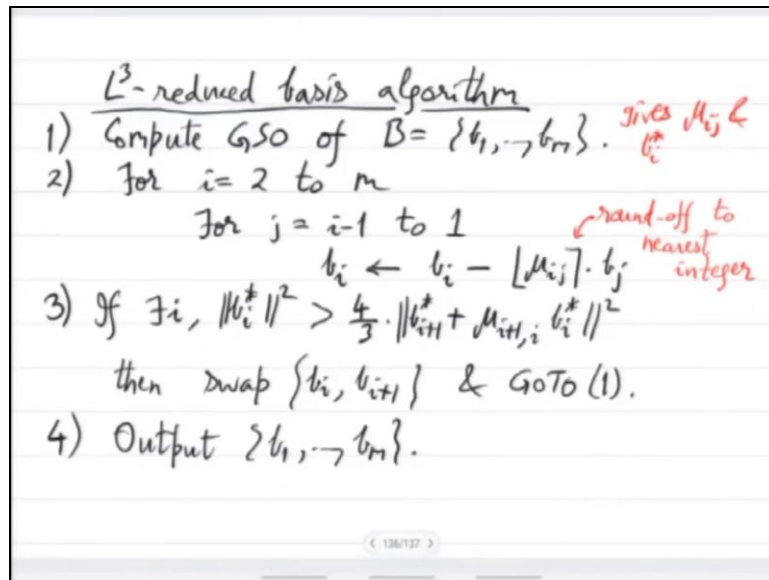


Computational Number Theory and Algebra
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Lecture – 22

Analysis of LLL - Reduced Basis Algorithm and Introduction to NTRU Cryptosystem

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So last time we wrote this algorithm which is L cubes reduced basis algorithm. So what it does is that b_1 to b_m are the linearly independent vectors that span a given lattice the your goal is to find an approximation to a shortest vector by the lattice generated by these vectors b_1 to b_m . So first in step 1 you compute the Gram Schmidt orthogonalization of b . Once you so the output of that will be b_1^* to b_m^* .

And then the relative these projection constants would be μ_{ij} 's. So these 2 are the standard output the data which you get out of GSO computation and then what is done is this μ_{ij} is rounded off to the nearest integer because μ_{ij} may be a real number it may not be an integer. So this computation you actually cannot do by remaining within a lattice so and you really want to remain in the lattice generated by b_1 to b_m you do not want to go out you do not want to change the lattice.

So instead of μ_{ij} you will calculate the nearest integer and then you will only use an approximation of μ_{ij} . So that will be the new vectors b_1 to b_m they still generate the same lattice. Now that was the first condition for reduced basis. The second condition was that if

you recall the second condition of reduced basis was this that is written in blue that sorry that is written in black point number one.

So point number 1 wants essentially this c_1 star to c_m star in sort of an increasing order right because you want to output in the end c_1 star. So ideally c_1 star should be smaller than c_2 star should be smaller than c_3 star and so on that may not be achievable efficiently so there is an approximation here. You want c_i star to be smaller than 2 over square root 3 of c_{i+1} star, c_1 to be smaller than 2 by square root 3 of let us say c_2 then c_2 to be smaller than 2 by square root 3 of c_3 and so on.

So it will be roughly in an ascending order now if this condition is violated till now when you come to step 3 suppose this condition is violated by some b_i meaning that b_i star's length is bigger than this bound on b_{i+1} . So if this happens then the simple correction is swap them. So b_{i+1} , b_i did not satisfy the condition but maybe when you swap b_{i+1} will satisfy the condition with respect to the next.

But then since you have changed the order of the vectors you have to recompute GSO so go to step 1 and keep doing this hopefully this will terminate after finite number of steps and then you will output b_1 to b_m . So the analysis of this algorithm is key first of all why will this algorithm stop if it stops in how many steps and when it stops is b_1 the correct approximation of shortest vector right those are the questions to be answered yet.

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The image shows a handwritten analysis of the LLL algorithm, specifically step 2. The text is written on a whiteboard background with a toolbar at the top. The analysis is as follows:

Analysis
Step 2: The new $b_2 \leftarrow b_2 - \left\lfloor \frac{\langle b_2, b_1 \rangle}{\|b_1\|^2} \right\rfloor \cdot b_1$

\triangleright So, $\frac{\langle b_2, b_1 \rangle}{\|b_1\|^2} \leftarrow \frac{\langle b_2, b_1 \rangle}{\|b_1\|^2} - \left\lfloor \frac{\langle b_2, b_1 \rangle}{\|b_1\|^2} \right\rfloor \cdot \frac{\langle b_1, b_1 \rangle}{\|b_1\|^2} =: \mu_{2,1}$

$\Rightarrow |\mu_{2,1}| \leq 1/2$

\triangleright The same holds for $|\mu_{i,i-1}|$, $i \in [m]$.

\triangleright Also, the transformation is unimodular & lattice remains unchanged.

So let us start with the analysis. So step 2 step 1 is just GSO that you understand that is standard. So what happened in step 2 in step 2 we recalculated or we changed b_1 to b_m following GSO but remaining in the lattice right. So the new b_2 for example is b_2 minus this projection constant rounded off times b_1 right. This is the new b_2 . So note that if you look at the new projection constant $b_2 \cdot b_1$ right this has become, so this is $b_2 \cdot b_1$ divided by norm of b_1 square - $b_2 \cdot b_1$ norm of p_1 square times b_1 , 1 divided by norm of p_1 square but this last quantity is 1 right.

So you see that you are actually subtracting $b_2 \cdot b_1$ over b_1 square the old 1 from that you are subtracting the nearest integer. So the difference will be smaller than half. So this value or let me be precise let me call this new $\mu_{2,1}$. So $\mu_{2,1}$ its absolute value so it is between minus half and half the absolute value is less than equal to half this you can check and so on. So what you have ensured is that μ_{ij} step 2 ensures that μ_{ij} is at most half in magnitude.

For $\mu_i, i-1$ so this property is true for all i by the same argument also the transformation that you are doing is this right. This is the transformation now this transformation is just subtracting a multiple of b_1 from b_2 it is not scaling b_2 . So since it is not scaling b_2 this is unimodular and the lattice does not change. So the lattice remains unchanged after this transformation so step 2 is good we understand that what is step 3.

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Step 3: • To show that it's repeated only few times, we need a potential function:

$$D(b_1, \dots, b_m) := \prod_{i \in [m]} \|b_i^*\|^2$$

• Step 2 has no effect on this. [$\because b_i^*$'s do not change]

While each repetition of Step 3 - swap reduces D by a factor of $\frac{\|b_{i+1}\|^2}{\|b_i^*\|^2} < \frac{3}{4} \cdot \frac{1}{\mu_{i+1,i}^2} < \frac{3}{4}$

Lemma 3: $|D(b_1, \dots, b_m)|$ is a positive integer of value less than $2^{O(n^2)}$.

Now in step 3 what you did is if this reduced basis condition is violated. So this LHS is bigger than RHS then you will swap the 2 vectors and you will repeat the algorithm go to step 1. So to show that this number of repetitions is bounded that it is not repeated to show that it

is repeated few times we need a potential function. So what will be the potential function potential function should be such that to begin with it is small.

And with every swap and repetition it reduces. So we will use the following potential function. It will be the product of the lens of b_i star but remember you want this thing to reduce with every swap. So intuitively what was happening b_i star some b_i star was larger than b_{i+1} star intuitively right. So when you swap for this to be to be reducing significantly let us give b_i star and b_{i+1} star different weights.

So for that we put an exponent here. So it is actually b_i star will get a larger exponent than b_{i+1} star. So when you will swap this value will actually fall how by how much? So we will now calculate that. So step 2 has no effect on this why so step 2 was mimicking GSO and this potential function actually looks at b_i star. So these axes these orthogonal axis do not change with GSO. So let us remember that.

So step 2 has no effect on this. While each step 3 repetition of step 3 swap reduces D by a factor of so b_i star is being replaced by b_{i+1} star and b_i star has more weight right. So the reduction is by this factor. And now by the reduced basis condition violation you know that b_i star was actually bigger. So this is less than $3 \cdot 4^{-\mu_i + 1} i^2$ now μ^2 is at most $1/4$ so this is this is less than what?

This is less than half sorry no μ^2 is no it is non-negative so this is actually less than three fourth even. So D will with every swap D will reduce by a factor of at least three-fourths what else so what was D to begin with and more importantly was D an integer or a non-integer? See if it is an integer then you know that if at every after every swap it remains an integer then you know that you can only hit one you cannot the potential function cannot go below that and then you will get a bound.

If it is a real number then it can keep on reducing infinitely many times. So we will actually show that at any point of time D is an integer. So that is an important property of the potential function. So the magnitude of D is a positive integer of value less than $2^{O(n)}$ raised to $5/4$ and was the ambient dimension that you started with of the lattice or the vectors l was the coefficients the coordinates in the vectors were l bit.

So we have a bound actually n is to 5 times l . This is the bit size bound on the potential function and it is an integer. Since every time you are reducing it by $3/4$ th this gives you number of times n raised to 5 times l . So that will be the immediate consequence of this lemma. So why is this true let us prove it.

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Proof: • Write D as $\prod_{j \in [m]} D_j$, where $D_j = \prod_{i \in I_j} \|b_i^*\|^2$

- D_j relates to $\text{vol}(b_1, \dots, b_j)$:
 - D_j is the determinant of $(b_1^*, \dots, b_j^*) \cdot (b_1^*, \dots, b_j^*)^T$, which is diagonal, & equals $((b_1, \dots, b_j) \cdot C)^T \cdot ((b_1, \dots, b_j) \cdot C)$, for a unimodular transformation C .

$$\Rightarrow D_j = |(b_1, \dots, b_j)^T \cdot (b_1, \dots, b_j)| \in \mathbb{Z}_{>0}.$$

$$\Rightarrow |D_j| < (2^{\tilde{O}(n^2)})^j \Rightarrow |D| < 2^{\tilde{O}(n^2) \cdot n^2} \quad \square$$

So write D as product of D_j 1 to $m - 1$ where D_j is simply a product of b_i star lengths. So instead of these exponents that we put we are removing the exponents essentially. So we are just multiplying b_1 star length 2 up to b_j star length squaring it that is D_j and you can see that D is equal to product of D_j , D_j has a nice interpretation. If you think in terms of orthogonal axis if you multiply the length of the axis this represents some kind of a volume.

So the potential function D is actually a product of volumes of sub let us say sub cubes or sub parallel pipettes. So D_j relates to the volume of b_1 to b_j because D_j is the determinant is the determinant of b_1 star to b_j star. So this is a sequence of column vectors transposed. So they become rho multiply it with this. So D_j is actually the determinant of this matrix this matrix is just remember that b_1 star to b_j star are orthogonal right.

So b_1 star inner product b_1 star will be the length of b_1 star square but other inner products will be 0. So this is actually a diagonal matrix and the determinant is just the product of b_i star square which is equal to which is a diagonal matrix and equals. Now remember that b_1 star to b_j star are computed by GSO. So they only depend on b_1 to b_j right so b_1 star to b_j star are just a transformation on b_1 to b_j so we can rewrite it as b_1 to b_j times a matrix transformation and itself right.

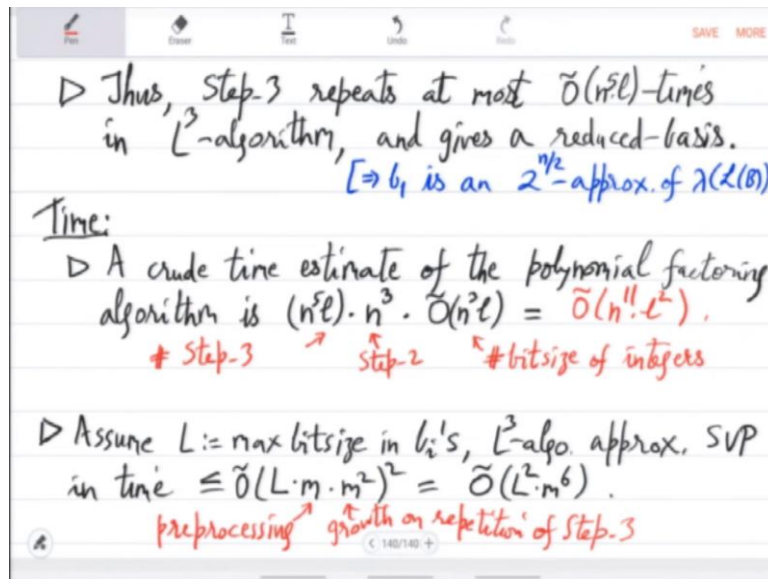
C is the unimodular transformation. So this is a nice transformation happening in the lattice well not quite but it is a basically it is a transformation GSO is a transformation such that determinant of c is ± 1 . So if you look at the determinant version of this then you will get that D_j equals so determinant of c and determinant of c transpose is ± 1 . So the product is 1 right so ultimately it is the determinant of b_1 to b_j transpose times b_1 to b_j determinant of this matrix square matrix which is now remember that b_1 to b_j are given in the input.

So they are integral entries. So the determinant of this integral matrix is integral. Moreover since the vectors were linearly independent this will be this cannot be 0 we want to b_j are linearly independent right so the volume will come out to be a positive integer and the bound follows from just look at the entries of b_j they are L bits so you will get actually for this you have to go back to the first algorithm.

How did you come from polynomial factoring integral polynomial factoring to this b_1 to b_m instance of SVP right. So there was this n^{q+1} times Lifting that we did. So the integers after that will potentially grow to $2^{O(n^3 \log L)}$. So these are this is the magnitude of the numbers integers you have in vectors b_1 to b_j . And then when you take determinant you will be multiplying these j times so you get times raised to j with and j remember is at most m which is at most n .

So this implies that D the potential function is less than $2^{O(n^3 \log L)}$ times so you just multiply for over j going from 1 to n so it gives you another n^2 so that is a bound that is a lazy bound on the potential function which proves the lemma. So the potential function is a positive integer of value less than $2^{O(n^5 \log L)}$.

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So now we have what we wanted we are nearing the end of the proof. So thus step 3 repeats at most $\tilde{O}(n^5 l)$ times in L^3 algorithm and gives the reduced basis. In fact reduced basis may be of many so you will get our reduced basis and why is that well you showed how many times step 3 will repeat. Once you once step 3 does not repeat it means that both the axioms of reduced basis in the definition are satisfied so then you will output the reduced basis.

So the basically the vectors b_1 to b_m are now approximately ascending order and the other condition was that if you look at the projection constants they are around half. So this is like an approximation to GSO. They are kind of pseudo orthogonal. So you will just output so you can pick b_1 in the output that is a SVP approximation. So this we have done last time right last time we showed that c_1 estimates the shortest vector by this factor, we have shown this.

So just recall this identity or this inequality that c_1 star will be a $2^{m/2}$ factor. So b_1 is and $2^{n/2}$ approximation of the shortest vector. So we have everything that we wanted finishes L^3 let us see the time complexity. So just a naive time estimator crude time estimate of the polynomial factoring algorithm is $n^{11} l^4$. So you have to start from the very beginning.

How did you do Hensal lifting and then you reached this lattice instance and then you applied L^3 algorithm. So this will be $n^{11} l^4$ these are how big the numbers are this actually is the number of times you are repeating the L^3 algorithm. The first steps you are repeating and is to $\tilde{O}(n^5 l)$ times. What happens in this step 2 is that this is already a for loop

nested for loop and when you are doing this difference $b_i - b_j$ remember there are n coordinates right.

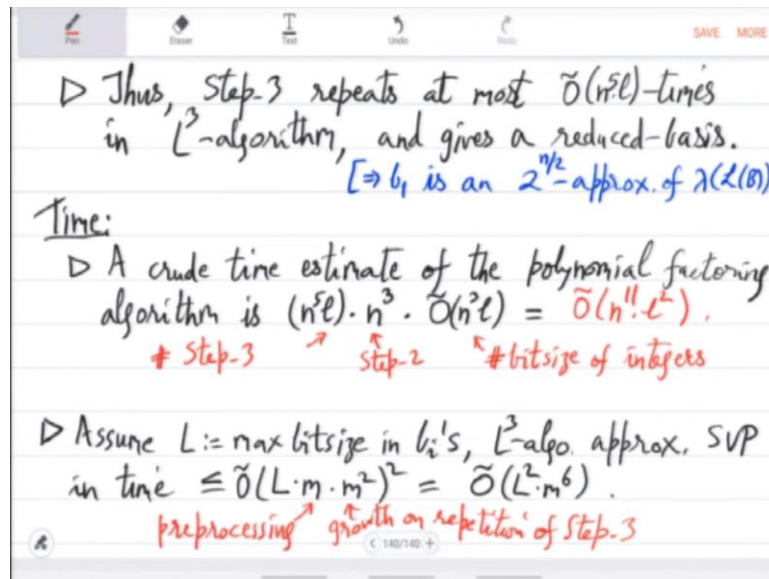
So overall step 2 takes n^3 naively a naive analysis so that is another n^3 and how big are these integers on which you are computing that is around $n^3 L$. So you get $O(n^{11} L^2)$. So this is a horrible time estimate it is n^{11} times L^2 . So as the dimension increases this algorithm is extremely slow you can optimize some parts of it but you cannot make it very fast at least not theoretically.

But on practical instances it is known to work well so this is used in practice some version of this. So this comes from the number of repetitions this n^3 is step 2 and this is the size of bit size of integers. So that is the time complexity of integral polynomial factoring. And if you just look at L^3 algorithm so to find reduce basis what is the reduced basis finding algorithms complexity. So assume L to be the max bit size in bit size L^3 algorithm approximates in how much time?

So this will be bit size of the integers times m and every vector there m of these or this actually is of node not like that this is m is for pre-processing times m^2 whole square. So you get $L^2 m^6$. So let me give an explanation for this so this is the bit size but this m we are putting for pre-processing and this m^2 you will get because of the number of time step 3 will repeat this comes from the potential function.

So you can think in terms of the bit size you started with L bit size when you did the pre-processing you had a growth of multiplier m and when you started repeating step 3 there was another blow up in the bit size by m^2 . So this is what the integers this integers are this big and so that also tells you how many times you have to repeat as step three. So you square it so this is a crude estimate in terms of m it is taking m to the sixth time.

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So let me finish L^3 algorithm by giving some properties that its output satisfies so L^3 algorithm and reduced basis is used in many places. So examples are computational problems in algebraic number theory, faster arithmetic in number field's knapsack problem and so on. So the key properties of this reduced basis which are useful there in these applications is the following. So let me collect that here so let b_1 to b_m be a reduced basis of the lattice L which is in the ambient space let us say z to the n and b_1 star to b_m star be the GSO.

After GSO you get b_1 star to b_m star on this then the things which are satisfied and these properties you can deduce from the calculation that we just did the calculations we did in the last 2 lectures using that you can reduce these properties. First property in fact we deduced it is it says that the length of b_j never exceeds the length of; so b_{i-1} let us say j equal to b_{i-1} , b_{i-1} is at most b_i star times 2 raised to $i-1$ by 2 for all j behind i .

So in particular it is saying that if you look at b_{i-1} it is a factor smaller than b_i star and this factor is exponential in i^2 raised to i by 2 . This can be shown by this inequality axiom this almost ascending property of the reduced basis it follows directly we did that calculation. Second is if you look at the product of b_i 's length I think for this I needed n , n would be simpler 1 to b_n , b_n star to b_n star there is no m or m is equal to n .

So this product of b_i of the reduced basis i if they were if b_i 's were orthogonal this would have been the volume of the lattice right. The volume of the lattice is the same as the determinant. So the product of these b_i 's is at least the determinant of the lattice and it is at

most this multiple 2^{n-1} by 4 times $D L$ in other words if you look at the product of the lengths of the vectors in the reduced basis.

This is an approximation of the determinant it is a 2^{n^2} approximation this is basically intuitively what it is saying is that the b_1 to b_n that you get are pseudo orthogonal. So their product also is not very far from the volume. Third is that b_1 right which is the vector you pick an output as an approximation of SVP this is then related to the volume like this. So one can be obtained can be proved inequality one can be proved by the inequality axiom of reduced basis.

From that it easily follows that product of b_i is related to the determinant and from the determinant then you can deduce something about b_1 because you know the relative ratios of b_i 's b_i lens so from that you will get actually that b_1 is basically it is smaller than in step 2 in RHS look at 1 by n th power. At this point I would like to remark that the shortest vector in the lattice has length around square root of n times the volume by raise to 1 by n .

This is a result by Minkowski this is a classical result that shortest vector in lattice has length around the volume raised to 1 by n times square root n . So if you look at b_1 that you are outputting this is close to that it is only off by $2^{n/4}$. So again this is an exponential approximation but theoretically it is connected to many things. So I will not go into the proofs of each of these I leave it as an as an exercise.

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\triangleright Thus, Step-3 repeats at most $\tilde{O}(n^2 \ell)$ -times in L^3 -algorithm, and gives a reduced-basis.
 $\Rightarrow b_1$ is an $2^{n/2}$ -approx. of $\lambda_1(L(B))$.

Time:
 \triangleright A crude time estimate of the polynomial factoring algorithm is $(n^2 \ell) \cdot n^3 \cdot \tilde{O}(n^2 \ell) = \tilde{O}(n^7 \ell^2)$.
 # Step-3 # Step-2 # bitsize of integers

\triangleright Assume $L := \max$ bitsize in b_i 's, L^3 -algo. approx. SVP in time $\leq \tilde{O}(L \cdot m \cdot m^2)^2 = \tilde{O}(L^2 \cdot m^6)$.
 preprocessing growth on repetition of Step-3

So one you prove by use this condition in the reduced basis. Condition number one reduce basis definition for the second one this relationship with the discriminant just use the above and the fact that the discriminant or volume is product of it is the determinant of this matrix which is then less than equal to product of the lens. And then you can use again inequality one which will relate b_i^* with b_i .

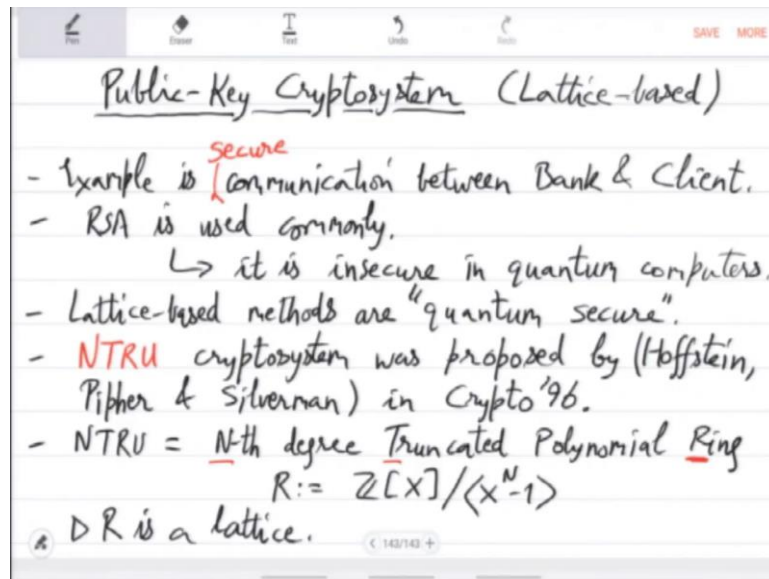
So that is how you will get inequality 2. Inequality 3 will follow by the ratios of p_i 's. So by 1 you get that b_1 length is less than equal to 2^{n-1} by 2 times p_i^* right this is what inequality 1 gives you for all i . So using this and inequality 2 that you got you will get 3 and the fact that product of b_i^* over all the i 's is product of b_i^* square is dL yeah that is true because b_i^* stars are orthogonal.

So I should have made this inequality actually that is true which is also the volume of the lattice. So using the same fact and this inequality 1 will give you inequality 3. So these are the 3 properties why which are always invoked in the applications major applications. So one application where I can stop now is given rationales α_1 to α_n and epsilon find integers p_1 to p_n q such that p_i by q approximates α_i and minimize q .

So you are given these rationales α_1 to α_n and you want a rational representation for all these α_i is the catch is that denominator should be the same. So this problem is called simultaneous Diophantine approximation. And Diophantine because you are given these rationales let us say α_1 and you want to write it as p_1 over q and simultaneous because you are given α_1 α_2 and you have to simultaneously express it as p_1 by q and p_2 by q .

Now obviously q exists but then it could be very large if you do it naively. You want to minimize q as much as possible and this problem surprisingly could be solved in polynomial time using a reduced basis L cube algorithm. So this also I will leave as an exercise. So solve it by L cube reduced basis algorithm. So with this I will stop the discussion on L cube algorithm and I will move to an application in security.

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So, we will look at a public key crypto cryptosystem which will be lattice based. So what is a public key crypto system so this is a mechanism that is used in a number of situations. One simple example is when you interact with your bank. So bank has given certain information to the public using which you can send your private information to the bank which only the bank can understand nobody else could understand over the internet.

So let us fix that example. Example is communication between bank and client and obviously it should be secure, secure communication. So one public key crypto system which is used quite commonly is RSA but the problem is that it is insecure if quantum computers exist. Now in the future quantum computers may exist. So people believe that we should have a mechanism which can even which can work even if quantum computers are created in the future.

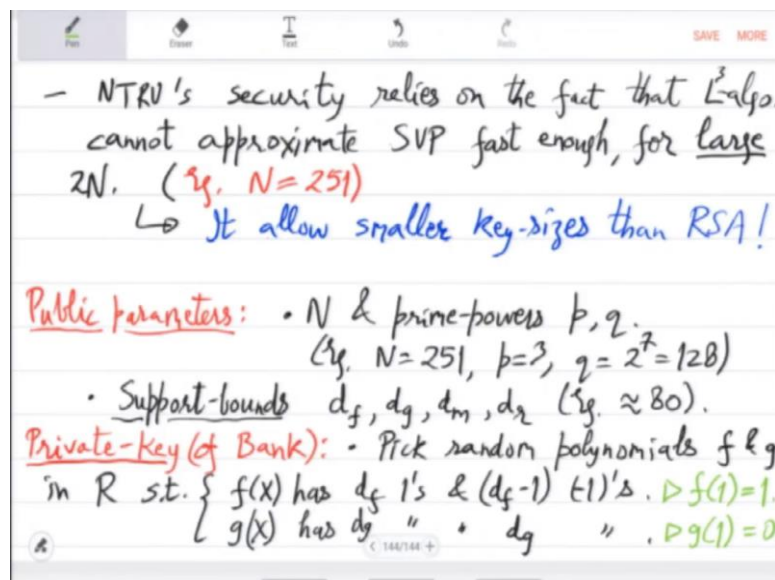
So for that lattice based methods are used this is why this is a major application of the lattices. Not only security in quantum computers but there are also other advantages for using lattice based cryptography. So lattice based methods are quantum secure so there are many systems proposed we will see here the basics of NTRU cryptosystem. So N T R U was proposed by Hofstein, Pipher and Silverman in the conference crypto in 96.

And this basic protocol is very popular and there are a lot of variants of this known some of which are also implemented and they work well. So NTRU stands for Nth degree truncated Polynomial Ring. So NTRU so what is this polynomial ring? This is this is very simple it is

just integral polynomial ring mod out $\mathbb{Z}[x]$ by $x^N - 1$. So this is a lattice it's an n -dimensional lattice and all the computations will happen here.

So the message the private key the public key they will all elements of this ring. So they will all be lattice elements and we will do little computations with them simple computations.

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So NTRU's security relies on the fact that the L cube algorithm cannot approximate SVP fast enough for large N . So maybe I should say for large to N and N will be taken let us take N to be 251. So N is 251 means that $2N$ is 500 and we have seen that the complexity of L cube reduced basis algorithm is something like 500 to the 6 times other factors and that in practice actually will be very slow and as you increase n it will get harder.

The L cube algorithm will become slower. So, one advantage of this is that it allows smaller key sizes than RSA. So, to get the same security same level of security RSA would require thousands of bits but here you can do in 200, 300, 400 bits. So the key sizes will also be small so there are many advantages in this system. Let us quickly go through the public key private key encryption and decryption.

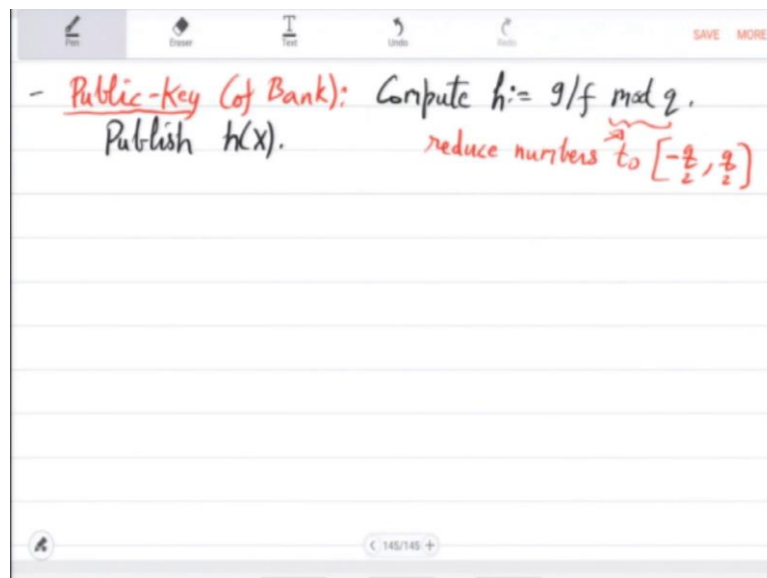
So what are the public parameters that the bank will release? So bank releases N and prime powers p, q so you can keep this example in mind N, p, q N is 251 p is 3 q is 2 raised to 7. So 128 and the bank releases support bounds. So these are just numbers we will call them d_f, d_g, d_m, d_r these are around again example numbers around 80. So they are not very large. So this is what the bank fixes and also publishes them on the website.

What is the private key? So, private key of the bank what does the bank keep private and will not publish. So this is pick random polynomials f and g in R such that so f has exactly d 1 's and 1 less -1 's g x on the other hand has equal 1 's and -1 's. So again f has d f which is the parameter published by the bank that many ones and minus ones are 1 less. So this means this immediately means that f at 1 is 1 .

G on the other hand has equal number of 1 's and -1 s so g at 1 is 0 . So randomly these polynomials are picked there is a lot of choice because if you take d f , d g to be 80 then there are around 80 positions to be picked out of N positions right. So, 80 positions out of 251 and even after picking the positions you still have to decide on plus minus 1 sign. So there is a lot of there are at least I would say 2 raise to 80 at least 2 waste to 80 possibilities are there.

And bank picks 1 of them and keeps it private and what is the public key which the bank releases.

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So public key it come; uses f and g to compute g by f . So compute g by $f \bmod q$ and publish this. This one thing I would like to say here is that this $\bmod q$ computation you should reduce numbers to $+ - q$ by 2 . So you have coefficients between $-q$ by 2 to $+ q$ by 2 that is your h_x bank publishes it. Note that from h it is not clear how to compute g or f right because h is g by f there are 2 unknowns.

So from h it is not clear how to find those 2 unknowns. So they seem to be still a secret. So next time we will see how to do encryption and decryption and talk about the security of this vis-a-vis L cube algorithm ok I will stop, thank you.