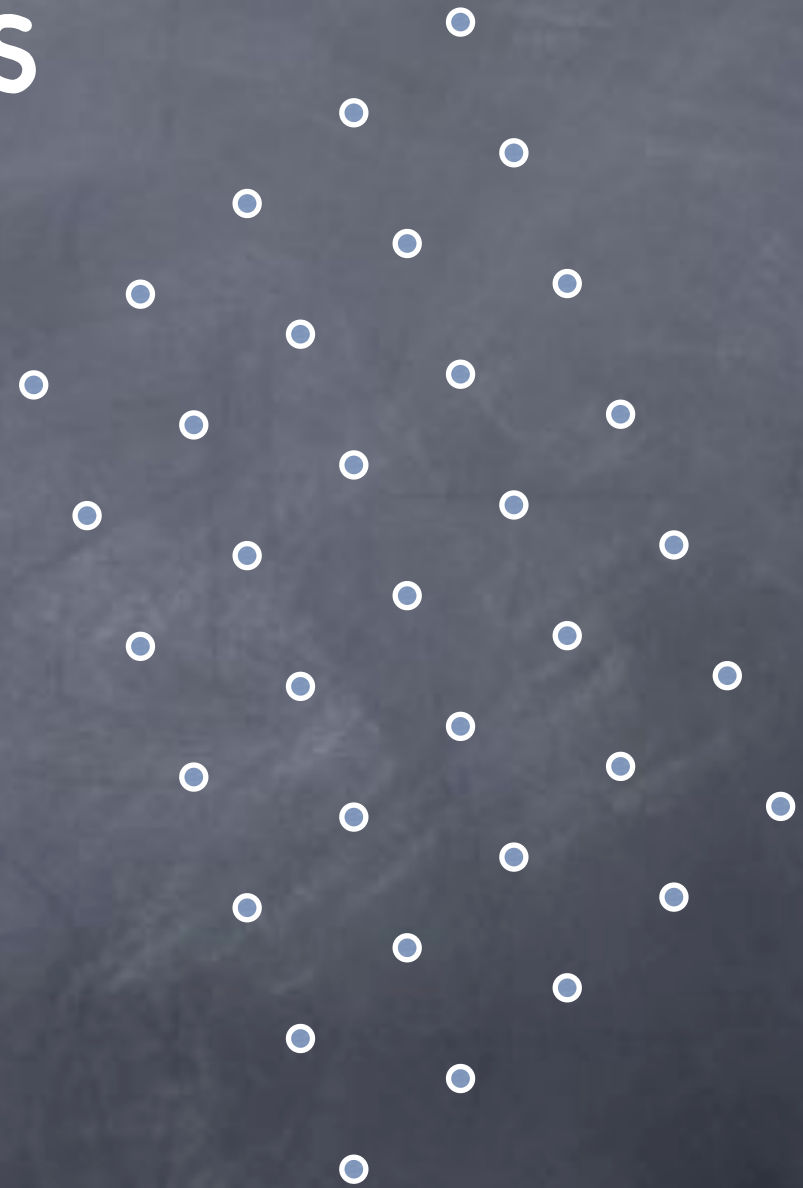


Lattice Cryptography

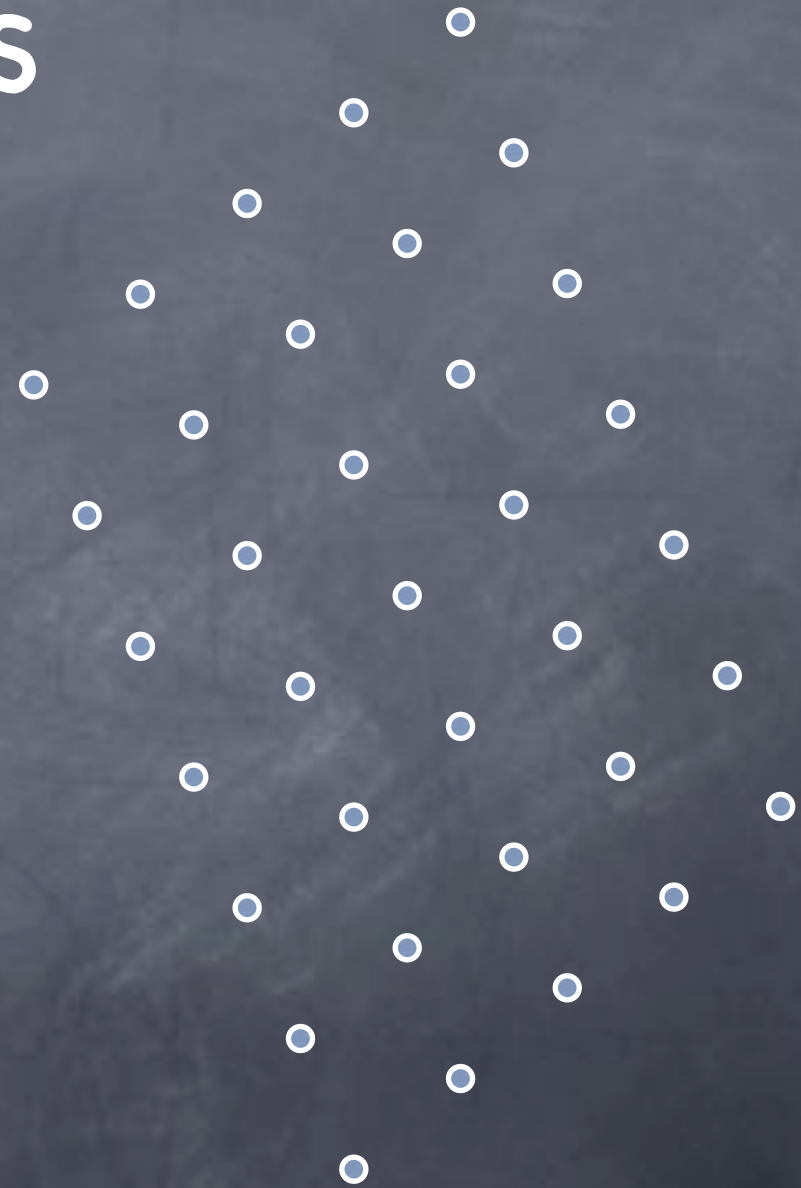
Lecture 21

Lattices



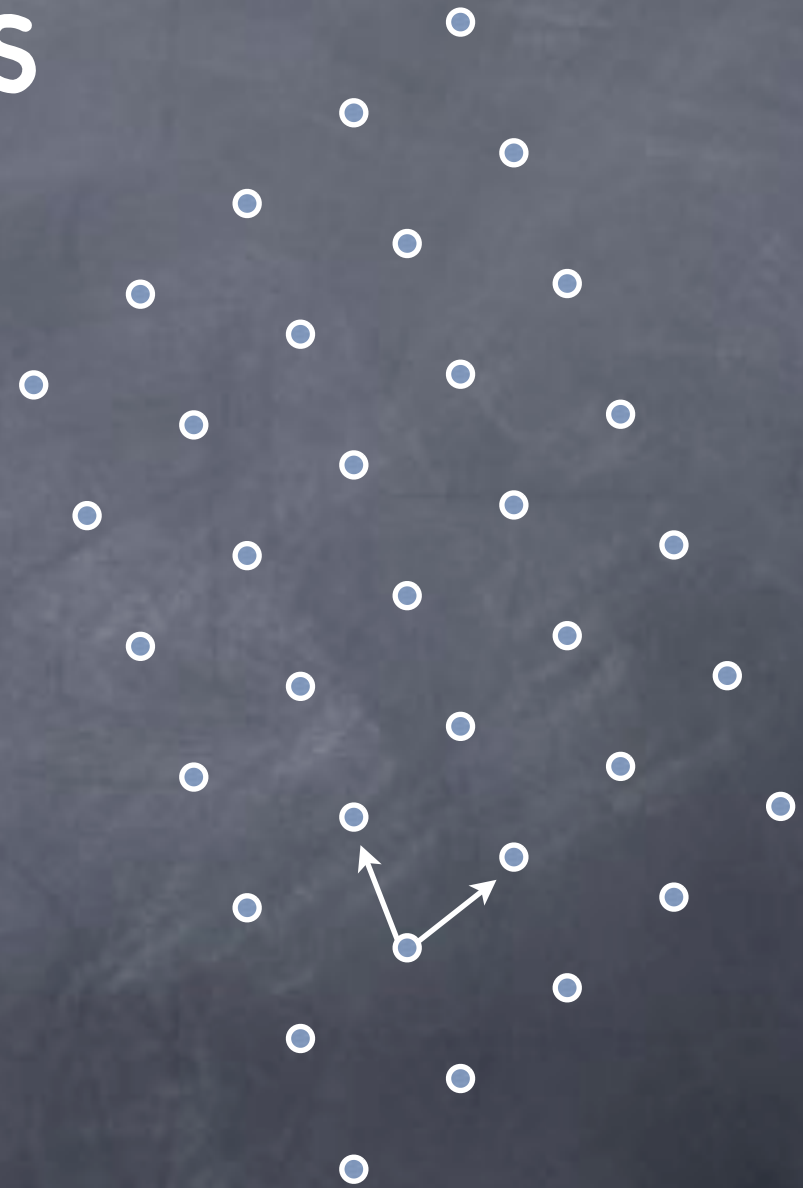
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”



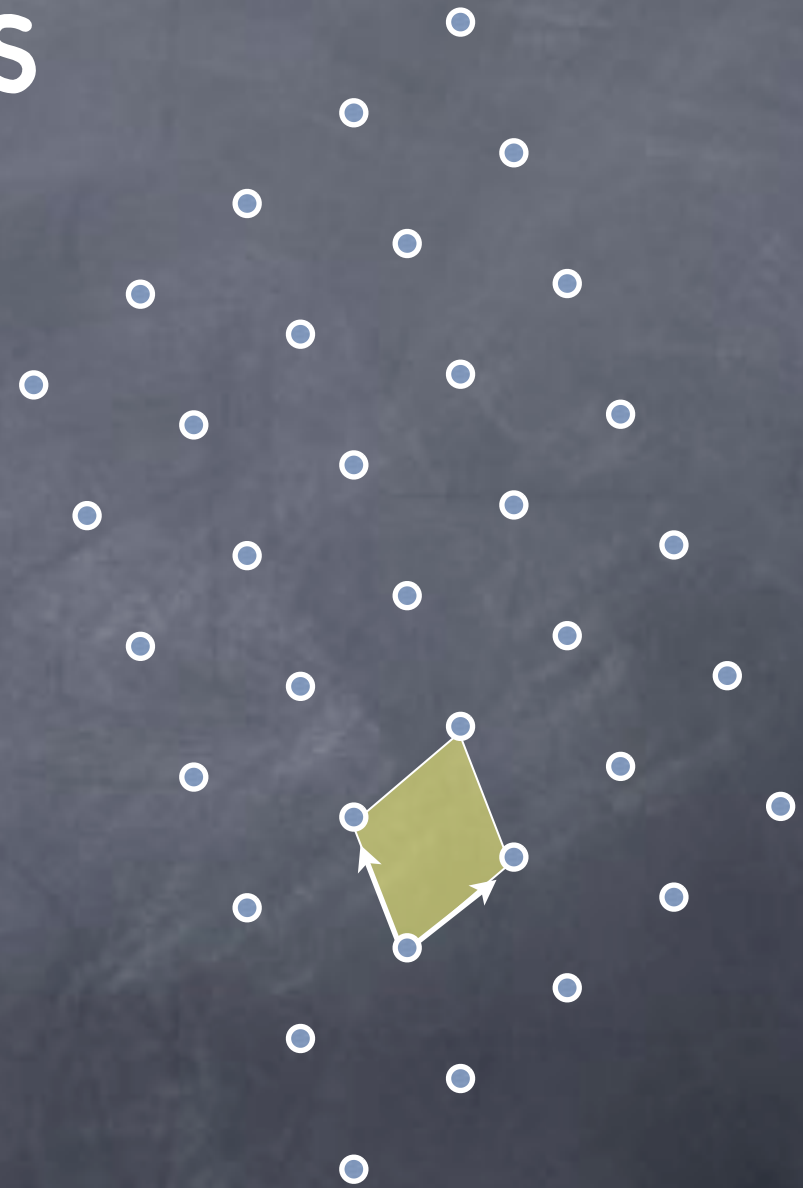
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”



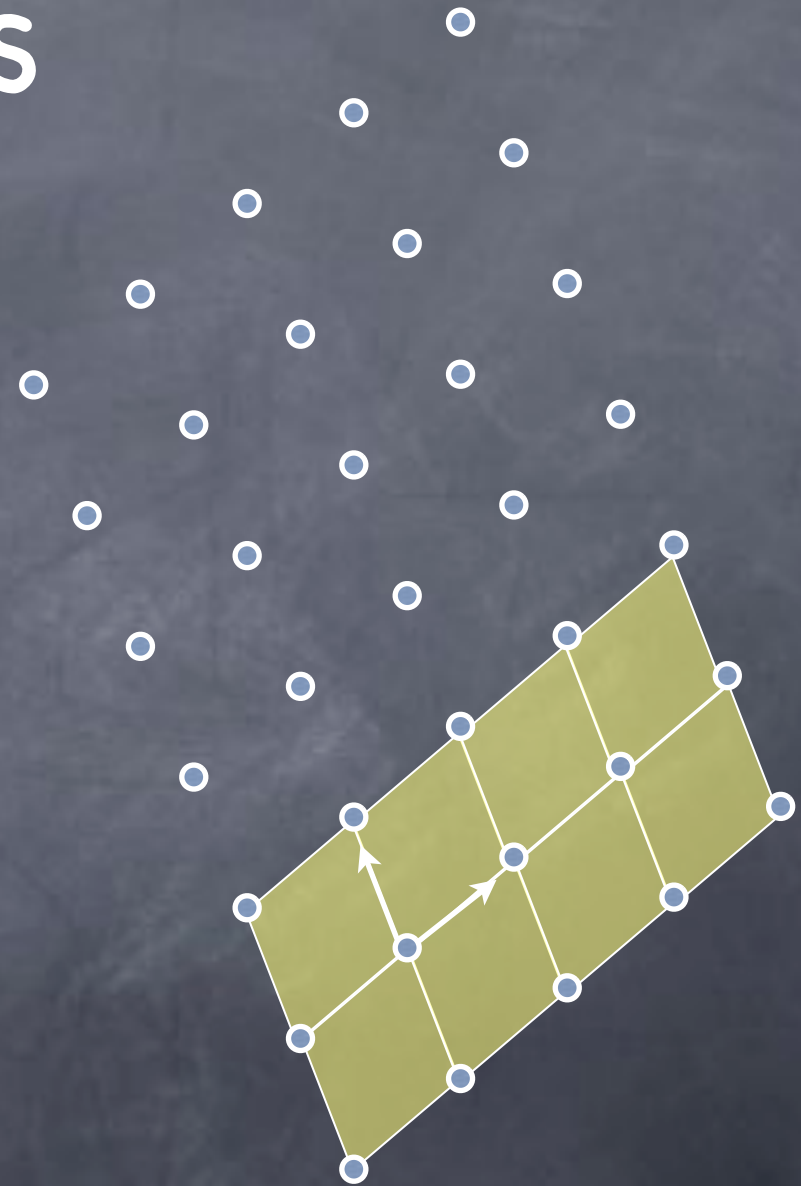
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”



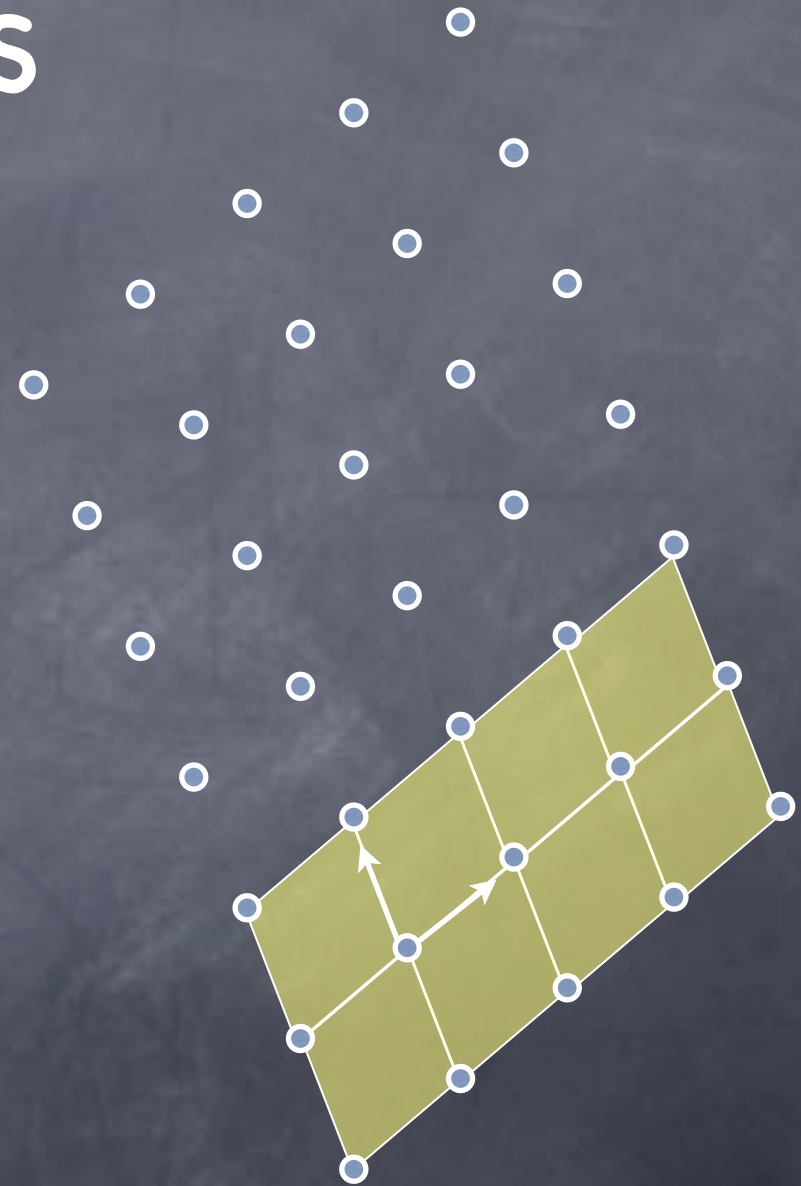
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”



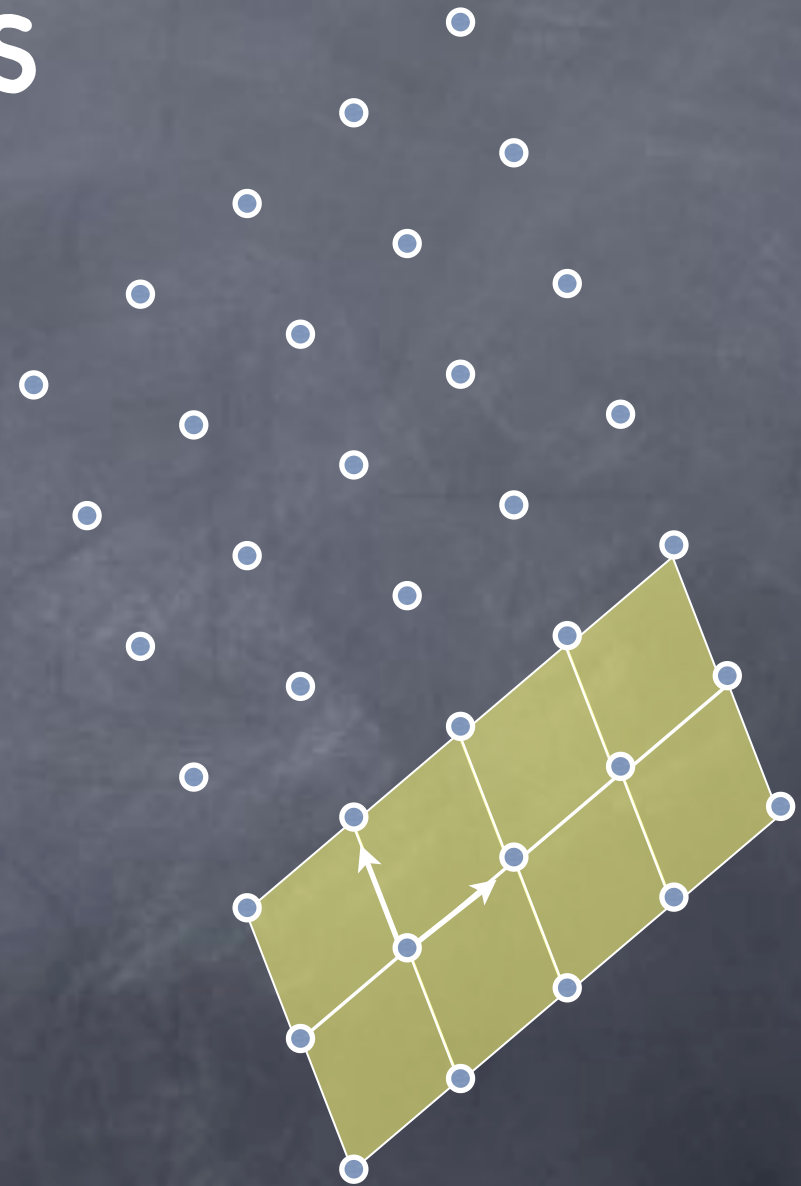
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”
 - Formally, $\{ \sum_i x_i \underline{\mathbf{b}}_i \mid x_i \text{ integers} \}$



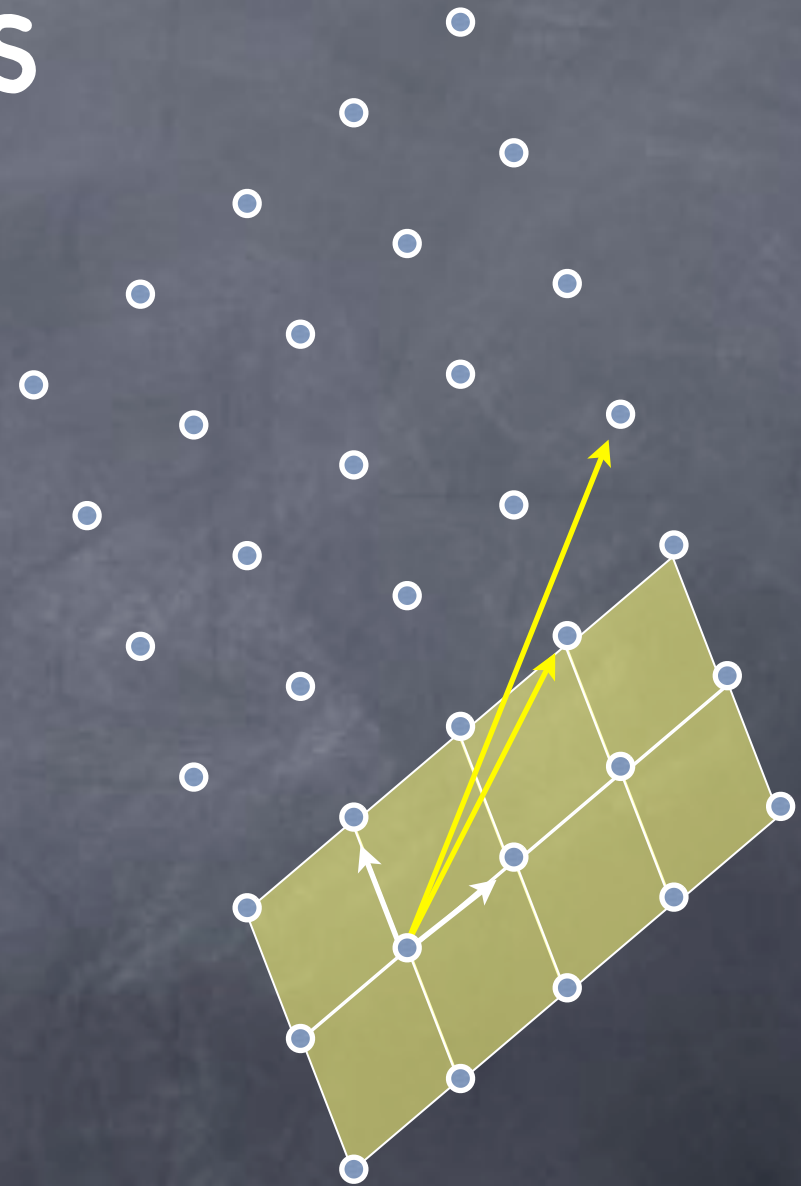
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”
 - Formally, $\{ \sum_i x_i \underline{\mathbf{b}}_i \mid x_i \text{ integers} \}$
- Basis is not unique



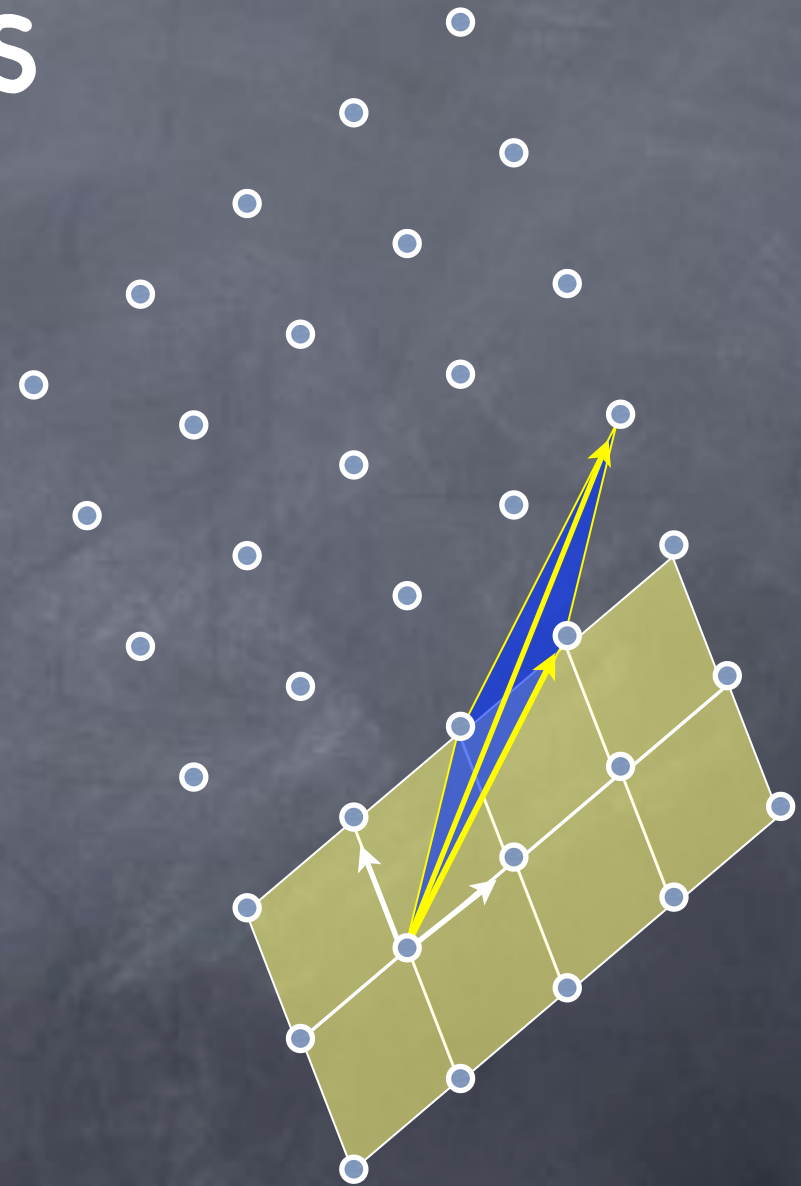
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”
 - Formally, $\{ \sum_i x_i \underline{\mathbf{b}}_i \mid x_i \text{ integers} \}$
- Basis is not unique



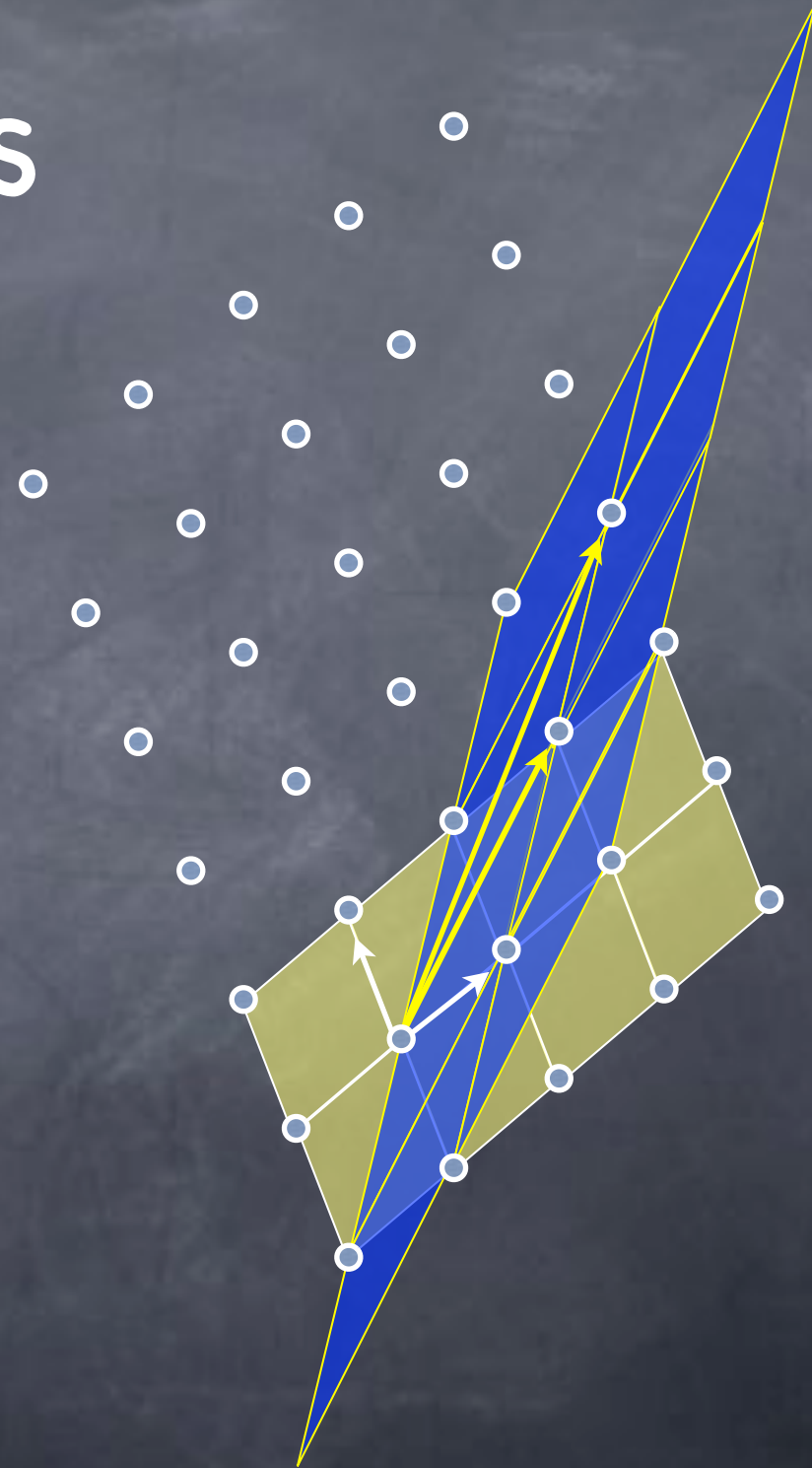
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”
 - Formally, $\{ \sum_i x_i \underline{\mathbf{b}}_i \mid x_i \text{ integers} \}$
- Basis is not unique



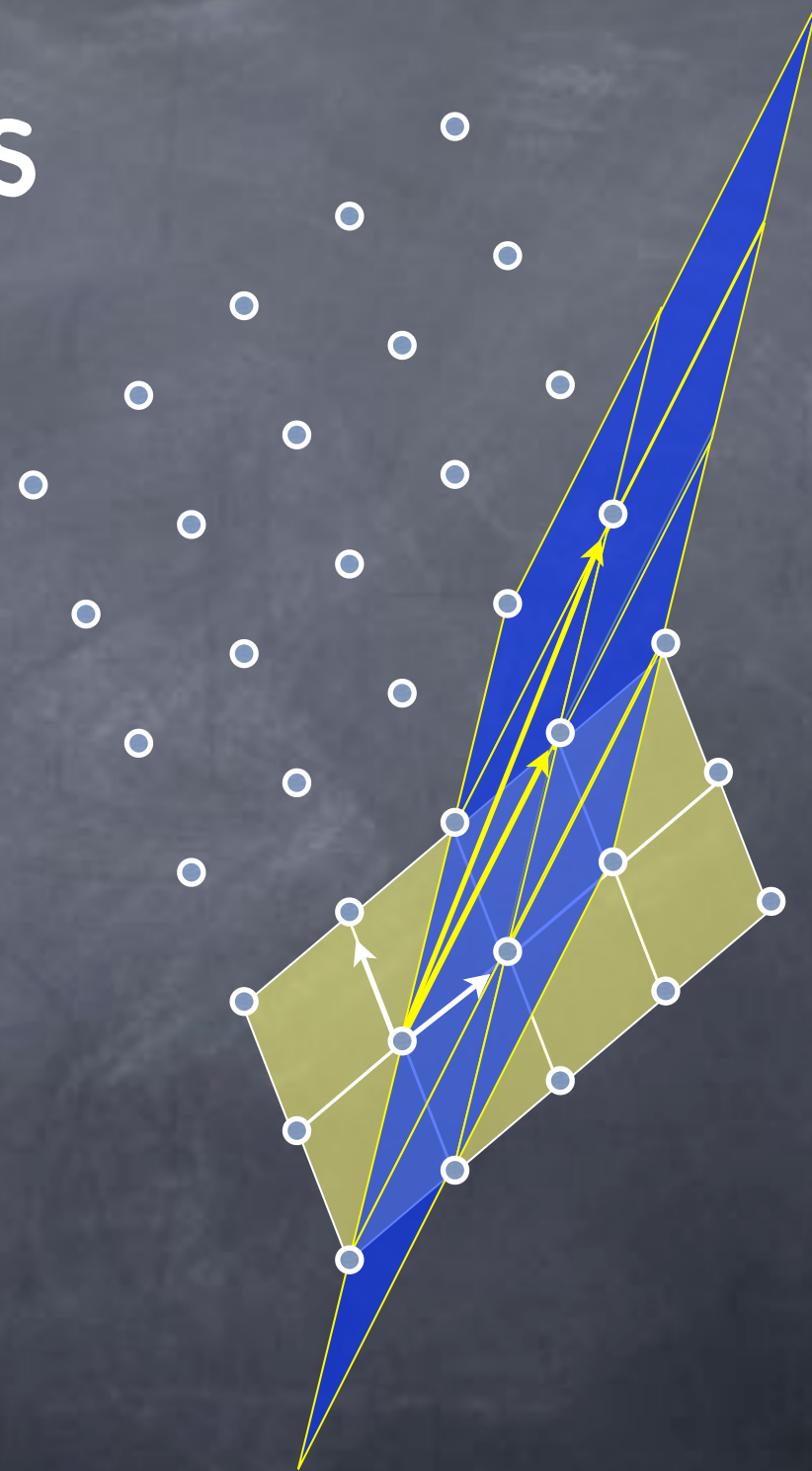
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”
 - Formally, $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- Basis is not unique



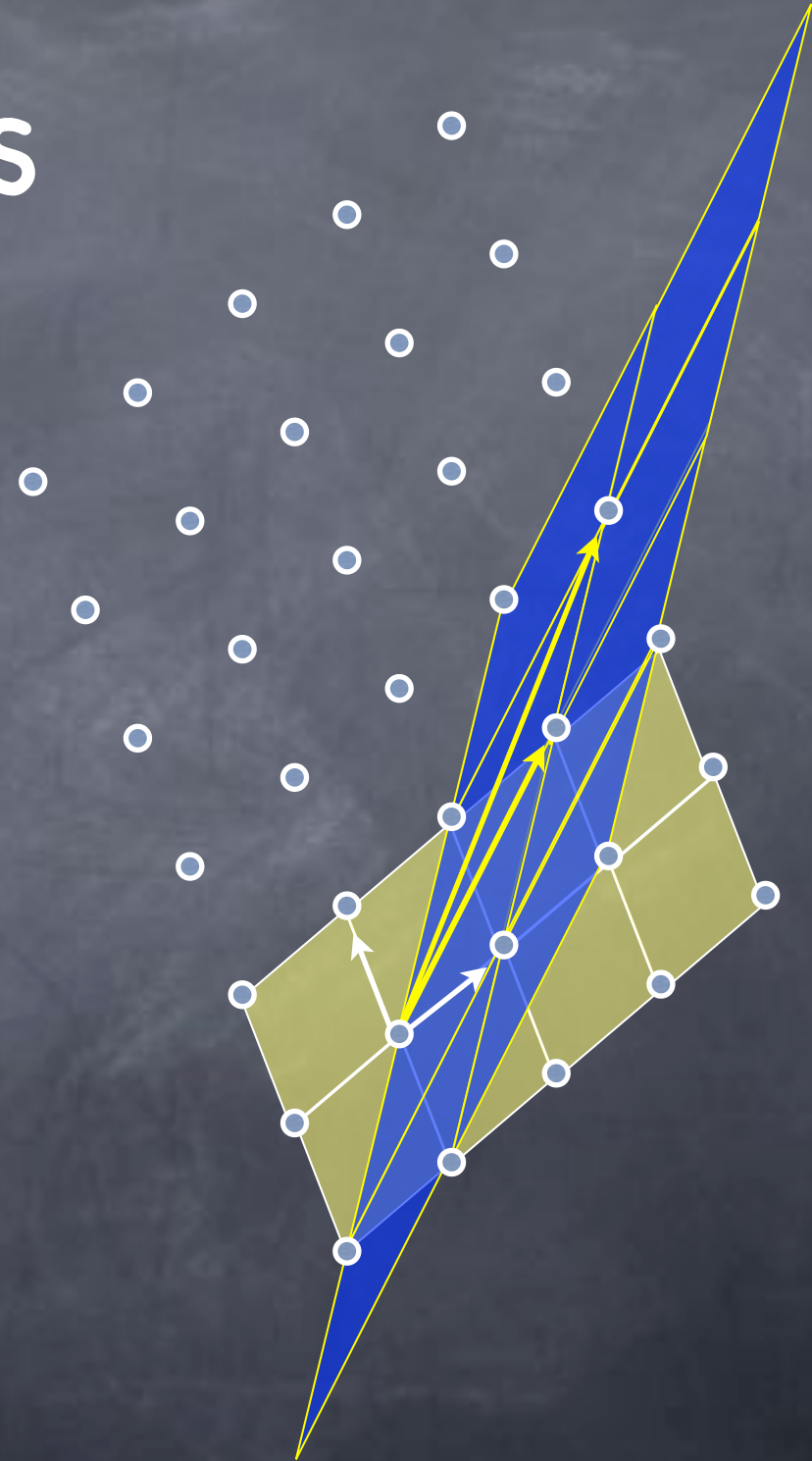
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”
 - Formally, $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- Basis is not unique
- Several problems related to high-dimensional lattices are believed to be hard, with cryptographic applications



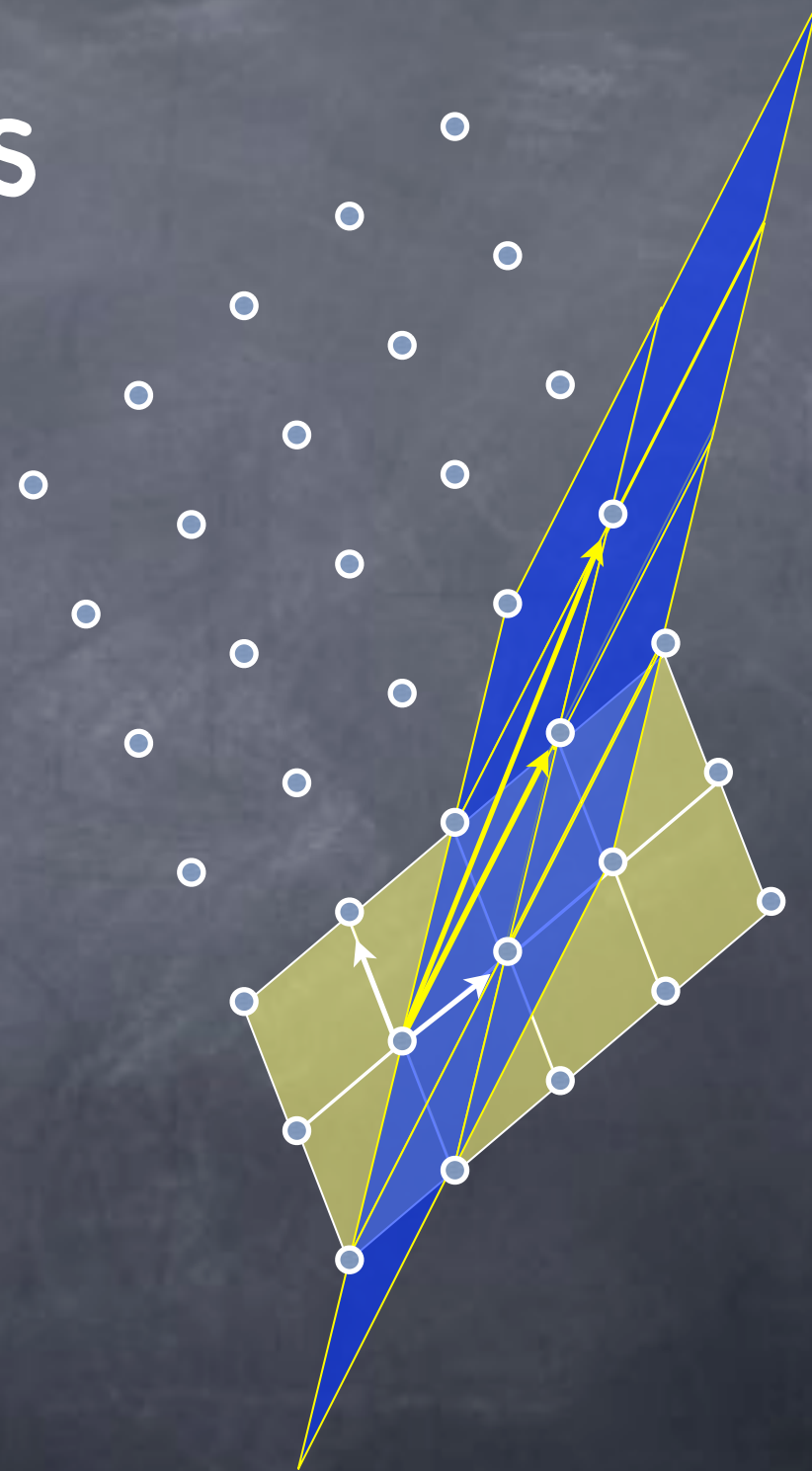
Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”
 - Formally, $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- Basis is not unique
- Several problems related to high-dimensional lattices are believed to be hard, with cryptographic applications
 - Hardness assumptions are “milder” (worst-case hardness)

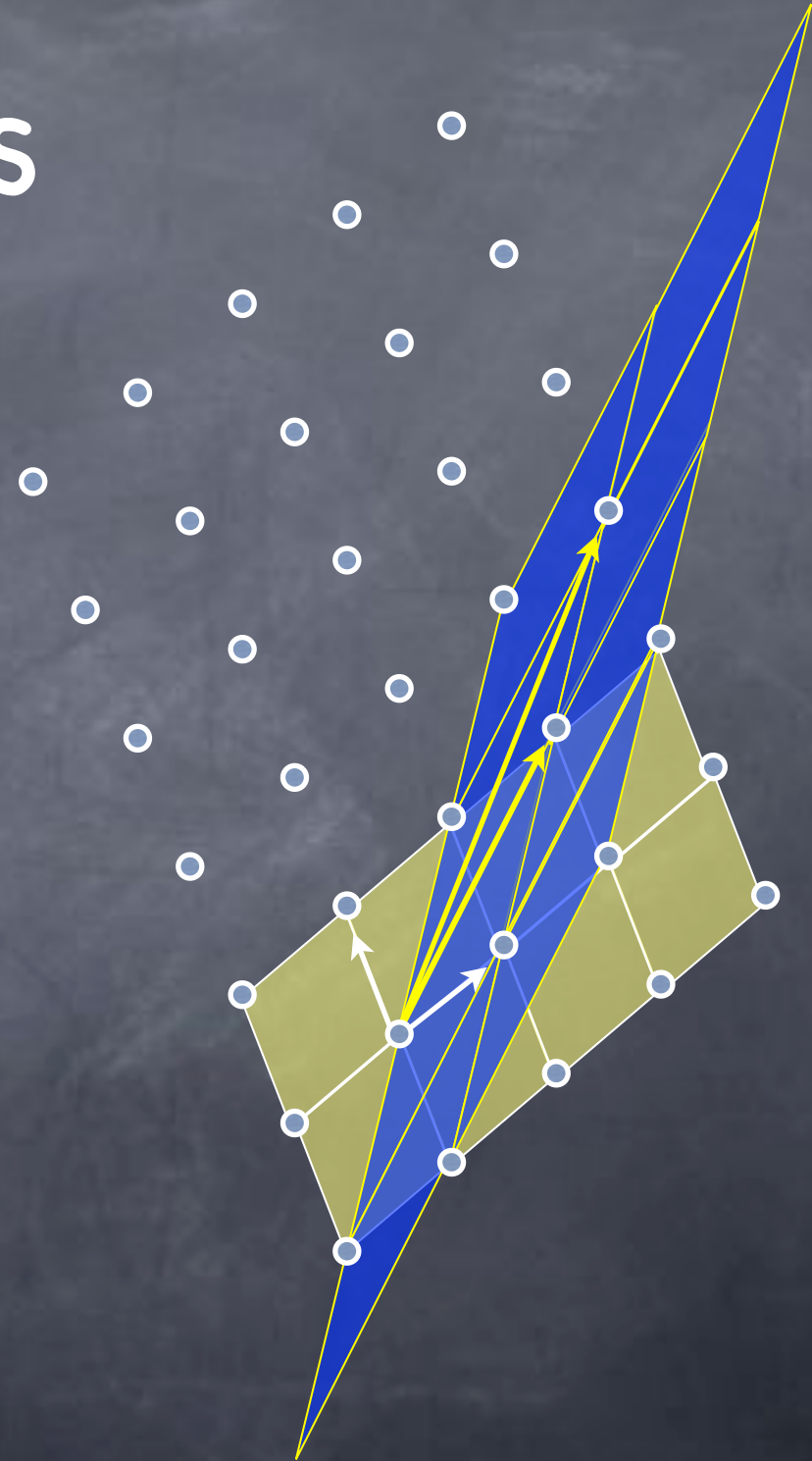


Lattices

- A infinite set of points in \mathbb{R}^n obtained by tiling with a “basis”
 - Formally, $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- Basis is not unique
- Several problems related to high-dimensional lattices are believed to be hard, with cryptographic applications
 - Hardness assumptions are “milder” (worst-case hardness)
 - Believed to hold even against quantum computation: “Post-Quantum Cryptography”

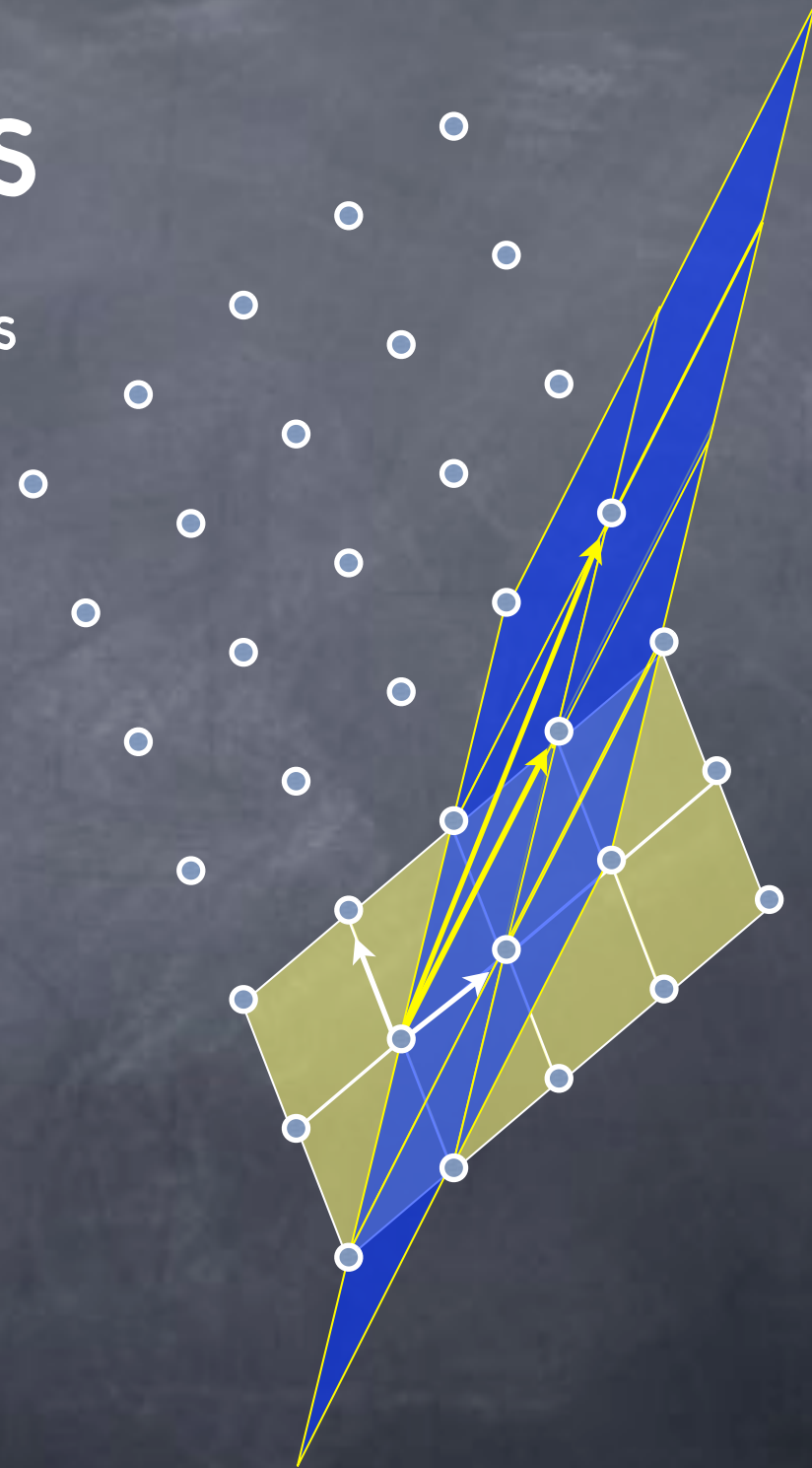


Lattices



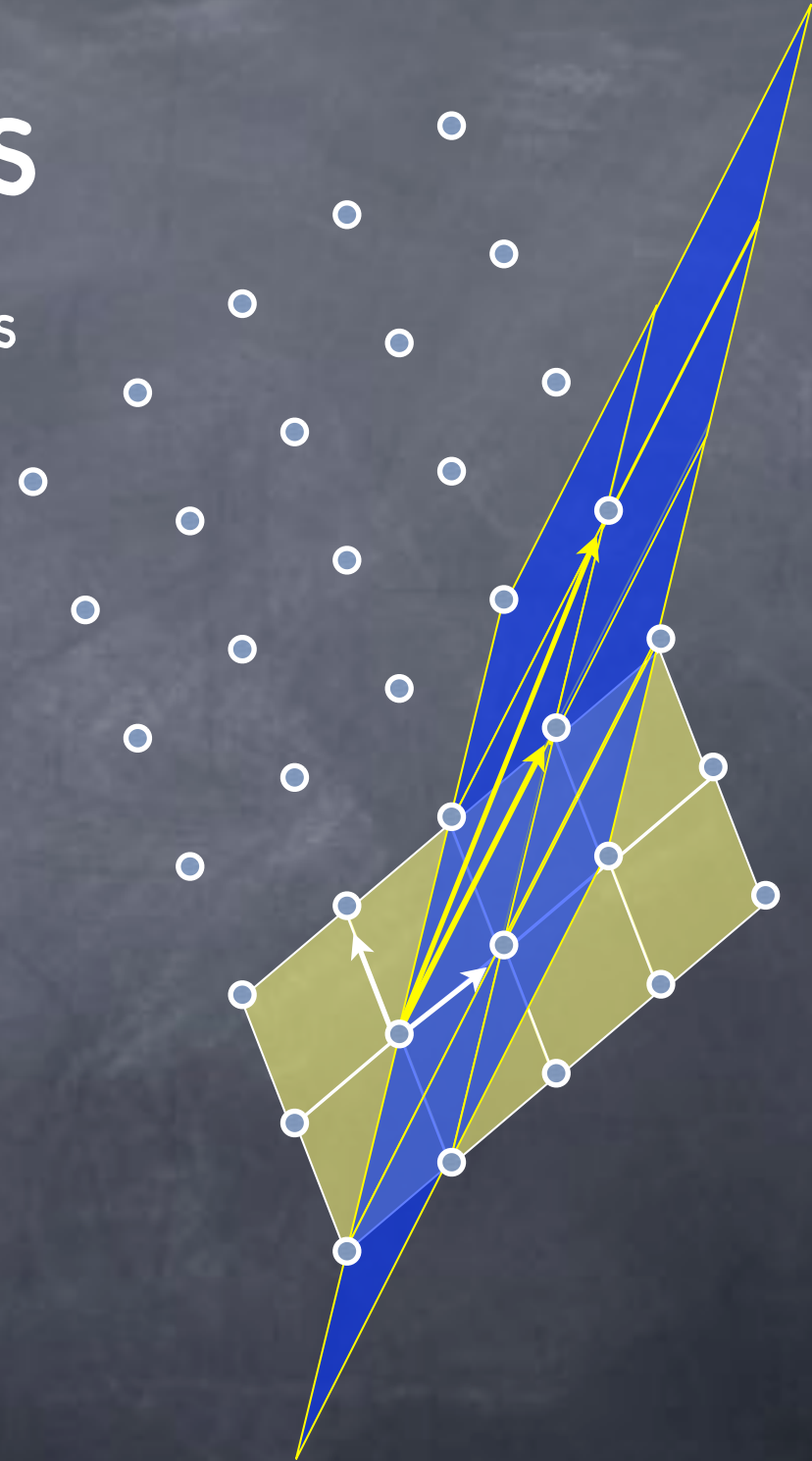
Lattices

- Given a basis $\{\underline{b}_1, \dots, \underline{b}_m\}$ in \mathbb{R}^n , lattice has points $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$



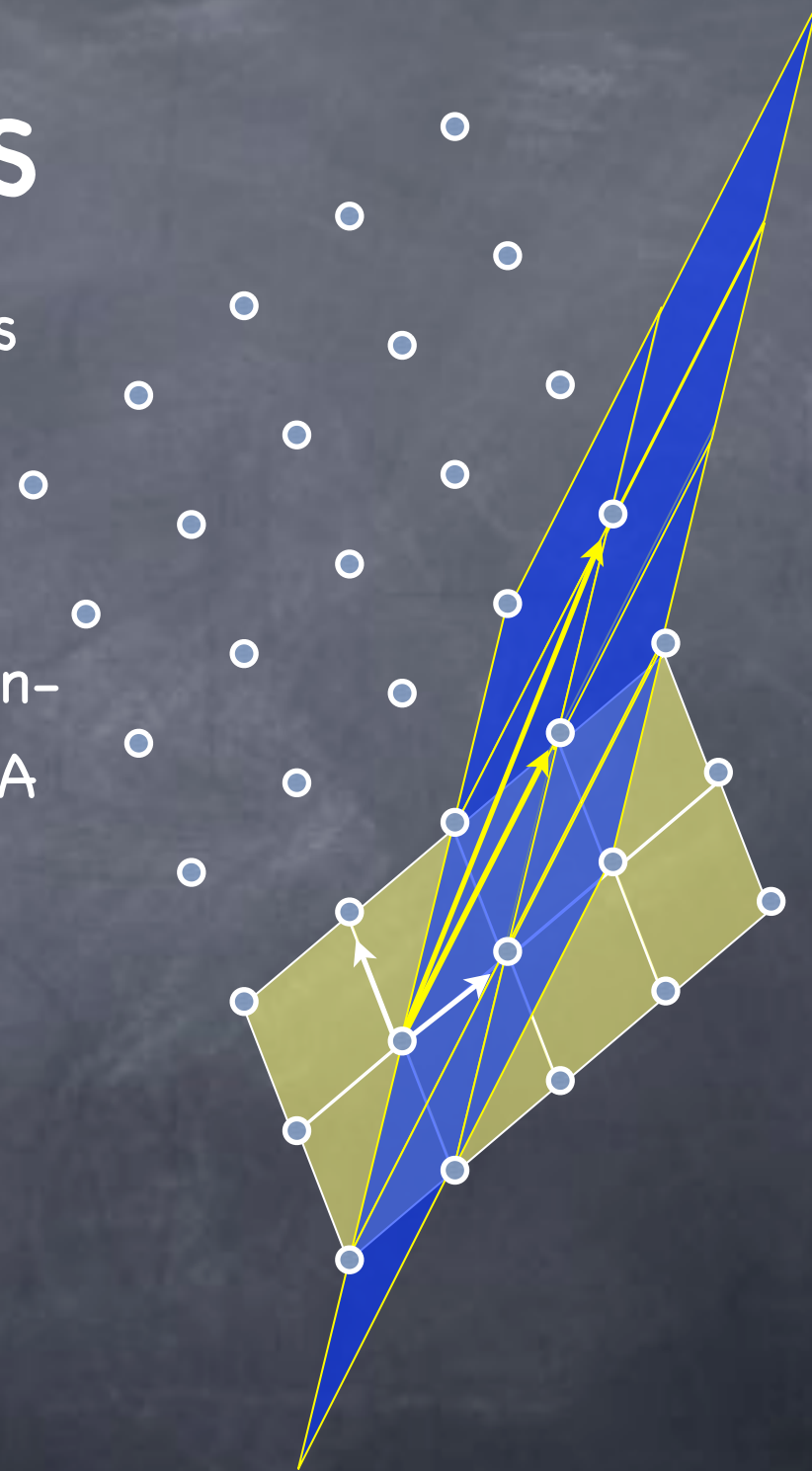
Lattices

- Given a basis $\{\underline{b}_1, \dots, \underline{b}_m\}$ in \mathbb{R}^n , lattice has points $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- An interesting case: lattices in \mathbb{Z}_q^n



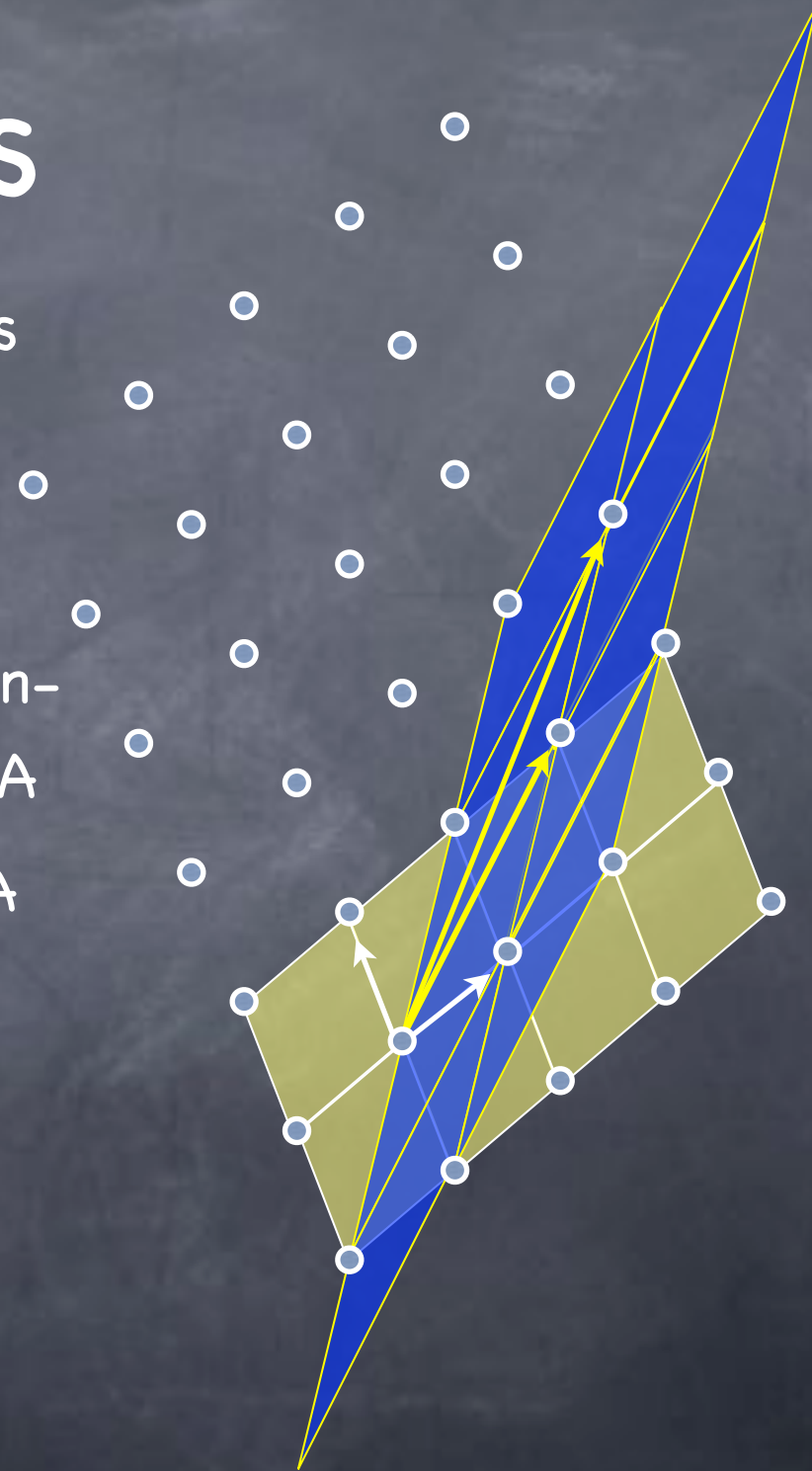
Lattices

- Given a basis $\{\underline{b}_1, \dots, \underline{b}_m\}$ in \mathbb{R}^n , lattice has points $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- An interesting case: lattices in \mathbb{Z}_q^n
 - Given an $n \times m$ matrix A over \mathbb{Z}_q two n -dimensional lattices associated with A



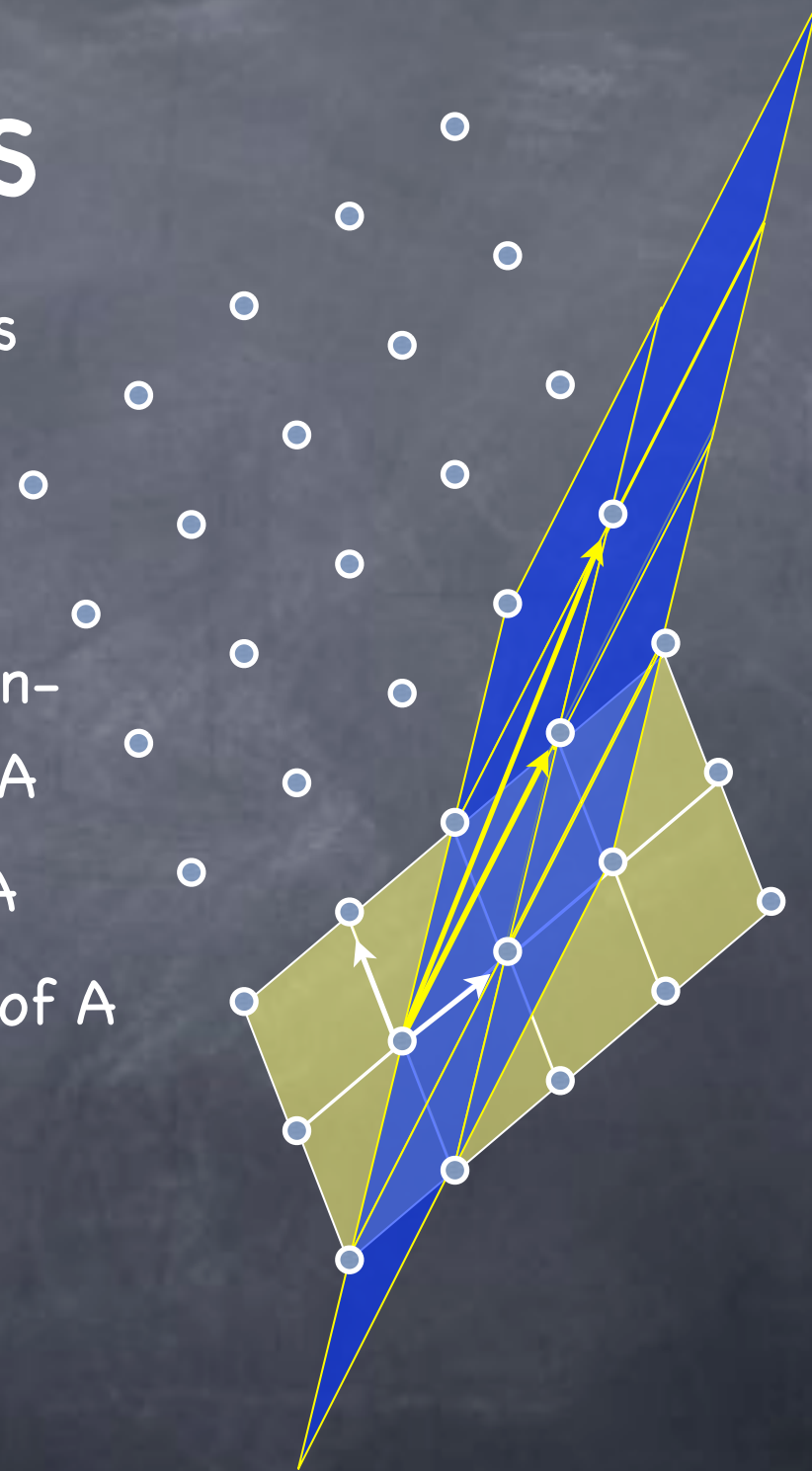
Lattices

- Given a basis $\{\underline{b}_1, \dots, \underline{b}_m\}$ in \mathbb{R}^n , lattice has points $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- An interesting case: lattices in \mathbb{Z}_q^n
 - Given an $n \times m$ matrix A over \mathbb{Z}_q two n -dimensional lattices associated with A
 - L_A : Vectors spanned by rows of A



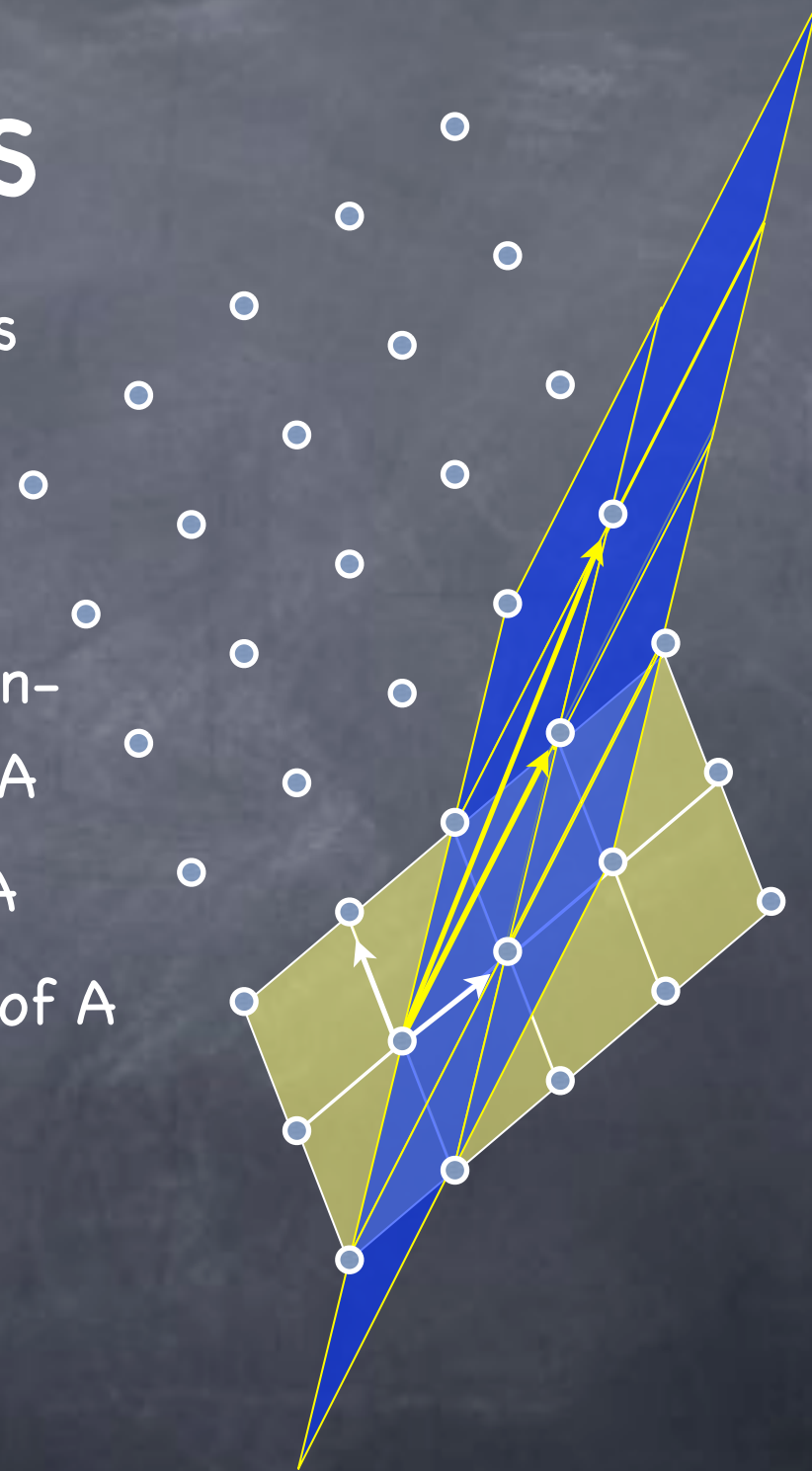
Lattices

- Given a basis $\{\underline{b}_1, \dots, \underline{b}_m\}$ in \mathbb{R}^n , lattice has points $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- An interesting case: lattices in \mathbb{Z}_q^n
 - Given an $n \times m$ matrix A over \mathbb{Z}_q two n -dimensional lattices associated with A
 - L_A : Vectors spanned by rows of A
 - L_A^\perp : Vectors orthogonal to rows of A



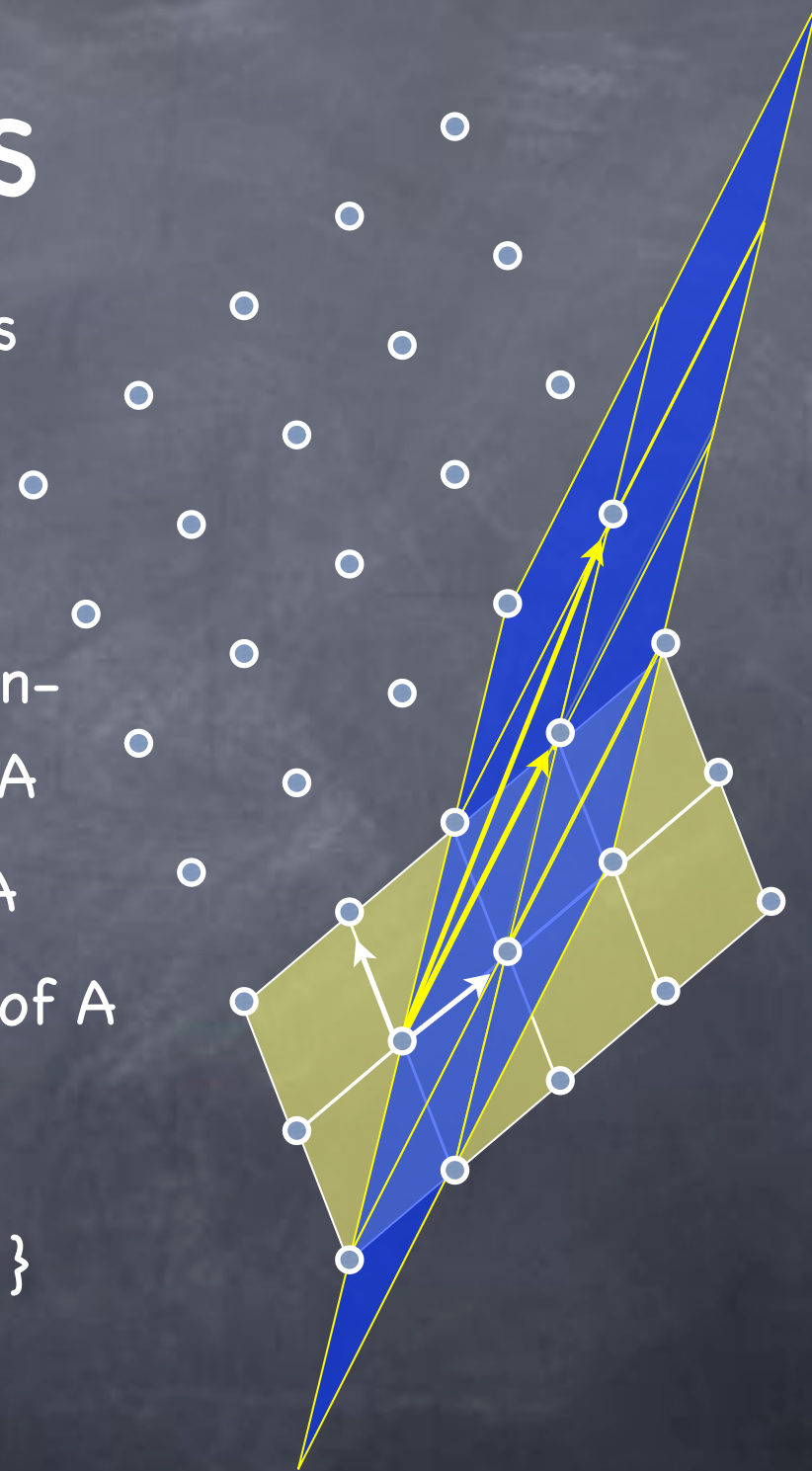
Lattices

- Given a basis $\{\underline{b}_1, \dots, \underline{b}_m\}$ in \mathbb{R}^n , lattice has points $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- An interesting case: lattices in \mathbb{Z}_q^n
 - Given an $n \times m$ matrix A over \mathbb{Z}_q two n -dimensional lattices associated with A
 - L_A : Vectors spanned by rows of A
 - L_A^\perp : Vectors orthogonal to rows of A
 - Operations mod q (i.e., over \mathbb{Z}_q)



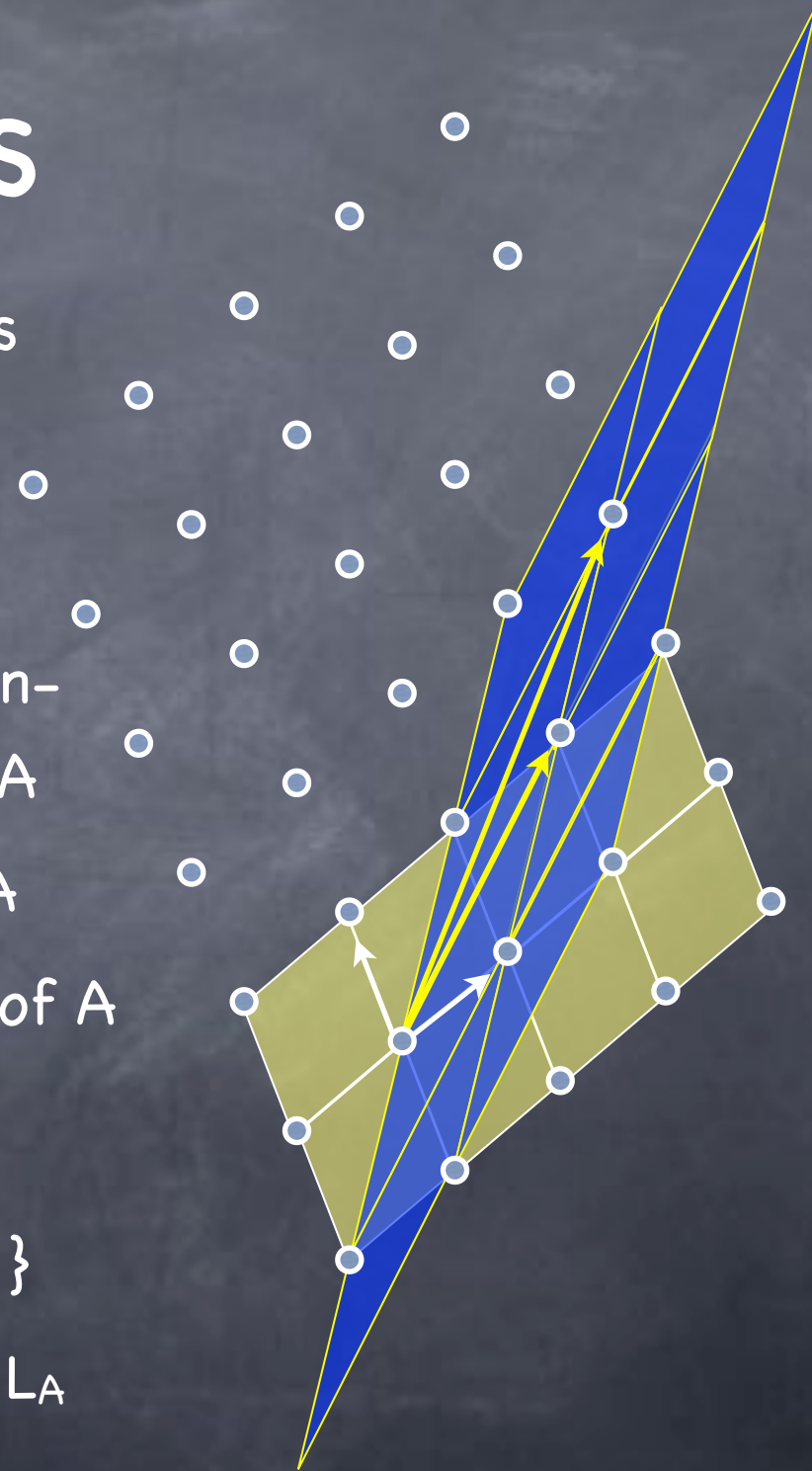
Lattices

- Given a basis $\{\underline{b}_1, \dots, \underline{b}_m\}$ in \mathbb{R}^n , lattice has points $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- An interesting case: lattices in \mathbb{Z}_q^n
 - Given an $n \times m$ matrix A over \mathbb{Z}_q two n -dimensional lattices associated with A
 - L_A : Vectors spanned by rows of A
 - L_A^\perp : Vectors orthogonal to rows of A
 - Operations mod q (i.e., over \mathbb{Z}_q)
- Dual lattice L^* : $\{ \underline{v} \mid \langle \underline{v}, \underline{u} \rangle \text{ is an integer} \}$



Lattices

- Given a basis $\{\underline{b}_1, \dots, \underline{b}_m\}$ in \mathbb{R}^n , lattice has points $\{ \sum_i x_i \underline{b}_i \mid x_i \text{ integers} \}$
- An interesting case: lattices in \mathbb{Z}_q^n
 - Given an $n \times m$ matrix A over \mathbb{Z}_q two n -dimensional lattices associated with A
 - L_A : Vectors spanned by rows of A
 - L_A^\perp : Vectors orthogonal to rows of A
 - Operations mod q (i.e., over \mathbb{Z}_q)
- Dual lattice L^* : $\{ \underline{v} \mid \langle \underline{v}, \underline{u} \rangle \text{ is an integer} \}$
 - e.g. $(L_A)^* = 1/q L_A^\perp$ and $(L_A^\perp)^* = 1/q L_A$



Lattices in Cryptography

Lattices in Cryptography

- Several problems related to lattices are believed to be computationally hard in high dimensions

Lattices in Cryptography

- Several problems related to lattices are believed to be computationally hard in high dimensions
- Closest Vector Problem (CVP): Given a point in \mathbb{R}^n , find the point closest to it in the lattice

Lattices in Cryptography

- Several problems related to lattices are believed to be computationally hard in high dimensions
- Closest Vector Problem (CVP): Given a point in \mathbb{R}^n , find the point closest to it in the lattice
- Shortest Vector Problem (SVP): Given a lattice basis, find the shortest non-zero vector in the lattice

Lattices in Cryptography

- Several problems related to lattices are believed to be computationally hard in high dimensions
- Closest Vector Problem (CVP): Given a point in \mathbb{R}^n , find the point closest to it in the lattice
- Shortest Vector Problem (SVP): Given a lattice basis, find the shortest non-zero vector in the lattice
 - SVP_γ : find one within a factor γ of the shortest

Lattices in Cryptography

- Several problems related to lattices are believed to be computationally hard in high dimensions
- Closest Vector Problem (CVP): Given a point in \mathbb{R}^n , find the point closest to it in the lattice
- Shortest Vector Problem (SVP): Given a lattice basis, find the shortest non-zero vector in the lattice
 - SVP_γ : find one within a factor γ of the shortest
 - GapSVP_γ : decide if the length of the shortest vector is < 1 or $> \gamma$ (promised to be one of the two)

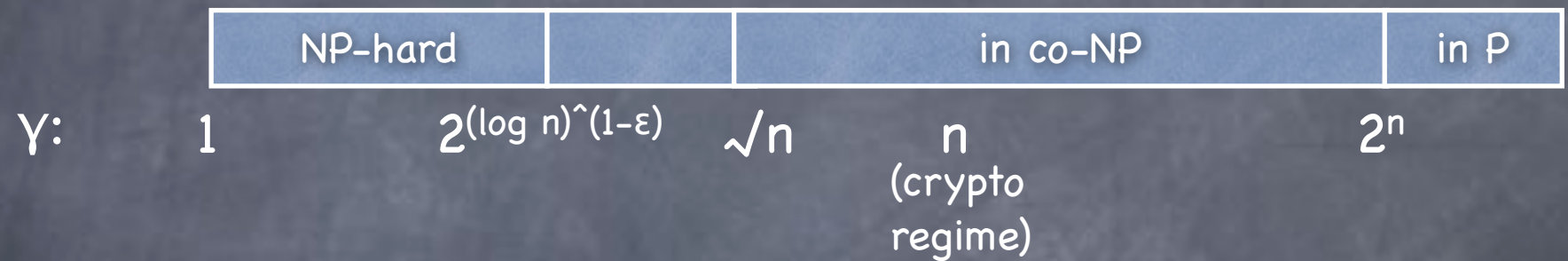
Lattices in Cryptography

- Several problems related to lattices are believed to be computationally hard in high dimensions
- Closest Vector Problem (CVP): Given a point in \mathbb{R}^n , find the point closest to it in the lattice
- Shortest Vector Problem (SVP): Given a lattice basis, find the shortest non-zero vector in the lattice
 - SVP_γ : find one within a factor γ of the shortest
 - GapSVP_γ : decide if the length of the shortest vector is < 1 or $> \gamma$ (promised to be one of the two)
 - uniqueSVP_γ : SVP, when guaranteed that the next (non-parallel) shortest vector is longer by a factor γ or more

Lattices in Cryptography

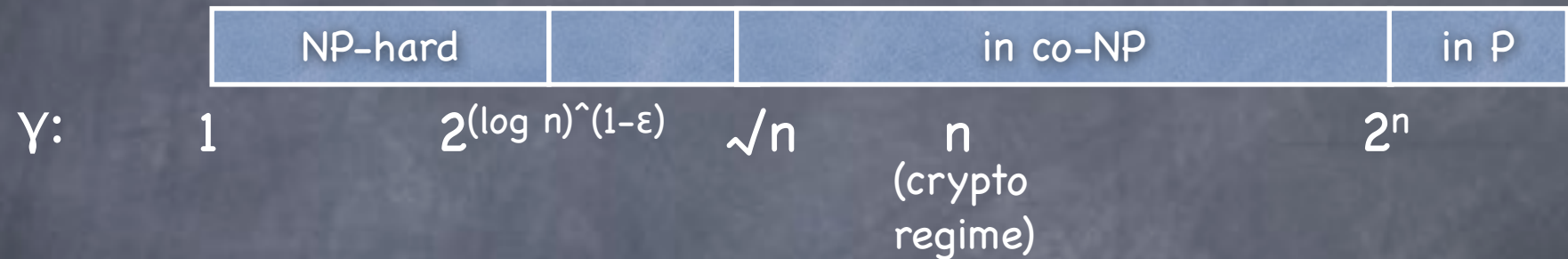
- Several problems related to lattices are believed to be computationally hard in high dimensions
- Closest Vector Problem (CVP): Given a point in \mathbb{R}^n , find the point closest to it in the lattice
- Shortest Vector Problem (SVP): Given a lattice basis, find the shortest non-zero vector in the lattice
 - SVP_γ : find one within a factor γ of the shortest
 - GapSVP_γ : decide if the length of the shortest vector is < 1 or $> \gamma$ (promised to be one of the two)
 - uniqueSVP_γ : SVP, when guaranteed that the next (non-parallel) shortest vector is longer by a factor γ or more
- Shortest Independent Vector Problem (SIVP): Find n independent vectors minimizing the longest of them

Lattices in Cryptography



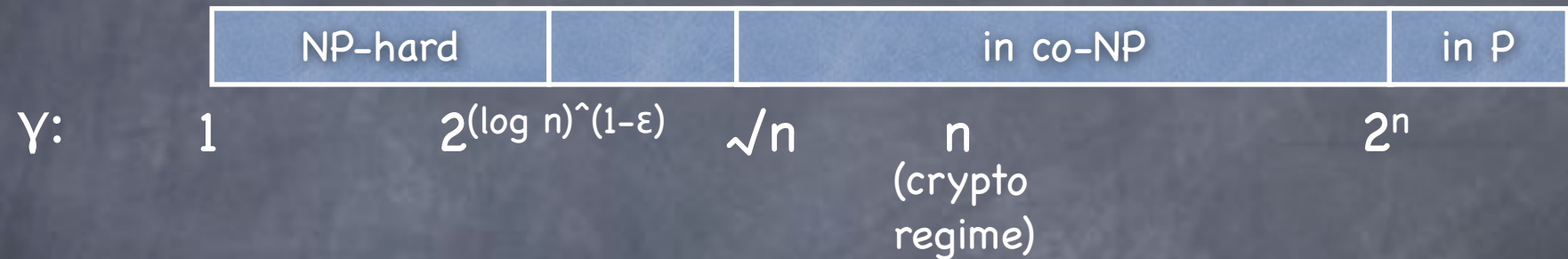
Lattices in Cryptography

- Worst-case hardness of lattice problems (e.g. GapSVP)



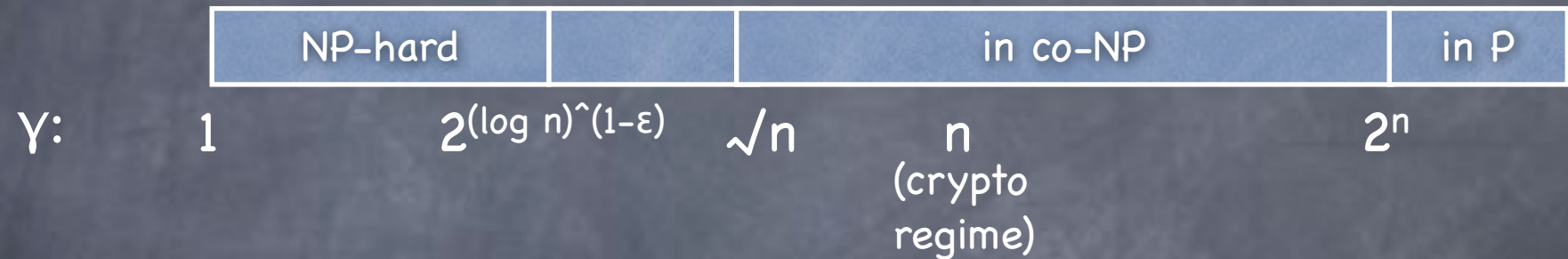
Lattices in Cryptography

- Worst-case hardness of lattice problems (e.g. GapSVP)



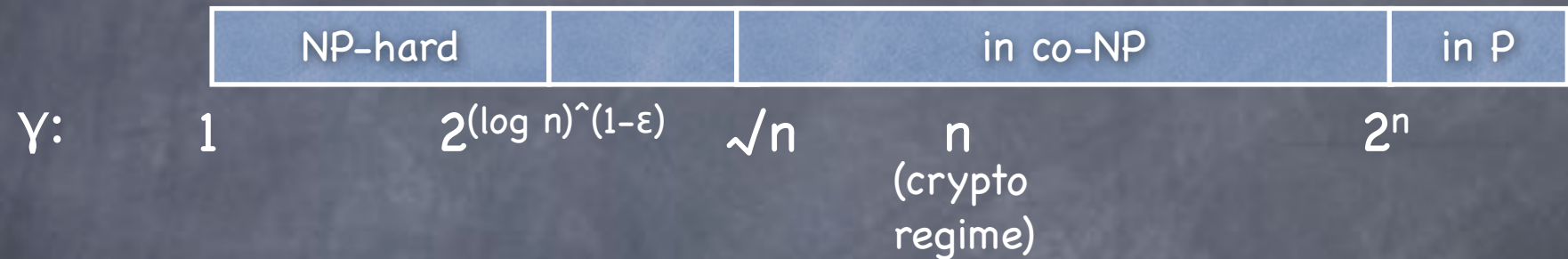
Lattices in Cryptography

- Worst-case hardness of lattice problems (e.g. GapSVP)



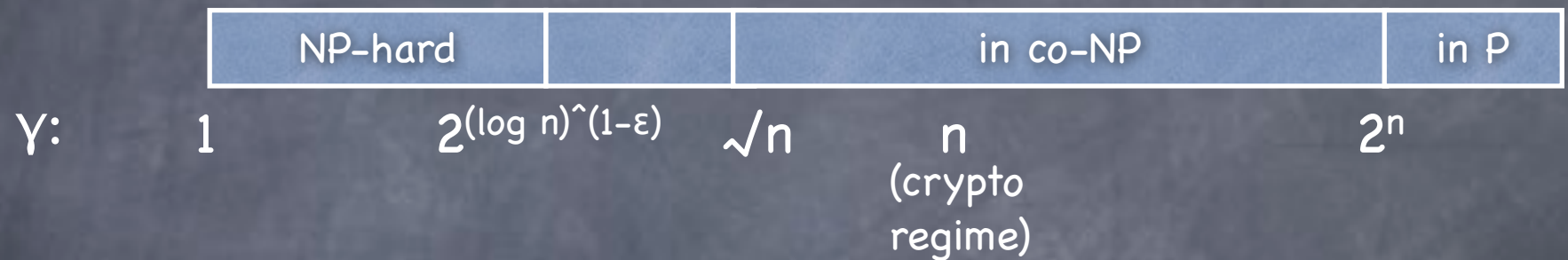
Lattices in Cryptography

- Worst-case hardness of lattice problems (e.g. GapSVP)



Lattices in Cryptography

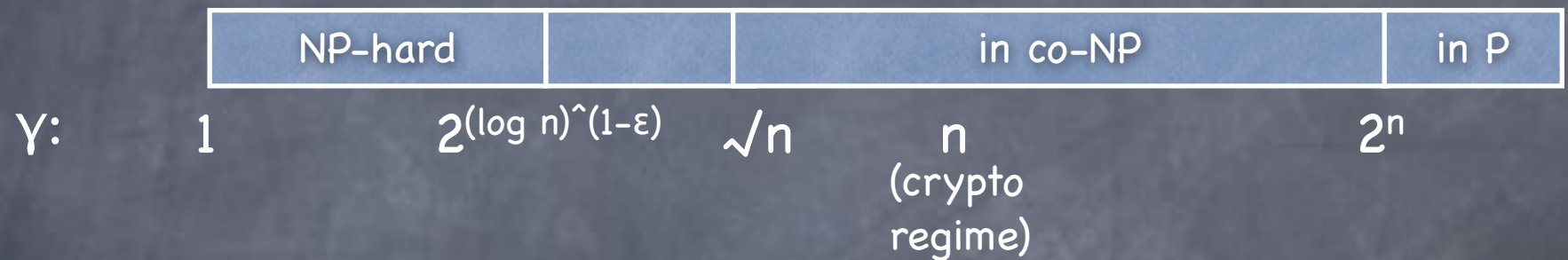
- Worst-case hardness of lattice problems (e.g. GapSVP)



- Assumptions about worst-case hardness (e.g. $P \neq NP$) are qualitatively simpler than that of average-case hardness

Lattices in Cryptography

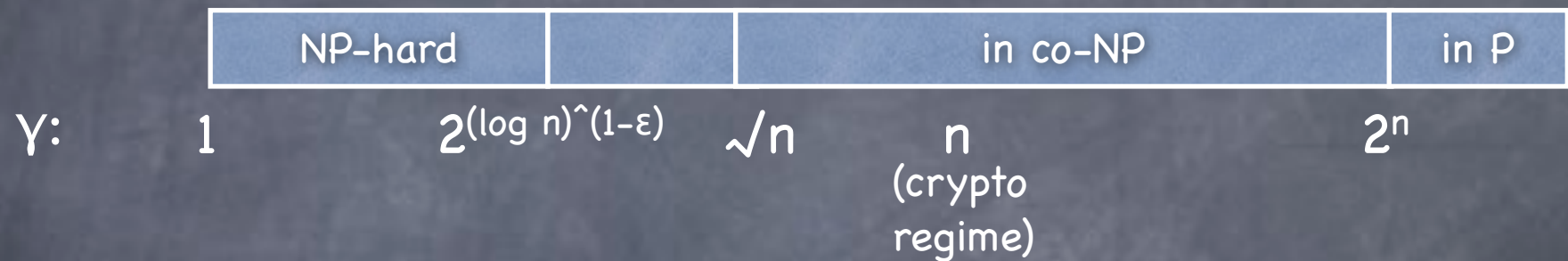
- Worst-case hardness of lattice problems (e.g. GapSVP)



- Assumptions about worst-case hardness (e.g. $P \neq NP$) are qualitatively simpler than that of average-case hardness
 - Crypto requires average-case hardness

Lattices in Cryptography

- Worst-case hardness of lattice problems (e.g. GapSVP)



- Assumptions about worst-case hardness (e.g. $P \neq NP$) are qualitatively simpler than that of average-case hardness
 - Crypto requires average-case hardness
 - 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)

Learning With Errors

Learning With Errors

- LWE: given noisy inner-products of random vectors with a hidden vector, find the hidden vector

Learning With Errors

- LWE: given noisy inner-products of random vectors with a hidden vector, find the hidden vector
- Given $\langle \underline{a}_1, \underline{s} \rangle + \underline{e}_1, \dots, \langle \underline{a}_m, \underline{s} \rangle + \underline{e}_m$ and $\underline{a}_1, \dots, \underline{a}_m$ find s .
 \underline{a}_i uniform, \underline{e}_i Gaussian noise

Learning With Errors

- LWE: given noisy inner-products of random vectors with a hidden vector, find the hidden vector
 - Given $\langle \underline{a}_1, \underline{s} \rangle + \underline{e}_1, \dots, \langle \underline{a}_m, \underline{s} \rangle + \underline{e}_m$ and $\underline{a}_1, \dots, \underline{a}_m$ find s .
 \underline{a}_i uniform, \underline{e}_i Gaussian noise
- LWE-Decision version: distinguish between such an input and a random input

Learning With Errors

- LWE: given noisy inner-products of random vectors with a hidden vector, find the hidden vector
 - Given $\langle \underline{a}_1, \underline{s} \rangle + \underline{e}_1, \dots, \langle \underline{a}_m, \underline{s} \rangle + \underline{e}_m$ and $\underline{a}_1, \dots, \underline{a}_m$ find s .
 \underline{a}_i uniform, \underline{e}_i Gaussian noise
- LWE-Decision version: distinguish between such an input and a random input
- Assumed to be hard (note: average-case hardness). Has been connected with worst-case hardness of GapSVP

Learning With Errors

- LWE: given noisy inner-products of random vectors with a hidden vector, find the hidden vector
 - Given $\langle \underline{a}_1, \underline{s} \rangle + \underline{e}_1, \dots, \langle \underline{a}_m, \underline{s} \rangle + \underline{e}_m$ and $\underline{a}_1, \dots, \underline{a}_m$ find s .
 \underline{a}_i uniform, \underline{e}_i Gaussian noise
- LWE-Decision version: distinguish between such an input and a random input
- Assumed to be hard (note: average-case hardness). Has been connected with worst-case hardness of GapSVP
 - Turns out to be a very useful assumption

Hash Functions and OWF

Hash Functions and OWF

• CRHF: $f(\underline{x}) = A\underline{x}$

Hash Functions and OWF

- CRHF: $f(\underline{x}) = A\underline{x}$
- \underline{x} required to be a "short" vector (i.e., each co-ordinate in the range $[0, d-1]$ for some small d)

Hash Functions and OWF

- CRHF: $f(\underline{x}) = A\underline{x}$
 - \underline{x} required to be a "short" vector (i.e., each co-ordinate in the range $[0, d-1]$ for some small d)
 - A is an $n \times m$ matrix: maps $m \log d$ bits to $n \log q$ bits (for compression we require $m > n \log_d q$)

Hash Functions and OWF

- CRHF: $f(\underline{x}) = A\underline{x}$
- \underline{x} required to be a "short" vector (i.e., each co-ordinate in the range $[0, d-1]$ for some small d)
- A is an $n \times m$ matrix: maps $m \log d$ bits to $n \log q$ bits (for compression we require $m > n \log_d q$)
- Collision yields a short vector (co-ordinates in $[-(d-1), d-1]$)
 \underline{z} s.t. $A\underline{z} = 0$: i.e., a short vector in the lattice L_A^\perp

Hash Functions and OWF

- CRHF: $f(\underline{x}) = A\underline{x}$
- \underline{x} required to be a "short" vector (i.e., each co-ordinate in the range $[0, d-1]$ for some small d)
- A is an $n \times m$ matrix: maps $m \log d$ bits to $n \log q$ bits (for compression we require $m > n \log_d q$)
- Collision yields a short vector (co-ordinates in $[-(d-1), d-1]$) \underline{z} s.t. $A\underline{z} = 0$: i.e., a short vector in the lattice L_A^\perp
- Simple to compute: if d small (say, $d=2$, i.e., \underline{x} binary), $f(\underline{x})$ can be computed using $O(m \log n)$ additions mod q

Hash Functions and OWF

- CRHF: $f(\underline{x}) = A\underline{x}$
 - \underline{x} required to be a "short" vector (i.e., each co-ordinate in the range $[0, d-1]$ for some small d)
 - A is an $n \times m$ matrix: maps $m \log d$ bits to $n \log q$ bits (for compression we require $m > n \log_d q$)
 - Collision yields a short vector (co-ordinates in $[-(d-1), d-1]$) \underline{z} s.t. $A\underline{z} = 0$: i.e., a short vector in the lattice L_A^\perp
 - Simple to compute: if d small (say, $d=2$, i.e., \underline{x} binary), $f(\underline{x})$ can be computed using $O(m \log n)$ additions mod q
- If sufficiently compressing (say by half), a CRHF is also a OWF

Average-Case/Worst-Case Connection

Average-Case/Worst-Case Connection

- Collision yields a short vector (co-ordinates in $[-(d-1), d-1]$)
 \underline{z} s.t. $A\underline{z} = 0$: i.e., a short vector in the lattice L_A^\perp

Average-Case/Worst-Case Connection

- Collision yields a short vector (co-ordinates in $[-(d-1), d-1]$)
 \underline{z} s.t. $A\underline{z} = 0$: i.e., a short vector in the lattice L_A^\perp
- Considered hard when A is chosen uniformly at random

Average-Case/Worst-Case Connection

- Collision yields a short vector (co-ordinates in $[-(d-1), d-1]$)
 \underline{z} s.t. $A\underline{z} = 0$: i.e., a short vector in the lattice L_A^\perp
- Considered hard when A is chosen uniformly at random
- 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)

Succinct Keys

Succinct Keys

- The hash function is described by an $n \times m$ matrix over \mathbb{Z}_q , where n is the security parameter and $m > n$

Succinct Keys

- The hash function is described by an $n \times m$ matrix over \mathbb{Z}_q , where n is the security parameter and $m > n$
- Large key and correspondingly large number of operations

Succinct Keys

- The hash function is described by an $n \times m$ matrix over \mathbb{Z}_q , where n is the security parameter and $m > n$
 - Large key and correspondingly large number of operations
- Using “ideal lattices”

Succinct Keys

- The hash function is described by an $n \times m$ matrix over \mathbb{Z}_q , where n is the security parameter and $m > n$
 - Large key and correspondingly large number of operations
- Using “ideal lattices”
 - Have more structure: a random basis for such a lattice can be represented using just m elements of \mathbb{Z}_q (instead of mn)

Succinct Keys

- The hash function is described by an $n \times m$ matrix over \mathbb{Z}_q , where n is the security parameter and $m > n$
 - Large key and correspondingly large number of operations
- Using “ideal lattices”
 - Have more structure: a random basis for such a lattice can be represented using just m elements of \mathbb{Z}_q (instead of mn)
 - Matrix multiplication can be carried out faster (using FFT) with $\tilde{O}(m)$ operations over \mathbb{Z}_q (instead of $O(mn)$)

Succinct Keys

- The hash function is described by an $n \times m$ matrix over \mathbb{Z}_q , where n is the security parameter and $m > n$
 - Large key and correspondingly large number of operations
- Using “ideal lattices”
 - Have more structure: a random basis for such a lattice can be represented using just m elements of \mathbb{Z}_q (instead of mn)
 - Matrix multiplication can be carried out faster (using FFT) with $\tilde{O}(m)$ operations over \mathbb{Z}_q (instead of $O(mn)$)
- Security depends on worst-case hardness of same problems as before, but when restricted to ideal lattices

Public-Key Encryption

Public-Key Encryption

- NTRU/GGH approach: Private key is a “good” basis, and the public key is a “bad basis”

Public-Key Encryption

- NTRU/GGH approach: Private key is a “good” basis, and the public key is a “bad basis”
- Worst basis (one that can be efficiently computed from any basis): Hermite Normal Form (HNF) basis

Public-Key Encryption

- NTRU/GGH approach: Private key is a “good” basis, and the public key is a “bad basis”
 - Worst basis (one that can be efficiently computed from any basis): Hermite Normal Form (HNF) basis
- To encrypt a message, encode it (randomized) as a short “noise vector” u . Output $c = v + u$ for a lattice point v that is chosen using the public basis

Public-Key Encryption

- NTRU/GGH approach: Private key is a “good” basis, and the public key is a “bad basis”
 - Worst basis (one that can be efficiently computed from any basis): Hermite Normal Form (HNF) basis
- To encrypt a message, encode it (randomized) as a short “noise vector” u . Output $c = v + u$ for a lattice point v that is chosen using the public basis
 - To decrypt, use the good basis to find v as the closest lattice vector to c , and recover $u = c - v$

Public-Key Encryption

- NTRU/GGH approach: Private key is a “good” basis, and the public key is a “bad basis”
 - Worst basis (one that can be efficiently computed from any basis): Hermite Normal Form (HNF) basis
- To encrypt a message, encode it (randomized) as a short “noise vector” u . Output $c = v + u$ for a lattice point v that is chosen using the public basis
 - To decrypt, use the good basis to find v as the closest lattice vector to c , and recover $u = c - v$
- NTRU Encryption: use lattices with succinct basis

Public-Key Encryption

- NTRU/GGH approach: Private key is a “good” basis, and the public key is a “bad basis”
 - Worst basis (one that can be efficiently computed from any basis): Hermite Normal Form (HNF) basis
- To encrypt a message, encode it (randomized) as a short “noise vector” u . Output $c = v + u$ for a lattice point v that is chosen using the public basis
 - To decrypt, use the good basis to find v as the closest lattice vector to c , and recover $u = c - v$
- NTRU Encryption: use lattices with succinct basis
- Conjectured to be CPA secure. No security reduction known to simple lattice problems

Public-Key Encryption

Public-Key Encryption

- A subset-sum approach:

Public-Key Encryption

- A subset-sum approach:
 - Encryption of bit 0 is a point from a uniform distribution (over an interval of integers); encryption of 1 comes from a “wavy” distribution of secret period

Public-Key Encryption

- A subset-sum approach:
 - Encryption of bit 0 is a point from a uniform distribution (over an interval of integers); encryption of 1 comes from a “wavy” distribution of secret period
 - Public-key gives several points from the wavy distribution that can be combined (subset sum) to get more points from the wavy distribution

Public-Key Encryption

- A subset-sum approach:
 - Encryption of bit 0 is a point from a uniform distribution (over an interval of integers); encryption of 1 comes from a “wavy” distribution of secret period
 - Public-key gives several points from the wavy distribution that can be combined (subset sum) to get more points from the wavy distribution
 - Secret-key consists of the period: enough for a statistical test to distinguish the two distributions

Public-Key Encryption

- A subset-sum approach:
 - Encryption of bit 0 is a point from a uniform distribution (over an interval of integers); encryption of 1 comes from a “wavy” distribution of secret period
 - Public-key gives several points from the wavy distribution that can be combined (subset sum) to get more points from the wavy distribution
 - Secret-key consists of the period: enough for a statistical test to distinguish the two distributions
- CPA Security: distinguishing the uniform and wavy distributions can be used to distinguish between noise added to lattices obtained as duals of lattices either with no short vector or with a unique short vector

Public-Key Encryption

Public-Key Encryption

- An LWE based approach:

Public-Key Encryption

- An LWE based approach:
 - Public-key is (A, P) where $P=AS+E$, for random matrices (of appropriate dimensions) A and S , and a noise matrix E over \mathbb{Z}_q

Public-Key Encryption

- An LWE based approach:
 - Public-key is (A, P) where $P=AS+E$, for random matrices (of appropriate dimensions) A and S , and a noise matrix E over \mathbb{Z}_q
 - To encrypt an n bit message, first map it to a vector \underline{v} in (a sparse sub-lattice of) \mathbb{Z}_q^n ; pick a random vector \underline{a} with small coordinates; ciphertext is $(\underline{u}, \underline{c})$ where $\underline{u} = A^T \underline{a}$ and $\underline{c} = P^T \underline{a} + \underline{v}$

Public-Key Encryption

- An LWE based approach:
 - Public-key is (A, P) where $P=AS+E$, for random matrices (of appropriate dimensions) A and S , and a noise matrix E over \mathbb{Z}_q
 - To encrypt an n bit message, first map it to a vector \underline{v} in (a sparse sub-lattice of) \mathbb{Z}_q^n ; pick a random vector \underline{a} with small coordinates; ciphertext is $(\underline{u}, \underline{c})$ where $\underline{u} = A^T \underline{a}$ and $\underline{c} = P^T \underline{a} + \underline{v}$
 - Decryption using S : recover message from $\underline{c} - S^T \underline{u} = \underline{v} + E^T \underline{a}$

Public-Key Encryption

- An LWE based approach:
 - Public-key is (A, P) where $P=AS+E$, for random matrices (of appropriate dimensions) A and S , and a noise matrix E over \mathbb{Z}_q
 - To encrypt an n bit message, first map it to a vector \underline{v} in (a sparse sub-lattice of) \mathbb{Z}_q^n ; pick a random vector \underline{a} with small coordinates; ciphertext is $(\underline{u}, \underline{c})$ where $\underline{u} = A^T \underline{a}$ and $\underline{c} = P^T \underline{a} + \underline{v}$
 - Decryption using S : recover message from $\underline{c} - S^T \underline{u} = \underline{v} + E^T \underline{a}$
 - Allows a small error probability; can be made negligible by first encoding the message using an error correcting code

Public-Key Encryption

- An LWE based approach:
 - Public-key is (A,P) where $P=AS+E$, for random matrices (of appropriate dimensions) A and S , and a noise matrix E over \mathbb{Z}_q
 - To encrypt an n bit message, first map it to a vector \underline{v} in (a sparse sub-lattice of) \mathbb{Z}_q^n ; pick a random vector \underline{a} with small coordinates; ciphertext is $(\underline{u},\underline{c})$ where $\underline{u} = A^T \underline{a}$ and $\underline{c} = P^T \underline{a} + \underline{v}$
 - Decryption using S : recover message from $\underline{c} - S^T \underline{u} = \underline{v} + E^T \underline{a}$
 - Allows a small error probability; can be made negligible by first encoding the message using an error correcting code
 - CPA security: By LWE assumption, the public-key is indistinguishable from random; and, encryption under random (A,P) loses essentially all information about the message

Public-Key Encryption

- An LWE based approach:
 - Public-key is (A,P) where $P=AS+E$, for random matrices (of appropriate dimensions) A and S , and a noise matrix E over \mathbb{Z}_q
 - To encrypt an n bit message, first map it to a vector \underline{v} in (a sparse sub-lattice of) \mathbb{Z}_q^n ; pick a random vector \underline{a} with small coordinates; ciphertext is $(\underline{u},\underline{c})$ where $\underline{u} = A^T \underline{a}$ and $\underline{c} = P^T \underline{a} + \underline{v}$
 - Decryption using S : recover message from $\underline{c} - S^T \underline{u} = \underline{v} + E^T \underline{a}$
 - Allows a small error probability; can be made negligible by first encoding the message using an error correcting code
 - CPA security: By LWE assumption, the public-key is indistinguishable from random; and, encryption under random (A,P) loses essentially all information about the message
- LWE also used for CCA secure PKE

Signatures

Signatures

- GGH/NTRU approach: Secret key is a good basis, and the public key is a bad (i.e., HNF) basis

Signatures

- GGH/NTRU approach: Secret key is a good basis, and the public key is a bad (i.e., HNF) basis
 - To sign a message, hash it (using an RO) to a random point in \mathbb{R}^n and use the good basis to find a lattice point close to it

Signatures

- GGH/NTRU approach: Secret key is a good basis, and the public key is a bad (i.e., HNF) basis
 - To sign a message, hash it (using an RO) to a random point in \mathbb{R}^n and use the good basis to find a lattice point close to it
 - e.g. with $\underline{s} = B \lfloor B^{-1} \underline{m} \rceil$, we have $\underline{s} - \underline{m} = B \underline{z}$ for $\underline{z} \in [-\frac{1}{2}, \frac{1}{2}]^n$

Signatures

- GGH/NTRU approach: Secret key is a good basis, and the public key is a bad (i.e., HNF) basis
 - To sign a message, hash it (using an RO) to a random point in \mathbb{R}^n and use the good basis to find a lattice point close to it
 - e.g. with $\underline{s} = B \lfloor B^{-1} \underline{m} \rfloor$, we have $\underline{s} - \underline{m} = B \underline{z}$ for $\underline{z} \in [1/2, -1/2]^n$
 - Intuitively, it is hard to find such a point using the HNF basis

Signatures

- GGH/NTRU approach: Secret key is a good basis, and the public key is a bad (i.e., HNF) basis
 - To sign a message, hash it (using an RO) to a random point in \mathbb{R}^n and use the good basis to find a lattice point close to it
 - e.g. with $\underline{s} = B \lfloor B^{-1} \underline{m} \rfloor$, we have $\underline{s} - \underline{m} = B \underline{z}$ for $\underline{z} \in [1/2, -1/2]^n$
 - Intuitively, it is hard to find such a point using the HNF basis
 - However, multiple signatures can leak B

Signatures

- GGH/NTRU approach: Secret key is a good basis, and the public key is a bad (i.e., HNF) basis
 - To sign a message, hash it (using an RO) to a random point in \mathbb{R}^n and use the good basis to find a lattice point close to it
 - e.g. with $\underline{s} = B \lfloor B^{-1} \underline{m} \rceil$, we have $\underline{s} - \underline{m} = B \underline{z}$ for $\underline{z} \in [1/2, -1/2]^n$
 - Intuitively, it is hard to find such a point using the HNF basis
 - However, multiple signatures can leak B
 - Fix (heuristic): Perturbation, to make it harder to recover B

Signatures

- GGH/NTRU approach: Secret key is a good basis, and the public key is a bad (i.e., HNF) basis
 - To sign a message, hash it (using an RO) to a random point in \mathbb{R}^n and use the good basis to find a lattice point close to it
 - e.g. with $\underline{s} = B \lfloor B^{-1} \underline{m} \rfloor$, we have $\underline{s} - \underline{m} = B \underline{z}$ for $\underline{z} \in [1/2, -1/2]^n$
 - Intuitively, it is hard to find such a point using the HNF basis
 - However, multiple signatures can leak B
 - Fix (heuristic): Perturbation, to make it harder to recover B
 - Fix [GPV'08]: instead of rounding off to $B \lfloor B^{-1} \underline{m} \rfloor$, sample from a distribution that does not leak B . Security (in ROM) reduces to worst-case hardness assumptions.

Signatures

- GGH/NTRU approach: Secret key is a good basis, and the public key is a bad (i.e., HNF) basis
 - To sign a message, hash it (using an RO) to a random point in \mathbb{R}^n and use the good basis to find a lattice point close to it
 - e.g. with $\underline{s} = B \lfloor B^{-1} \underline{m} \rfloor$, we have $\underline{s} - \underline{m} = B \underline{z}$ for $\underline{z} \in [1/2, -1/2]^n$
 - Intuitively, it is hard to find such a point using the HNF basis
 - However, multiple signatures can leak B
 - Fix (heuristic): Perturbation, to make it harder to recover B
 - Fix [GPV'08]: instead of rounding off to $B \lfloor B^{-1} \underline{m} \rfloor$, sample from a distribution that does not leak B . Security (in ROM) reduces to worst-case hardness assumptions.
 - Quadratic key size/signing complexity (unlike NTRUSign)

Signatures

Signatures

- Using CRHF (not in ROM)

Signatures

- Using CRHF (not in ROM)
 - Obtaining a one-time signature from a “homomorphic” CRHF

Signatures

- Using CRHF (not in ROM)
 - Obtaining a one-time signature from a “homomorphic” CRHF
 - $h(a.x+y)=a.h(x)+h(y)$ where a is from a ring \mathcal{A} and x,y from a module over the ring (say \mathcal{A}^m). e.g., $h(\underline{x}) = A\underline{x}$.

Signatures

- Using CRHF (not in ROM)
 - Obtaining a one-time signature from a “homomorphic” CRHF
 - $h(a.x+y)=a.h(x)+h(y)$ where a is from a ring \mathcal{A} and x,y from a module over the ring (say \mathcal{A}^m). e.g., $h(\underline{x}) = A\underline{x}$.
 - Signing key: (x,y) . Verification key: $(h,X,Y) = (h,h(x),h(y))$.
Signature: Message is mapped to an element $a \in \mathcal{A}$. $s=a.x+y$
Verification: Check $h(s)=a.X+Y$

Signatures

- Using CRHF (not in ROM)
 - Obtaining a one-time signature from a “homomorphic” CRHF
 - $h(a.x+y)=a.h(x)+h(y)$ where a is from a ring \mathcal{A} and x,y from a module over the ring (say \mathcal{A}^m). e.g., $h(\underline{x}) = A\underline{x}$.
 - Signing key: (x,y) . Verification key: $(h,X,Y) = (h,h(x),h(y))$.
Signature: Message is mapped to an element $a \in \mathcal{A}$. $s=a.x+y$
Verification: Check $h(s)=a.X+Y$
 - (x,y) is information theoretically well-hidden after one sign; so, w.h.p., forgery yields a different signature than computed using the signing key, thereby giving a collision

Signatures

- Using CRHF (not in ROM)
 - Obtaining a one-time signature from a “homomorphic” CRHF
 - $h(a.x+y)=a.h(x)+h(y)$ where a is from a ring \mathcal{A} and x,y from a module over the ring (say \mathcal{A}^m). e.g., $h(\underline{x}) = A\underline{x}$.
 - Signing key: (x,y) . Verification key: $(h,X,Y) = (h,h(x),h(y))$.
Signature: Message is mapped to an element $a \in \mathcal{A}$. $s=a.x+y$
Verification: Check $h(s)=a.X+Y$
 - (x,y) is information theoretically well-hidden after one sign; so, w.h.p., forgery yields a different signature than computed using the signing key, thereby giving a collision
 - Trickier when using ideal lattice based hashing

Signatures

- Using CRHF (not in ROM)
 - Obtaining a one-time signature from a “homomorphic” CRHF
 - $h(a.x+y)=a.h(x)+h(y)$ where a is from a ring \mathcal{A} and x,y from a module over the ring (say \mathcal{A}^m). e.g., $h(\underline{x}) = A\underline{x}$.
 - Signing key: (x,y) . Verification key: $(h,X,Y) = (h,h(x),h(y))$.
Signature: Message is mapped to an element $a \in \mathcal{A}$. $s=a.x+y$
Verification: Check $h(s)=a.X+Y$
 - (x,y) is information theoretically well-hidden after one sign; so, w.h.p., forgery yields a different signature than computed using the signing key, thereby giving a collision
 - Trickier when using ideal lattice based hashing
 - Recall: one-time signatures can be augmented to full-fledged signatures using a CRHF (in fact, a UOWHF)

Other Constructions

Other Constructions

- Schemes based on LWE

Other Constructions

- Schemes based on LWE
 - IBE, OT, Fully Homomorphic Encryption...

Other Constructions

- Schemes based on LWE
 - IBE, OT, Fully Homomorphic Encryption...
- ZK proof systems for lattice problems

Other Constructions

- Schemes based on LWE
 - IBE, OT, Fully Homomorphic Encryption...
- ZK proof systems for lattice problems
 - Interactive and non-interactive statistical ZK proofs of knowledge for various lattice problems

Other Constructions

- Schemes based on LWE
 - IBE, OT, Fully Homomorphic Encryption...
- ZK proof systems for lattice problems
 - Interactive and non-interactive statistical ZK proofs of knowledge for various lattice problems
 - Useful in building “identification schemes” and potentially in other lattice-based constructions

Today

Today

- Lattice based cryptography

Today

- Lattice based cryptography
 - Candidate for post-quantum cryptography

Today

- Lattice based cryptography
 - Candidate for post-quantum cryptography
 - Security typically based on worst-case hardness of problems

Today

- Lattice based cryptography
 - Candidate for post-quantum cryptography
 - Security typically based on worst-case hardness of problems
 - Several problems: SVP and variants, LWE

Today

- Lattice based cryptography
 - Candidate for post-quantum cryptography
 - Security typically based on worst-case hardness of problems
 - Several problems: SVP and variants, LWE
- Hash functions, PKE, Signatures, ...