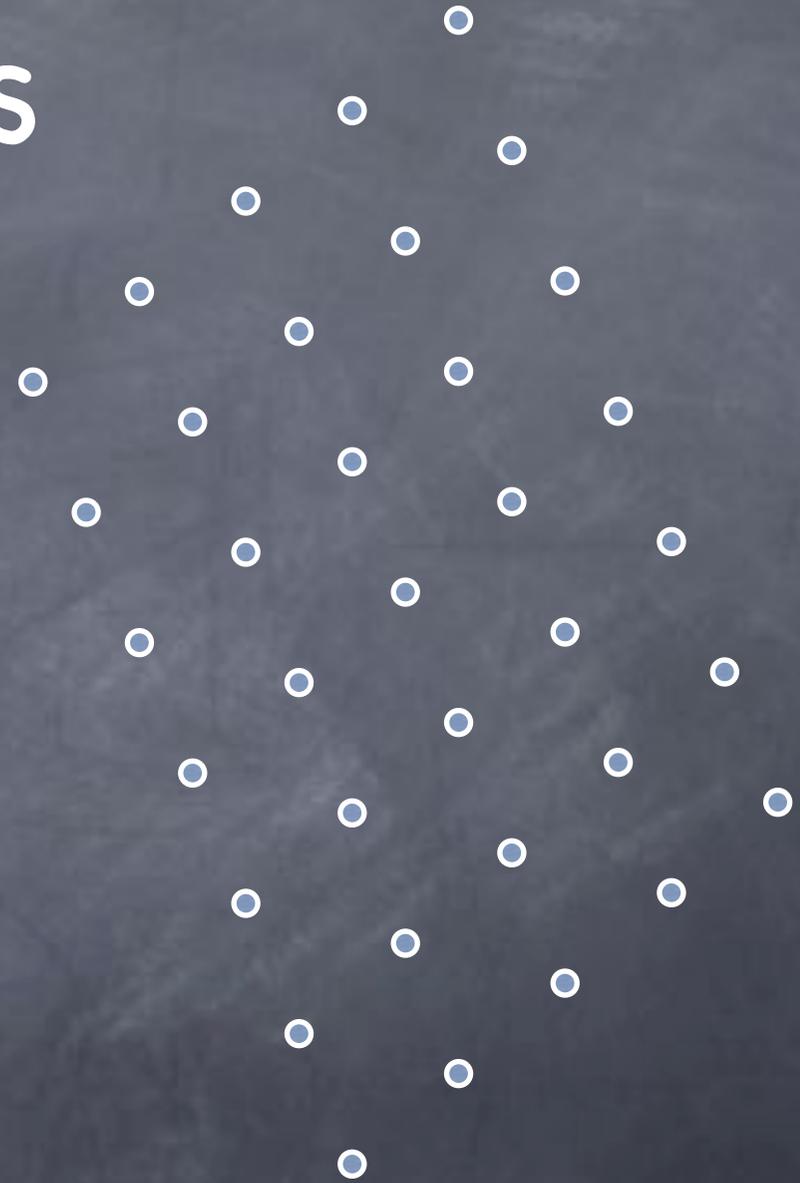


Lattice Cryptography

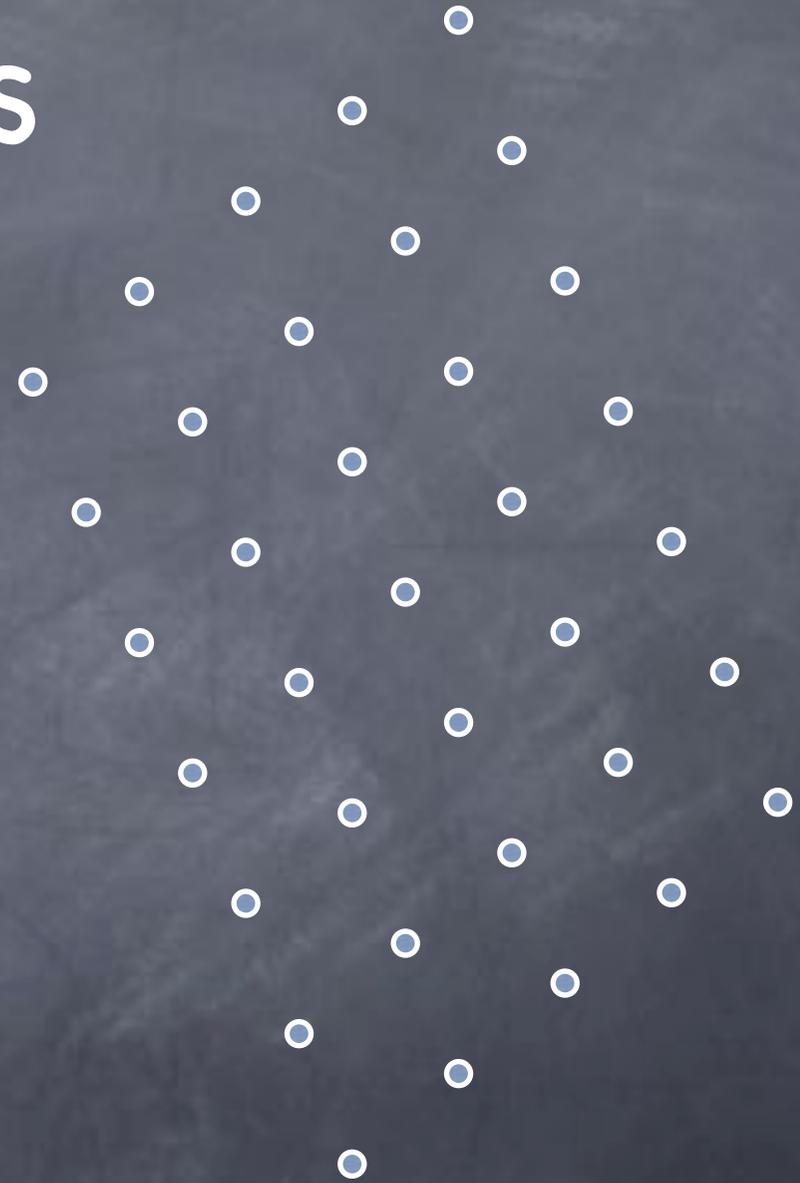
Lecture 25

Lattices



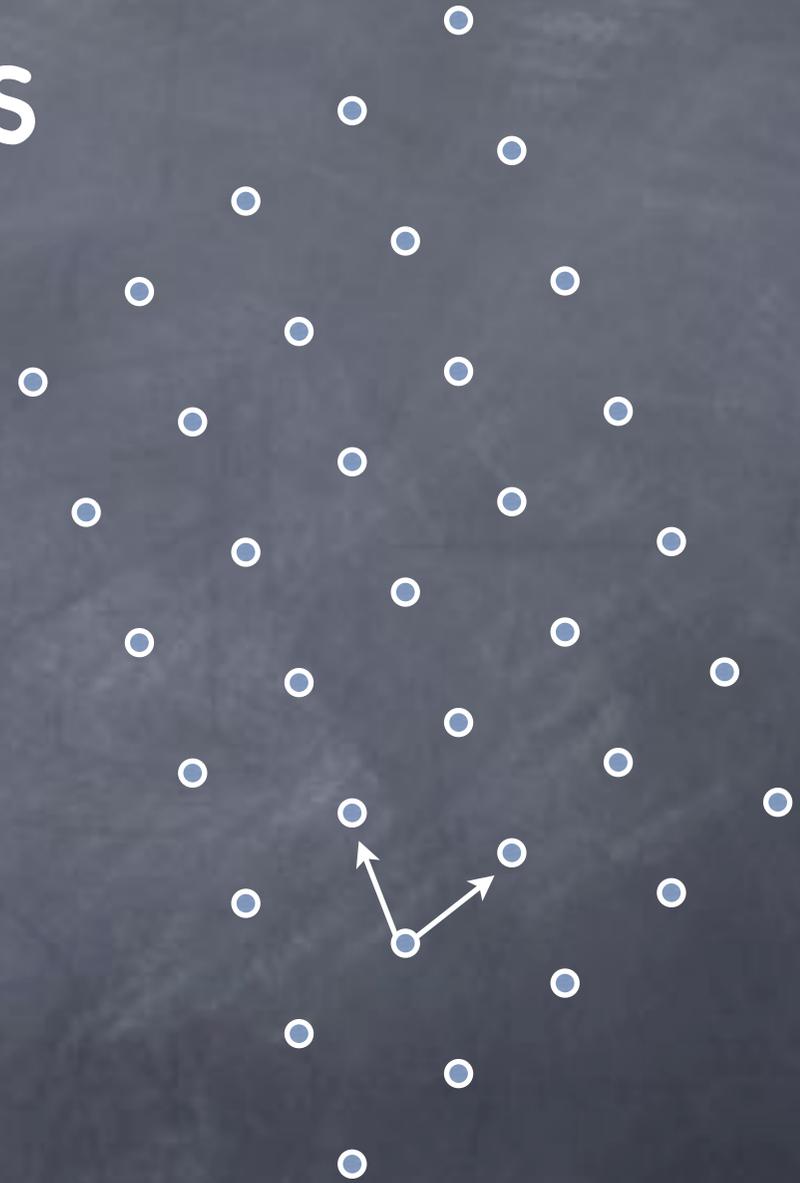
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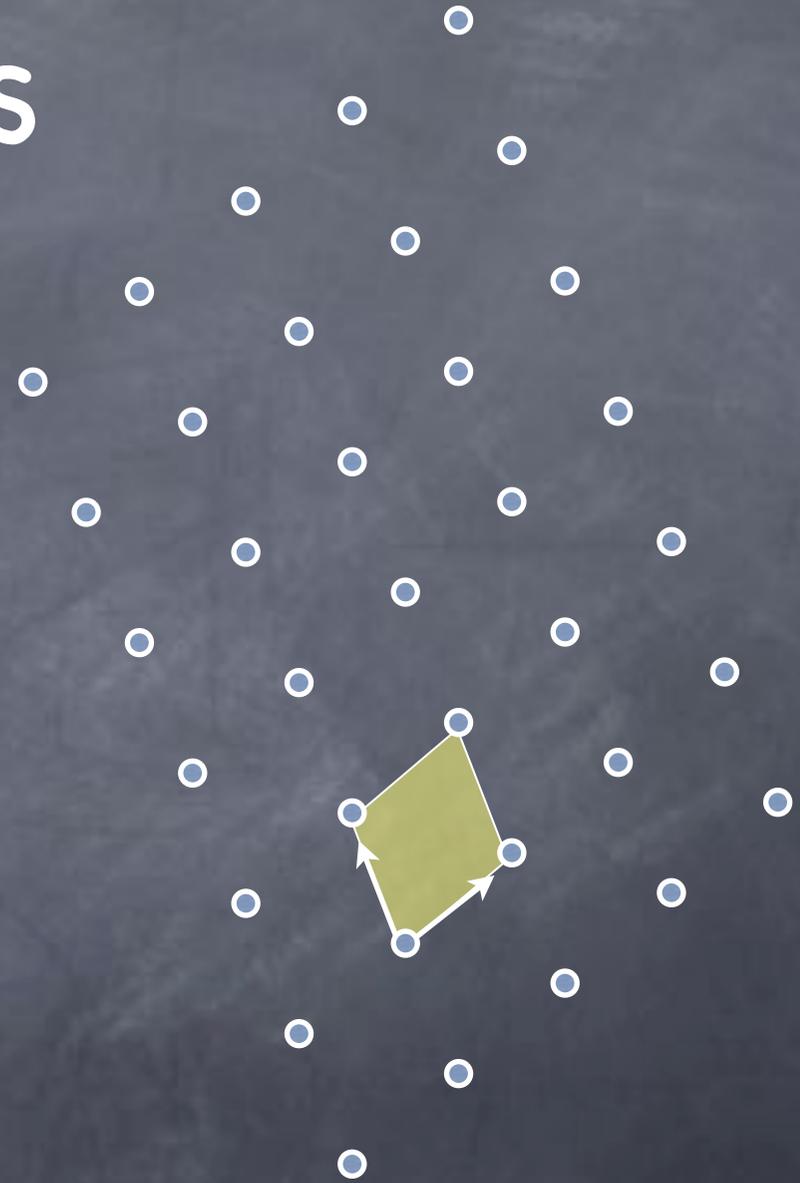
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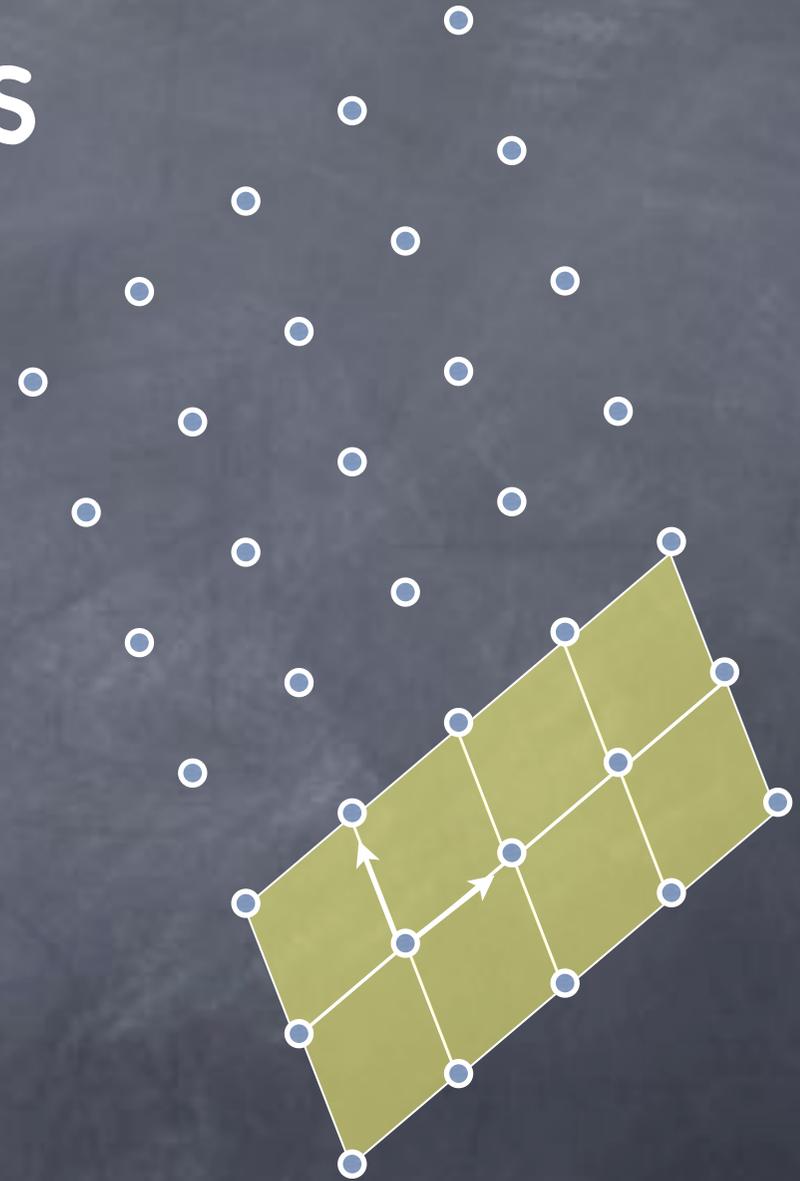
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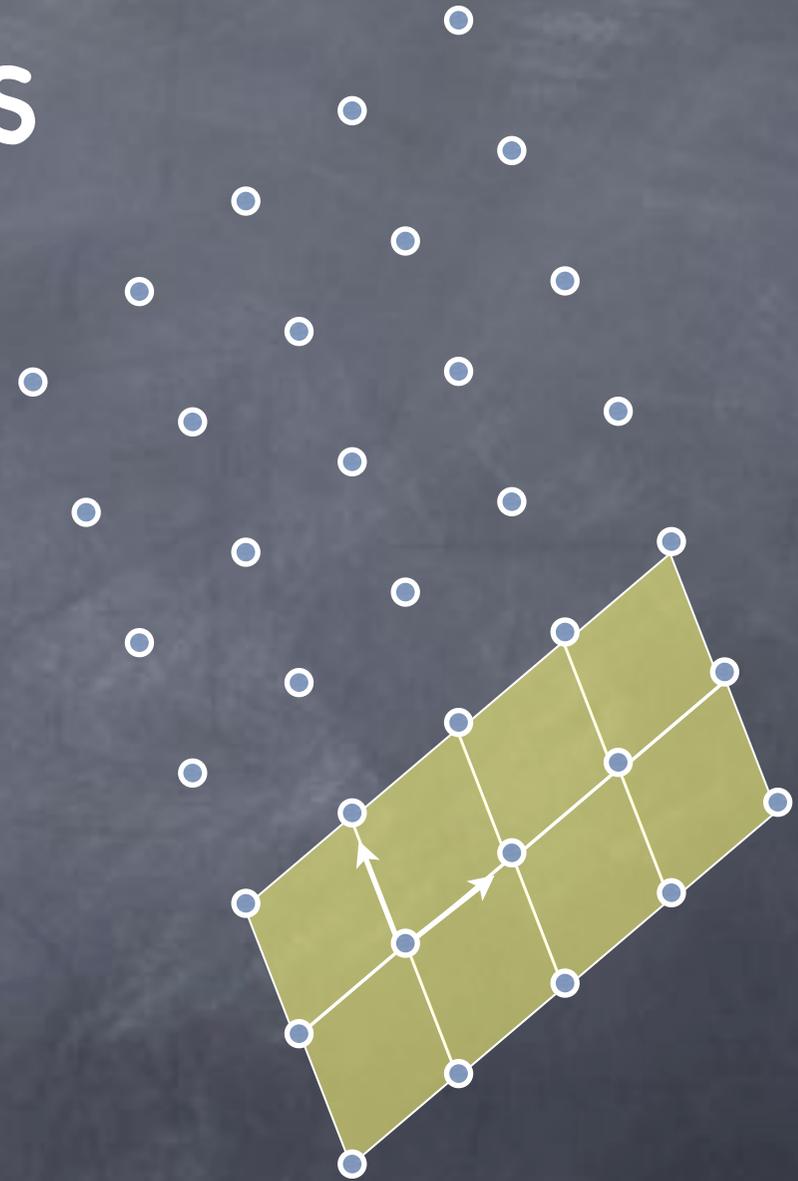
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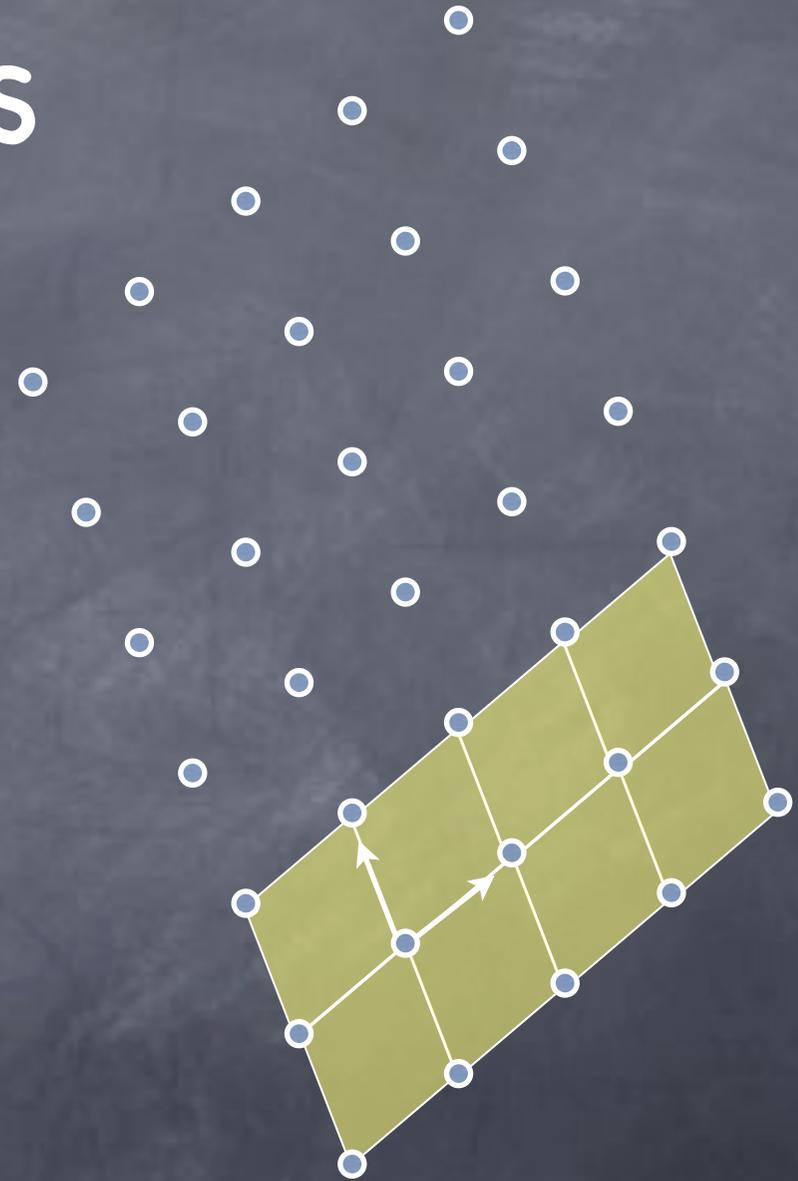
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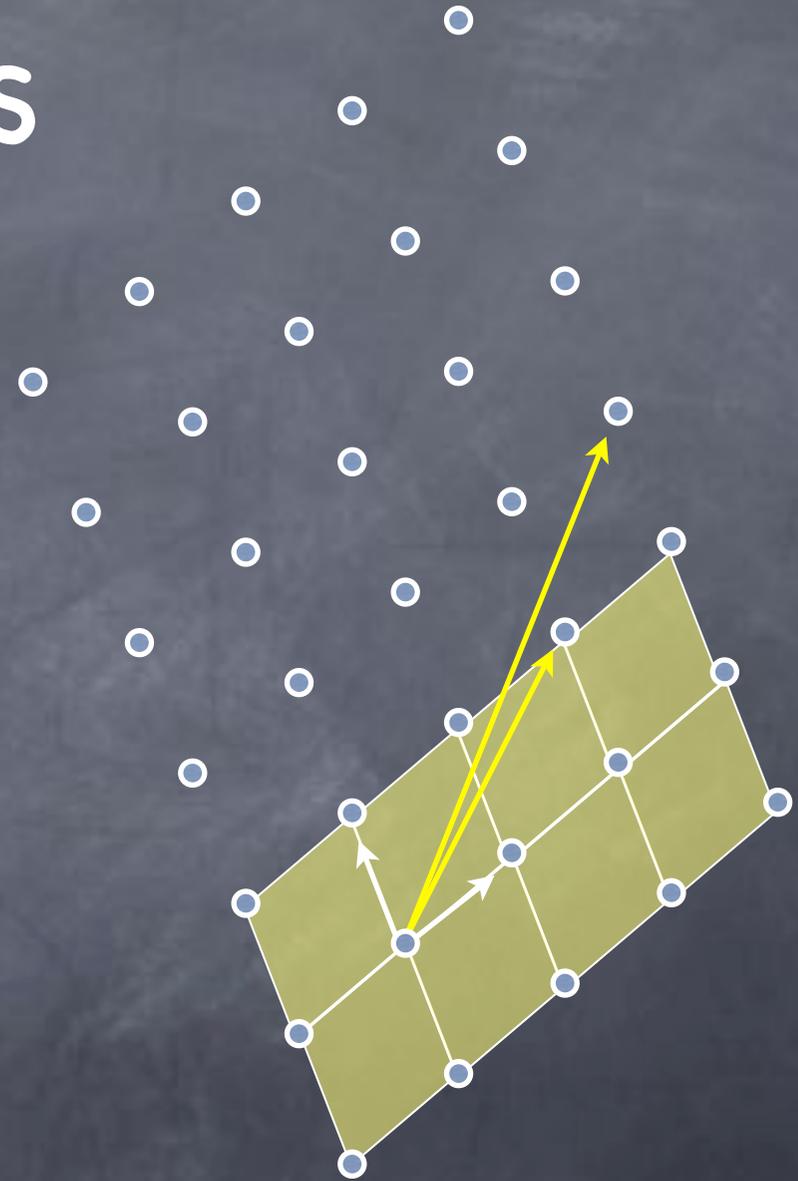
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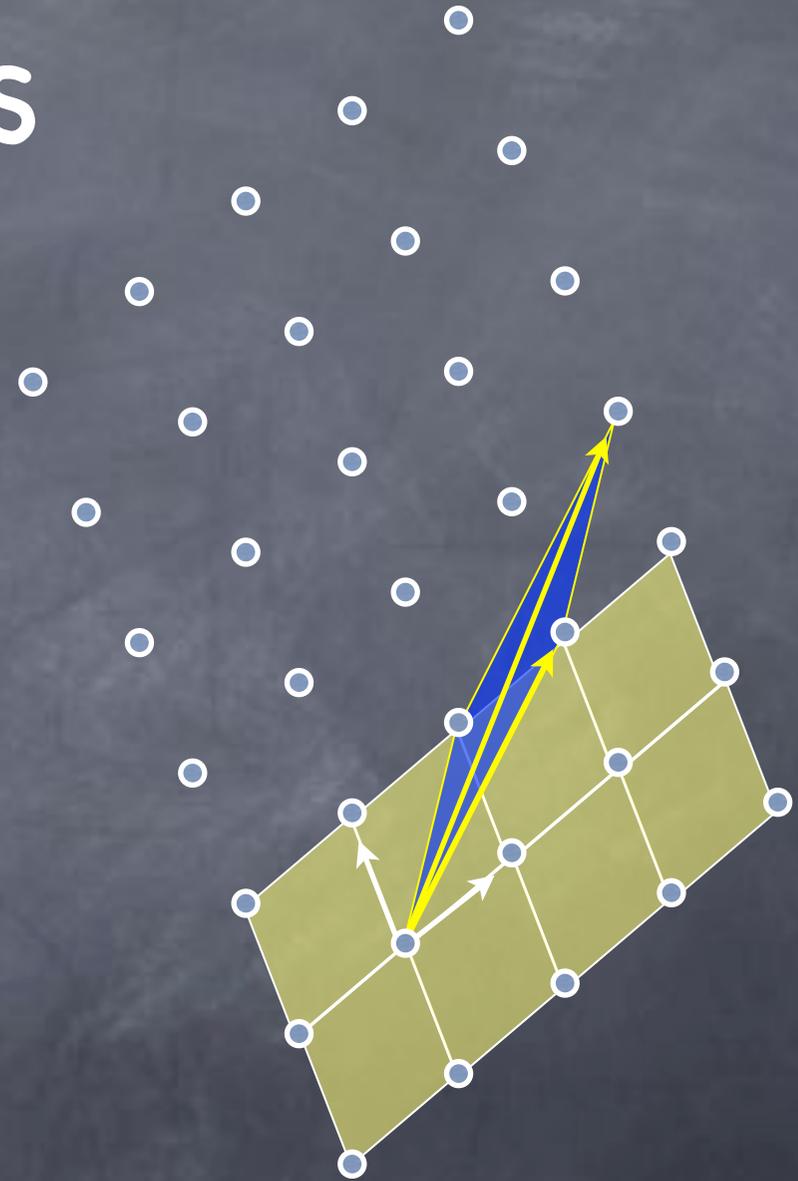
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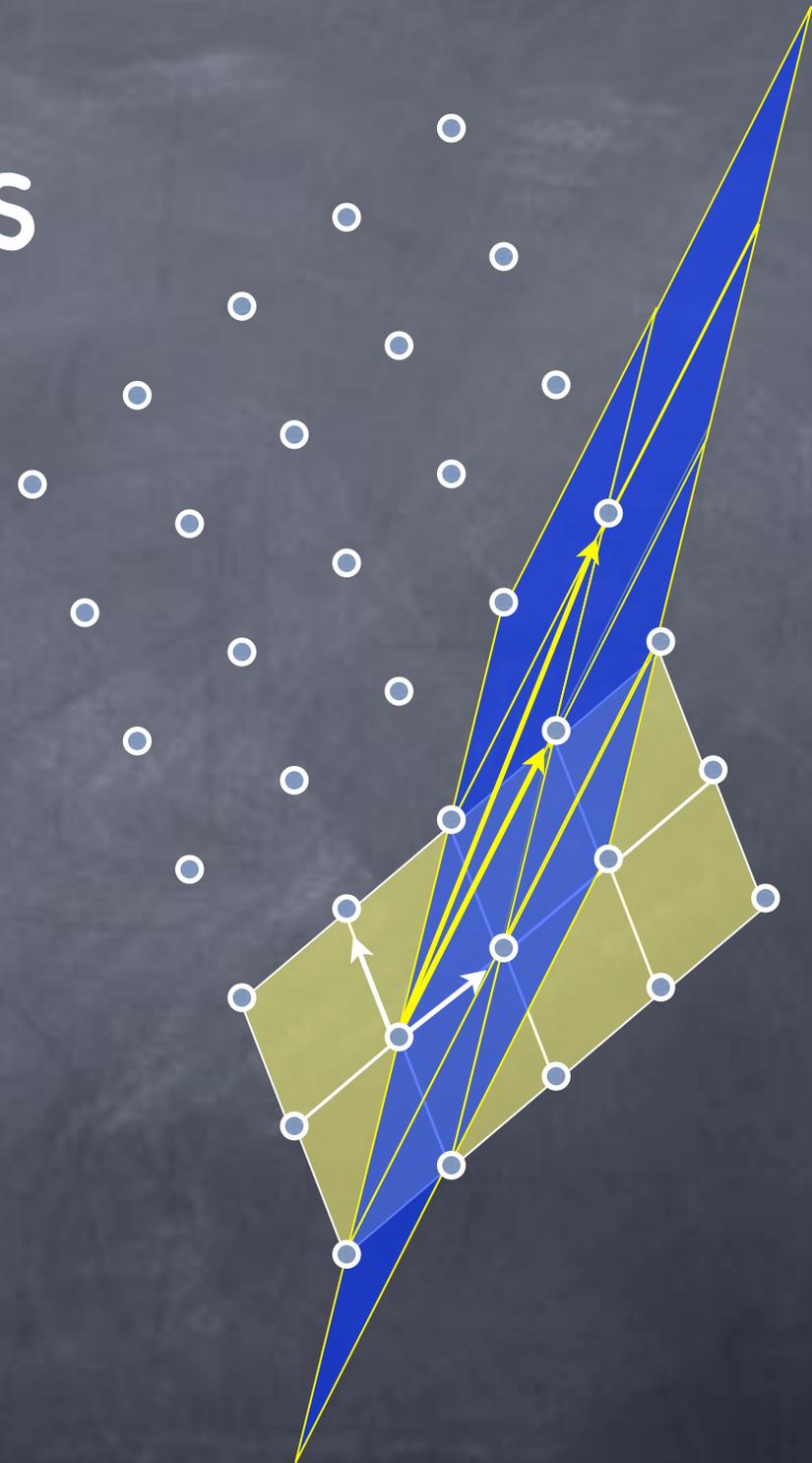
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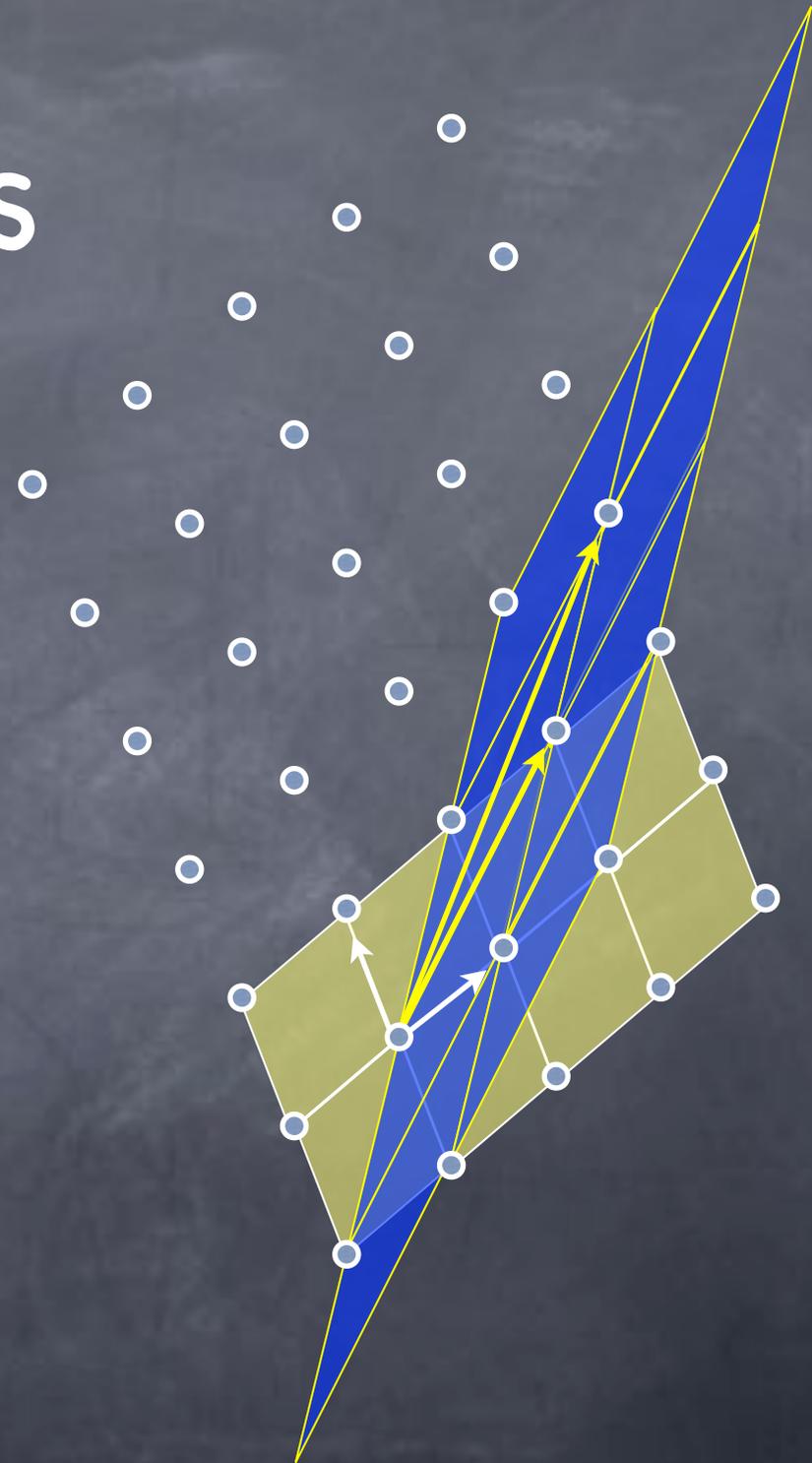
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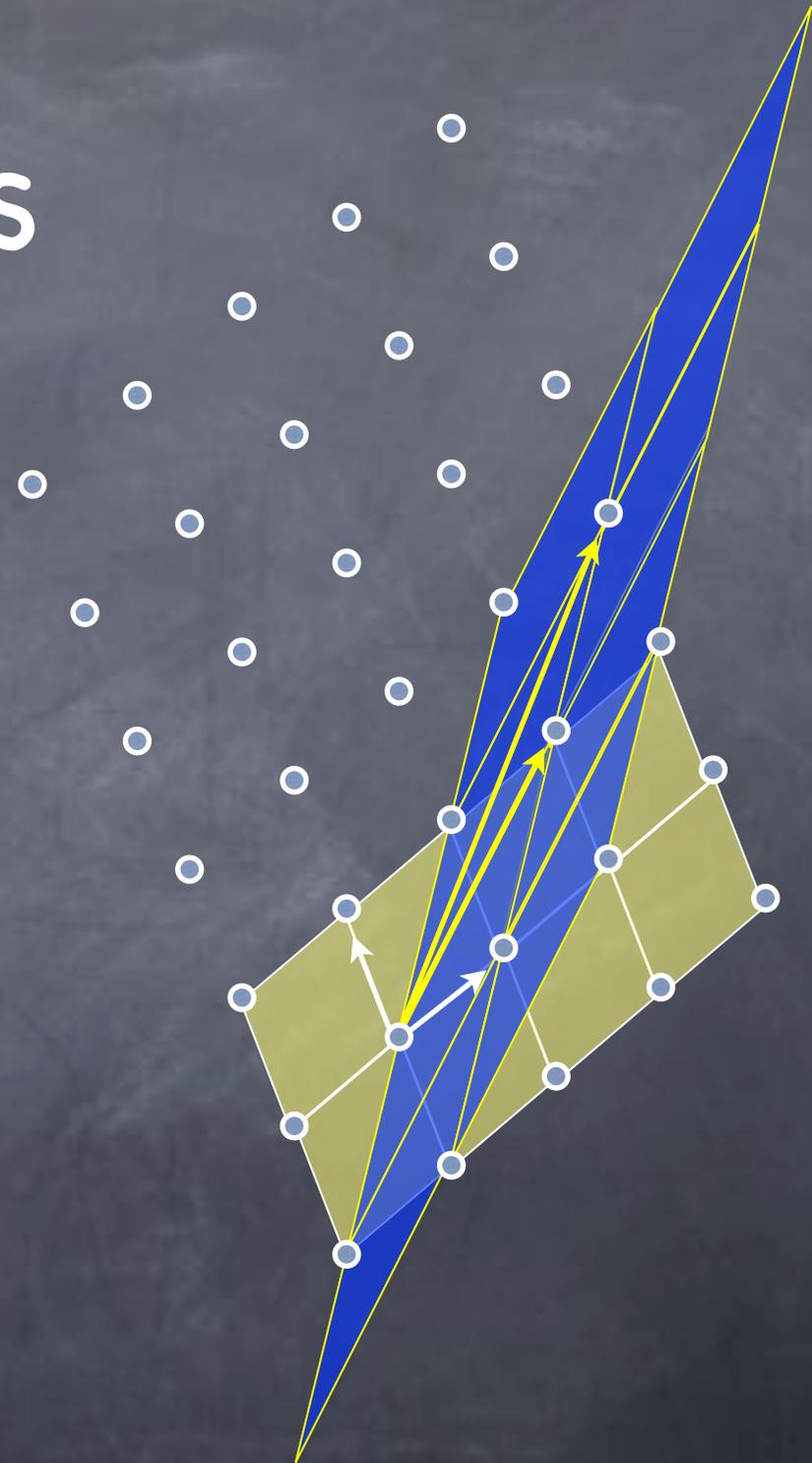
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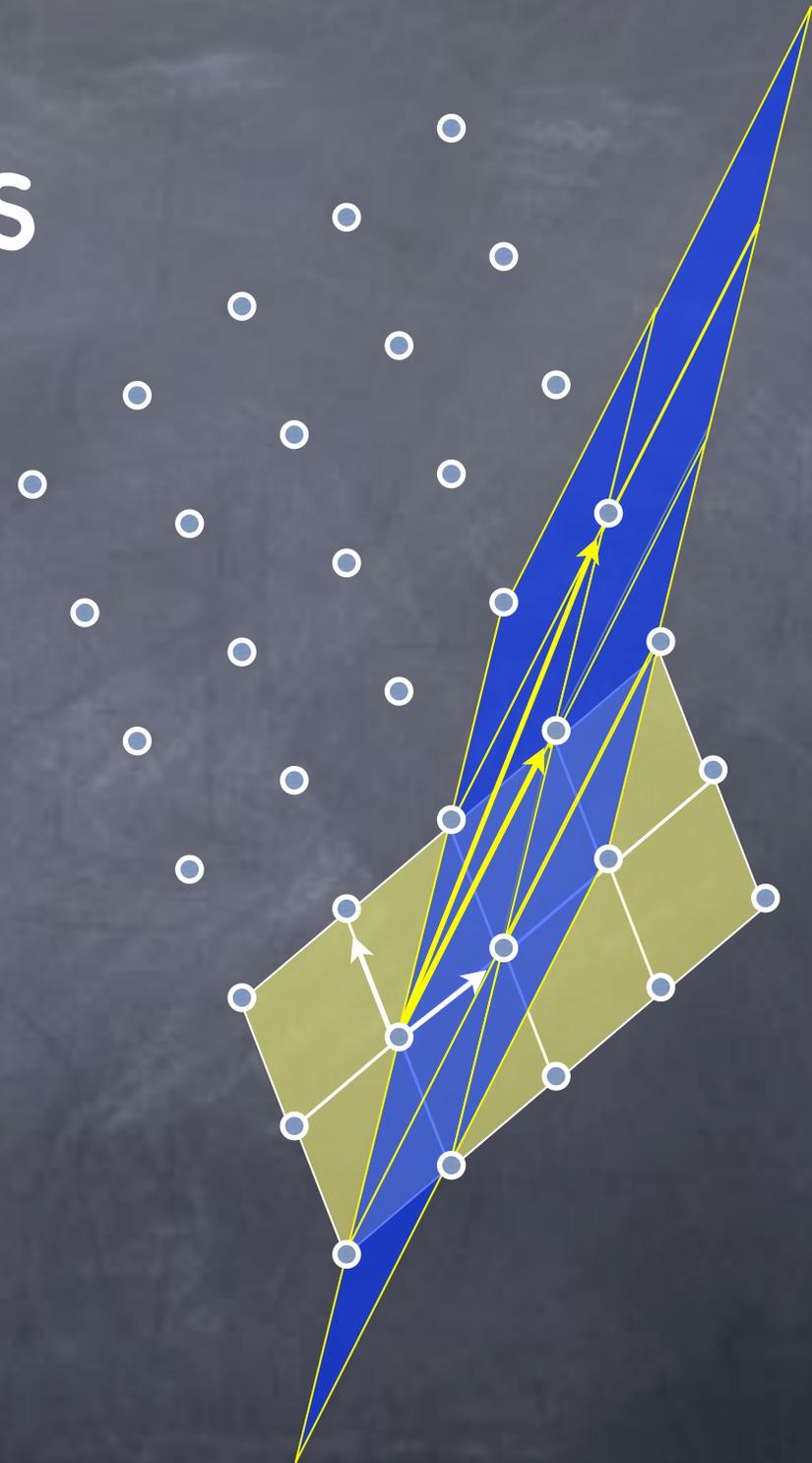
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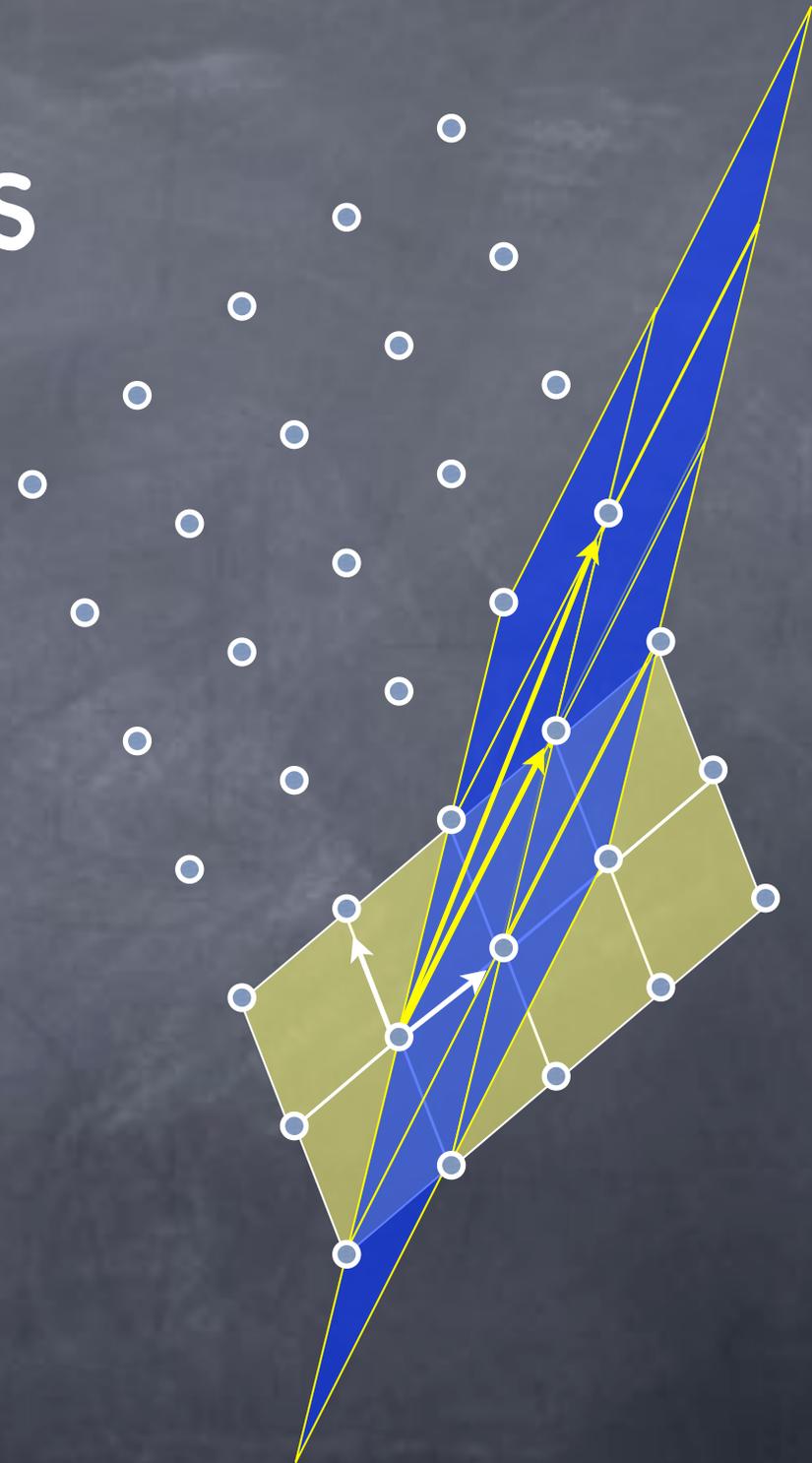


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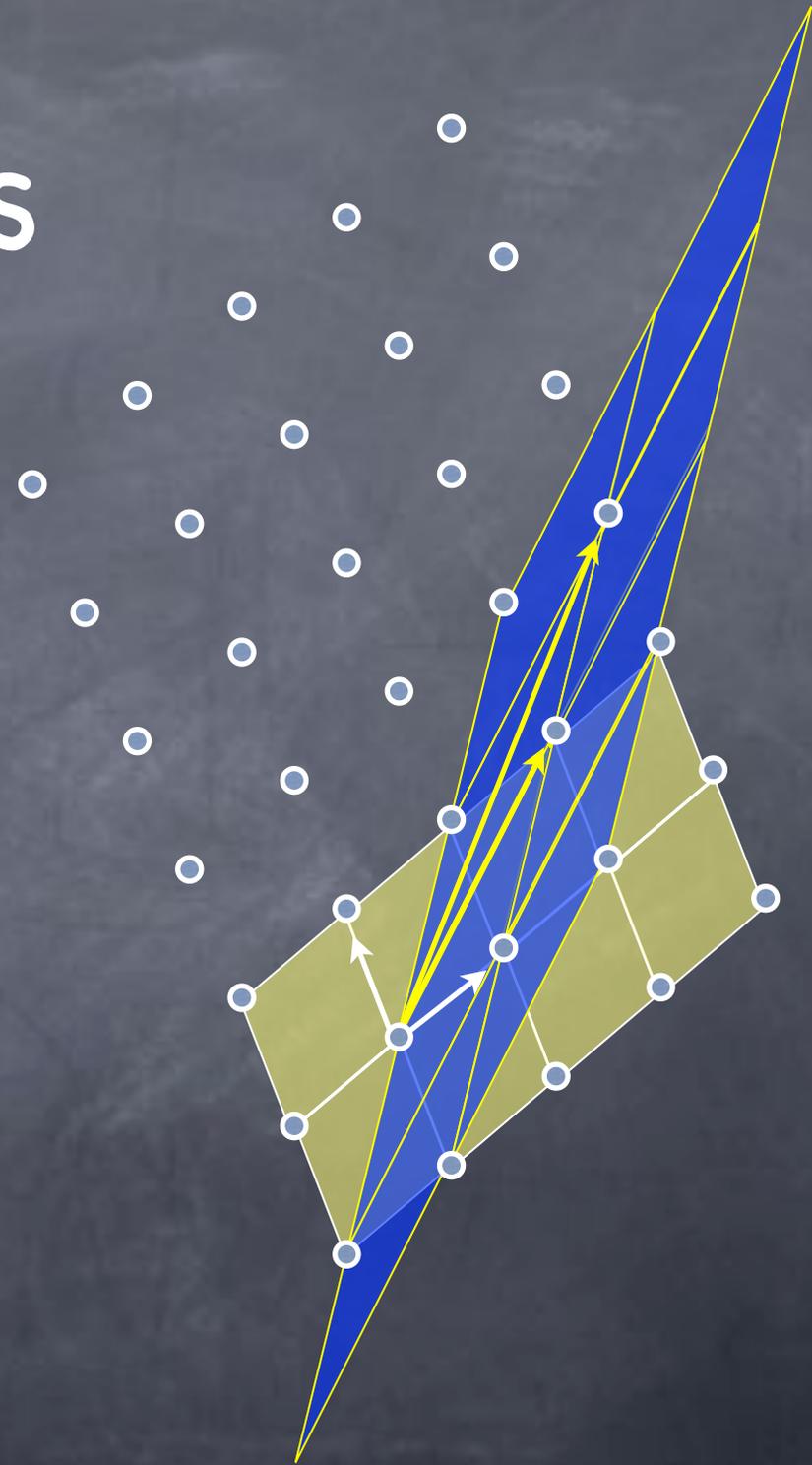


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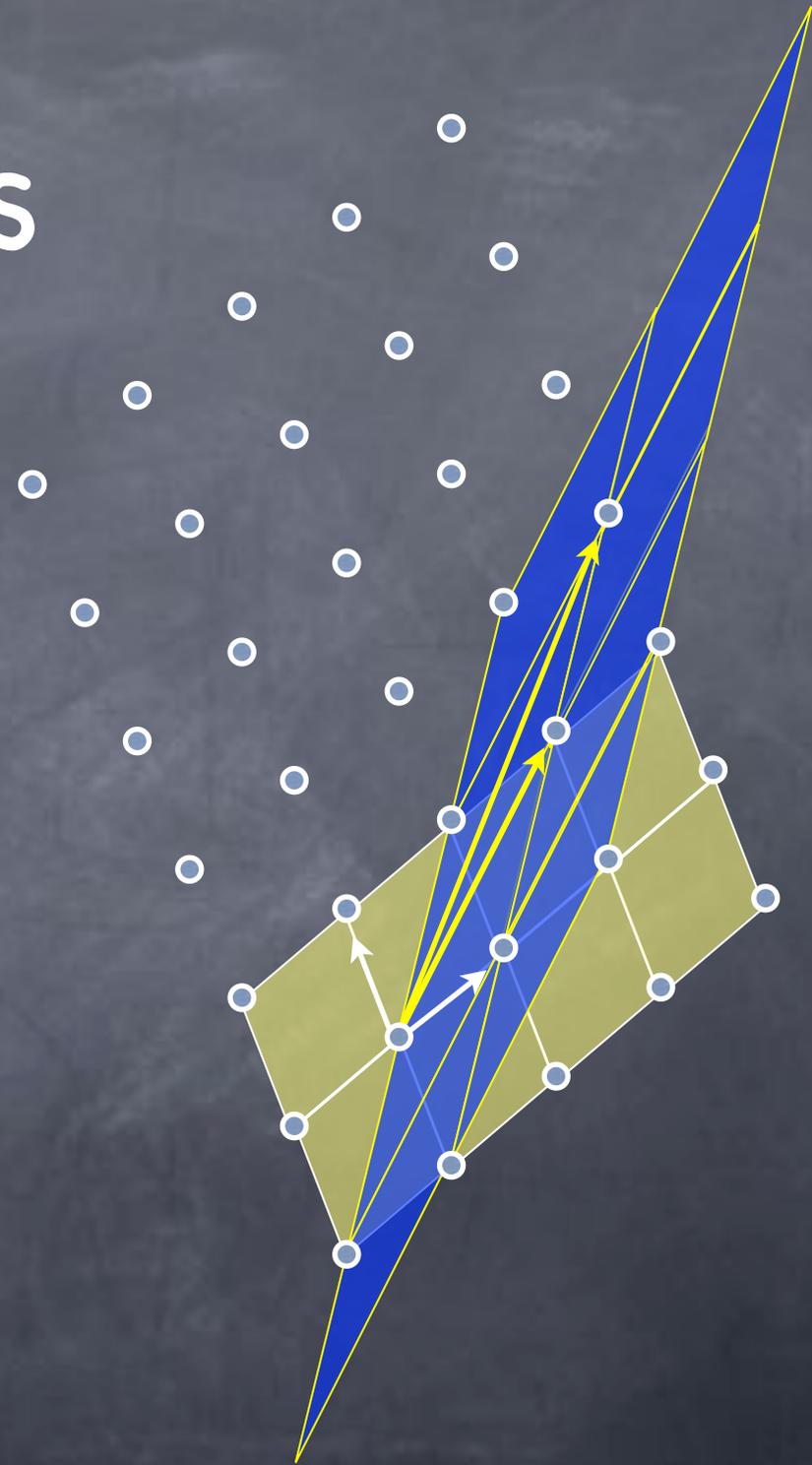
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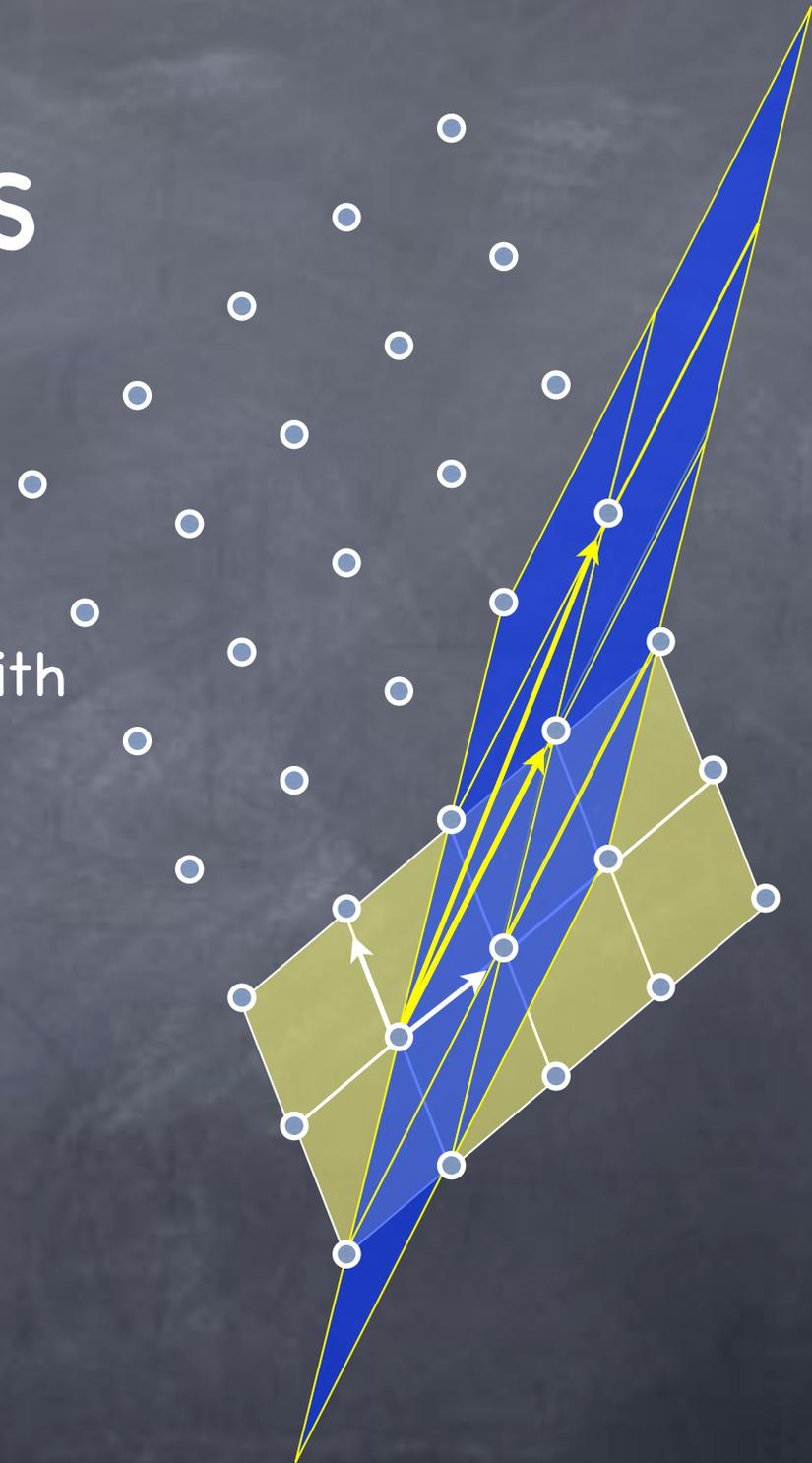
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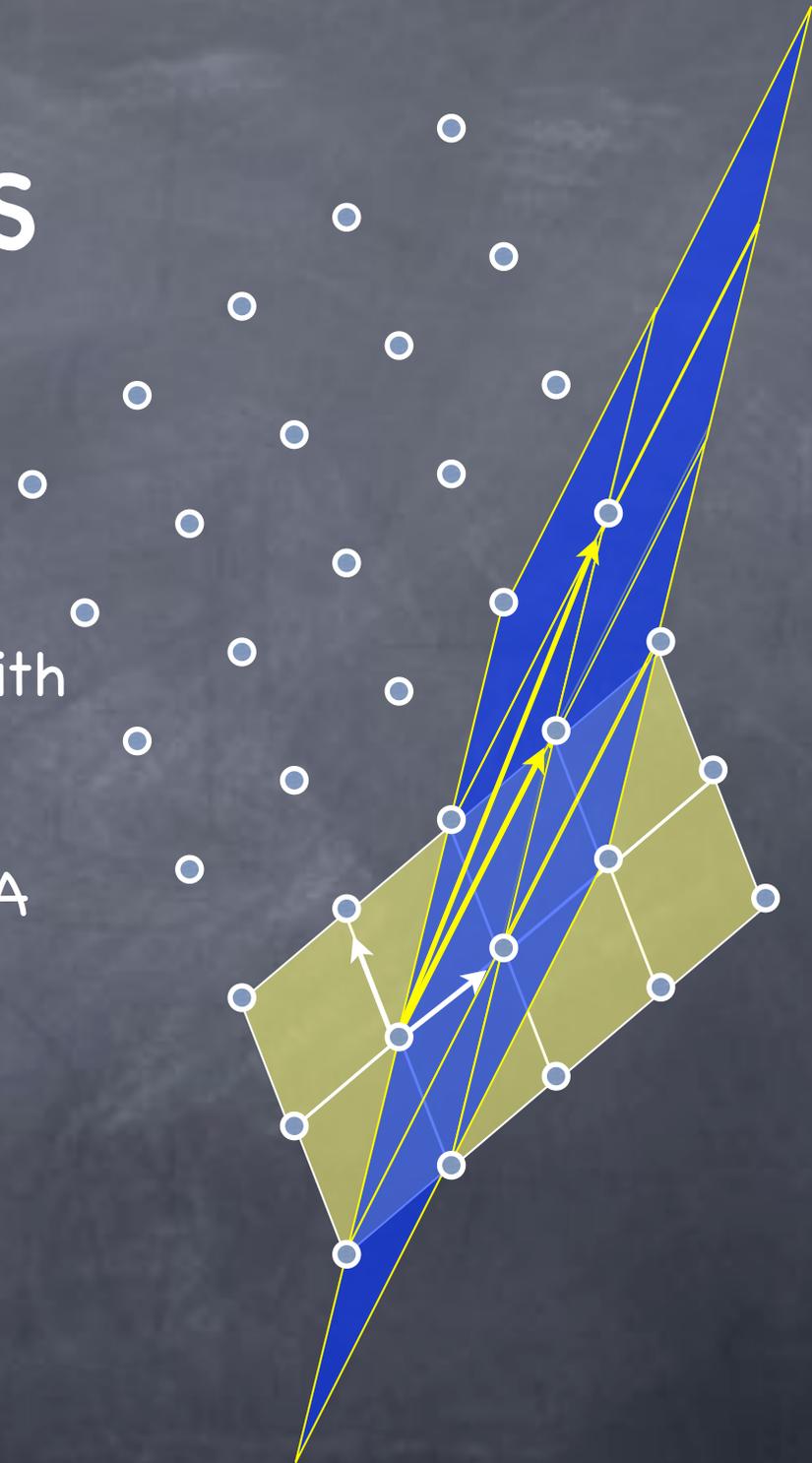
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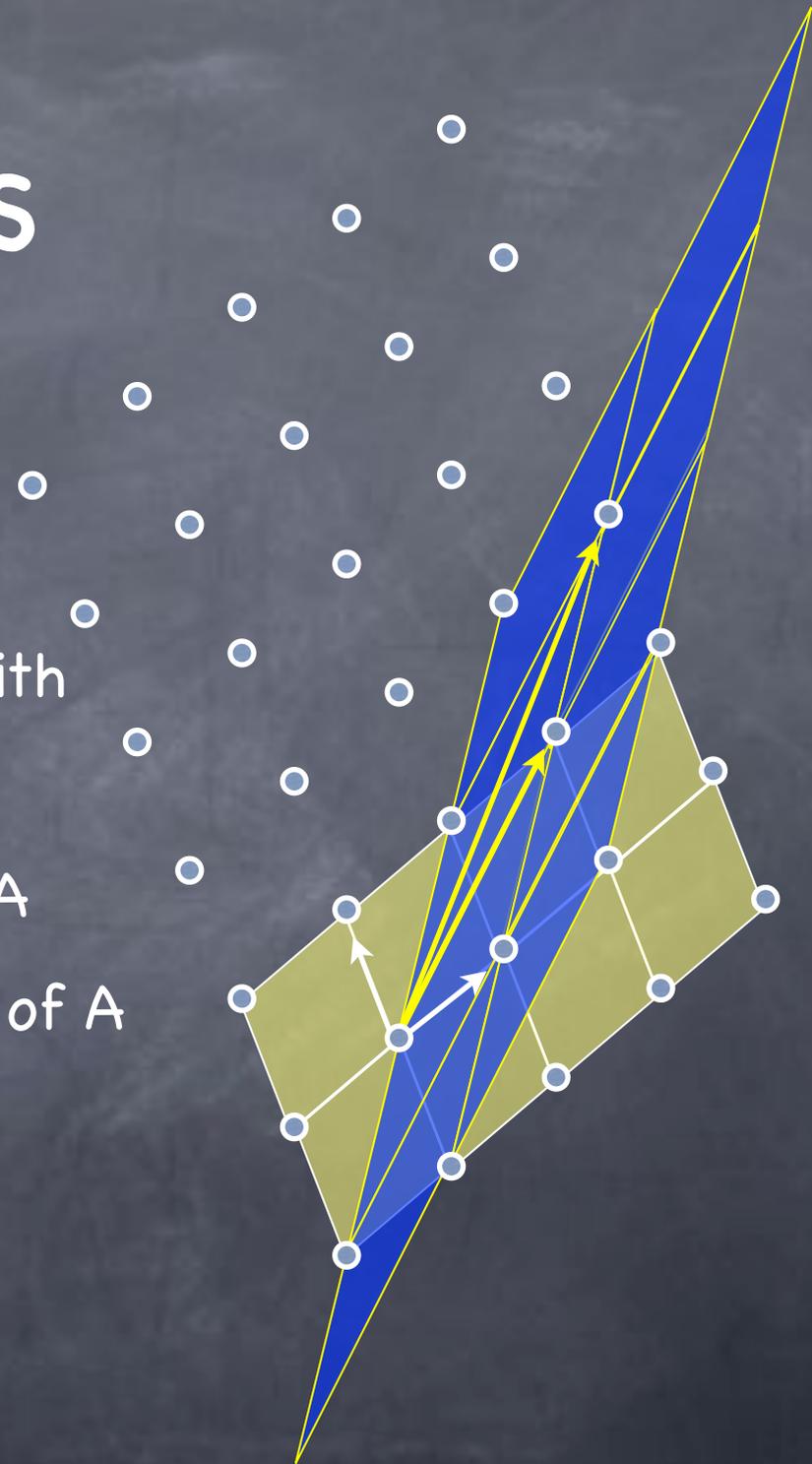
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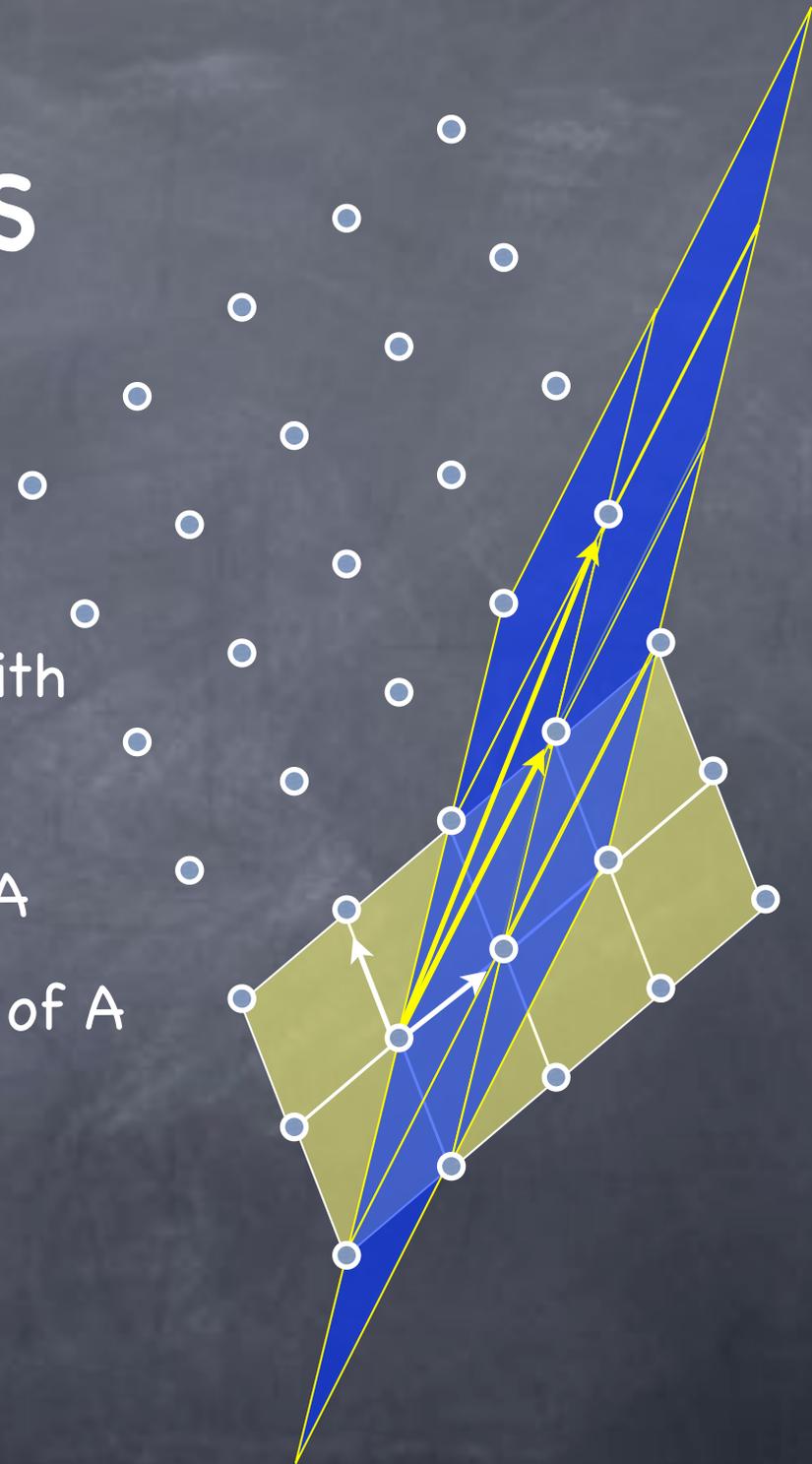
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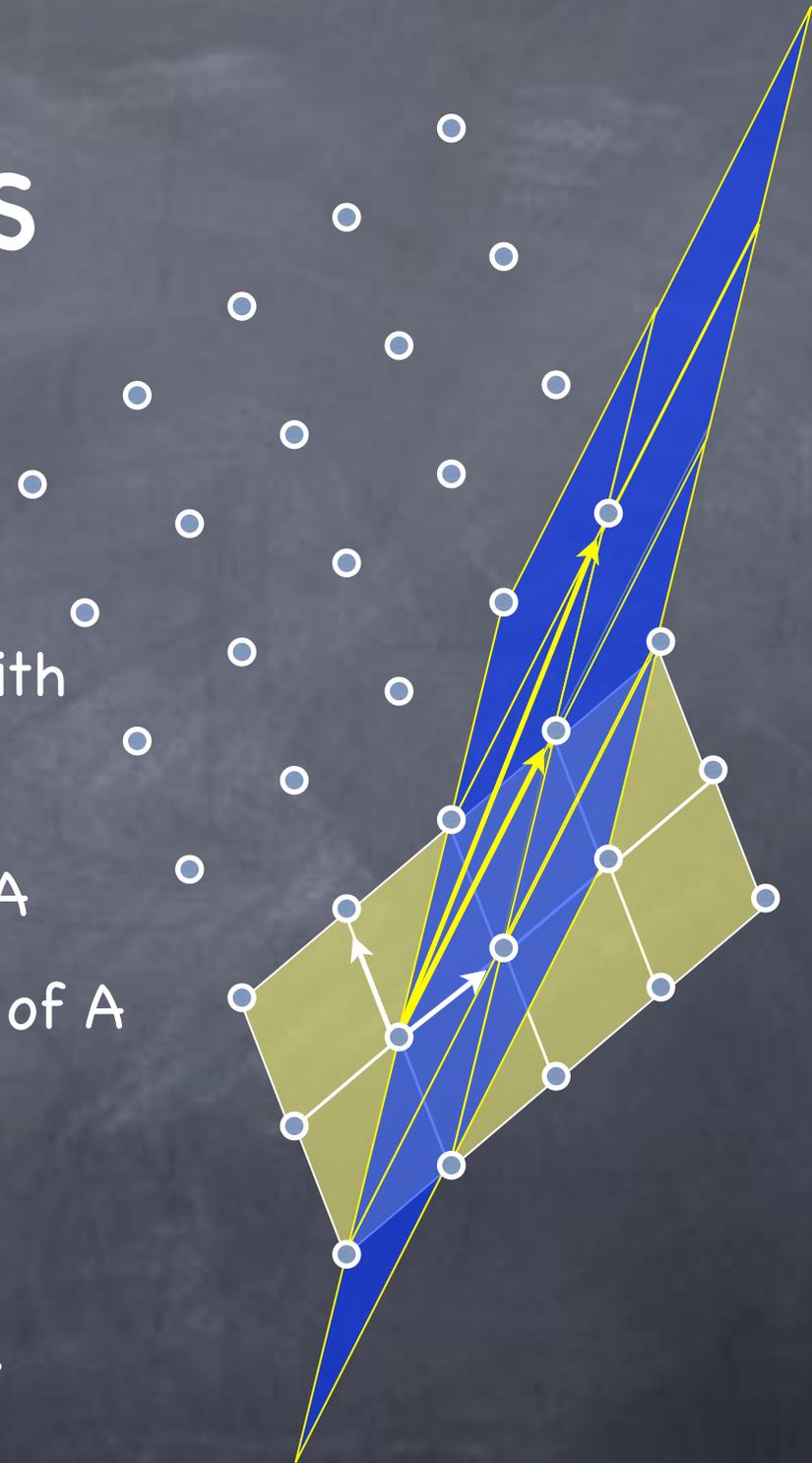
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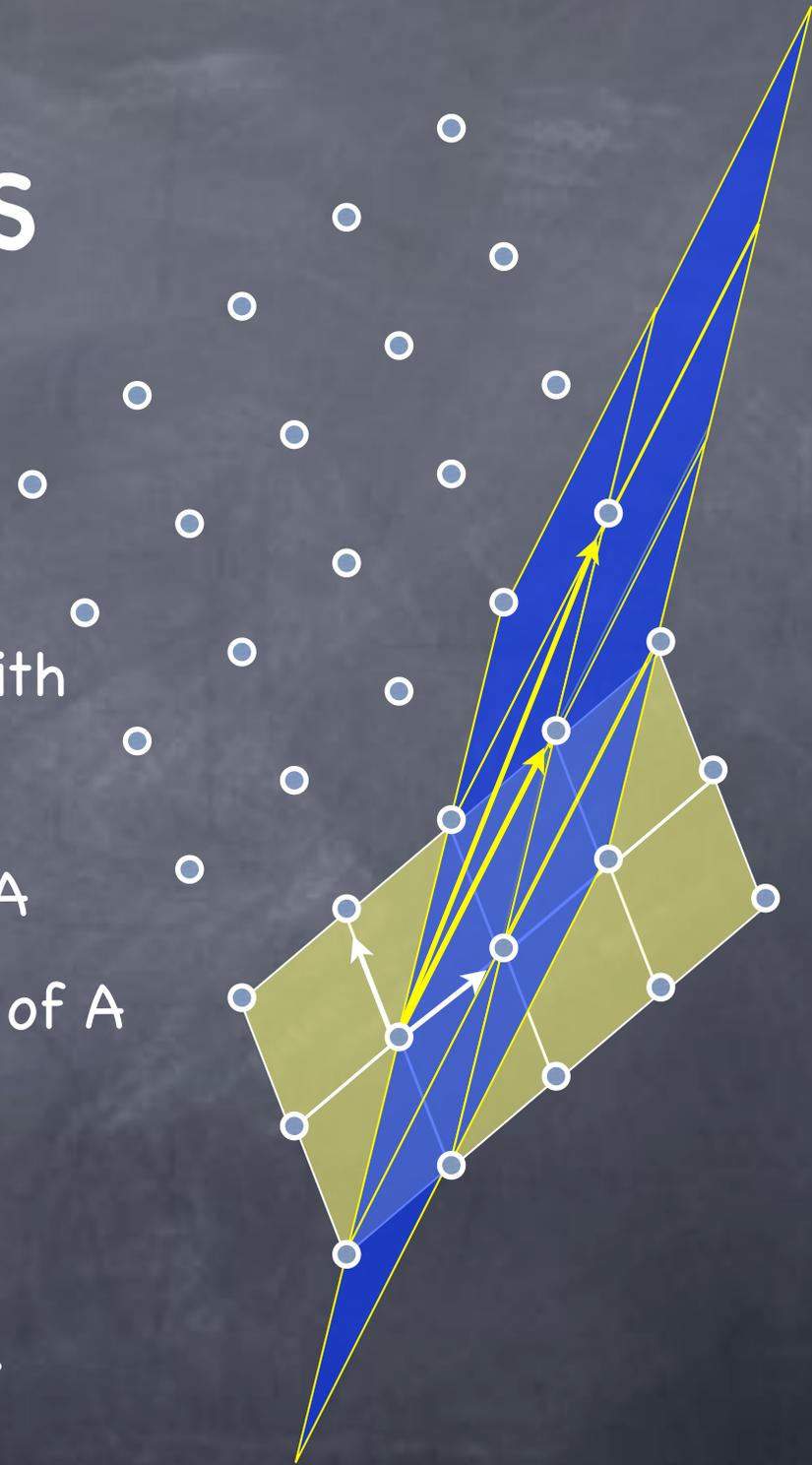
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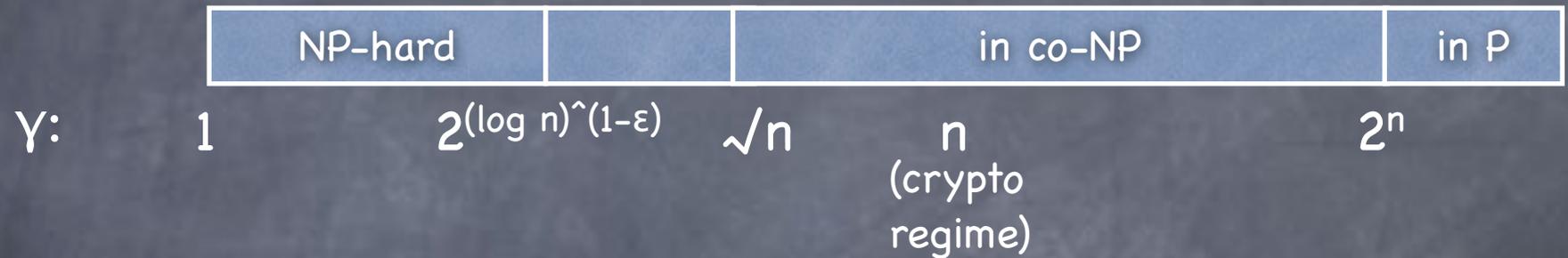
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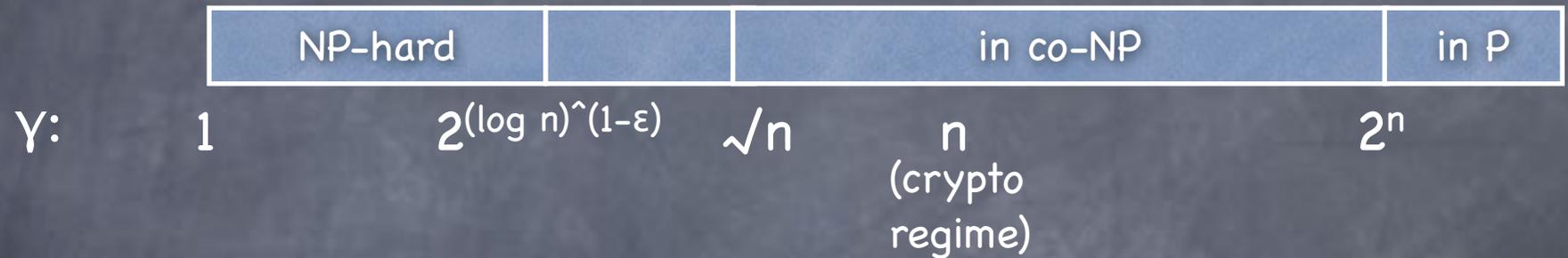
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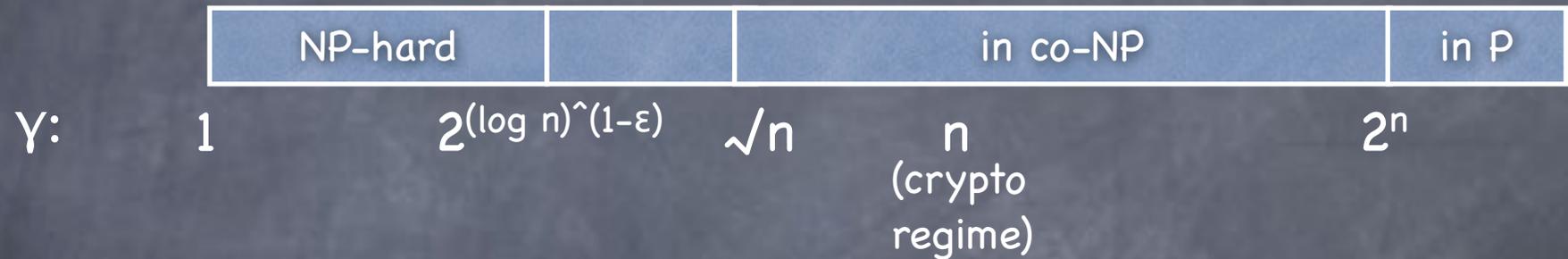
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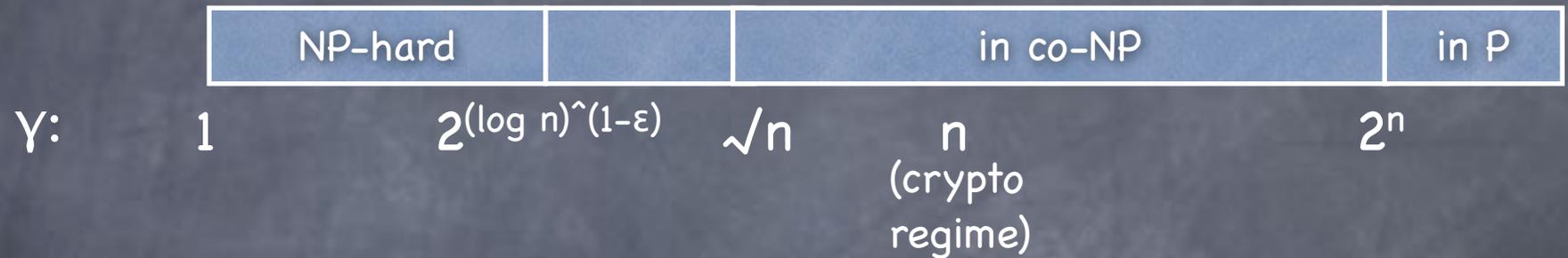
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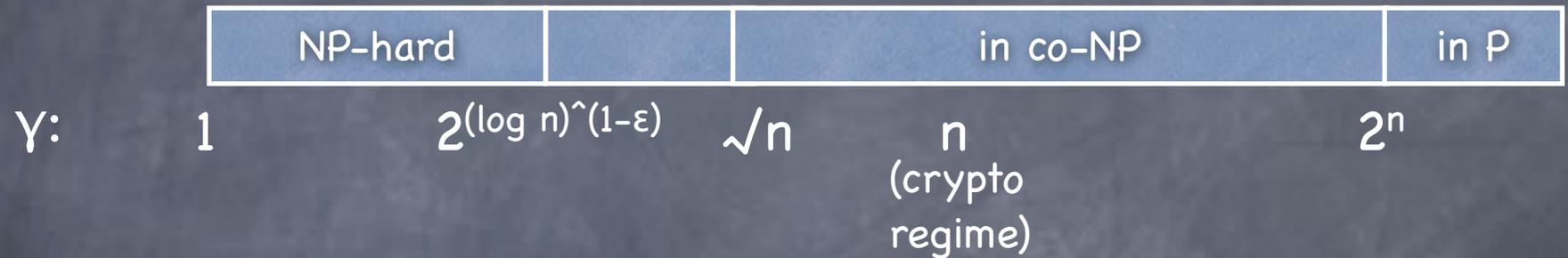
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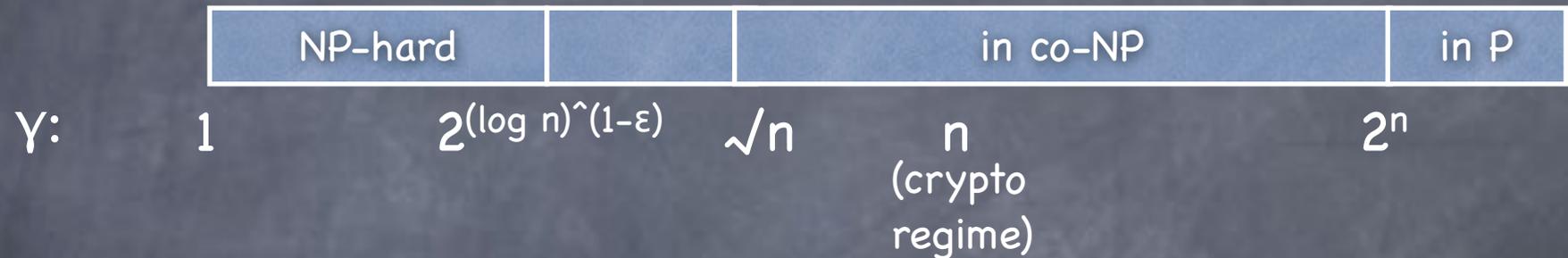
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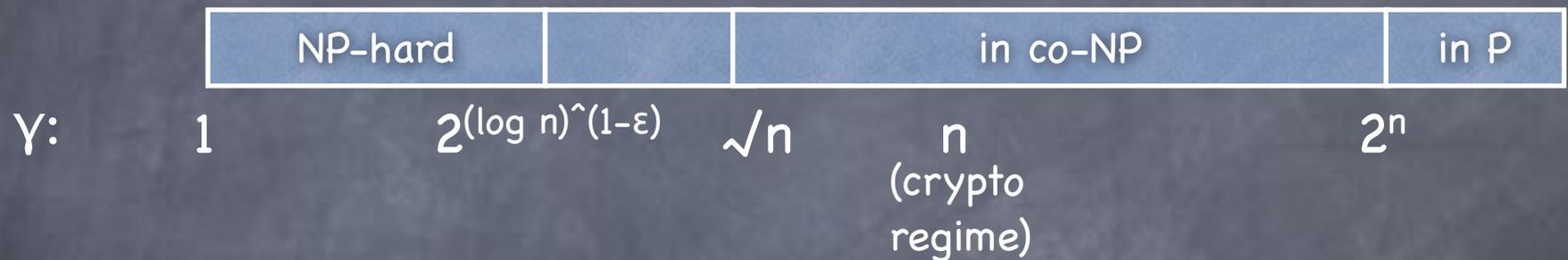
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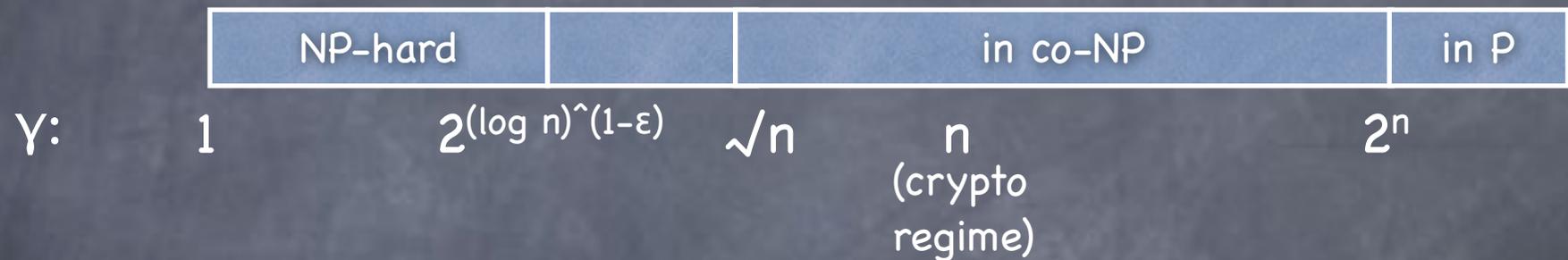
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 - For many lattice problems average-case hardness assumptions are implied by worst-case hardness of related problems (but at regimes not known to be NP-hard)

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- This is as hard as solving certain lattice problems in the worst case (i.e., with good success probability for every instance of the problem)

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- Security depends on worst-case hardness of same problems as before, but when restricted to ideal lattices

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 - Worst basis (one that can be efficiently computed from any basis): Hermite Normal Form (HNF) basis
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- Conjectured to be CPA secure. No security reduction known to simple lattice problems

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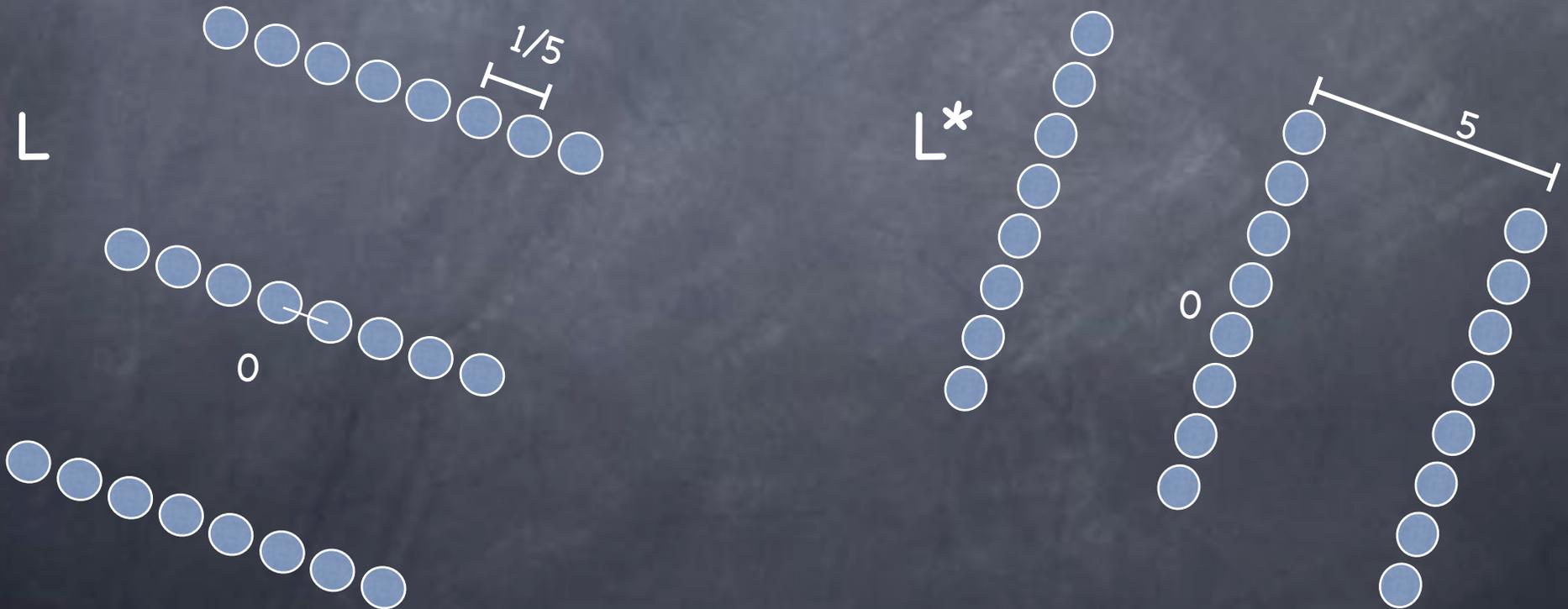
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Dual Lattice

Given a lattice L , the dual lattice is

$$L^* = \{ x \mid \text{for all } y \in L, \langle x, y \rangle \in \mathbb{Z} \}$$

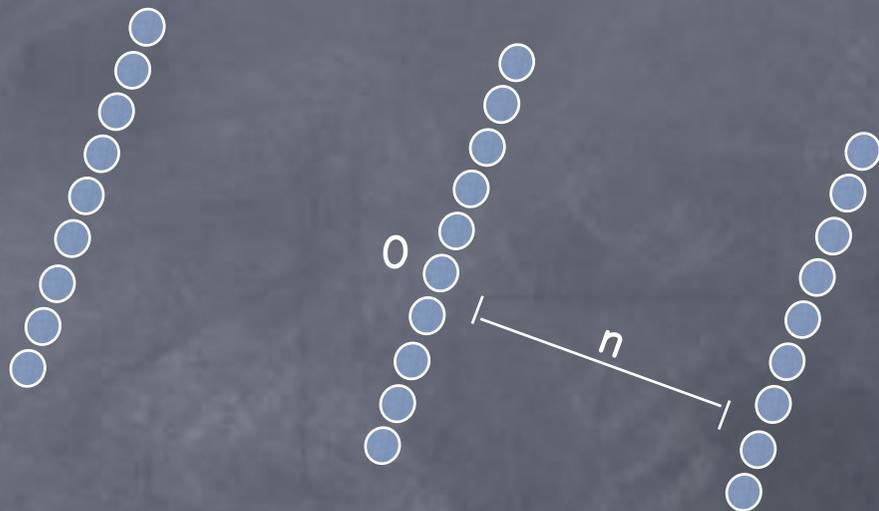
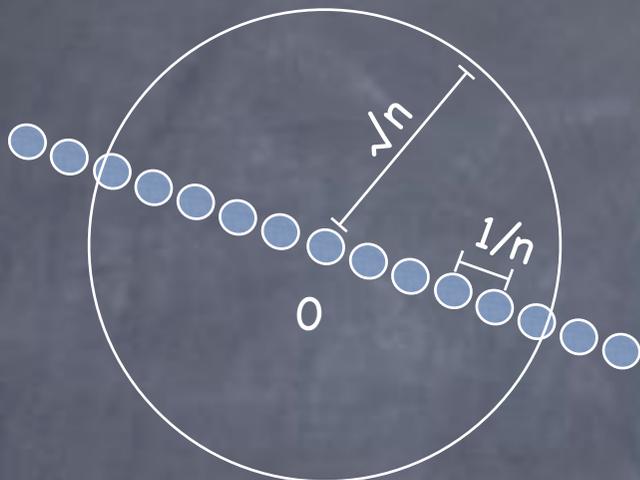


L^* - the dual of L

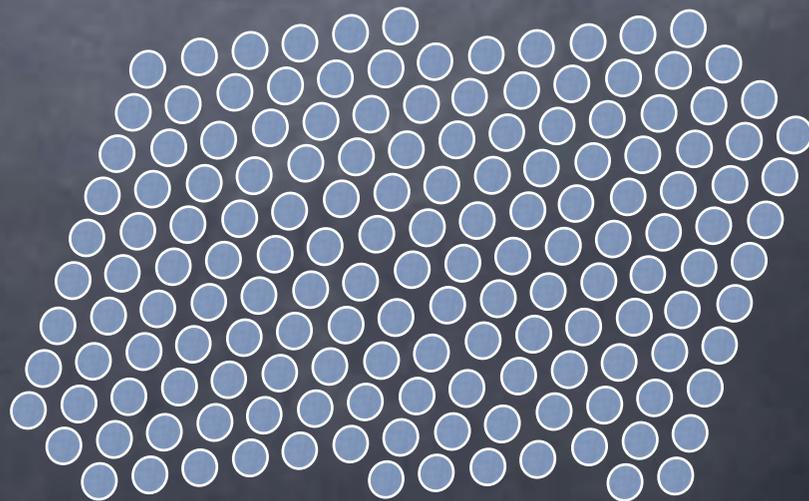
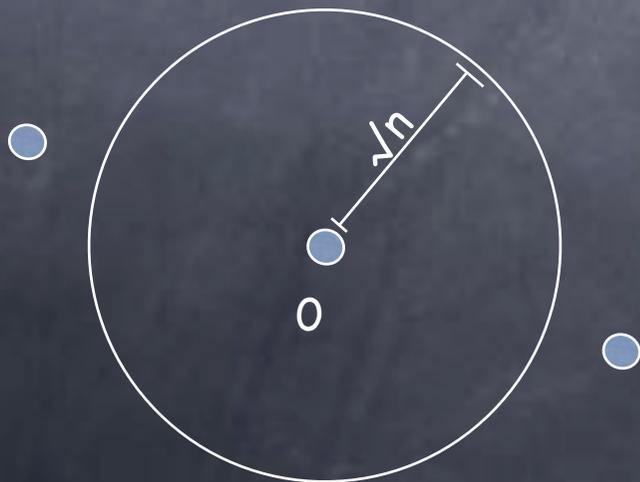
L

L^*

Case 1



Case 2



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- LWE also used for CCA secure PKE

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 - Quadratic key size/signing complexity (unlike NTRUSign)

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 - Recall: one-time signatures can be augmented to full-fledged signatures using a CRHF (in fact, a UOWHF)

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 - Useful in building “identification schemes” and potentially in other lattice-based constructions

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