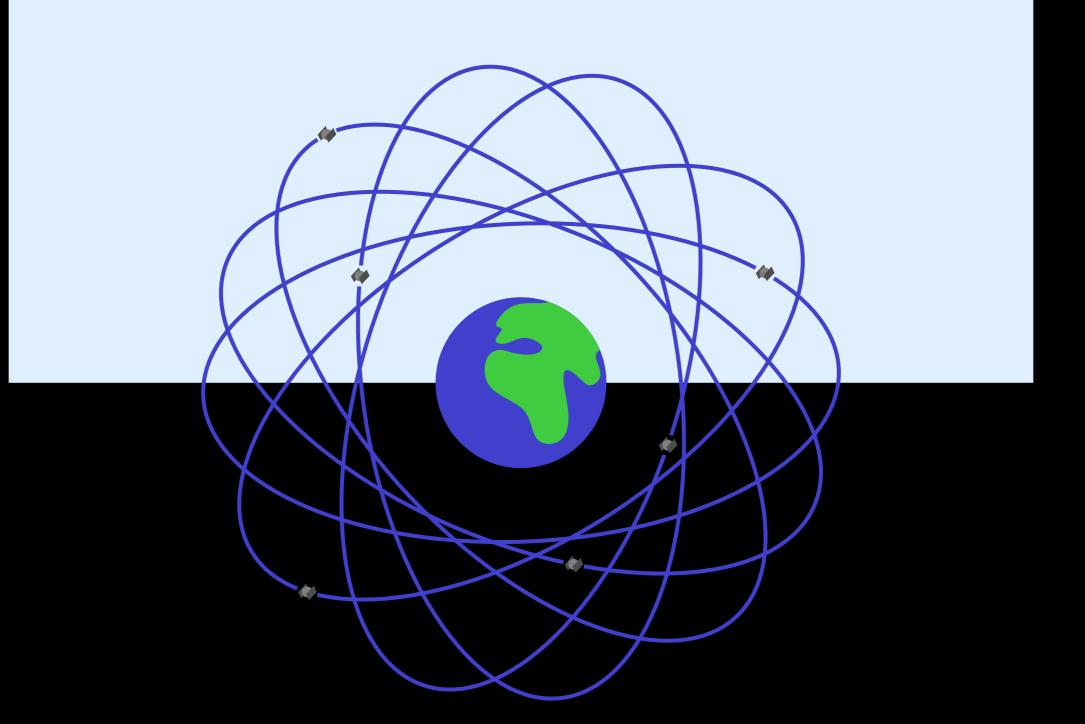
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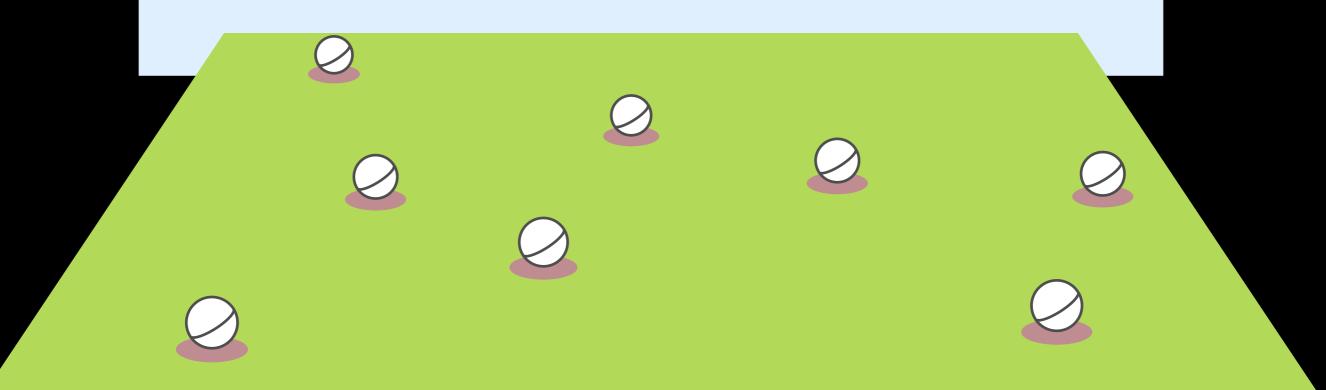
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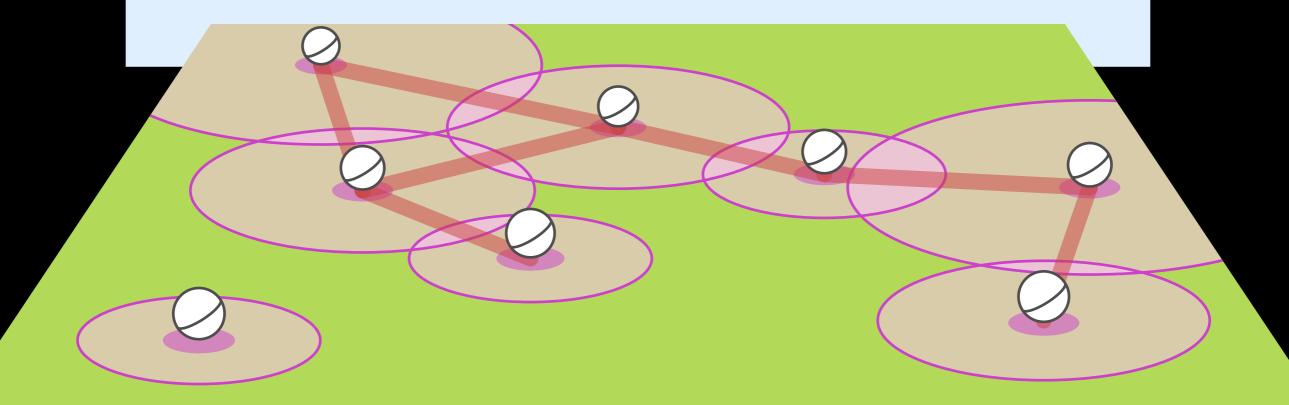
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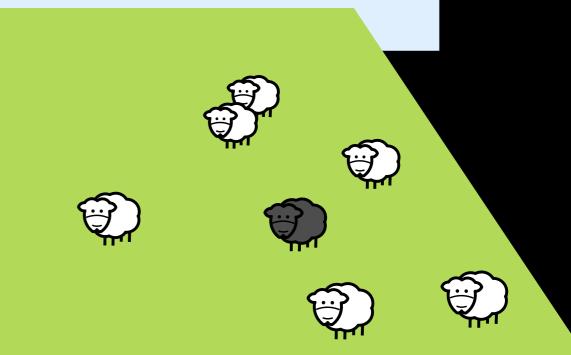


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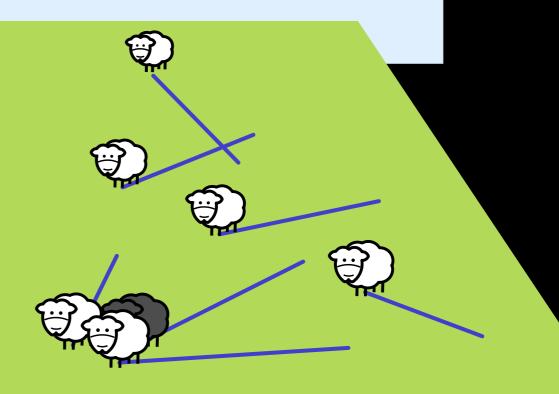


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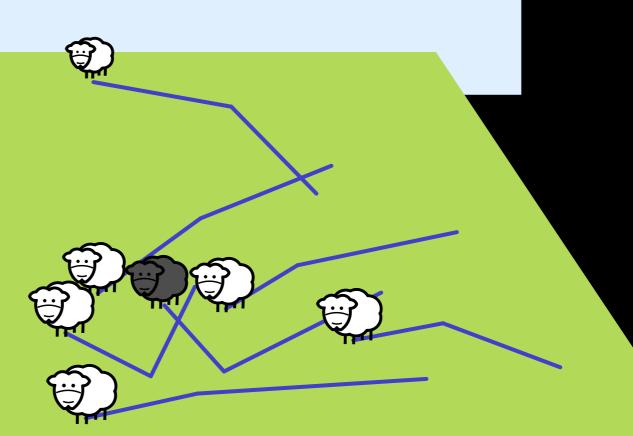
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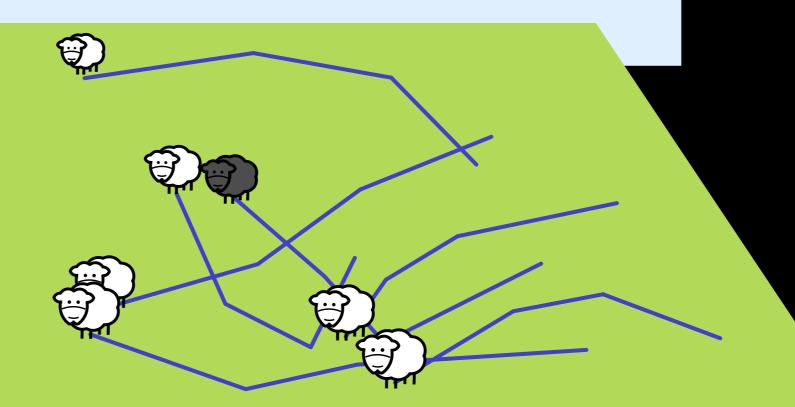
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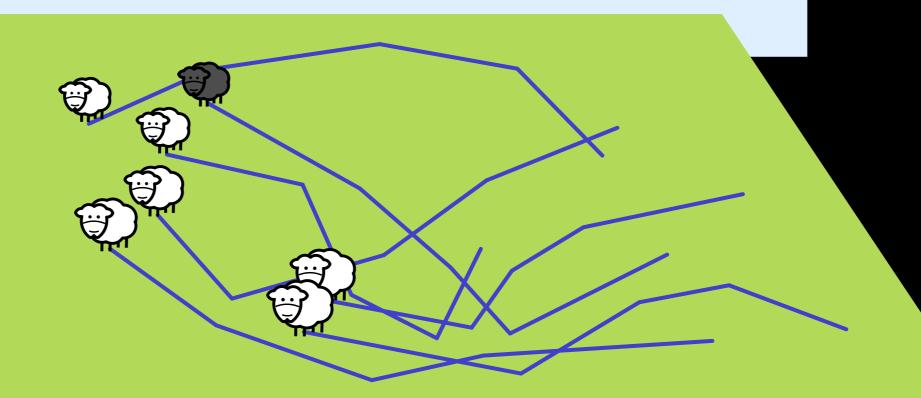
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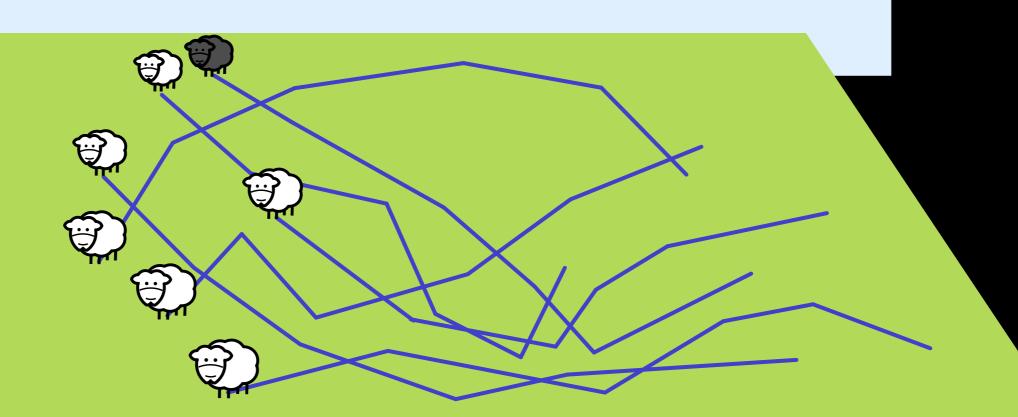
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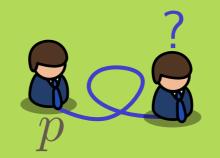
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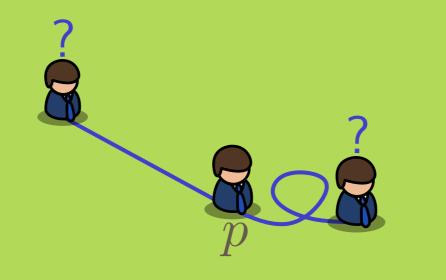
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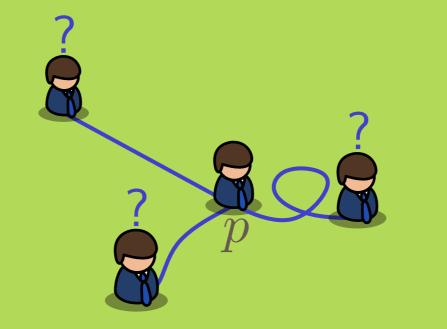
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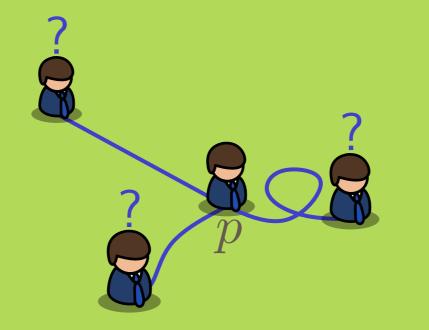
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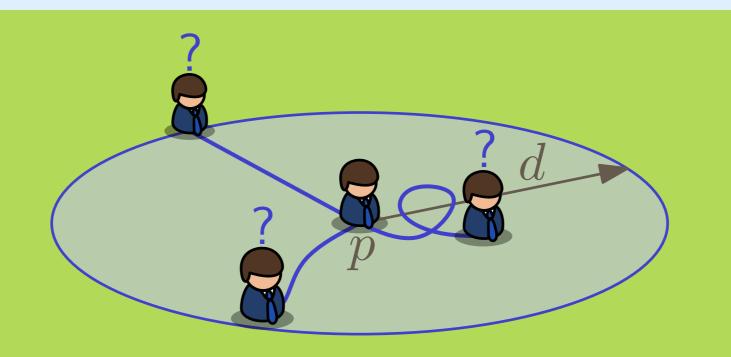
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 - We model the *potential locations* of p in the next time step by a disk of radius d

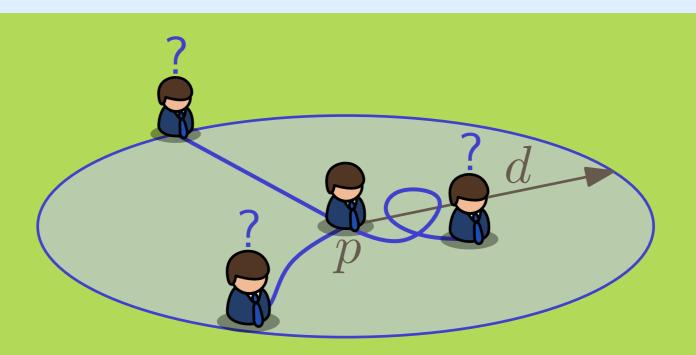


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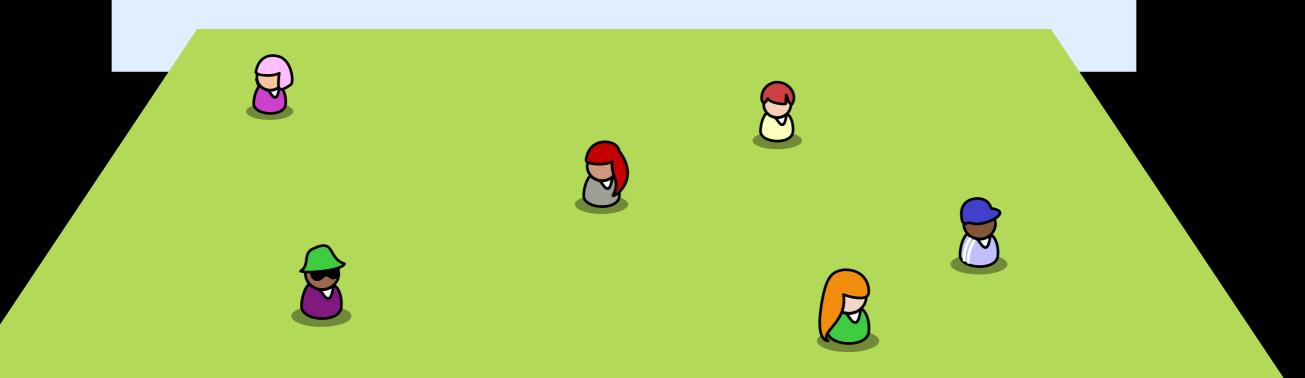
OBSERVATION:*If we knew where p was t time ago, we know it is now somewhere in a disk of radius td*



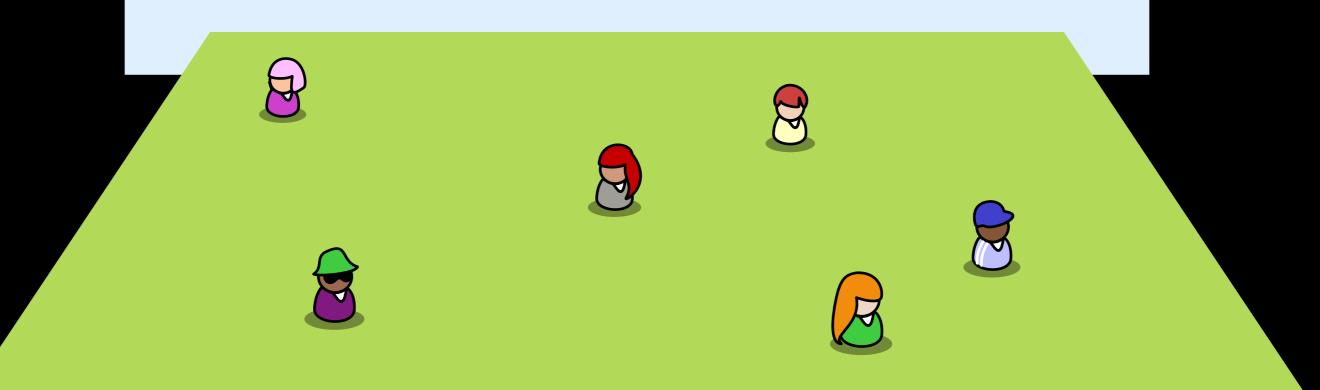


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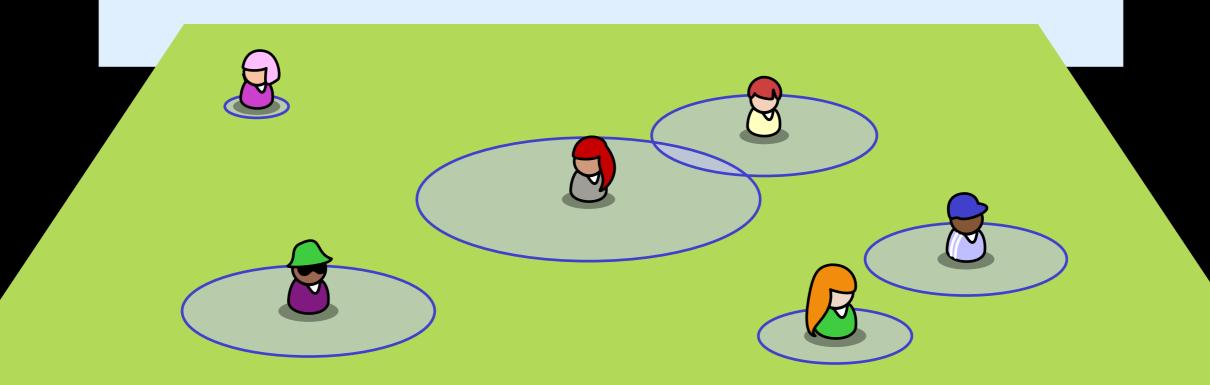
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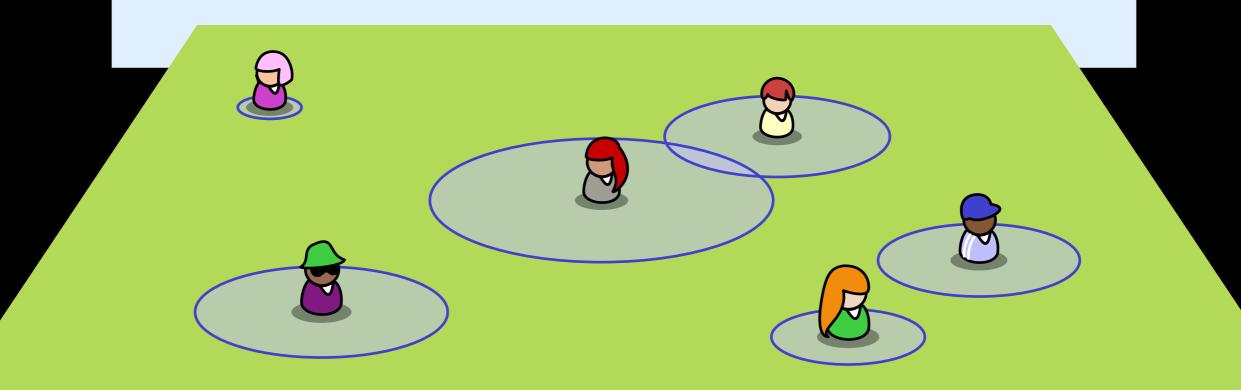
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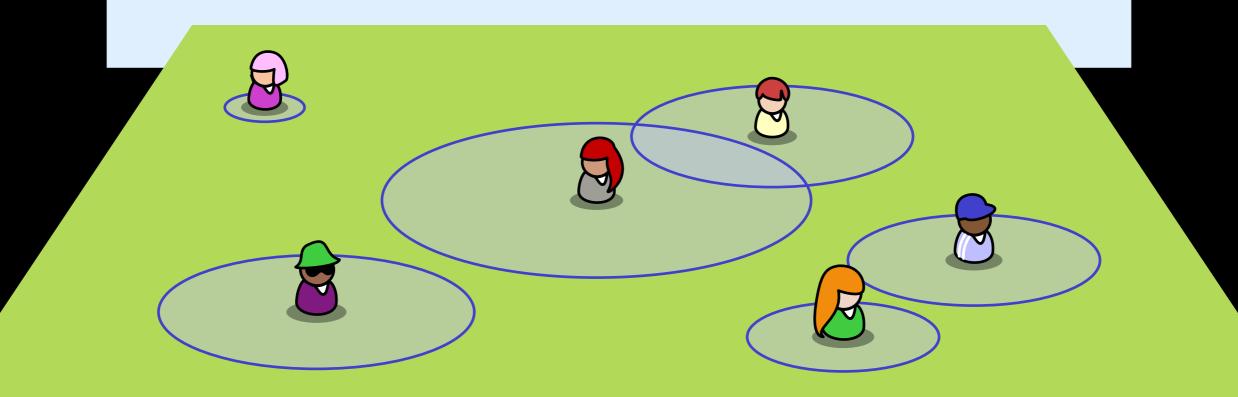
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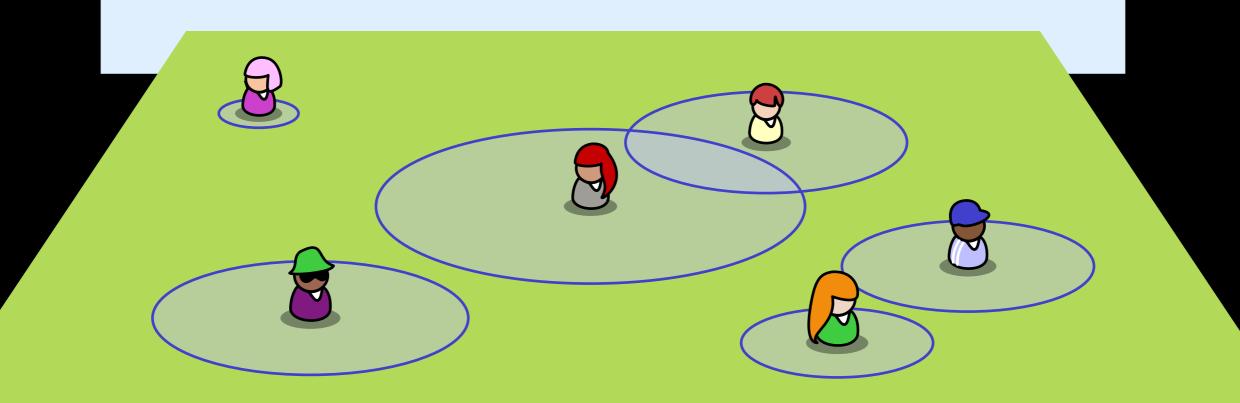
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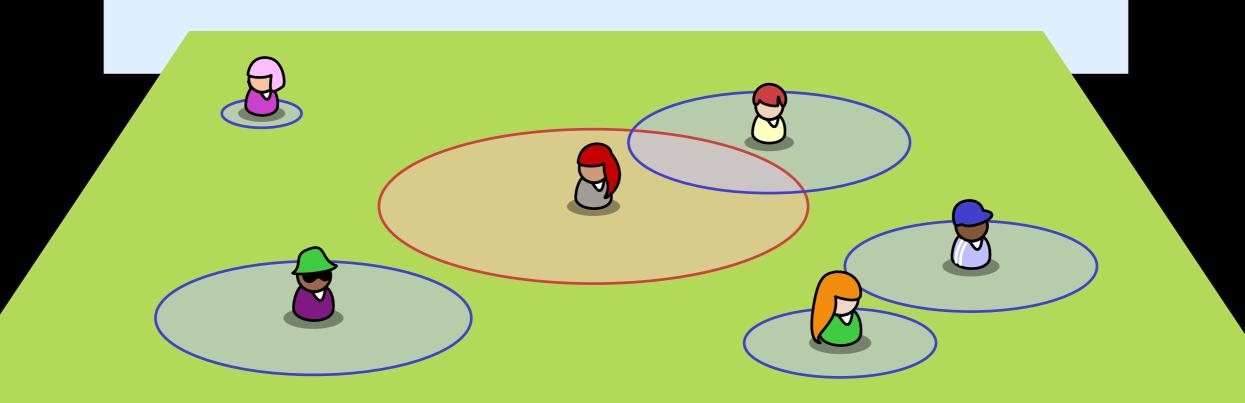
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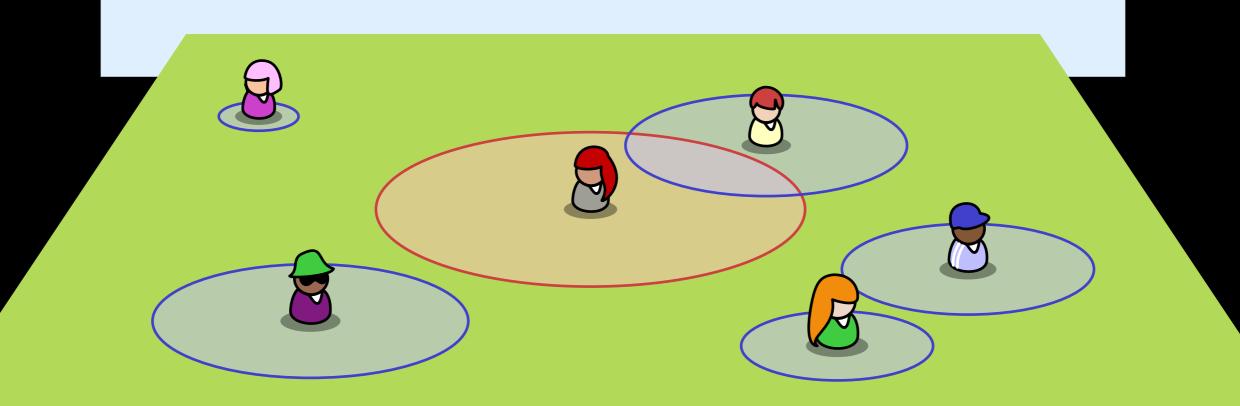
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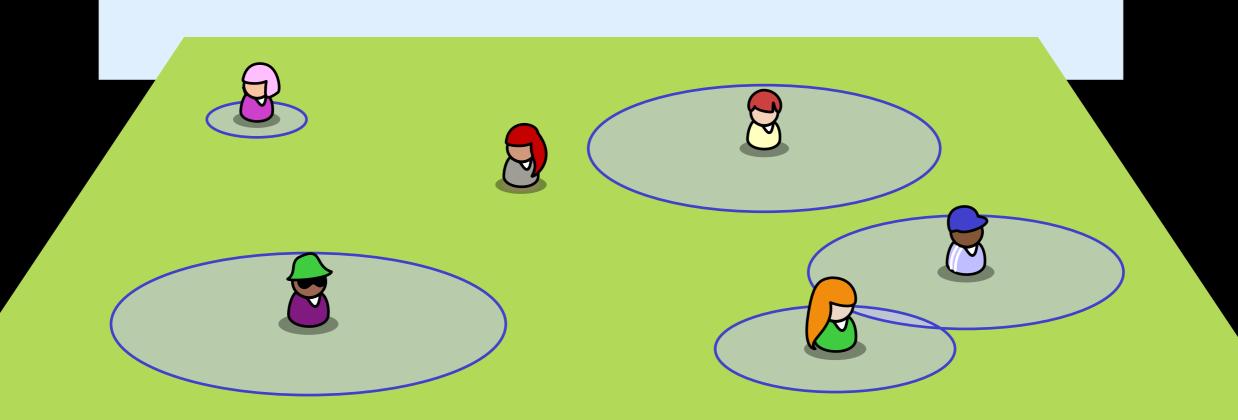
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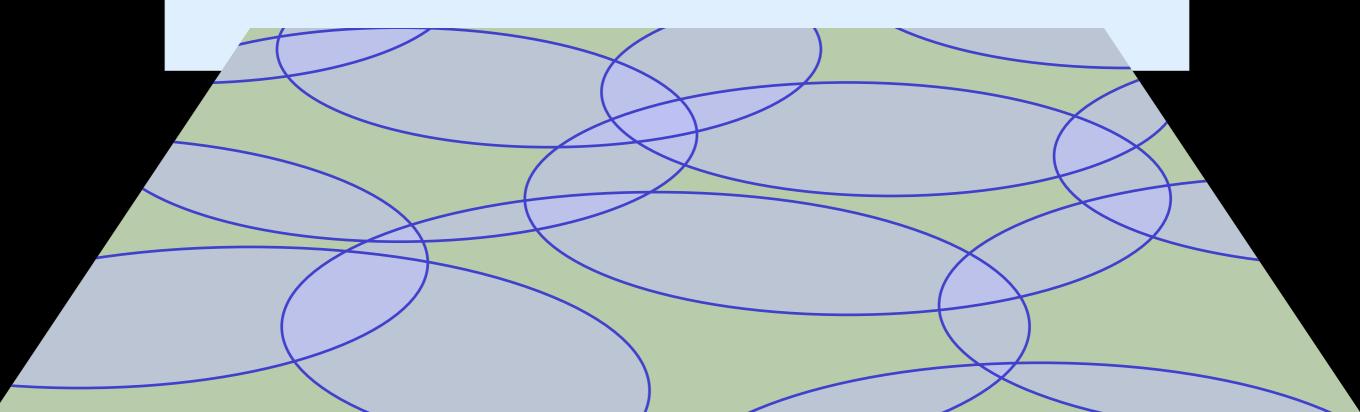
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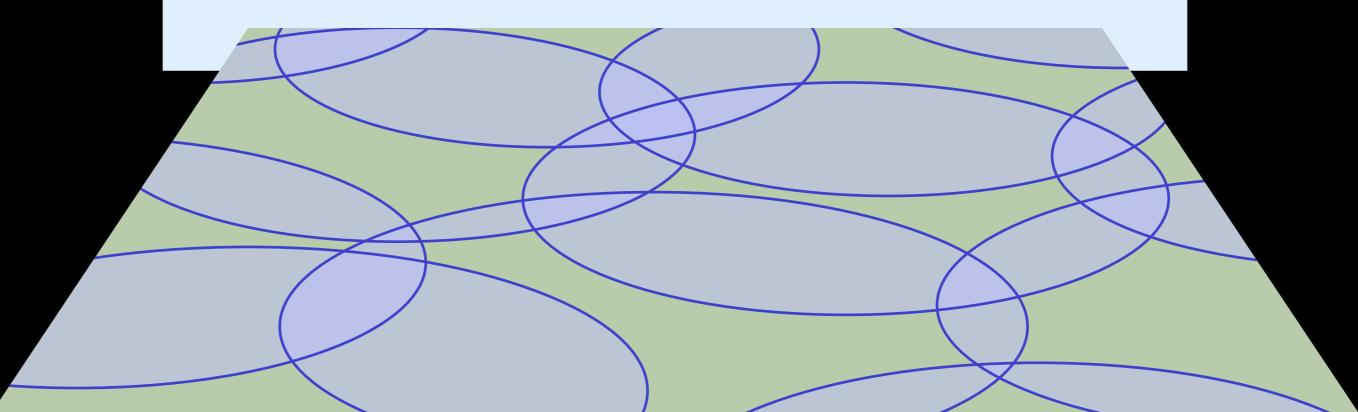
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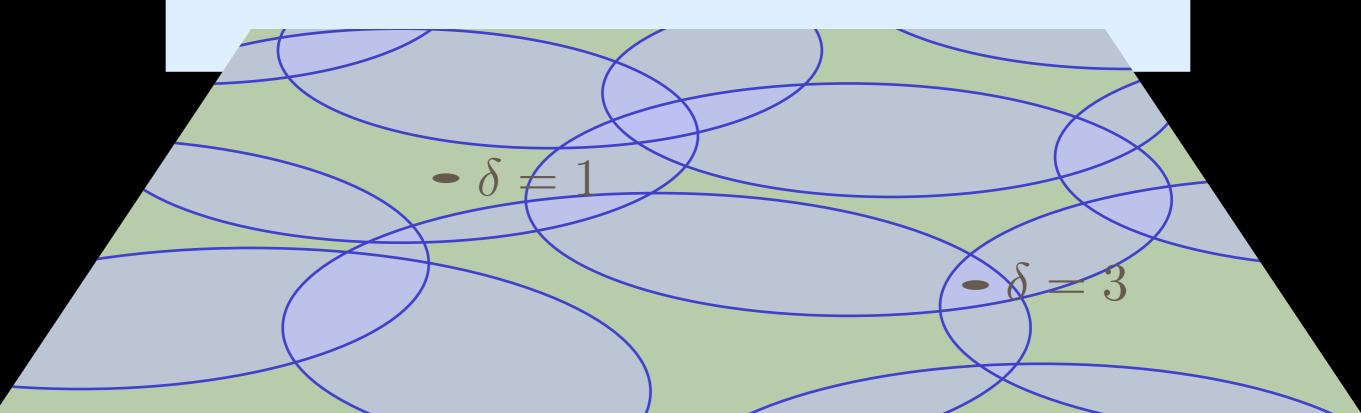
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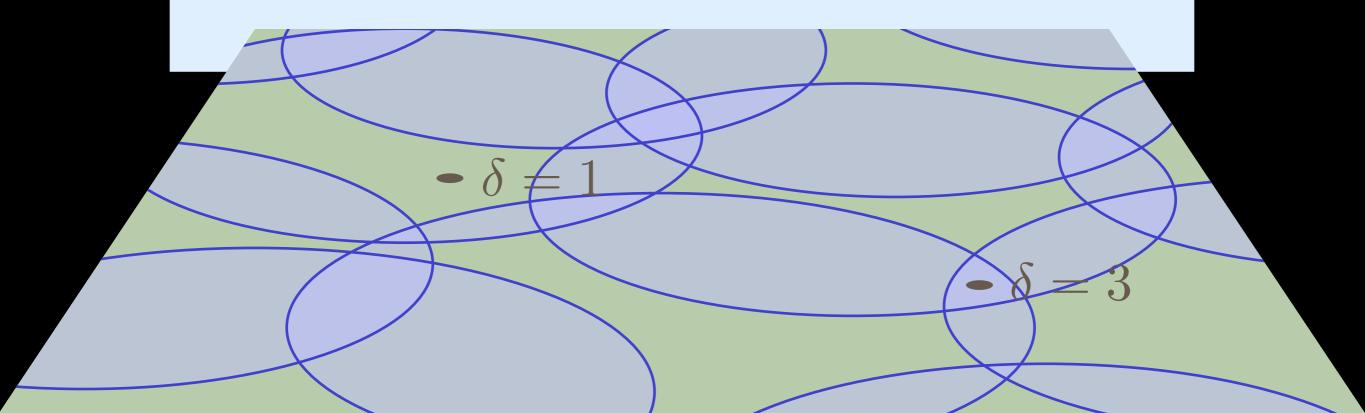
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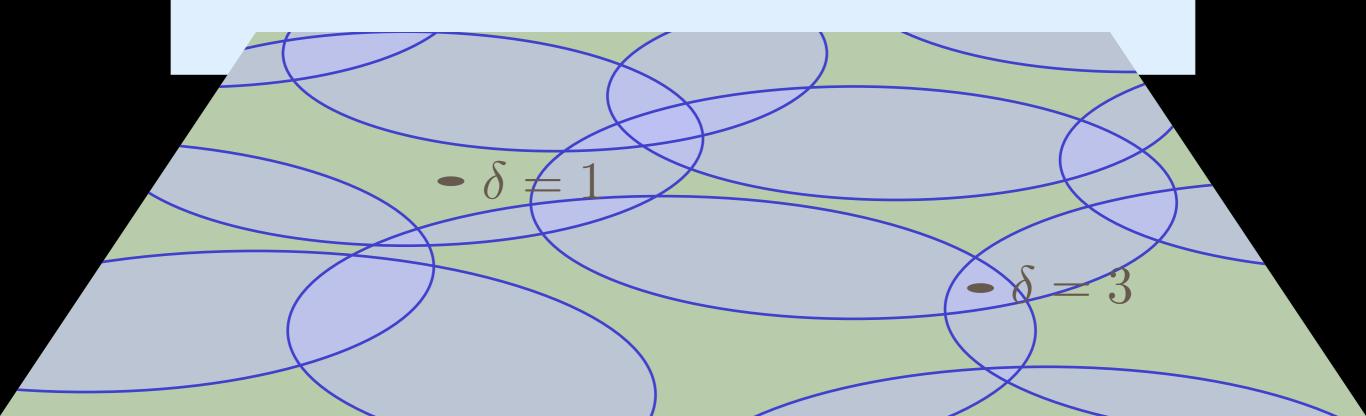
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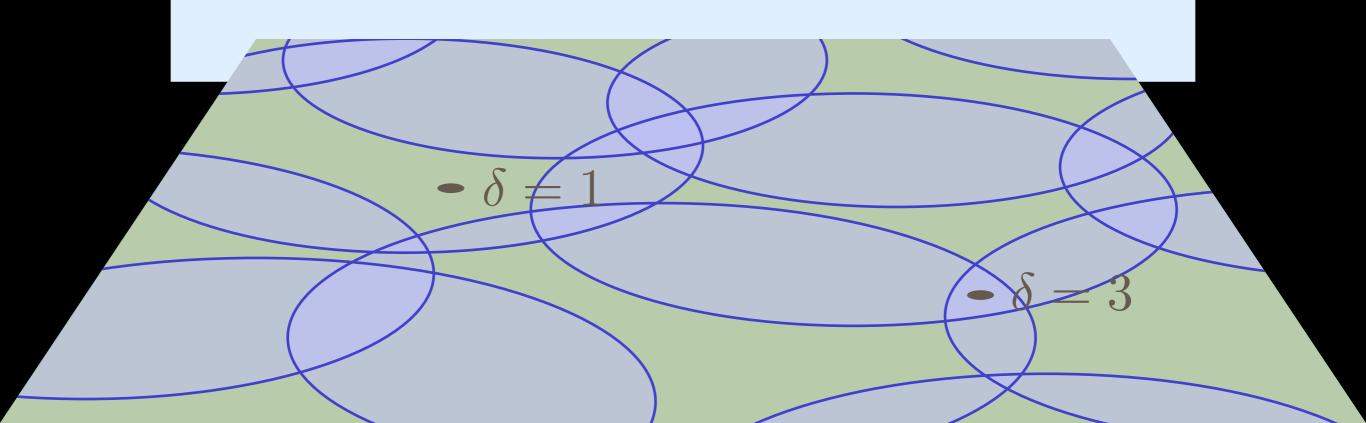
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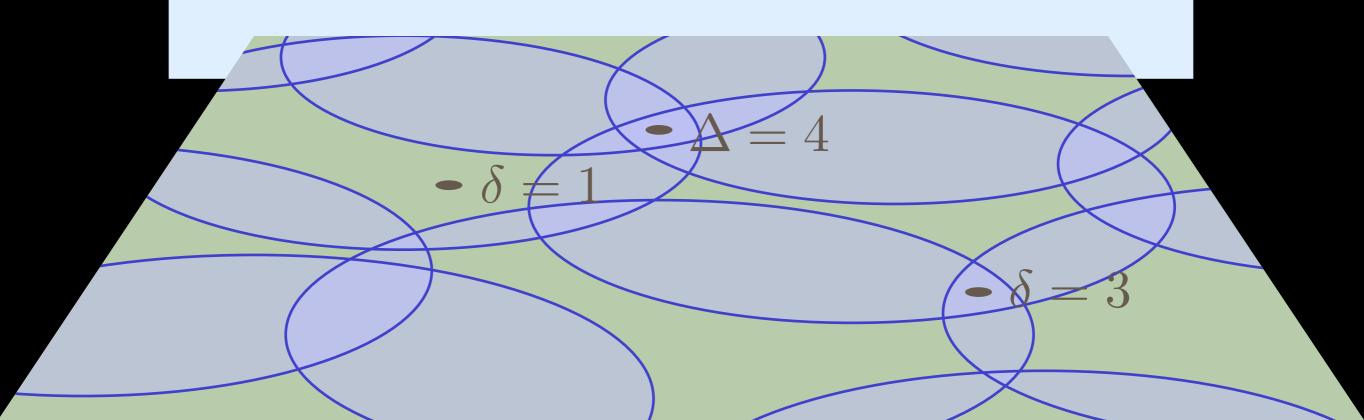
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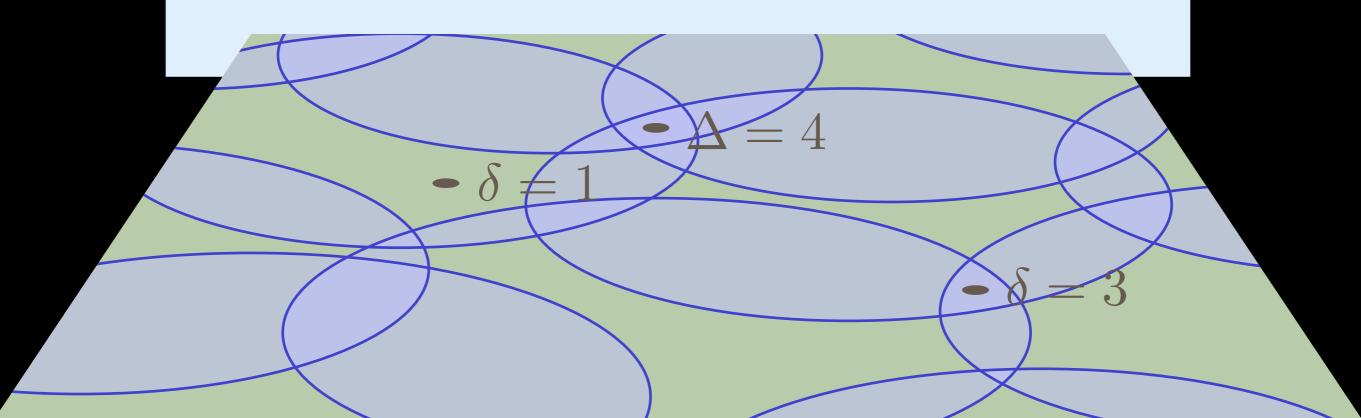
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- **POSTULATION:***Low ply is good!*



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PROBLEM STATEMENTInput

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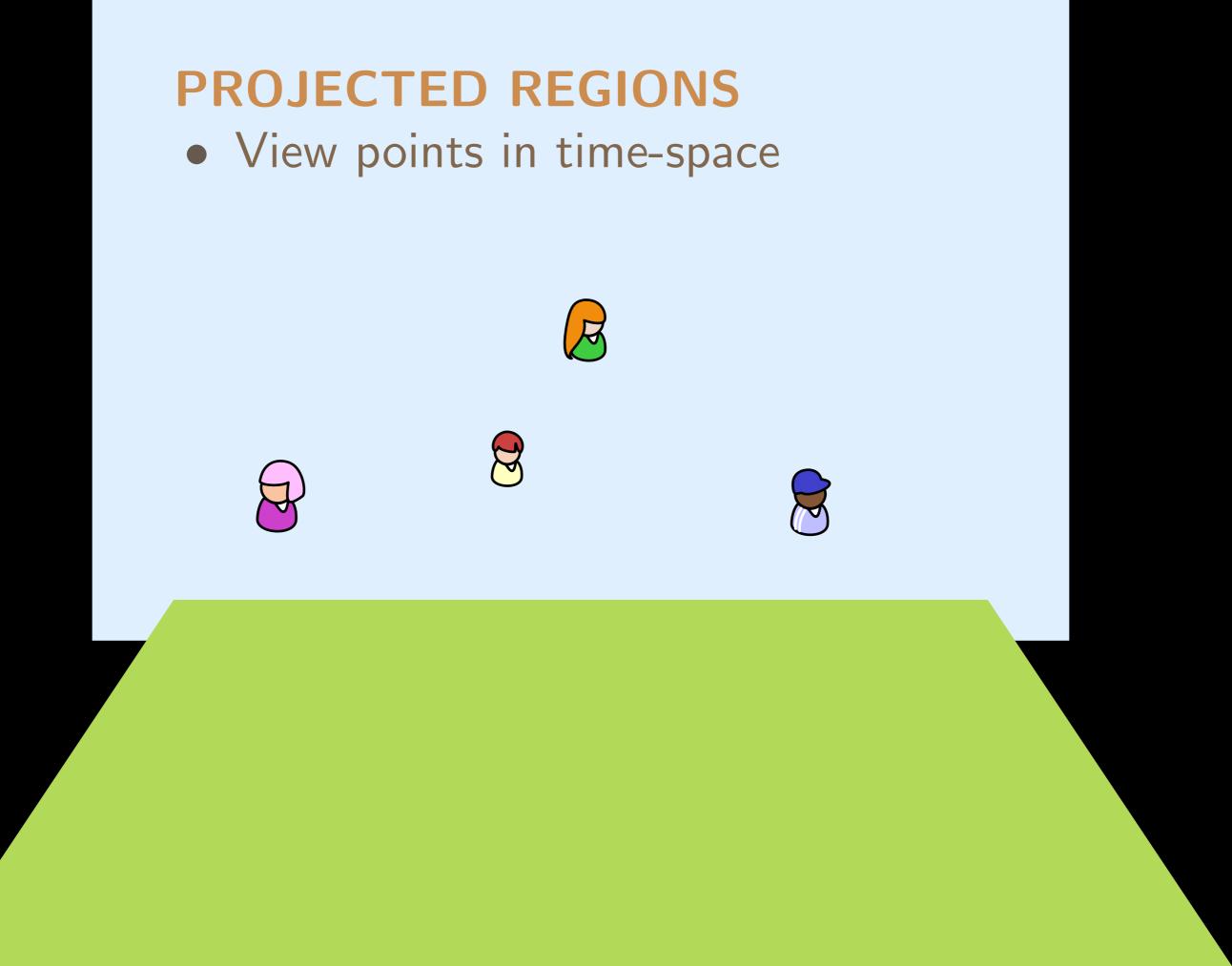
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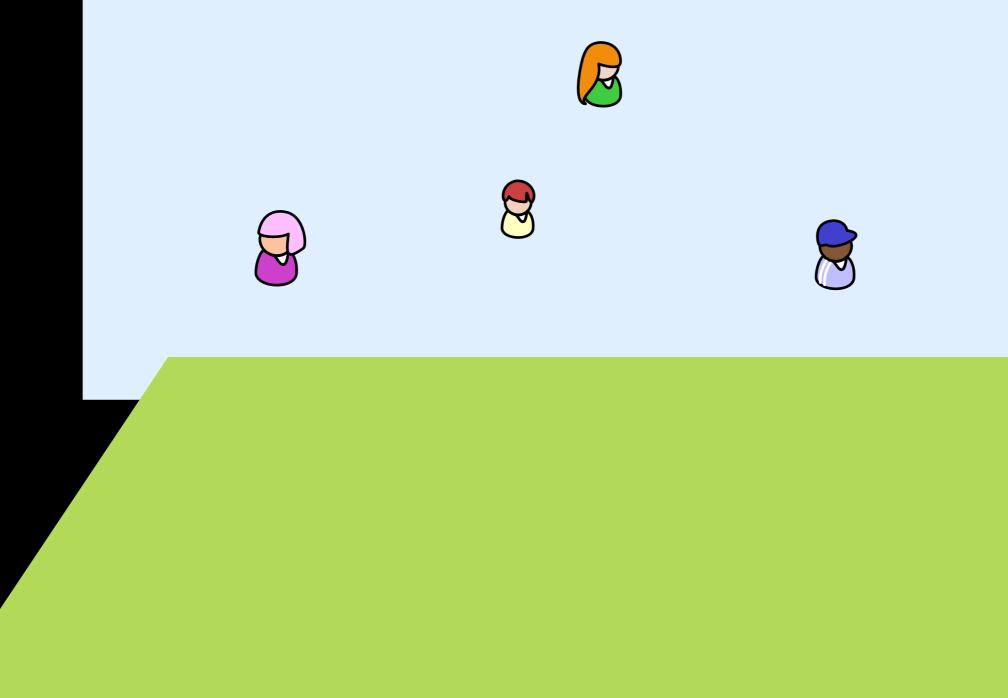
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 - Compare against adversary that knows the full trajectories of the points in advance

TECHNICAL STUFF

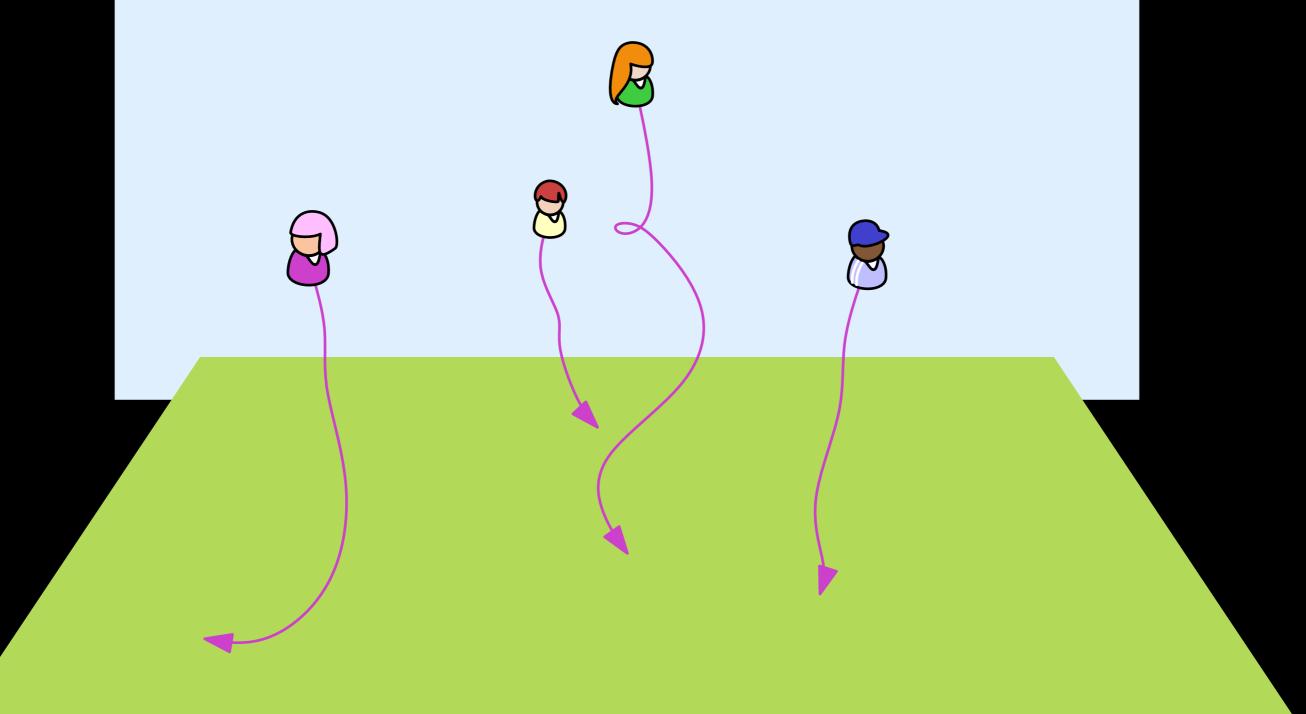
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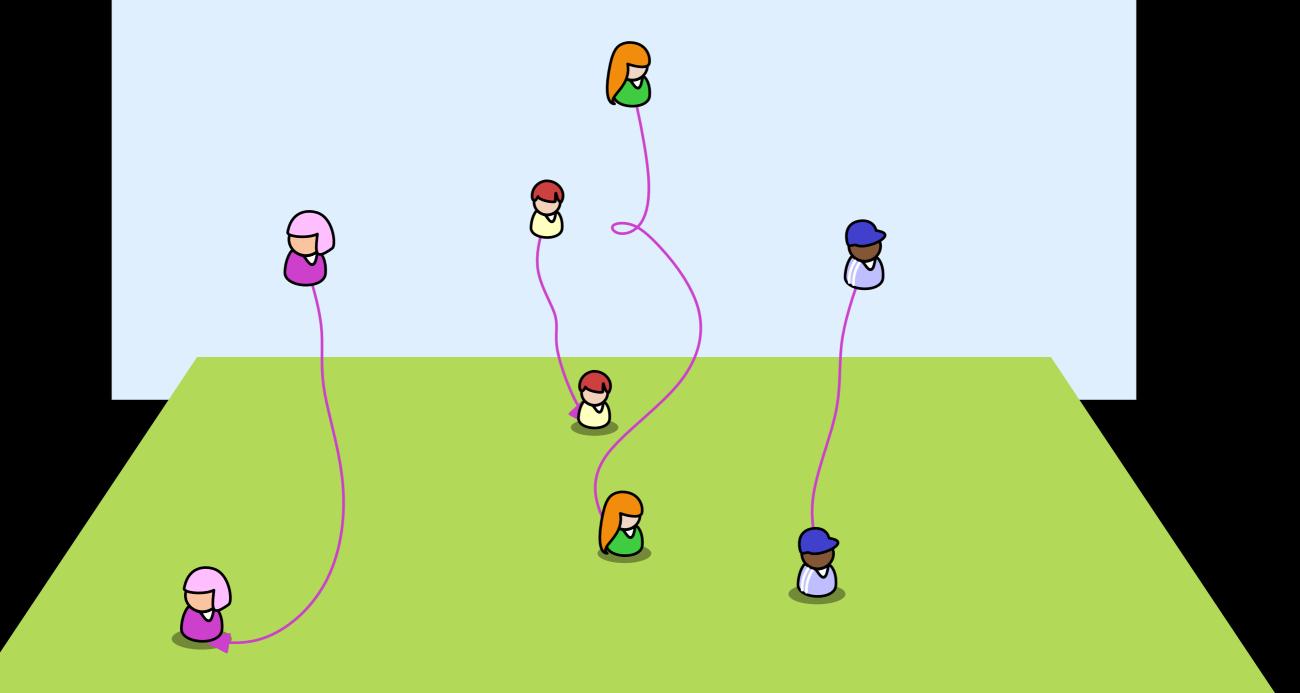
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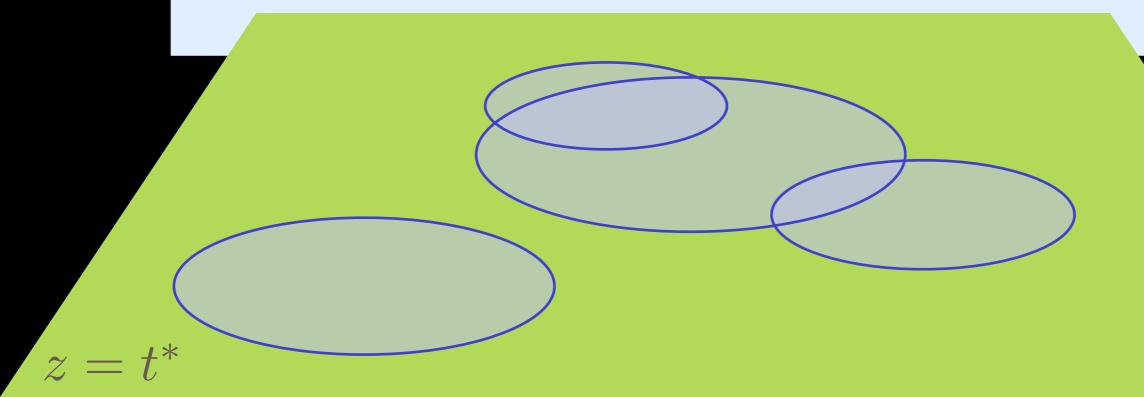
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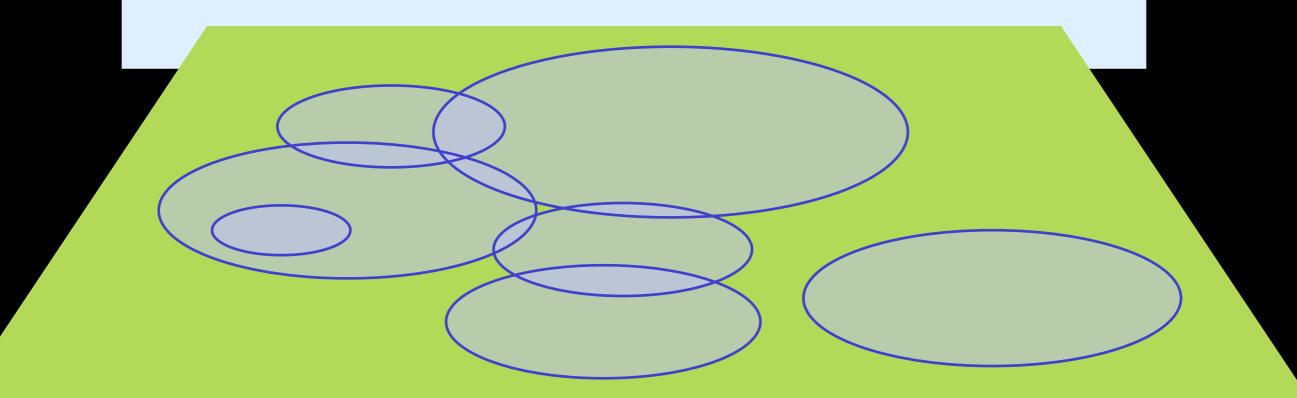
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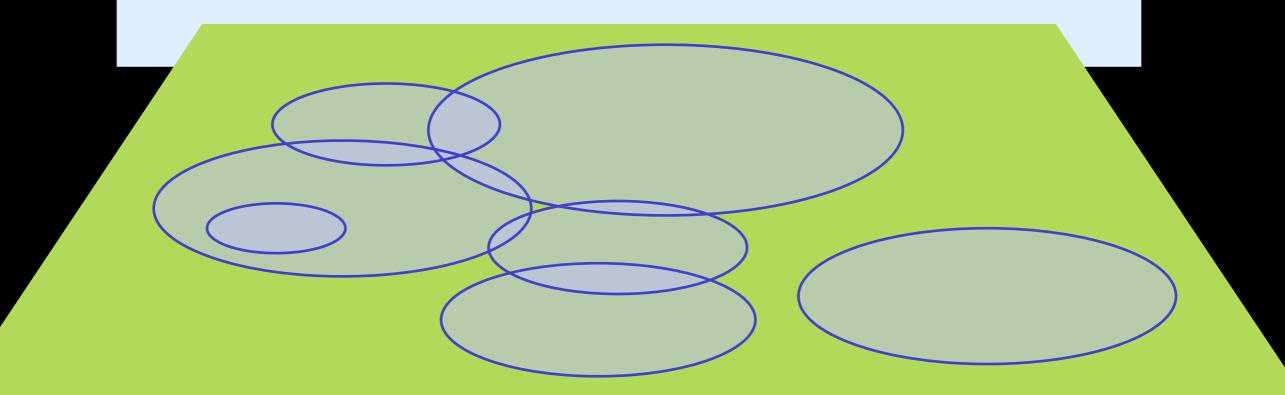
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 - Projected regions never grow, and they shrink to radius $t^* t$ when we query them

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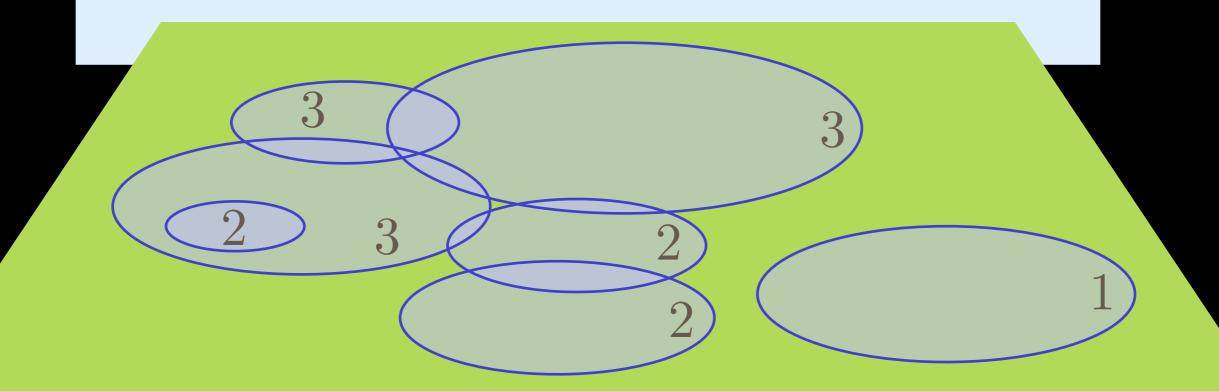
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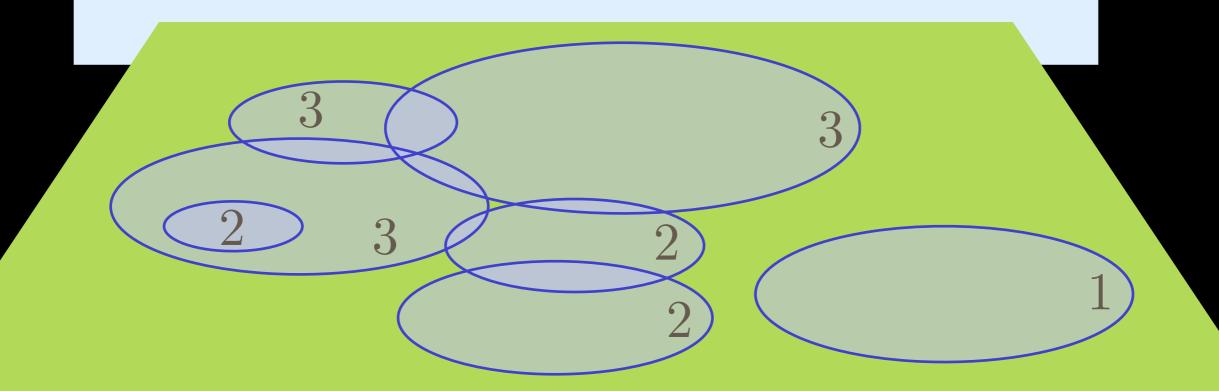
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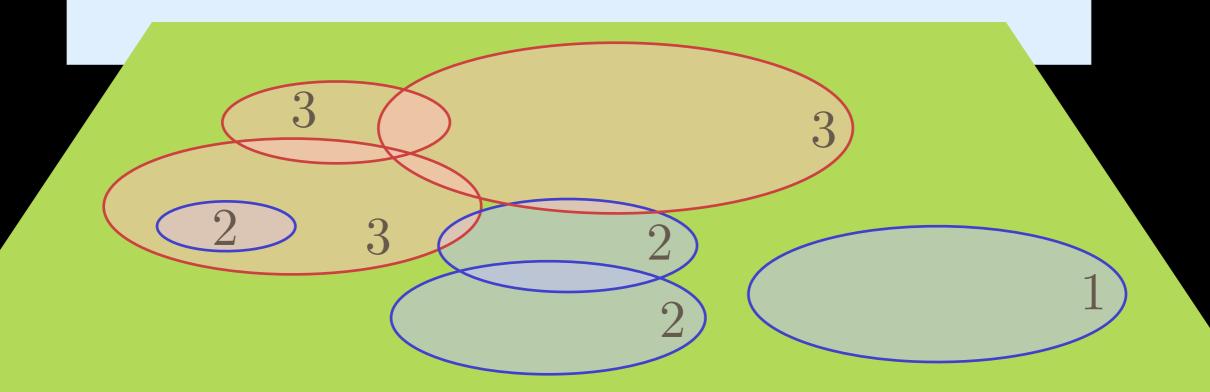
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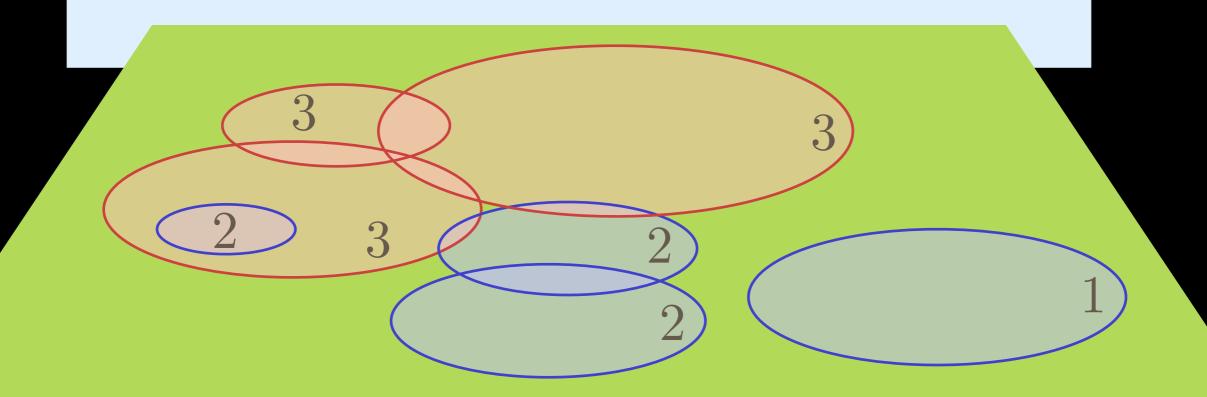
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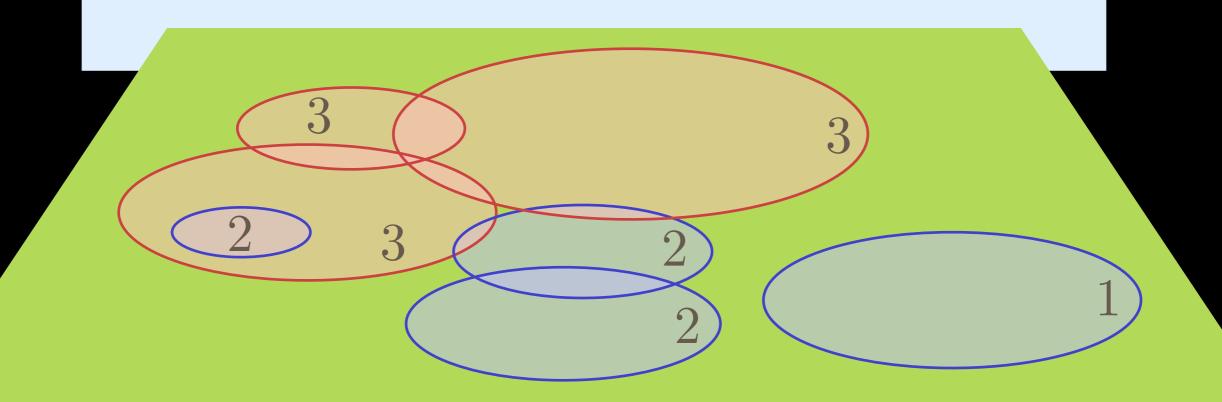
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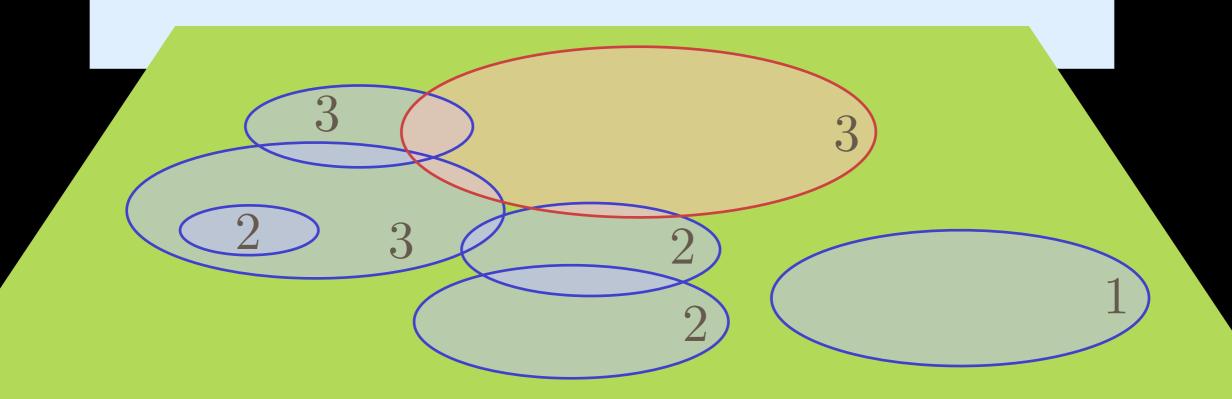
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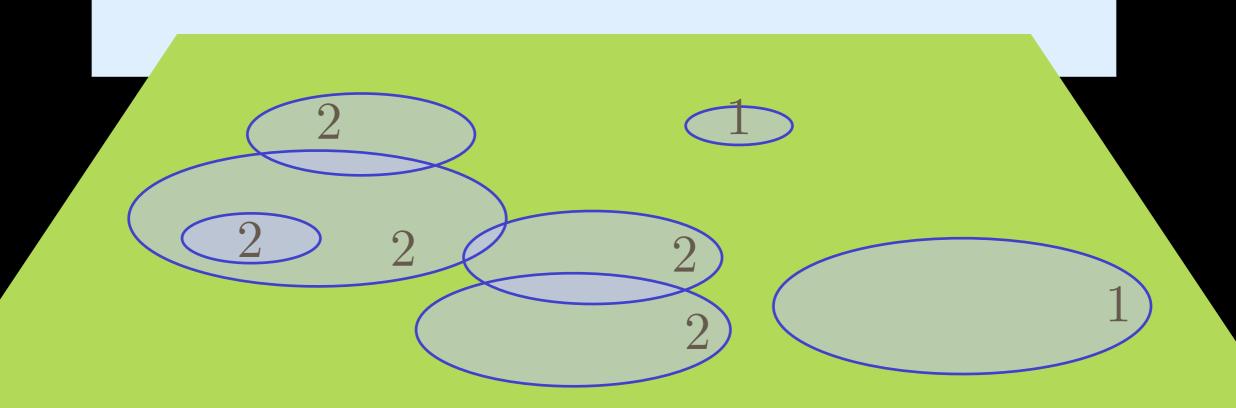
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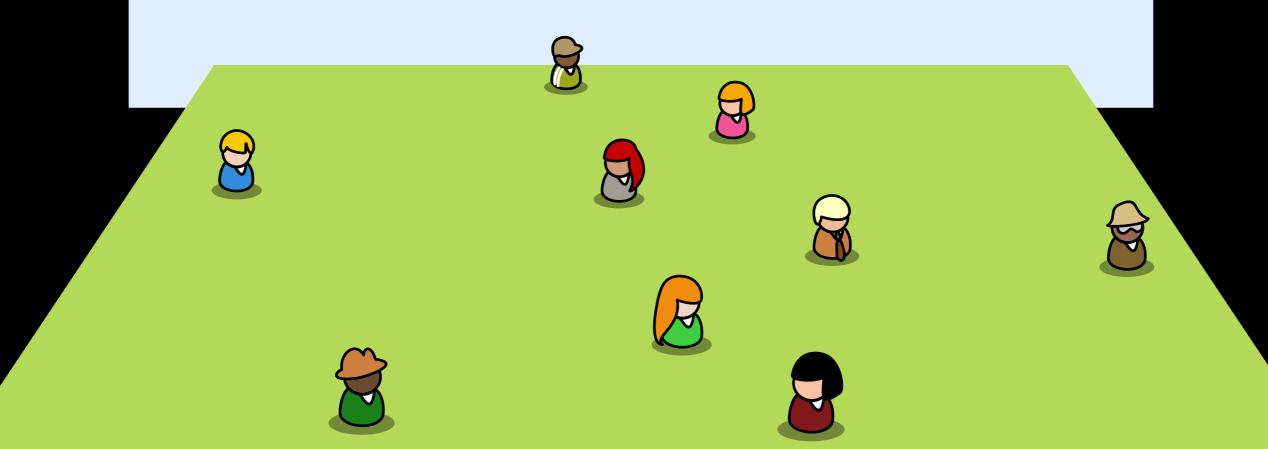


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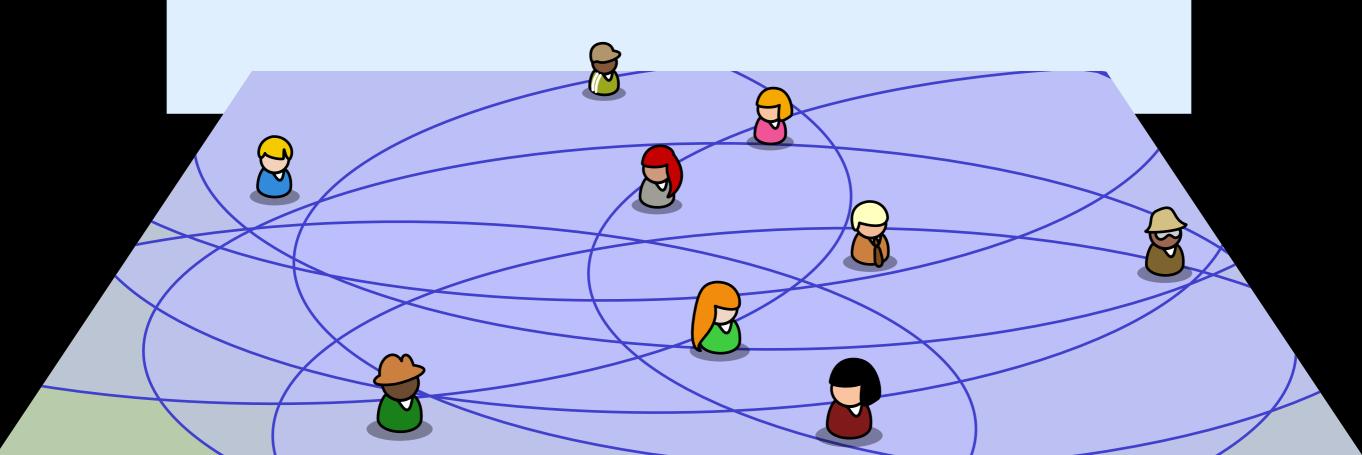
CLAIM: Resulting ply Δ can be a factor n larger than optimal!

6

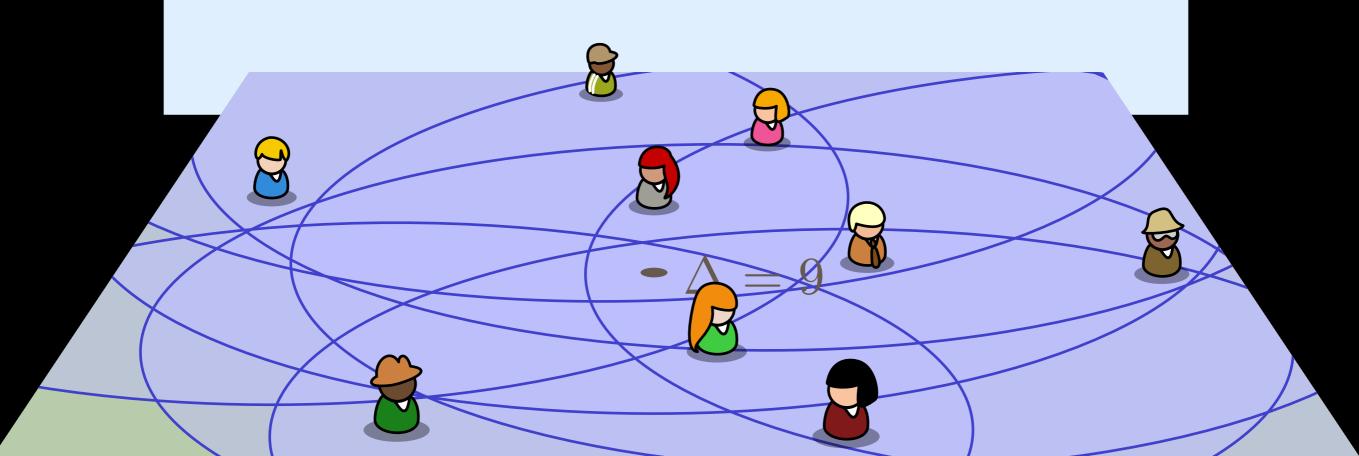
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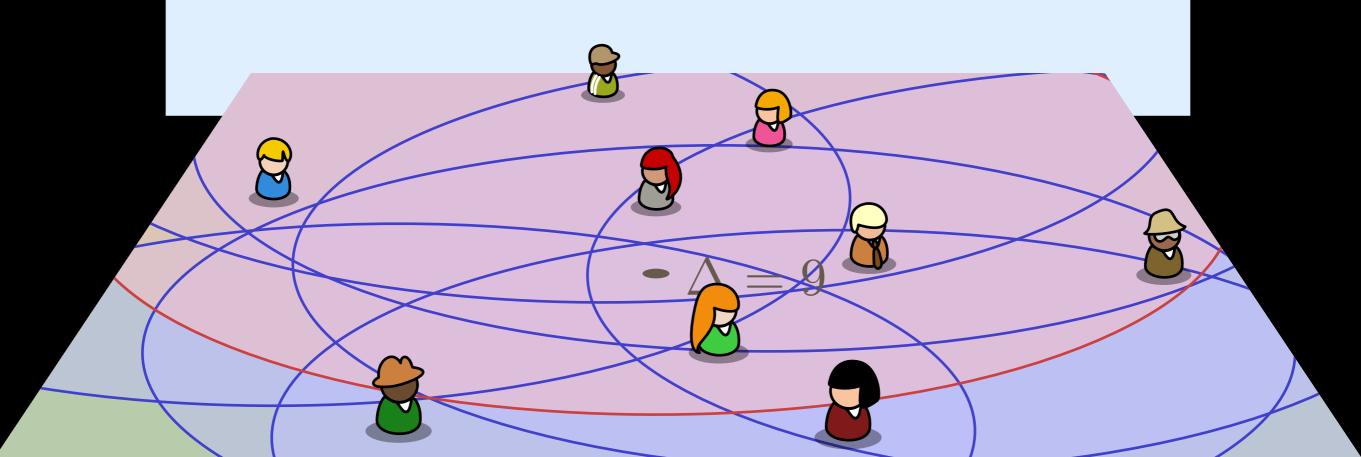
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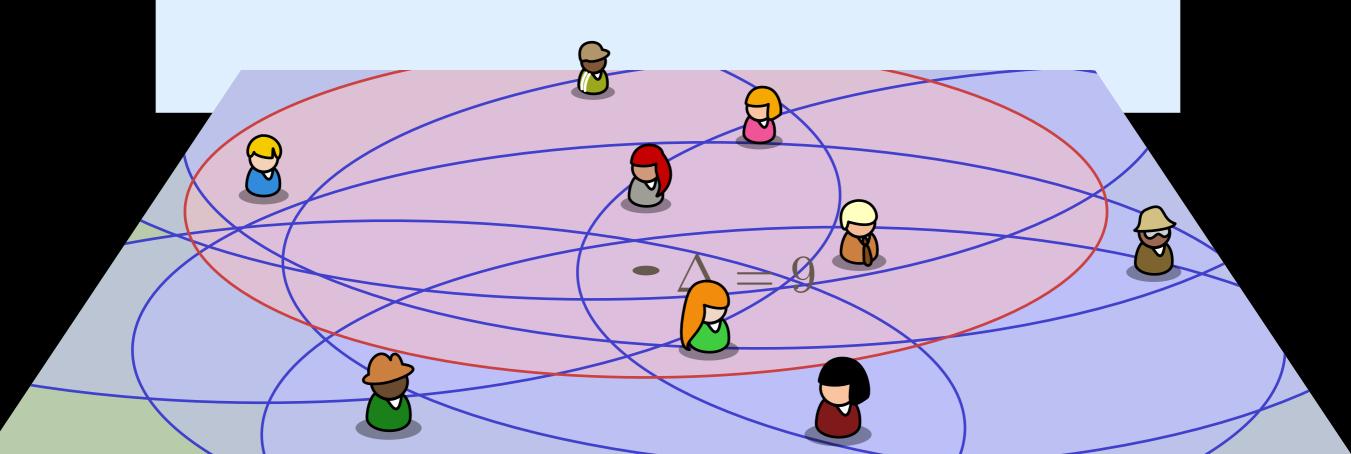
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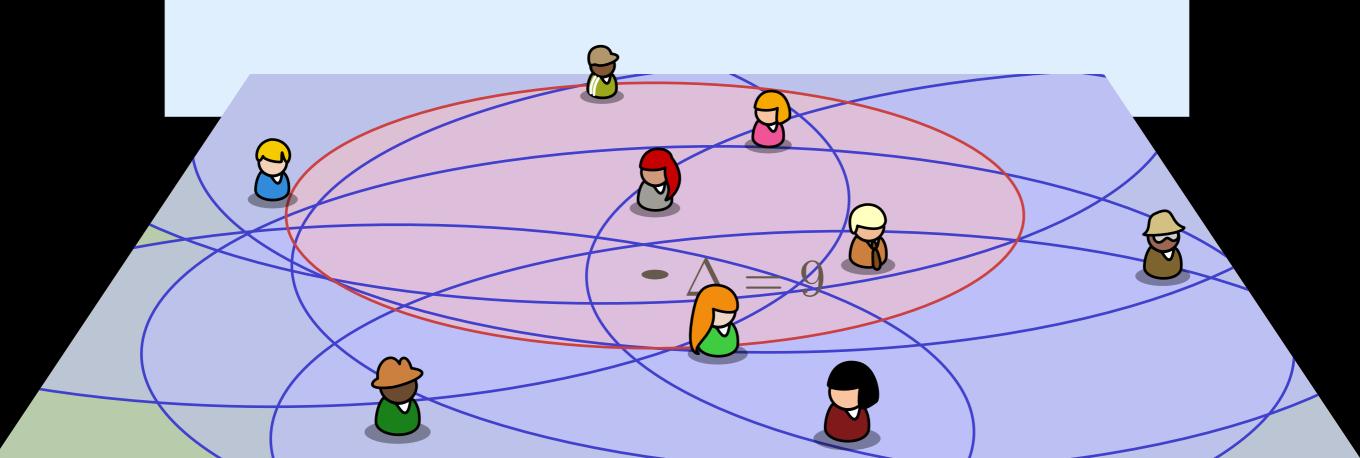
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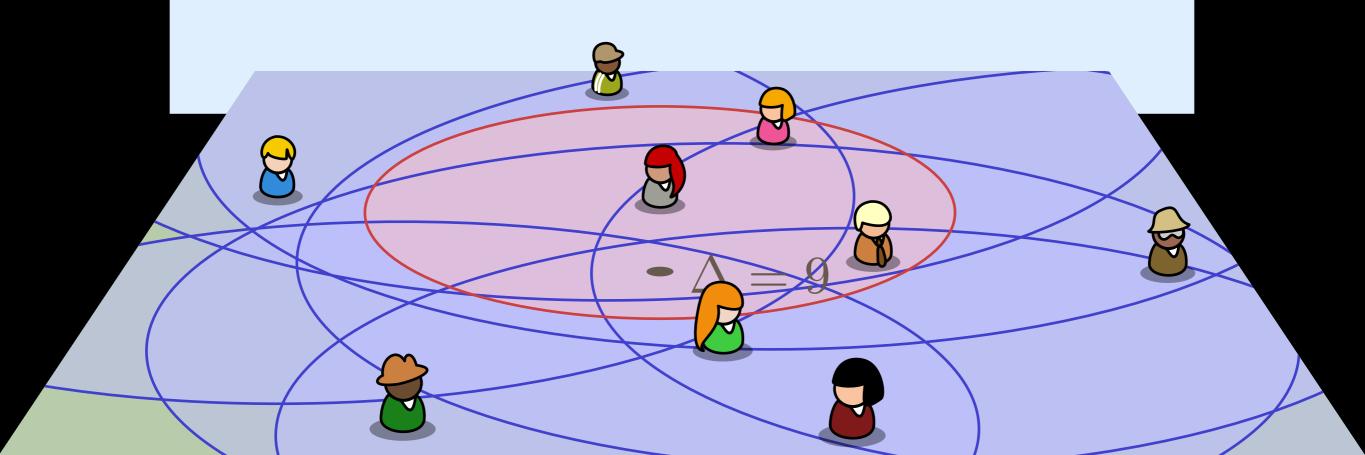
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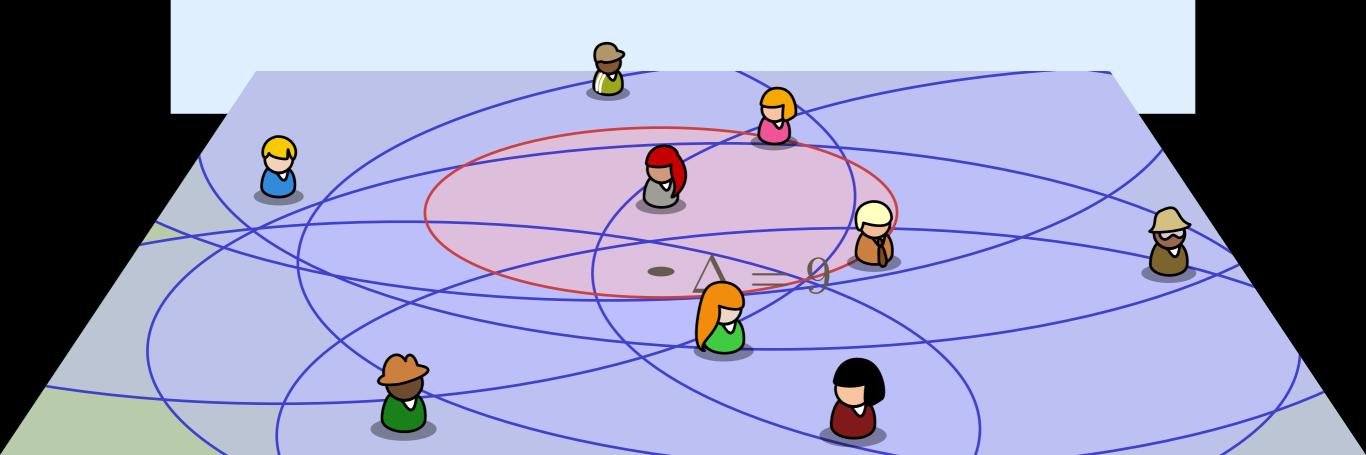
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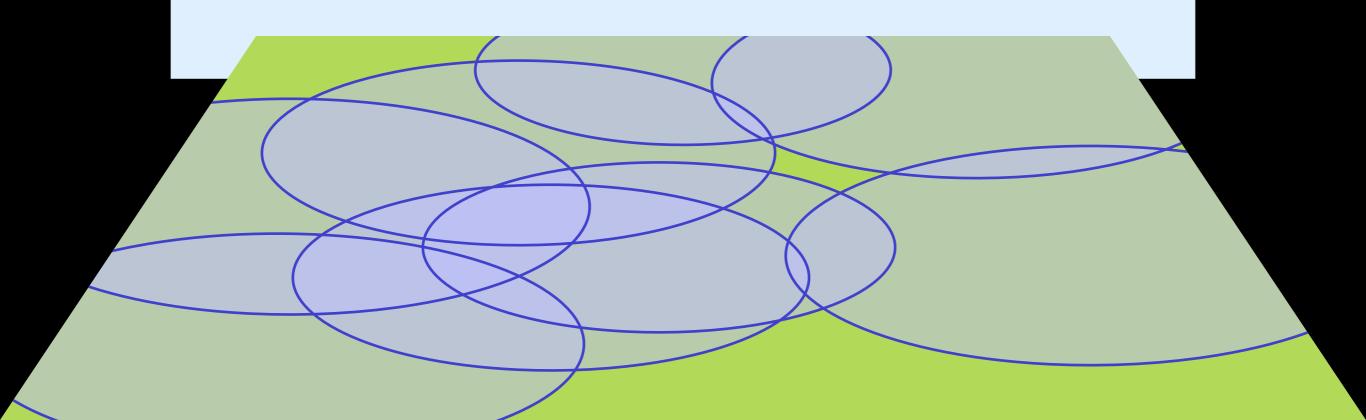


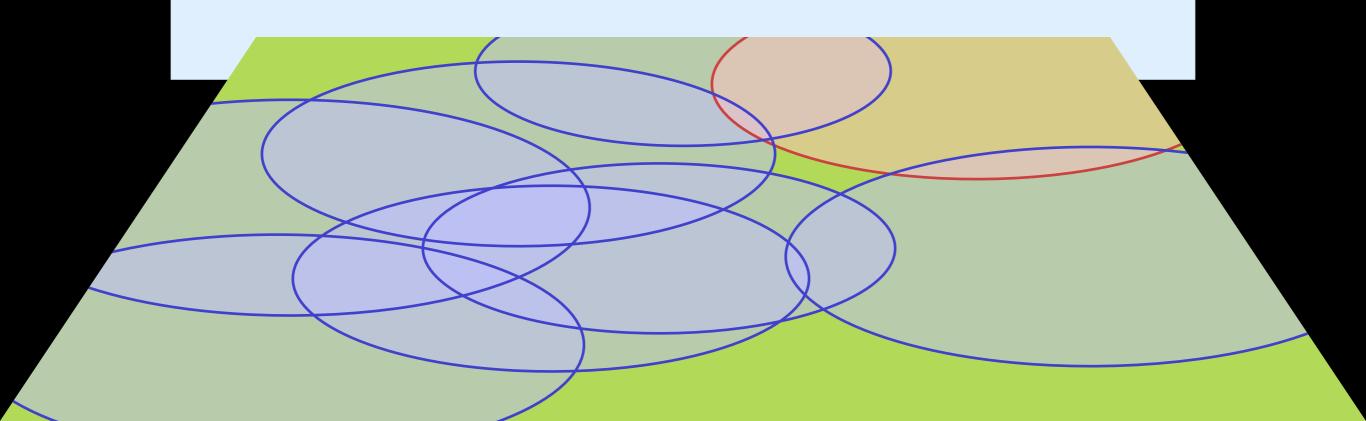
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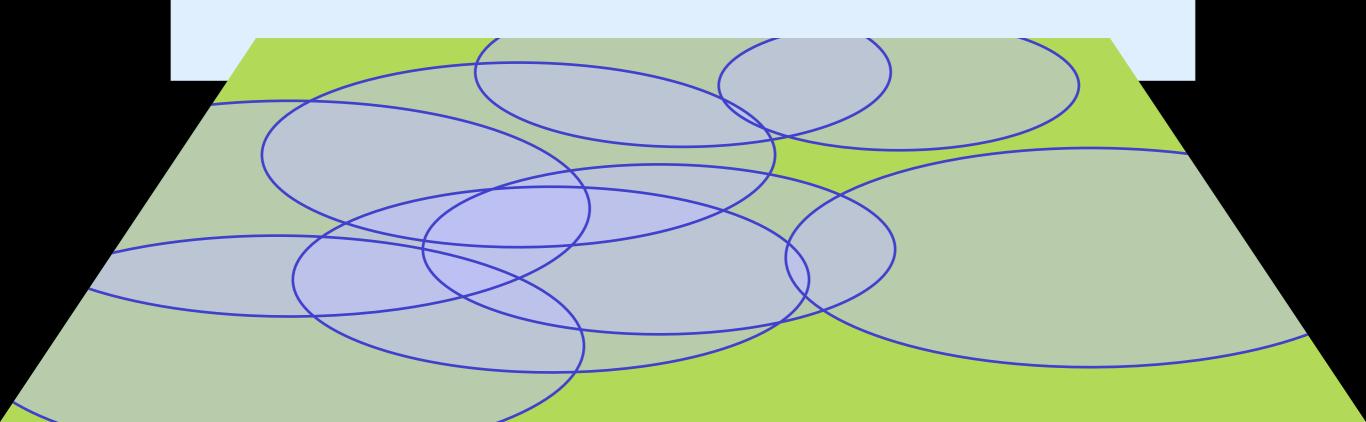


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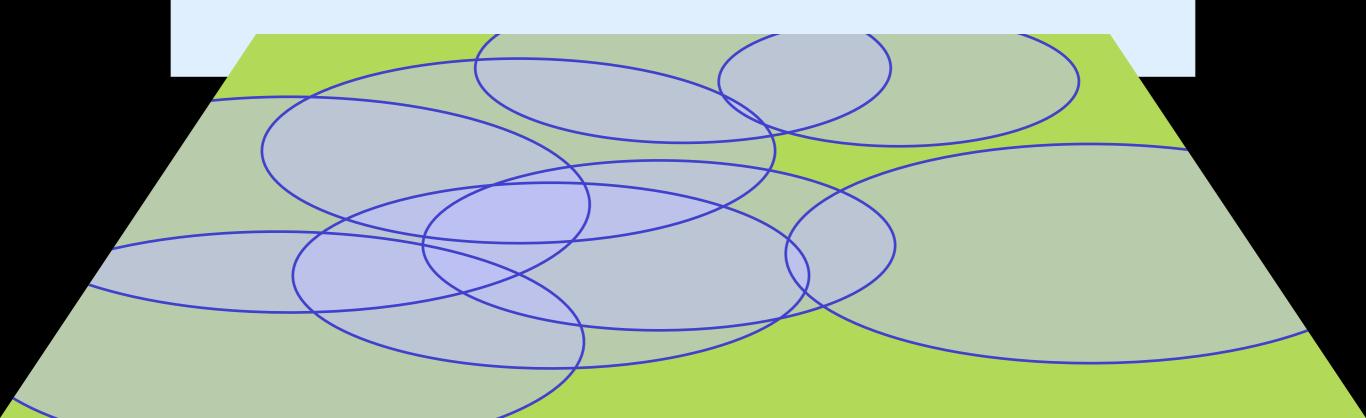




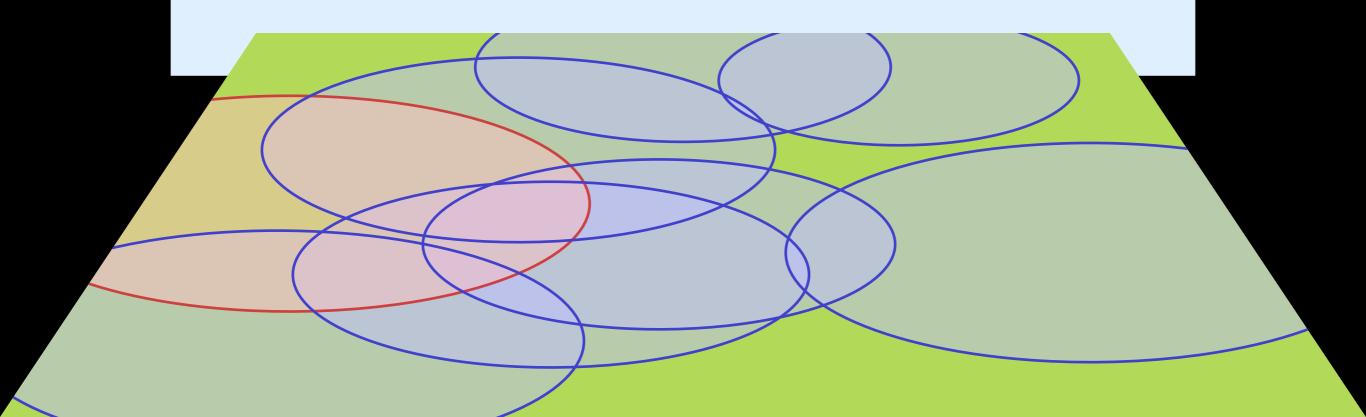




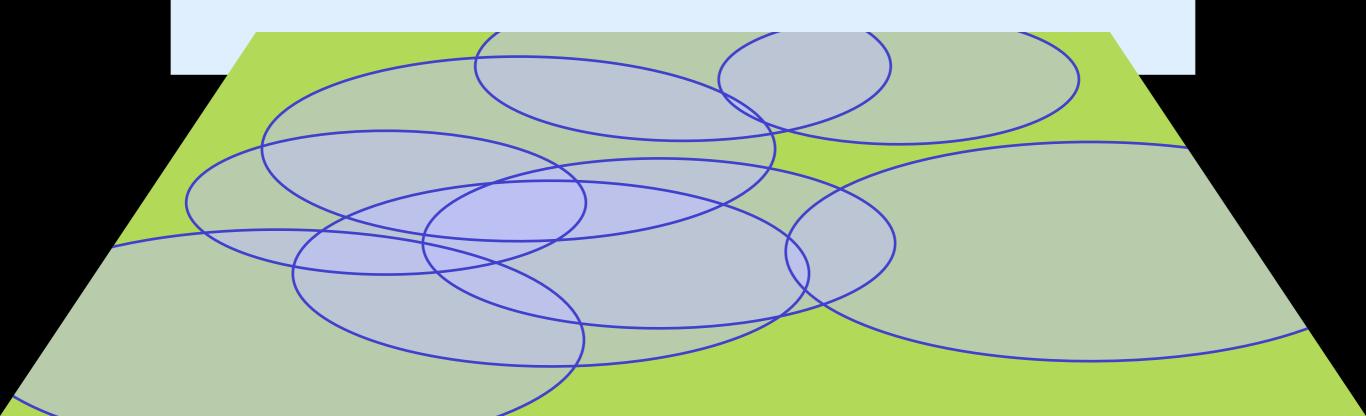
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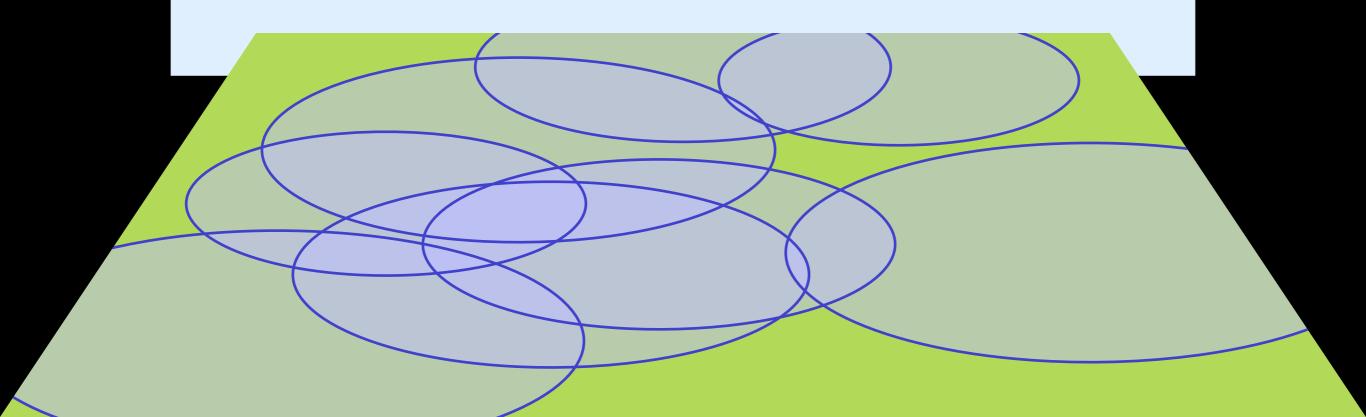
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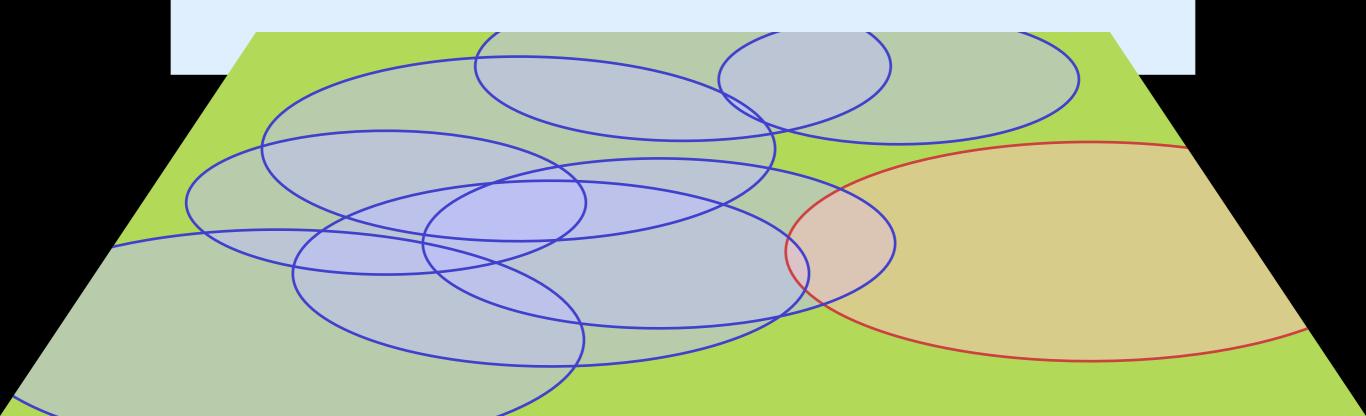
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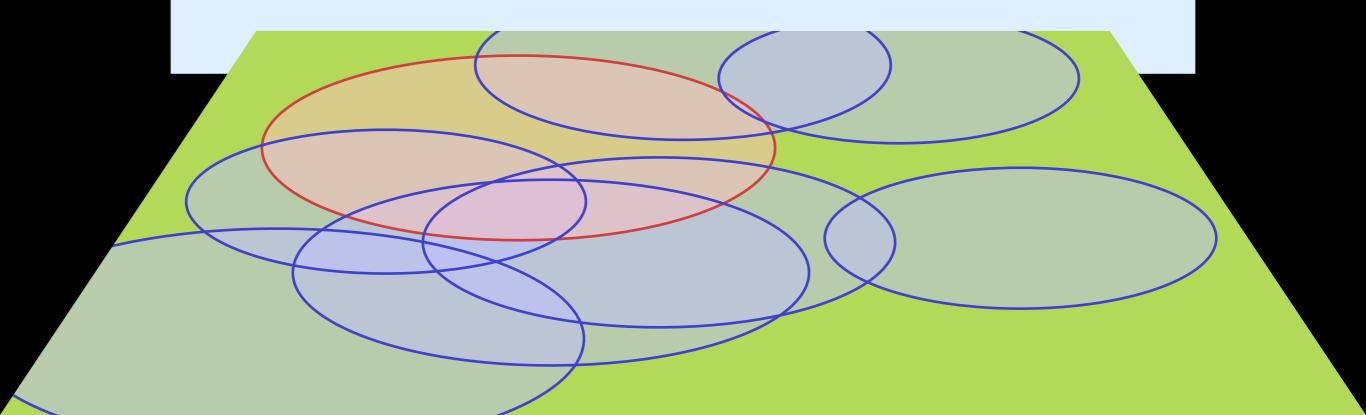
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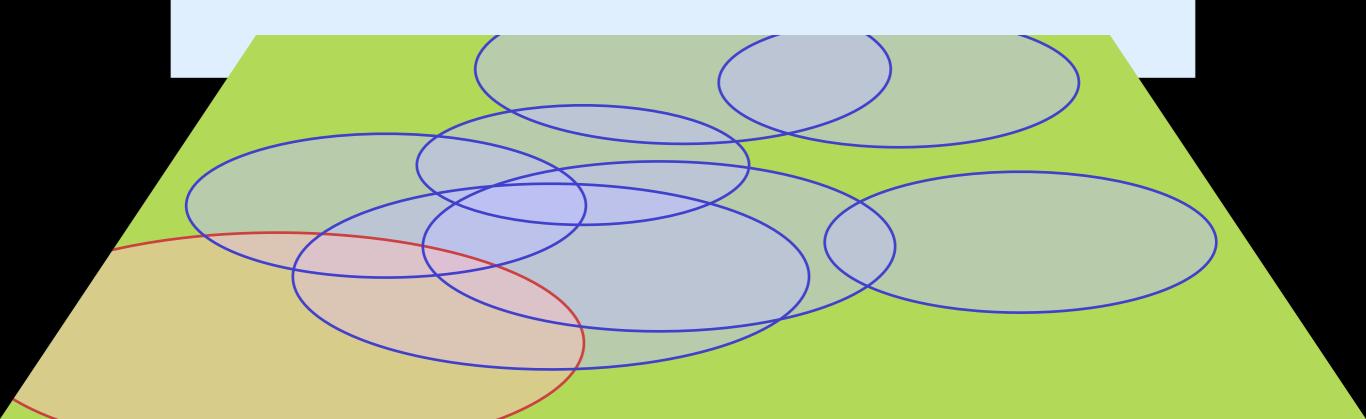
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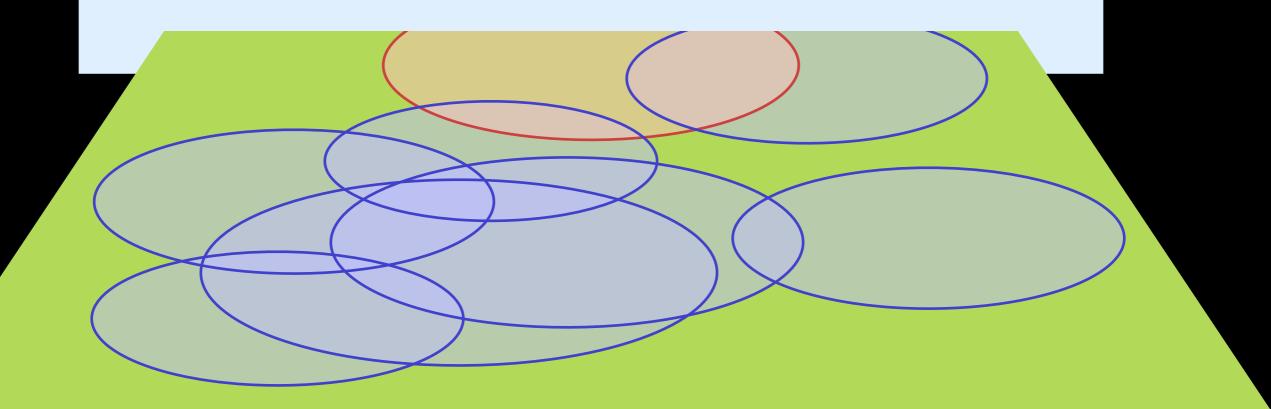
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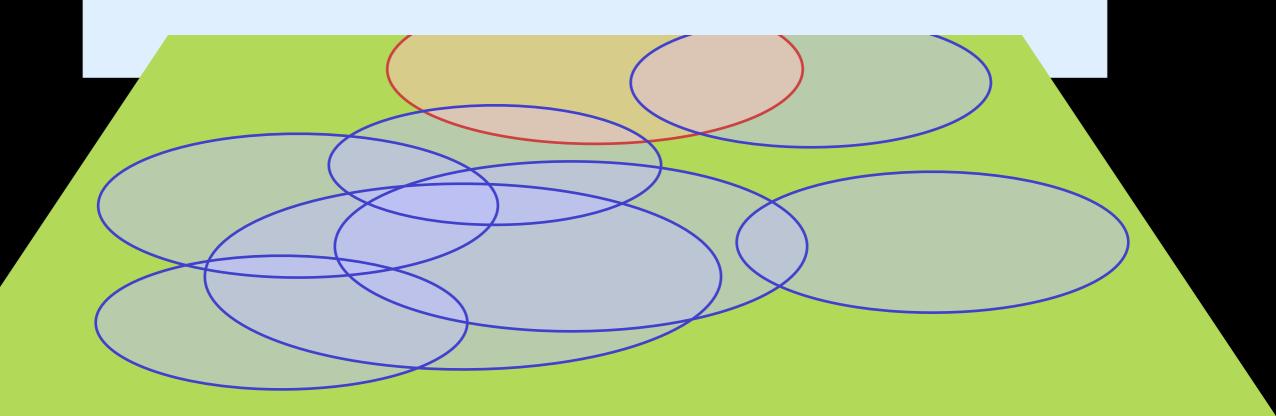
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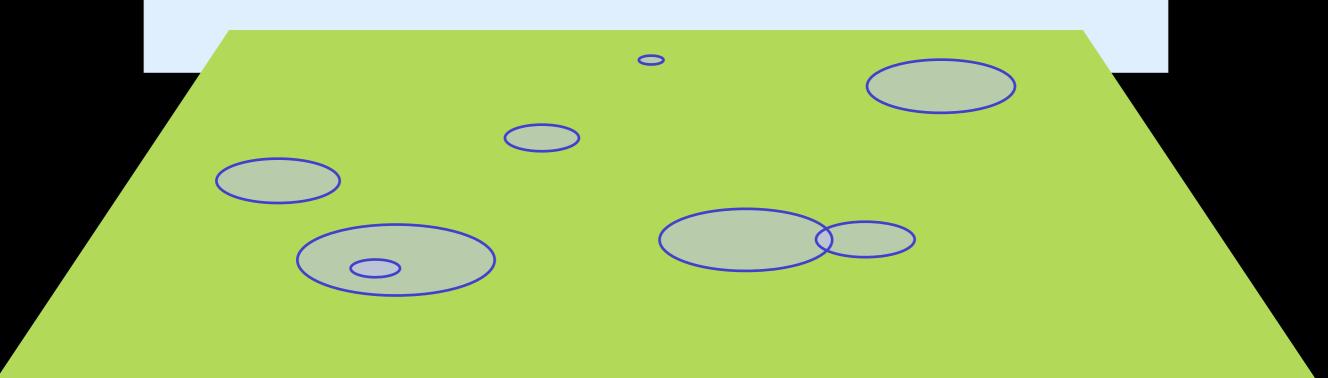
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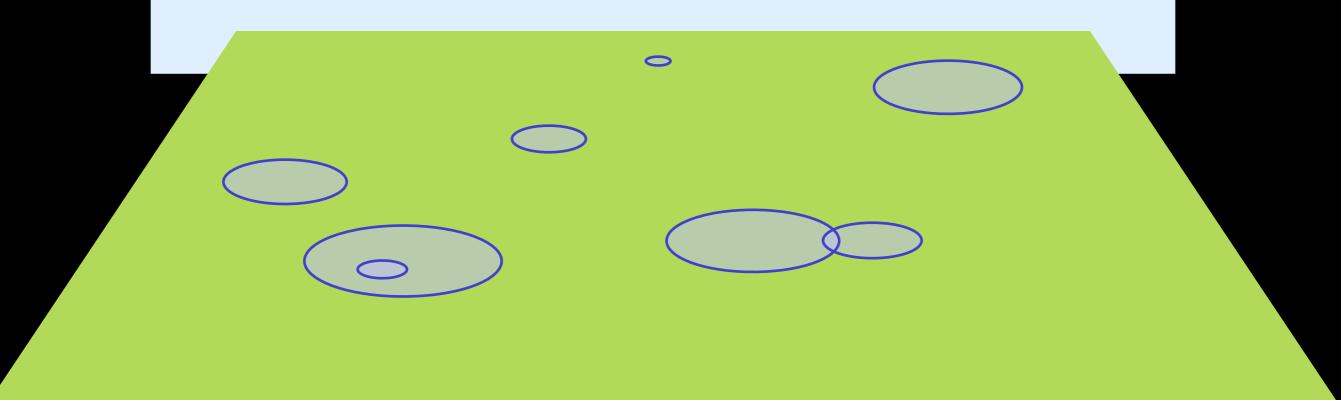
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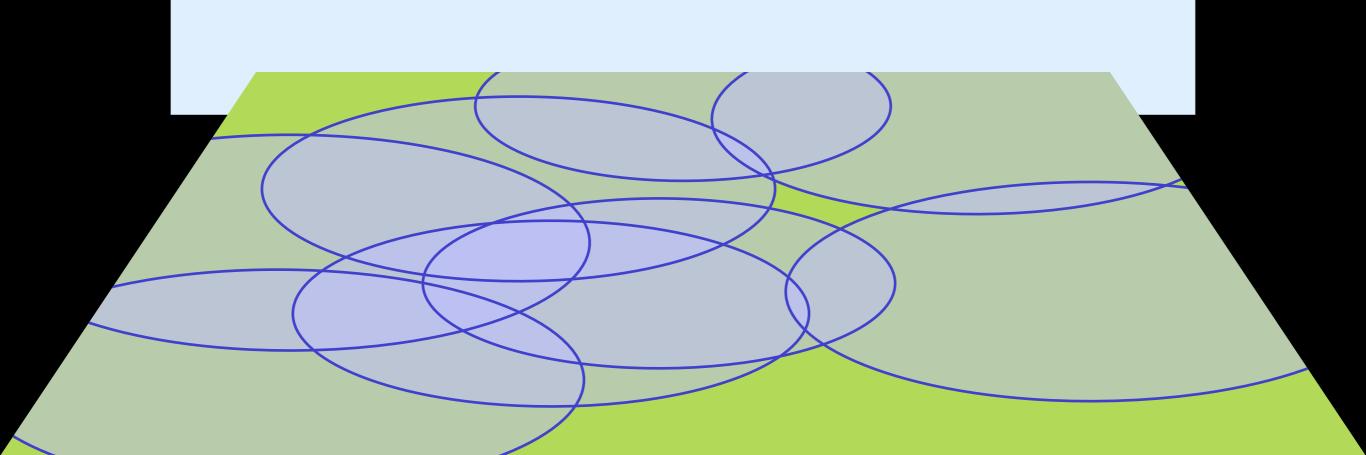
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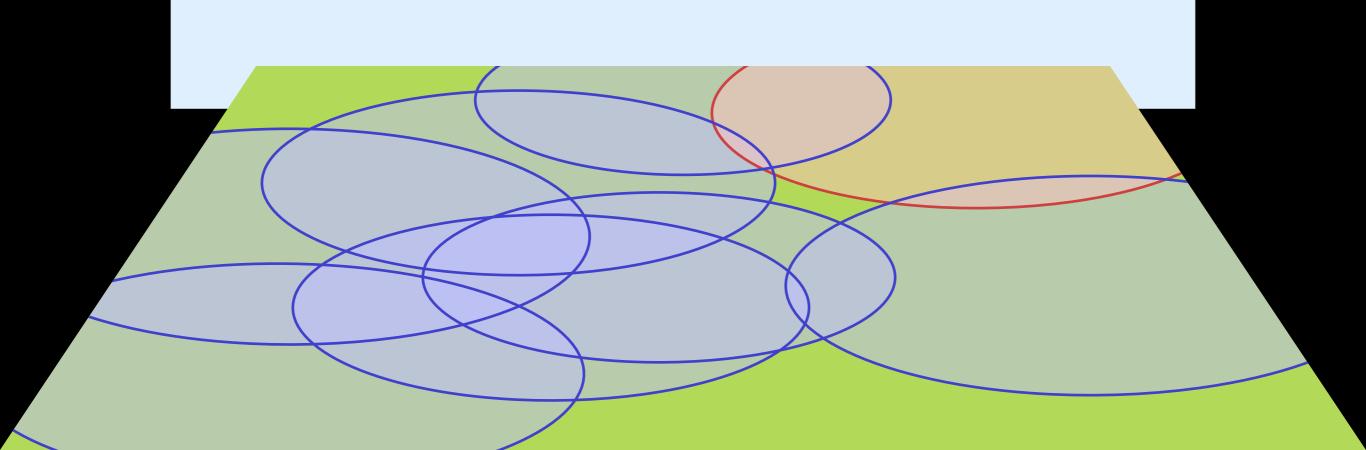


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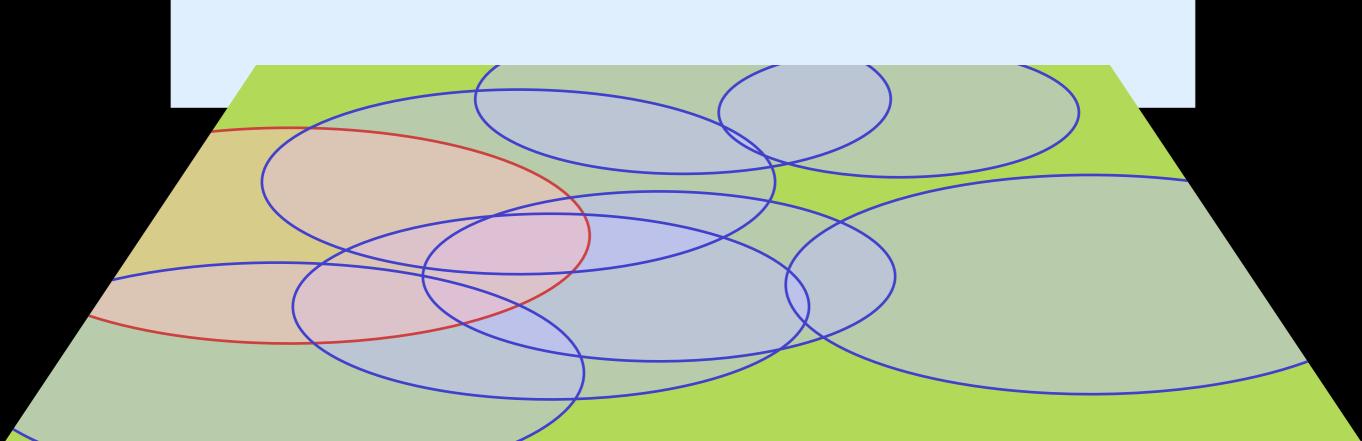
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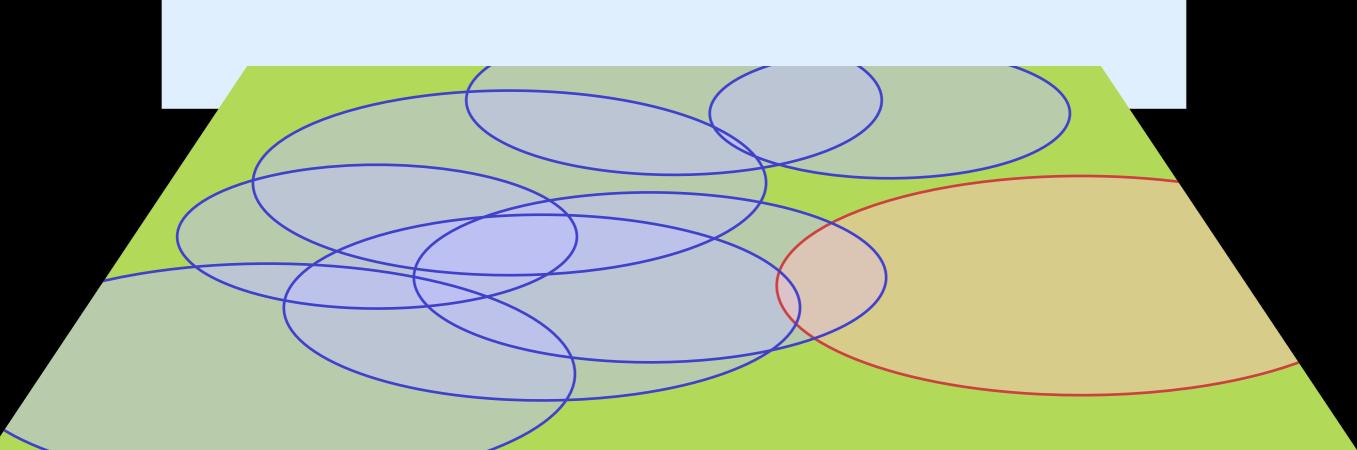
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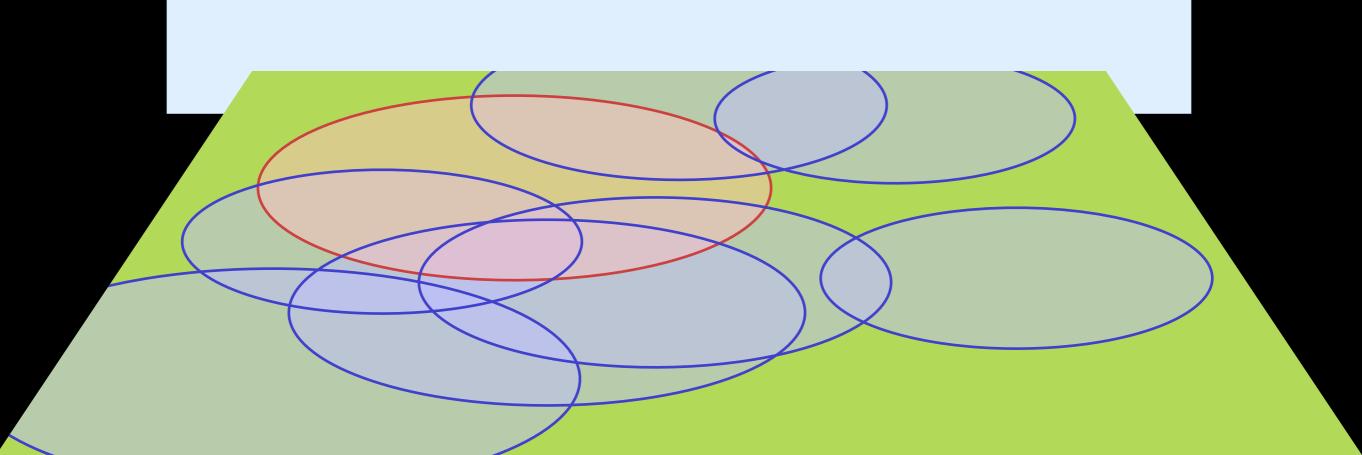
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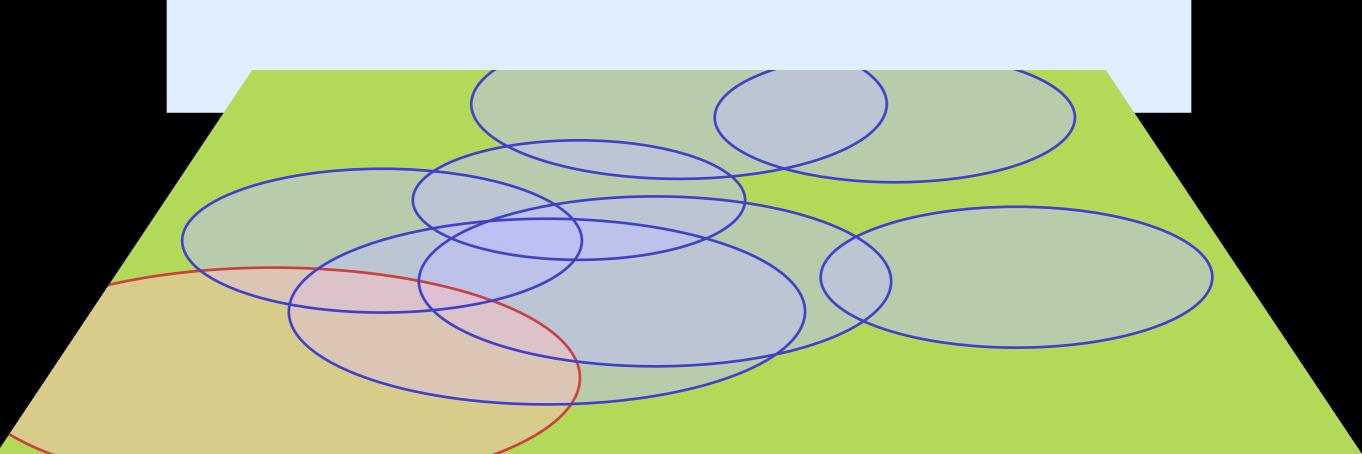


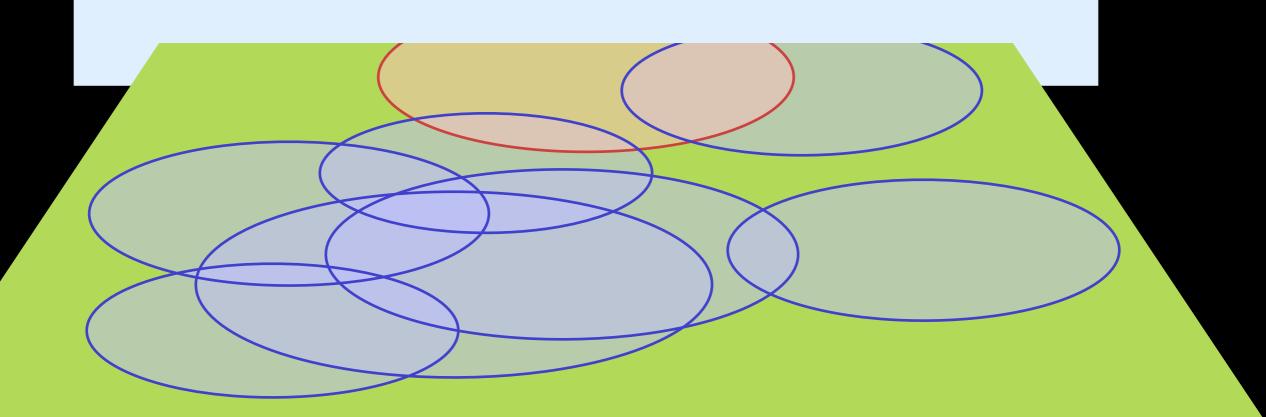
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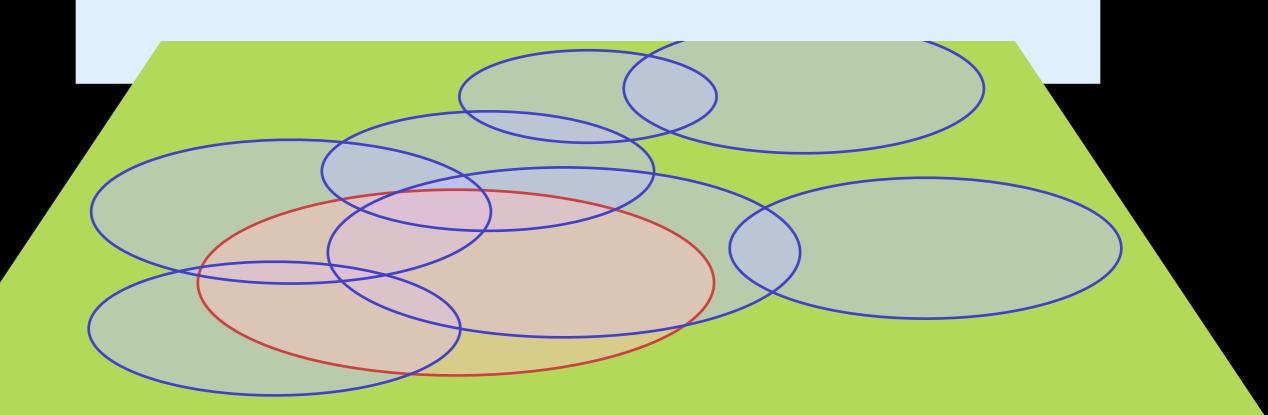


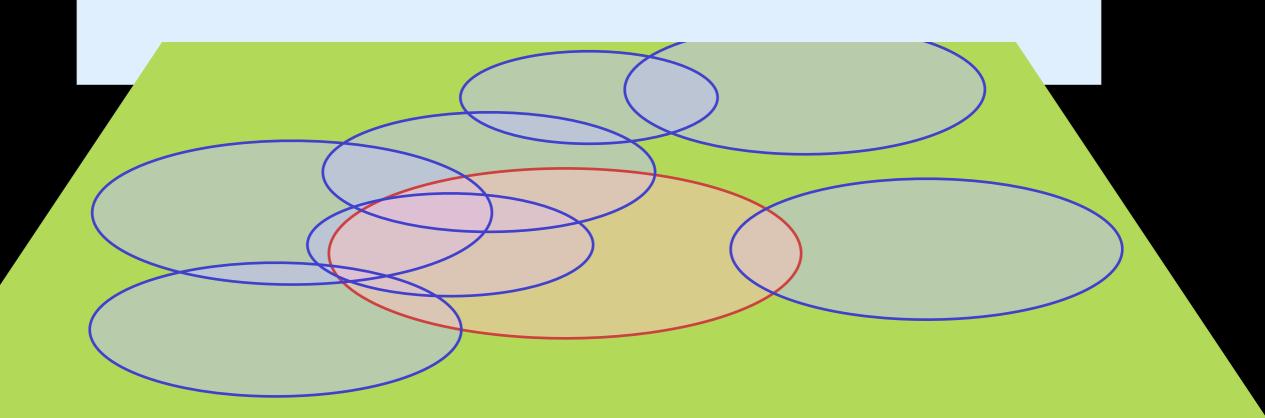
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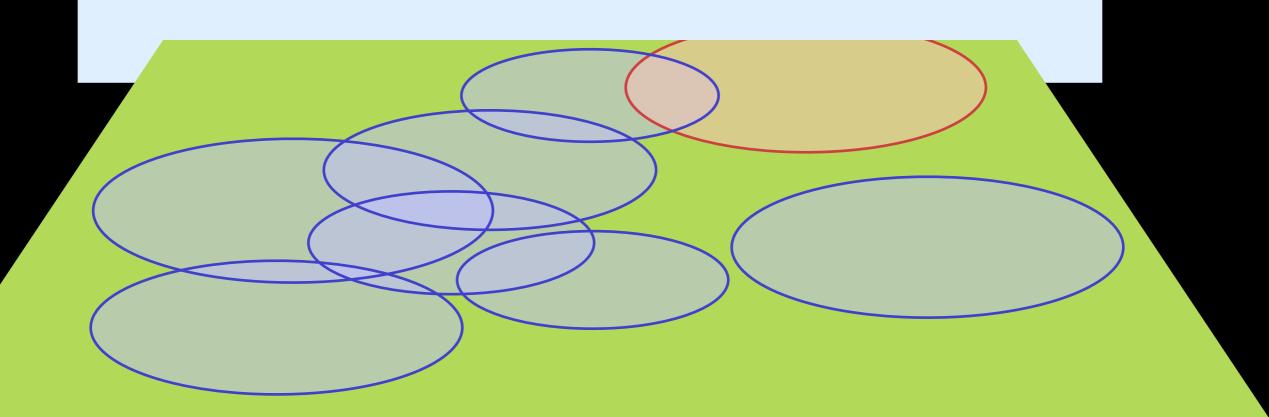


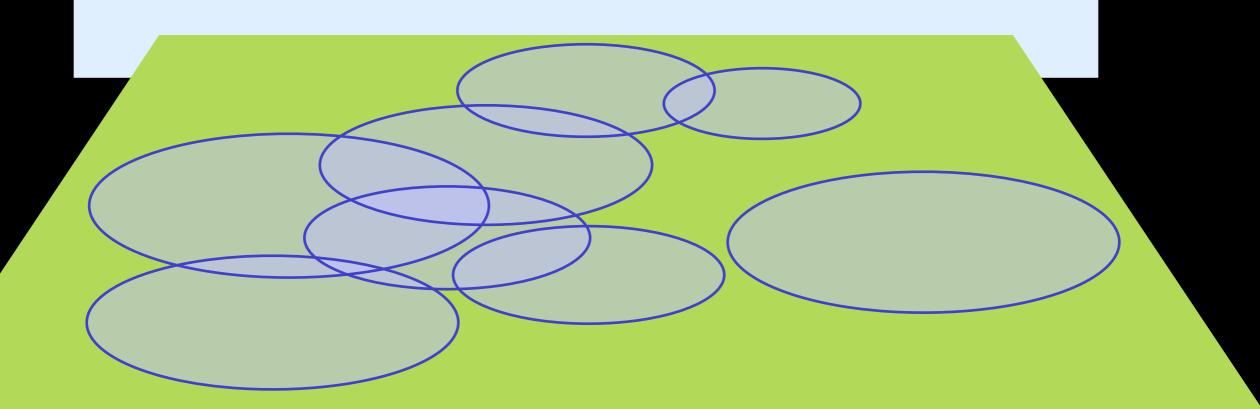




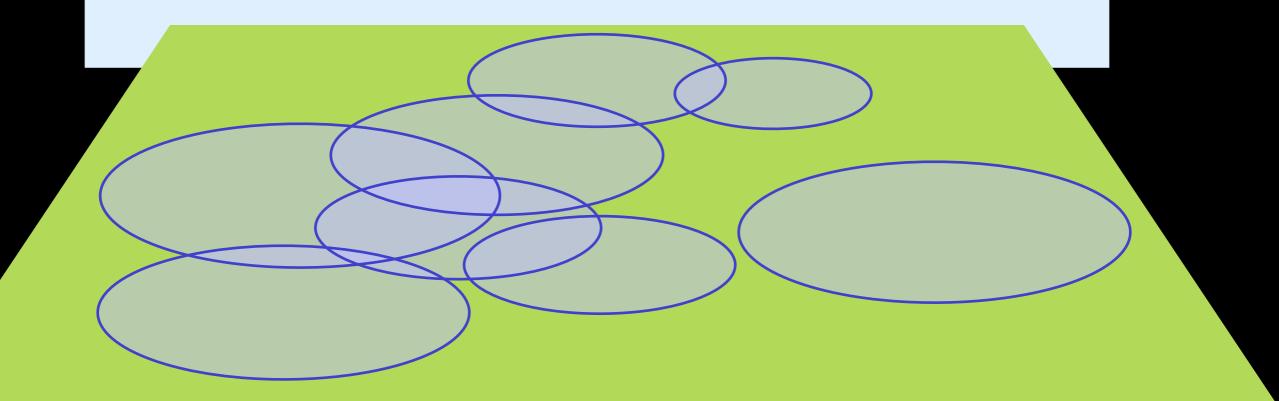




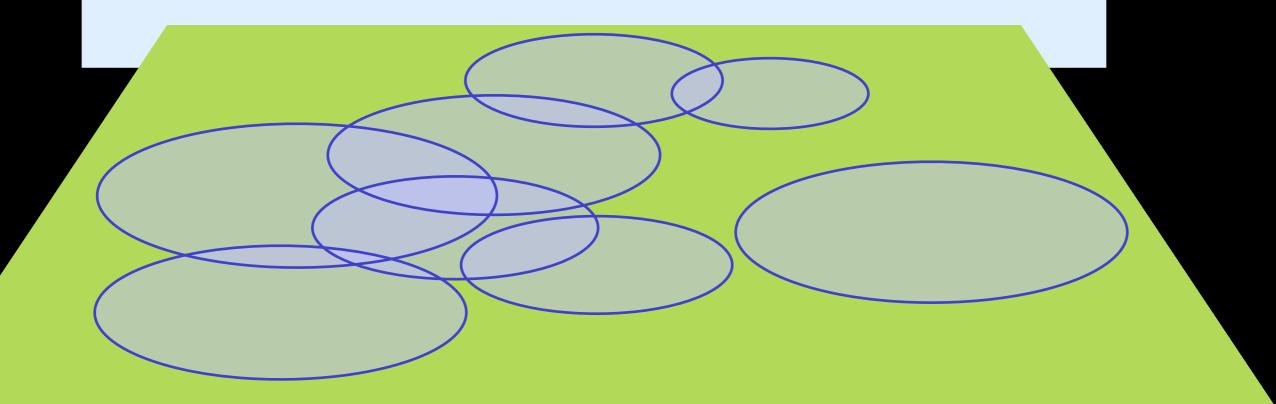




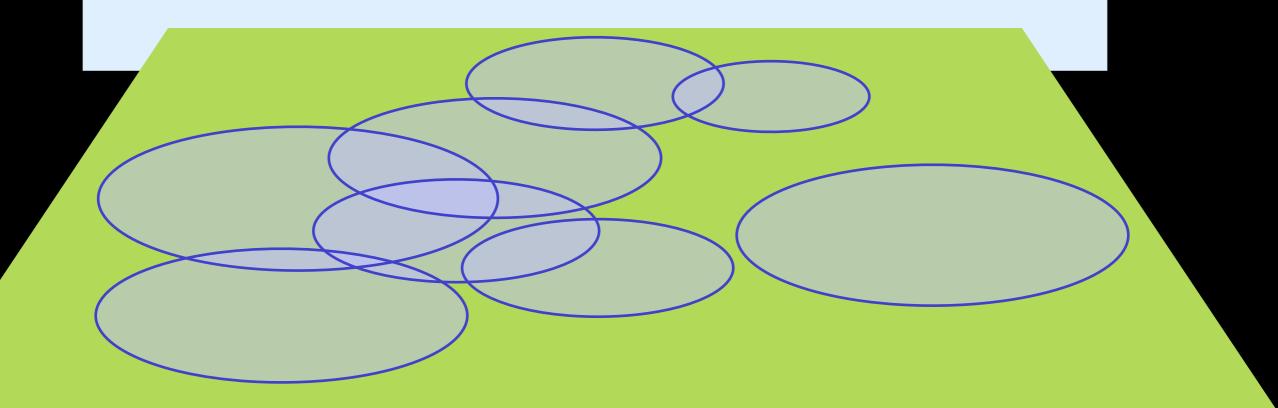
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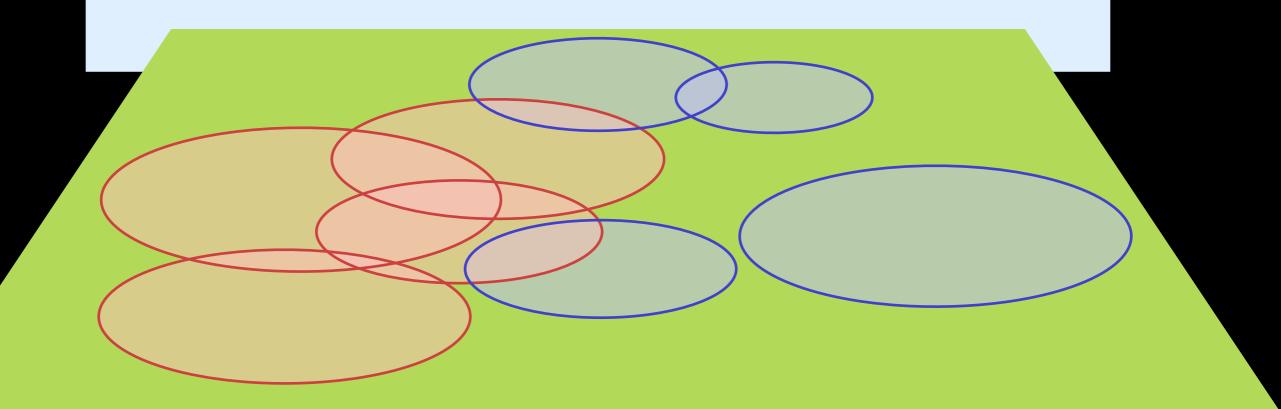
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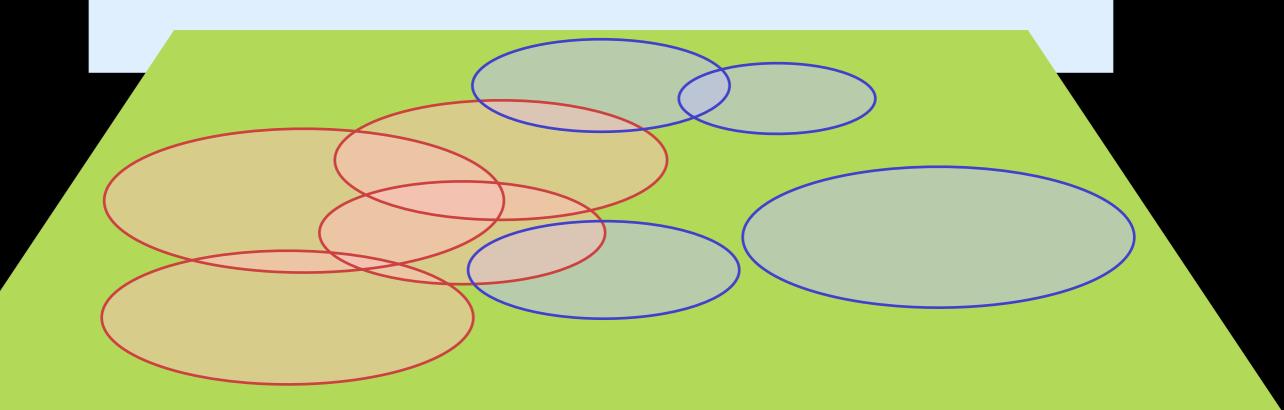
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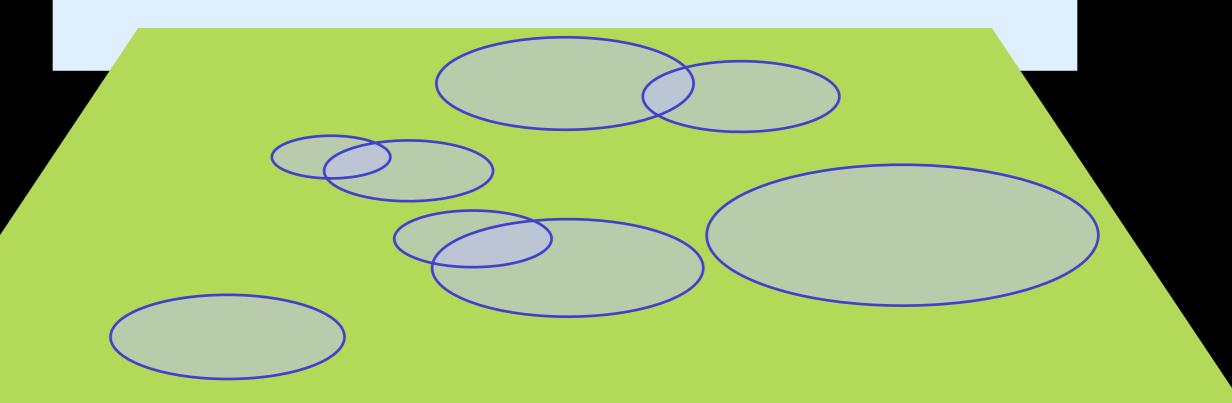
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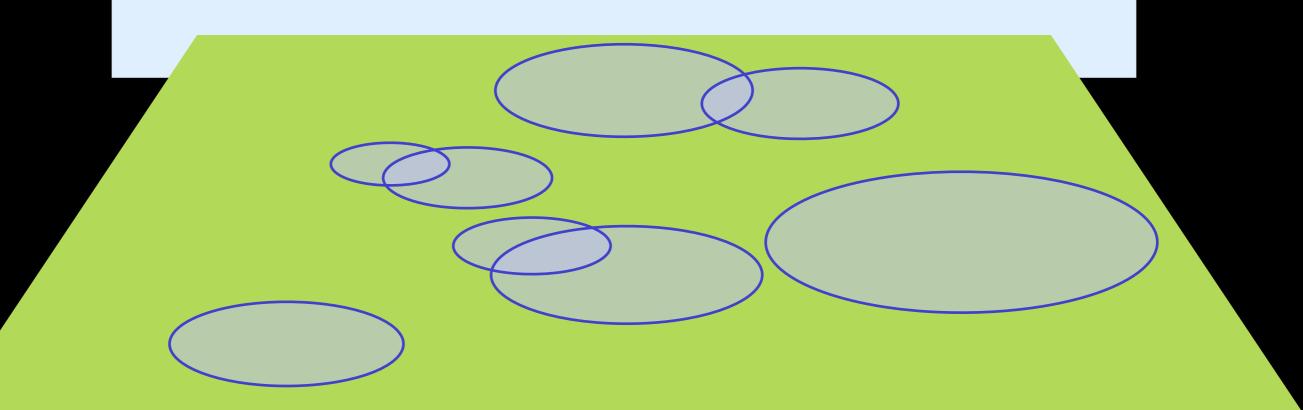
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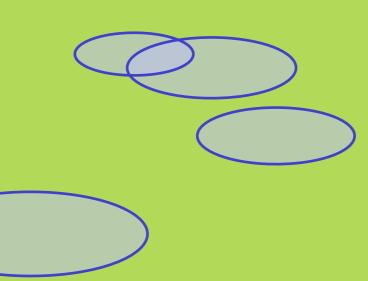
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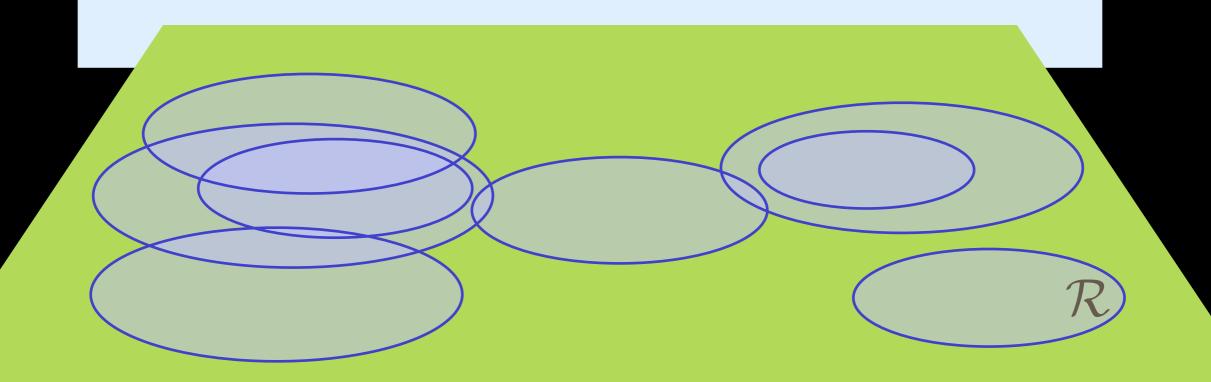
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CLAIM: Resulting ply Δ is within a constant factor of optimal!

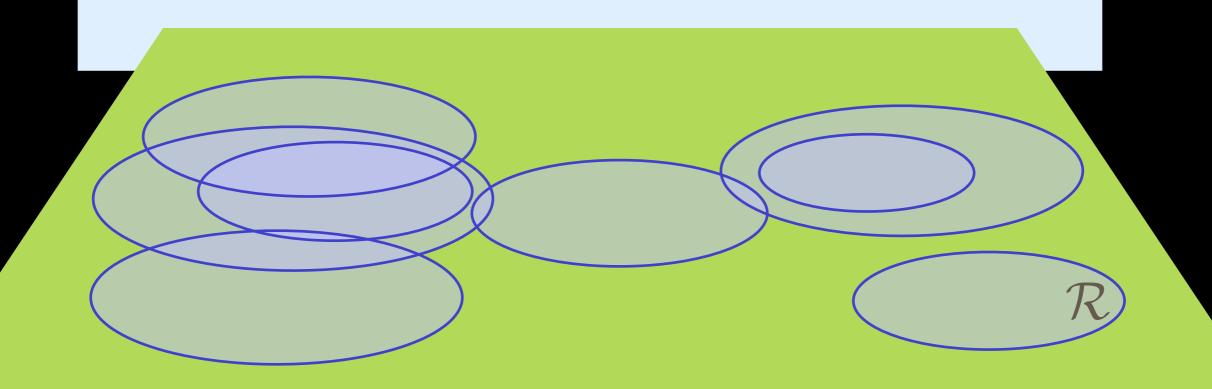
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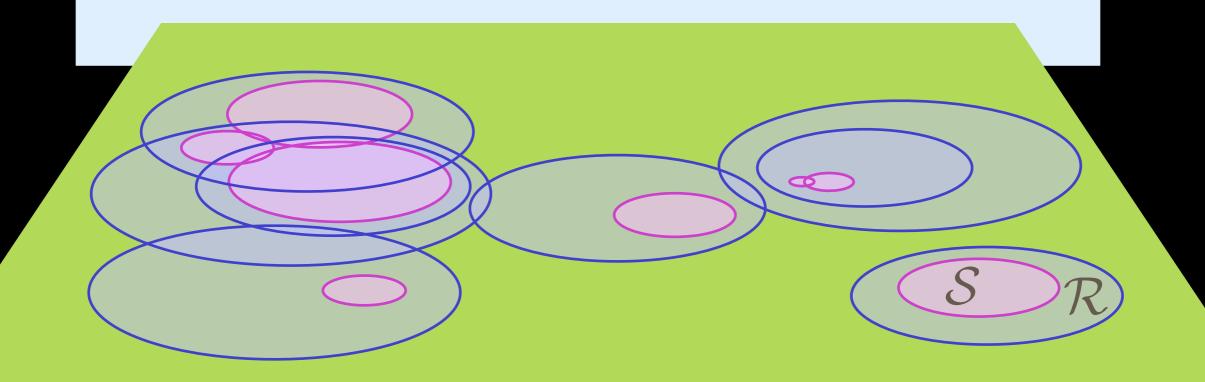
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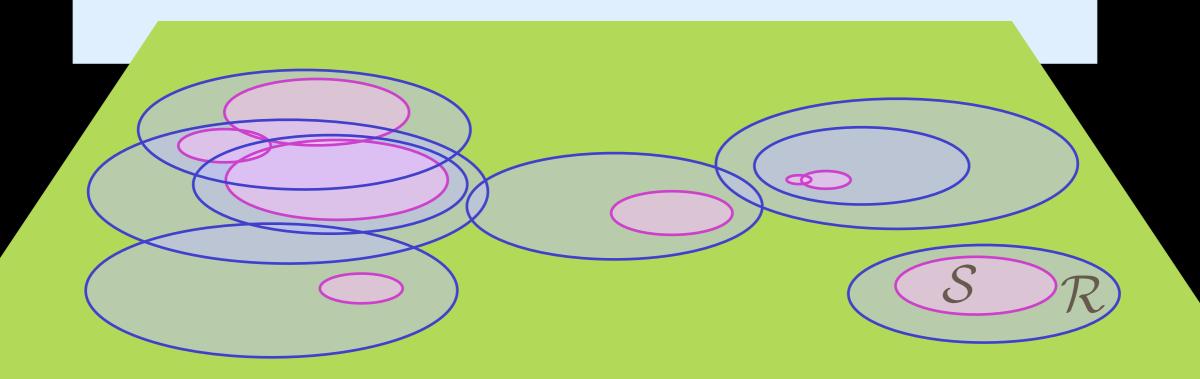
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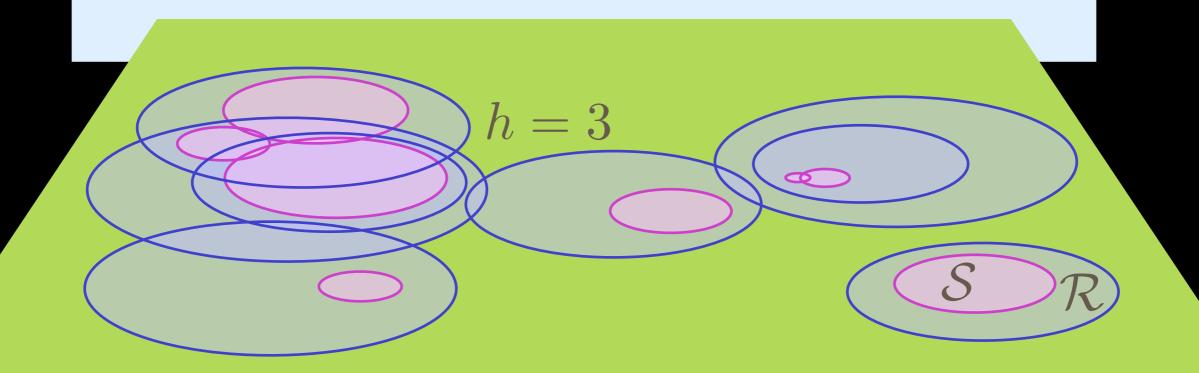
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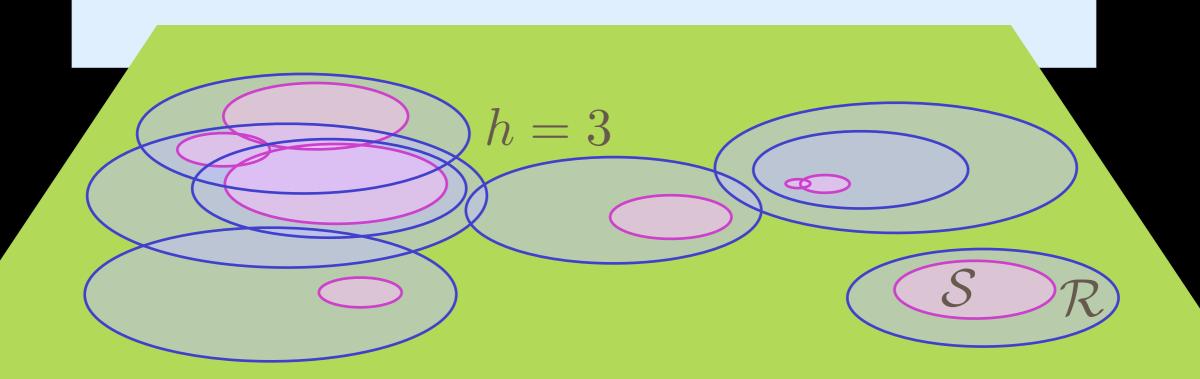
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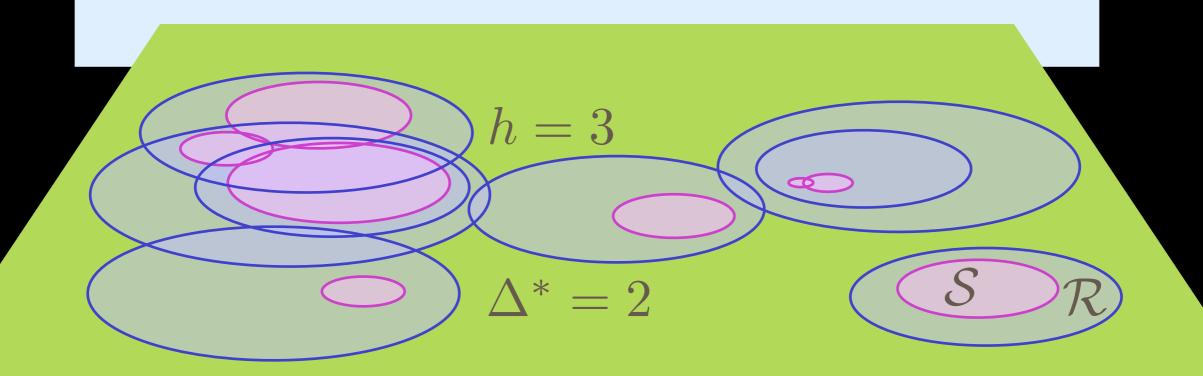


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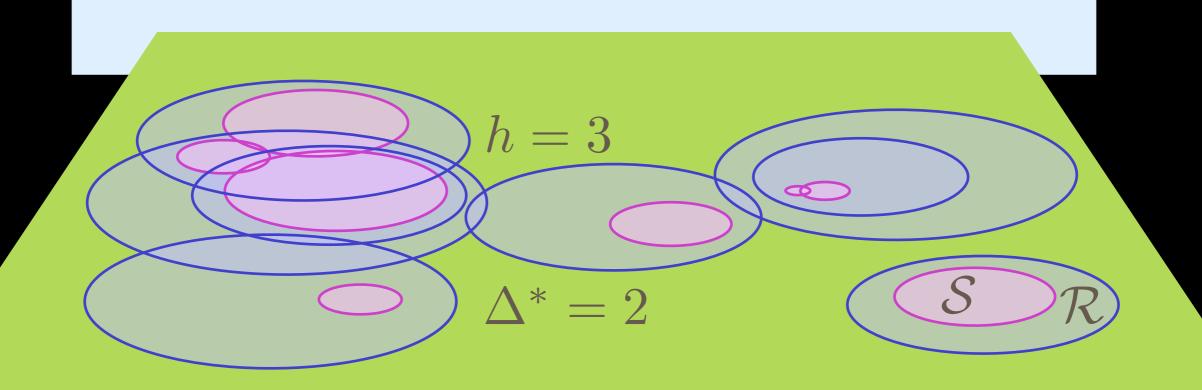


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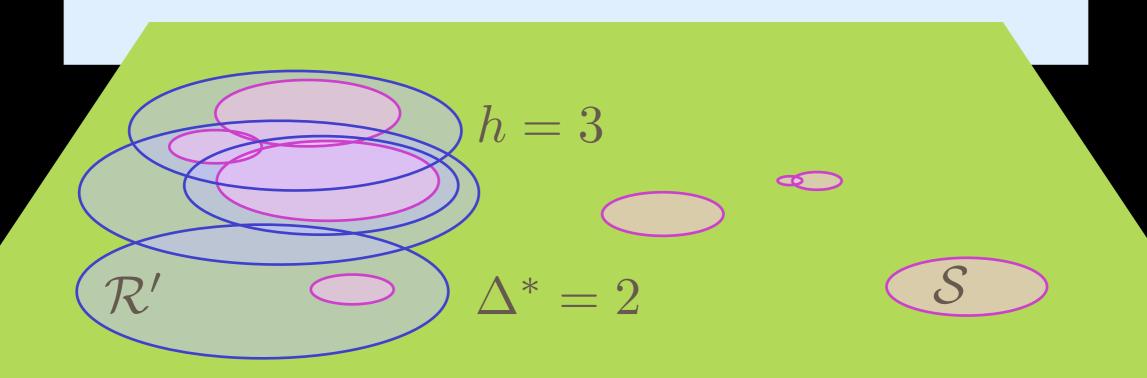
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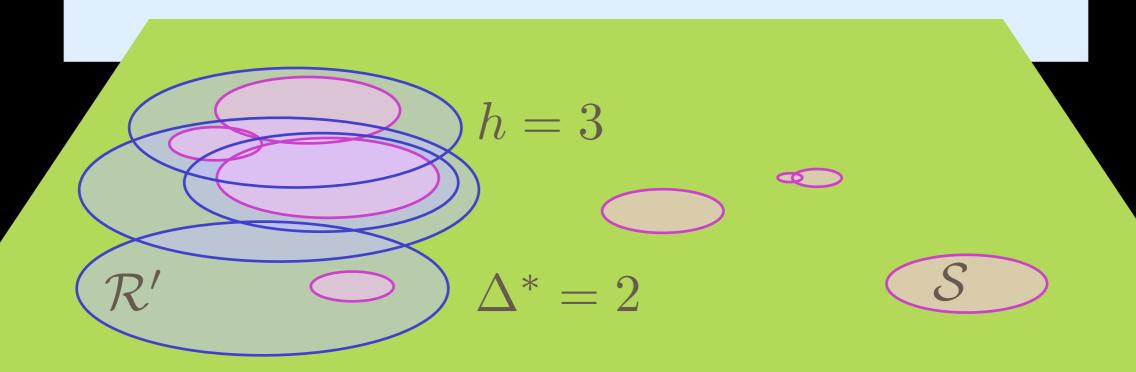
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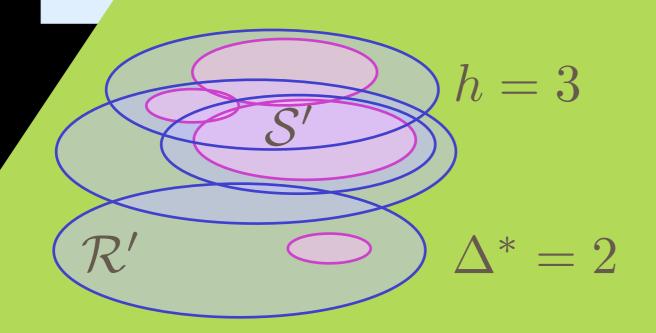
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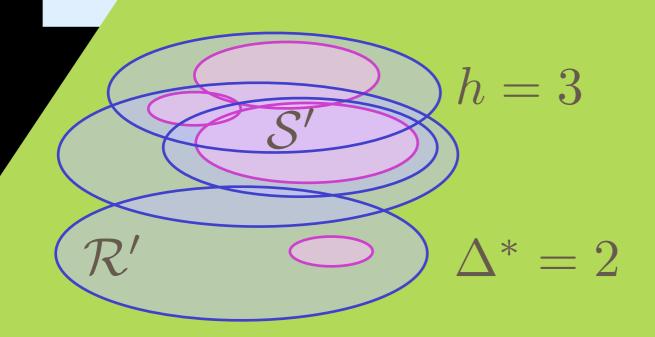
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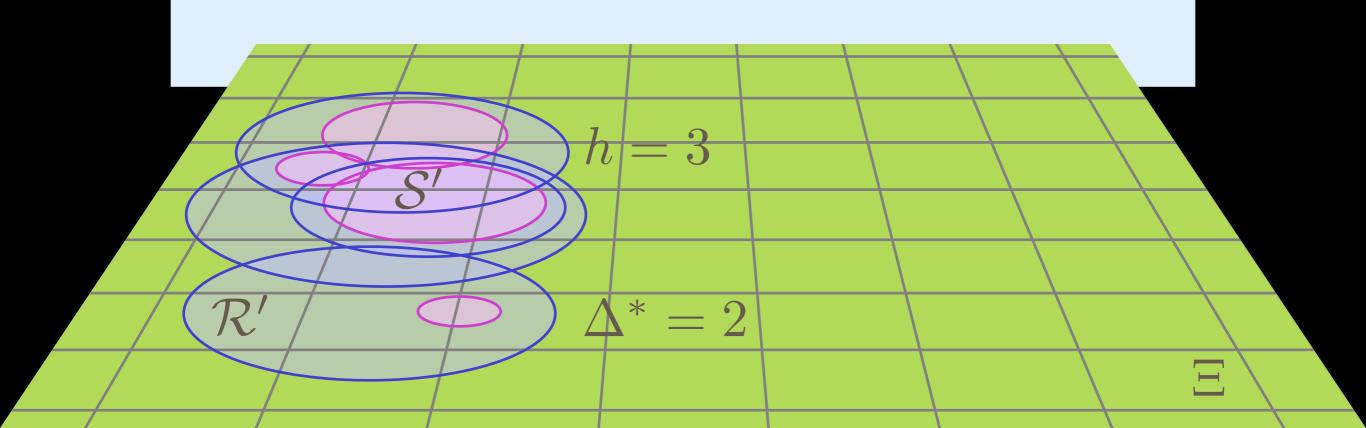
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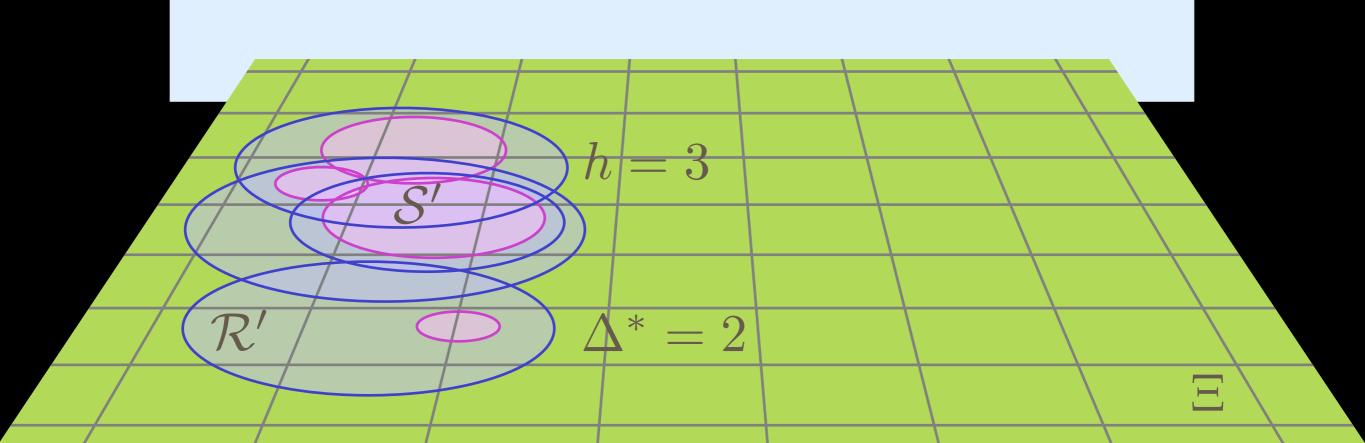
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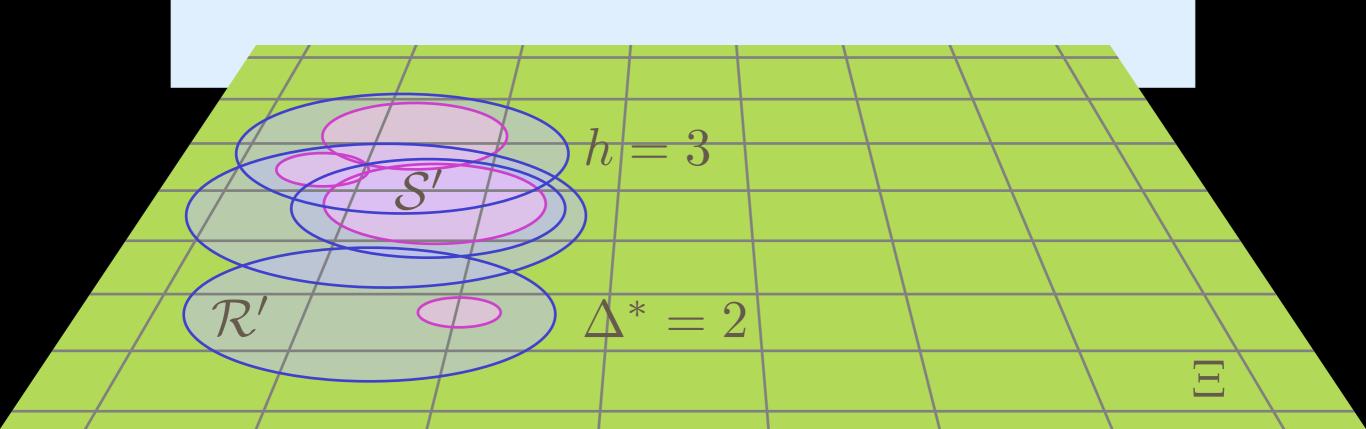
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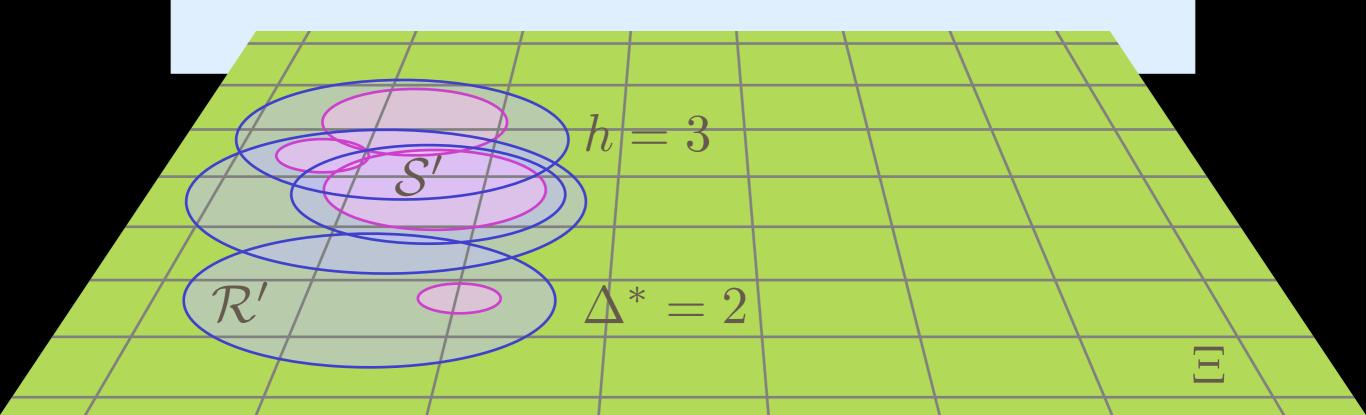
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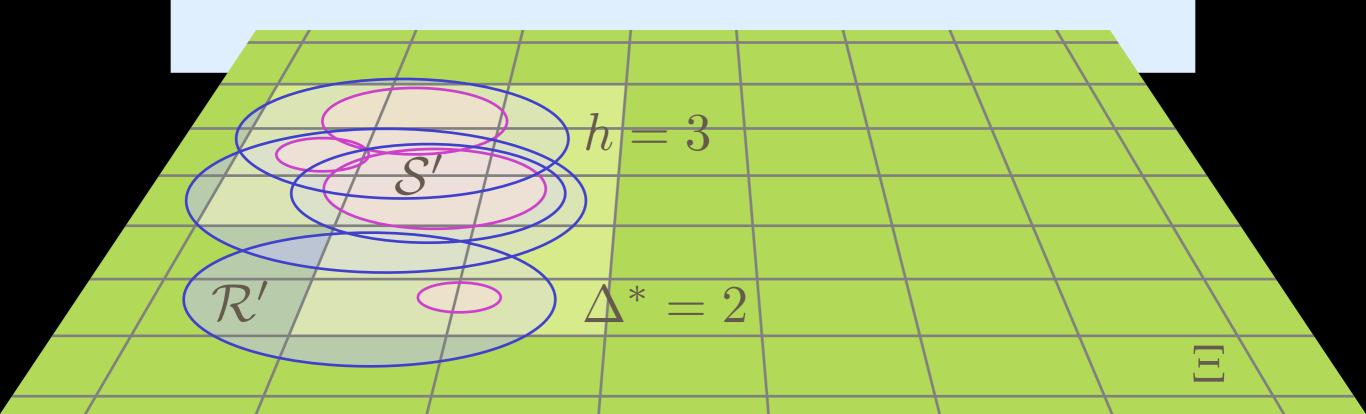
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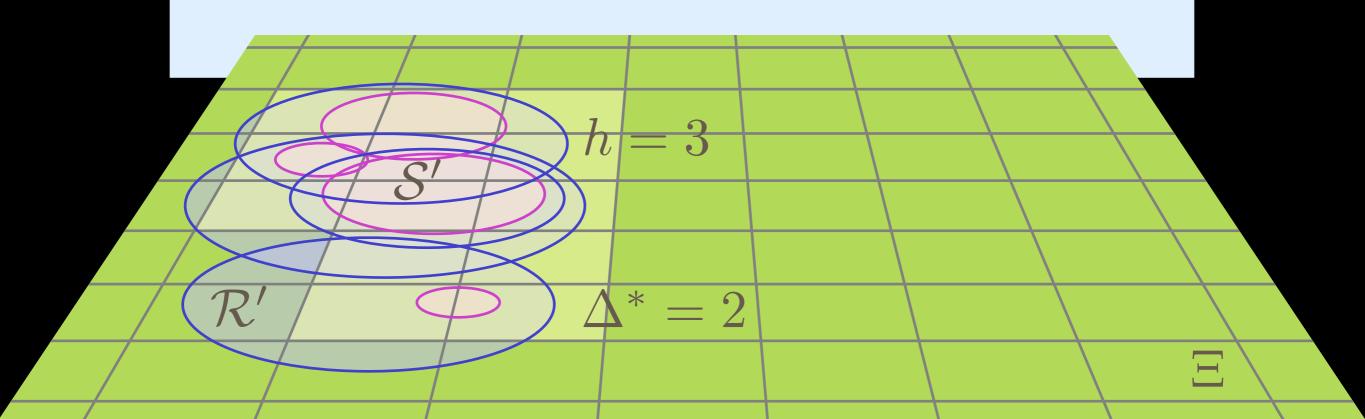


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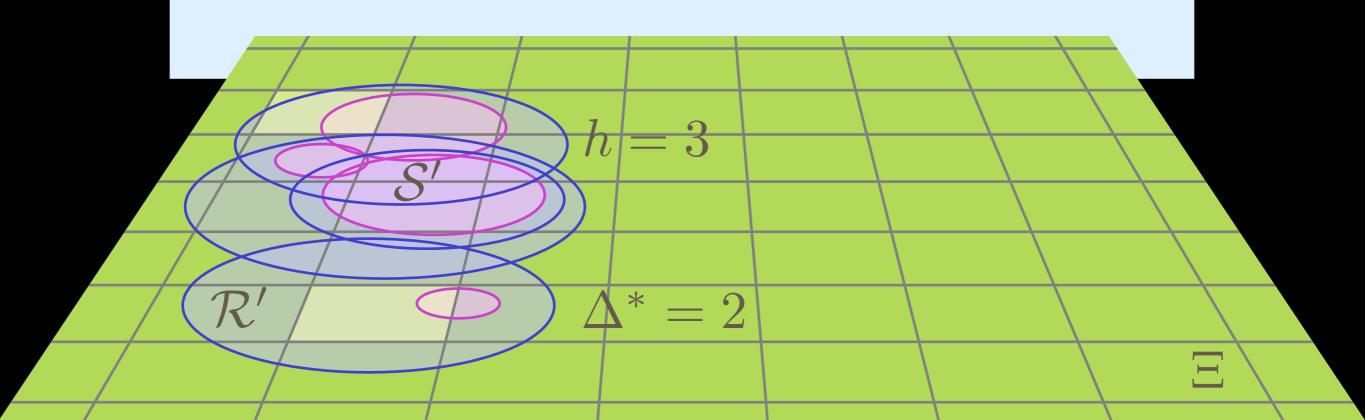
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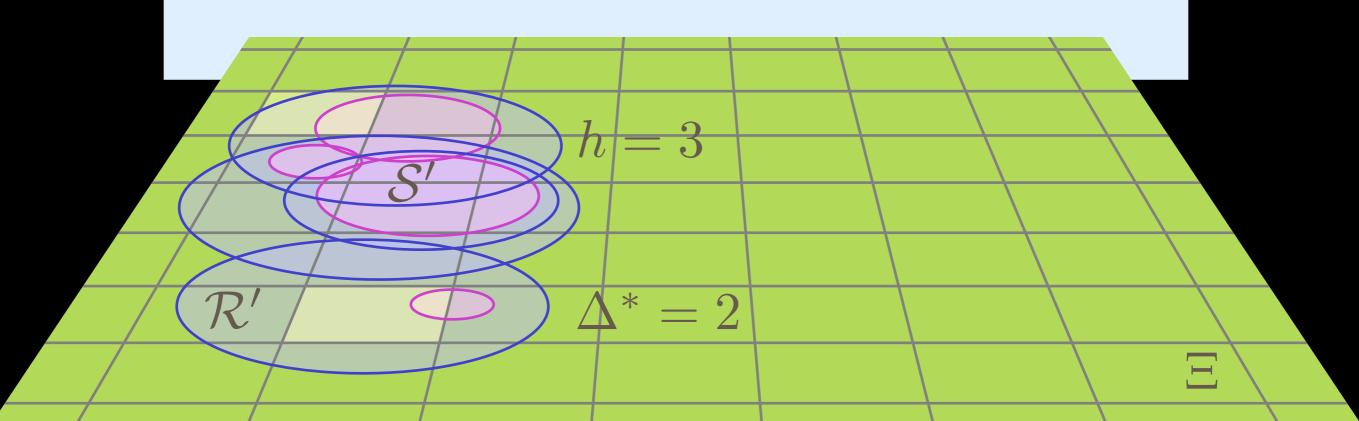


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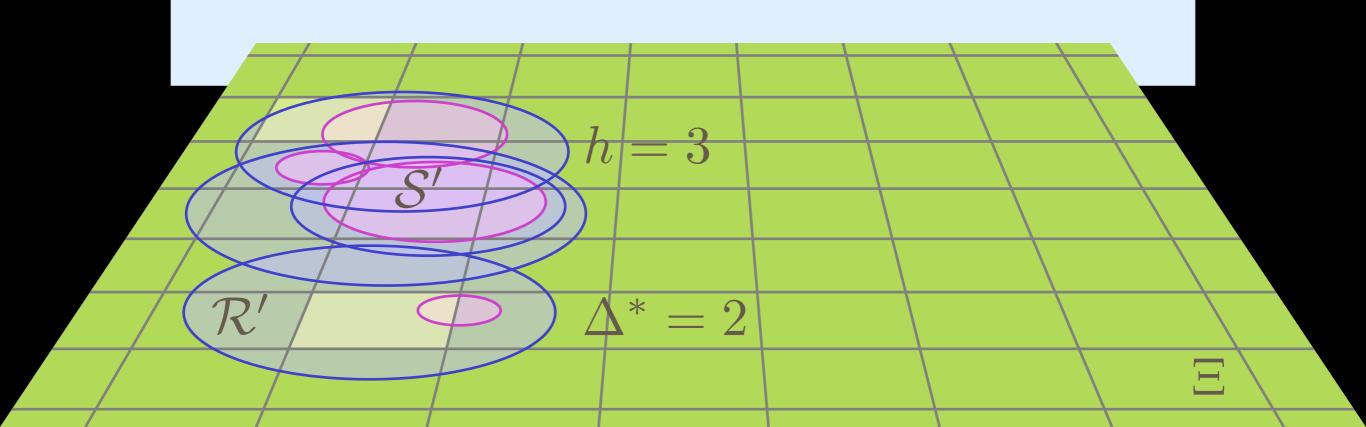
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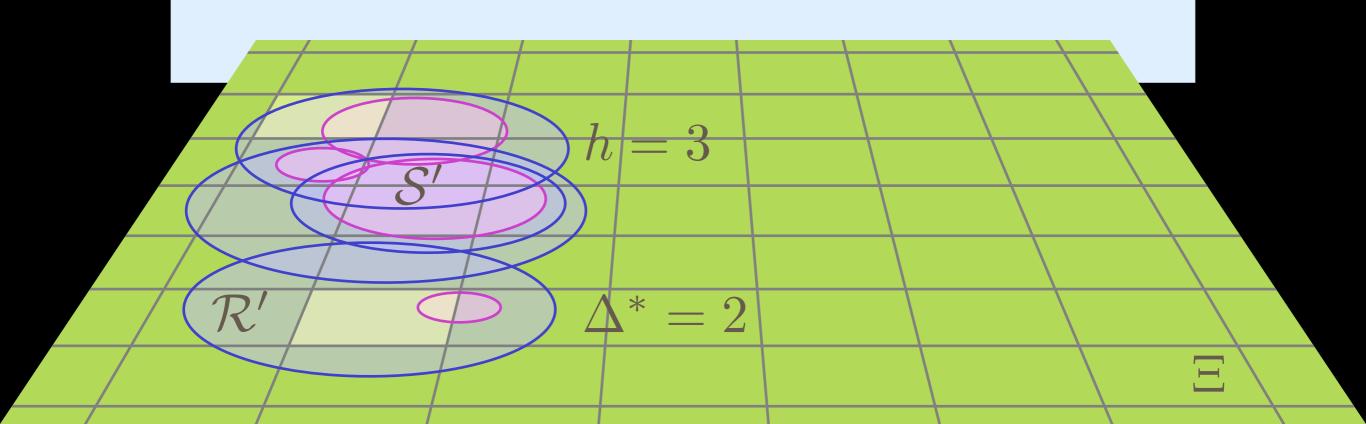
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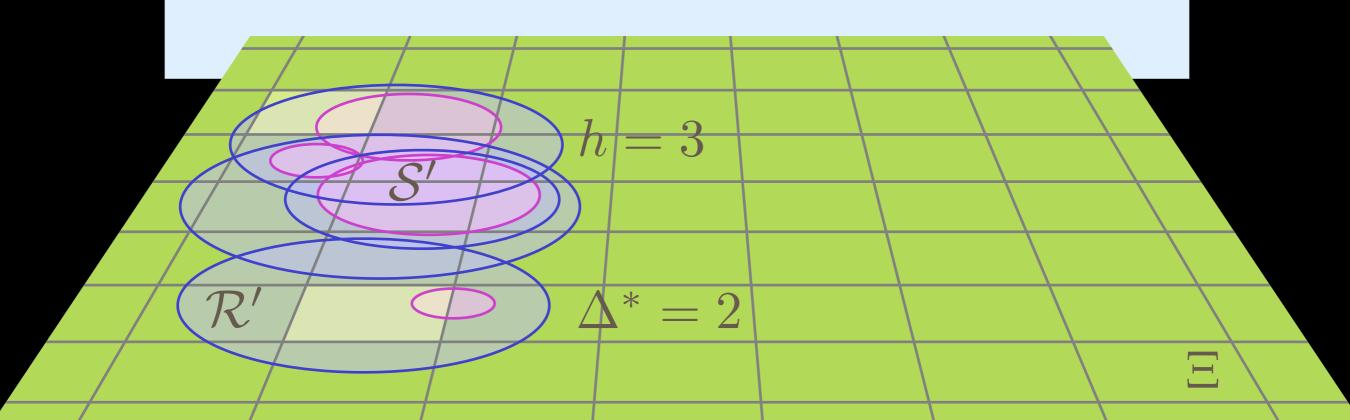


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 - \mathcal{S}' covers an area of at least $\Omega(n^3/\Delta^*)$
 - \mathcal{S}' intersects at least $\Omega(n/\Delta^*)$ cells of Ξ
 - There is an independent set I of cells of Ξ that are intersected by \mathcal{S}' of size $\Omega(n/\Delta^*)$
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 - Even knowing the full trajectories

