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1. Introduction. This literate program performs lattice reduction using the celebrated LLL algorithm of A. K. Lenstra, H. W. Lenstra, Jr., and L. Lovász [*Math. Annalen* **261** (1982), 515–534]. It is a C implementation of the algorithm as described and analysed by H. Cohen in Section 2.6.1 of his book *A Course in Computational Algebraic Number Theory* (New York: Springer, 1996).

Vectors will be represented as C arrays, but since arrays are 0-indexed in C, we will always allocate one extra entry of memory and then keep the zeroth cell empty. This is for consistency with the usual numbering $\mathbf{b}_1, \dots, \mathbf{b}_n$ of vectors in a basis.

The input to the program is a set of n vectors (\mathbf{b}_i) that form a \mathbf{Z} -basis for the lattice L that we wish to reduce. We also need to specify the quadratic form q , which is done with a matrix Q . If x is a vector, then the function $b(x, y) = Qx \cdot y$ is bilinear (where \cdot is the ordinary Euclidean dot-product), and we have the associated quadratic form $q(x) = b(x, x) = Qx \cdot x$.

This program does not take input from the console. To change its arguments, modify the three macros DIM, INPUT_BASIS, and INPUT_QUAD. The LLL-reduced basis will be printed as well as a change-of-basis matrix H .

2. This is the main outline of the program.

```
#define DIM 3
#define INPUT_BASIS {{15.0, 23.0, 11.0}, {46.0, 15.0, 3.0}, {32.0, 1.0, 1.0}}
#define INPUT_QUAD {{1.0, 0.0, 0.0}, {0.0, 1.0, 0.0}, {0.0, 0.0, 1.0}}
#include <float.h>
#include <math.h>
#include <stdio.h>
#include <stdlib.h>

int n; /* global variables, for convenience */
double bb[DIM + 1][DIM + 1], Q[DIM + 1][DIM + 1];
<Linear algebra subroutines 3>;
<Lattice reduction algorithm lll 4>;

int main()
{
    n = DIM;
    <Format input into global variables 11>;
    int **H;
    H = lll(bb); /* set H to the output of the LLL algorithm, modify bb in place */
    if (H != 0) {
        <Output basis bb 12>;
        <Output matrix H 14>;
        return 0;
    }
    else {
        return 1;
    }
}
```

3. Linear algebra subroutines. We begin with some linear algebra subroutines that will help us treat arrays as vectors. Calling $set(z, x)$ sets the entries of z to the entries of x , while $sub(z, x, y)$ stores the vector difference of x and y to z . We can scale a vector with $scale$, and the function dot is the ordinary Euclidean dot-product. The functions b and q both rely on the matrix Q ; we have $q(x) = Qx \cdot x$ and $b(x, y) = Qx \cdot y$.

\langle Linear algebra subroutines 3 $\rangle \equiv$

```

void set(double  $z[n]$ , double  $x[n]$ )
{
    for (int  $i = 1$ ;  $i \leq n$ ;  $++i$ ) {
         $z[i] = x[i]$ ;
    }
}

void add(double  $z[n]$ , double  $x[n]$ , double  $y[n]$ )
{
    for (int  $i = 1$ ;  $i \leq n$ ;  $++i$ ) {
         $z[i] = x[i] + y[i]$ ;
    }
}

void sub(double  $z[n]$ , double  $x[n]$ , double  $y[n]$ )
{
    for (int  $i = 1$ ;  $i \leq n$ ;  $++i$ ) {
         $z[i] = x[i] - y[i]$ ;
    }
}

void scale(double  $z[n]$ , double  $lambda$ , double  $x[n]$ )
{
    for (int  $i = 1$ ;  $i \leq n$ ;  $++i$ ) {
         $z[i] = lambda * x[i]$ ;
    }
}

void set_i(int  $z[n]$ , int  $x[n]$ )    /* integer versions of set, add, sub, and scale */
{
    for (int  $i = 1$ ;  $i \leq n$ ;  $++i$ ) {
         $z[i] = x[i]$ ;
    }
}

void add_i(int  $z[n]$ , int  $x[n]$ , int  $y[n]$ )
{
    for (int  $i = 1$ ;  $i \leq n$ ;  $++i$ ) {
         $z[i] = x[i] + y[i]$ ;
    }
}

void sub_i(int  $z[n]$ , int  $x[n]$ , int  $y[n]$ )
{
    for (int  $i = 1$ ;  $i \leq n$ ;  $++i$ ) {
         $z[i] = x[i] - y[i]$ ;
    }
}

void scale_i(int  $z[n]$ , int  $lambda$ , int  $x[n]$ )
{
    for (int  $i = 1$ ;  $i \leq n$ ;  $++i$ ) {

```

```

     $z[i] = \textit{lambda} * x[i];$ 
  }
}
double dot(double  $x[n]$ , double  $y[n]$ )
{
  double sum = 0;
  for (int  $i = 1$ ;  $i \leq n$ ;  $++i$ ) {
    sum +=  $x[i] * y[i]$ ;
  }
  return sum;
}
double b(double  $x[n]$ , double  $y[n]$ )
{
  double sum = 0;
  for (int  $i = 1$ ;  $i \leq n$ ;  $++i$ ) {
    sum += dot( $Q[i], x$ ) *  $y[i]$ ;
  }
  return sum;
}
double q(double  $x[n]$ )
{
  return b( $x, x$ );
}

```

This code is used in section 2.

4. The LLL lattice reduction algorithm. This is the interesting part of the program. The variable bb denotes the basis (\mathbf{b}_i) . We will use the Gram-Schmidt orthogonalisation procedure to find an orthogonal basis (\mathbf{b}_i^*) , but we do this incrementally, as the algorithm progresses. We keep track of the dot products $\mathbf{b}_i^* \cdot \mathbf{b}_i^*$ in the array B .

The variable k is the main loop variable, but it doesn't always increase from iteration to iteration; sometimes it decreases and sometimes it maintains its value. We will therefore need to store k_{max} , the largest value that k has attained. For $1 \leq k, j \leq n$, $\mu_{k,j} = b(\mathbf{b}_k, \mathbf{b}_j^*)/q(\mathbf{b}_j^*)$. We will not want to compute this every time it is needed, so we store the μ values in a table called mu .

The basis (\mathbf{b}_i) is modified in place so that it is LLL-reduced once the algorithm terminates. The output is an integer matrix H that represents the new, reduced basis in terms of the original basis, i.e., if M is the matrix whose columns are the vectors \mathbf{b}_i , then $M \cdot H$ has the LLL-reduced basis as its columns. Note that H_i is the i th column of H .

```

⟨ Lattice reduction algorithm lll 4 ⟩ ≡
  int **lll(double bb[n+1][n+1])
  {
    int k, k_max, l;
    int **H = malloc((n+1) * sizeof(int *));
    double mu[n+1][n+1];
    double bb_star[n+1][n+1];
    double B[n+1];
    double temp[n+1], tempb[n+1];    /* temporary arrays for calculations */
    int temp_i[n+1];
    ⟨ Initialisation 5 ⟩;
    int num_loops = 0;
    do {
      if (k > k_max) {
        ⟨ Add one Gram-Schmidt vector 6 ⟩;
      }
      l = k - 1;
      ⟨ Reduce bb[k] by subtracting multiples of bb[l] 7 ⟩;
      if (⟨ Lovász condition 8 ⟩) {
        for (l = k - 2; l > 0; --l) {
          ⟨ Reduce bb[k] by subtracting multiples of bb[l] 7 ⟩;
        }
        ++k;
      }
      else {
        ⟨ Swap bb[k] with bb[k-1] 9 ⟩;
        k = (2 > k - 1) ? 2 : k - 1;
        continue;
      }
    } while (k ≤ n);
    return H;
  }

```

This code is used in section 2.

5. A **for**-loop initialises the *mu* and *bb_star* arrays to 0 and sets the *H* matrix to the identity. The Gram-Schmidt procedure is kickstarted by setting $\mathbf{b}_1^* \leftarrow \mathbf{b}_1$, and the main loop variable *k* is set to 2.

⟨ Initialisation 5 ⟩ ≡

```

for (int i = 1; i ≤ n; ++i) {
    H[i] = malloc((n + 1) * sizeof(int));
    B[i] = 0;
    for (int j = 1; j ≤ n; ++j) {
        H[i][j] = (i ≡ j) ? 1 : 0;
        mu[i][j] = bb_star[i][j] = 0.0;
    }
}
k = 2;
k_max = 1;
set(bb_star[1], bb[1]);
B[1] = q(bb_star[1]);

```

This code is used in section 4.

6. If *k* is bigger than it has ever been, we do exactly one step of the Gram-Schmidt orthogonalisation procedure. To add a new vector \mathbf{b}_k to the orthogonal basis, we trim away all components of \mathbf{b}_k that are not orthogonal to some \mathbf{b}_j^* for *j* < *k*. At the end of this process, the \mathbf{b}_k^* can safely be added to the orthogonal basis (\mathbf{b}_i^*) if it is nonzero; otherwise, there is some linear dependence in the original basis (\mathbf{b}_i) so we signal an error and return Λ .

⟨ Add one Gram-Schmidt vector 6 ⟩ ≡

```

k_max = k;
set(bb_star[k], bb[k]);
for (int j = 1; j < k; ++j) {
    mu[k][j] = b(bb[k], bb_star[j]) / B[j];
    scale(temp, mu[k][j], bb_star[j]);
    sub(bb_star[k], bb_star[k], temp);
}
B[k] = b(bb_star[k], bb_star[k]);
if (B[k] < DBL_EPSILON) {
    printf("ERROR: The input vectors do not form a basis.\n");
    return  $\Lambda$ ;
}

```

This code is used in section 4.

7. When we want to determine if a candidate vector \mathbf{b}_k is to be added into the lattice, we can subtract integer multiples of a vector \mathbf{b}_l already in the basis. The result is sort of a “remainder vector” (taking a vector “modulo” another should remind you of Euclidean division), that becomes the new working vector. We will also have to update the H matrix and the mu table.

```

⟨ Reduce  $bb[k]$  by subtracting multiples of  $bb[l]$  7 ⟩ ≡
  if ( $fabs(mu[k][l]) > 0.5$ ) {
    int rounded = (int) floor((0.5 +  $mu[k][l]$ ));
    scale(temp, rounded,  $bb[l]$ );
    sub( $bb[k]$ ,  $bb[k]$ , temp); /* subtract some integer multiple of  $\mathbf{b}_l$  */
    scale_i(temp_i, rounded,  $H[l]$ );
    sub_i( $H[k]$ ,  $H[k]$ , temp_i);
     $mu[k][l] = mu[k][l] - rounded$ ;
    for (int i = 1; i < l; ++i) {
       $mu[k][i] = mu[k][i] - rounded * mu[l][i]$ ;
    }
  }

```

This code is used in section 4.

8. At this stage of the algorithm, we are trying to determine if a candidate vector \mathbf{b}_k should be added to the LLL-reduced basis. This is done by checking the so-called Lovász condition, namely,

$$B_k \geq (3/4 - \mu_{k,k-1}^2) B_{k-1}.$$

If it is satisfied, we can add \mathbf{b}_k to the LLL-basis; but if not (this happens when \mathbf{b}_k is “too long”, in some sense), we must swap \mathbf{b}_k and \mathbf{b}_{k-1} and update the auxiliary tables accordingly.

```

⟨ Lovász condition 8 ⟩ ≡
   $B[k] \geq (0.75 - mu[k][k-1] * mu[k][k-1]) * B[k-1]$ 

```

This code is used in section 4.

9. Here we perform the gnarly task of swapping \mathbf{b}_k and \mathbf{b}_{k-1} . This means all of the auxiliary arrays and tables must be updated.

```

⟨ Swap  $bb[k]$  with  $bb[k-1]$  9 ⟩ ≡
    set(temp, bb[k]);      /* swap  $\mathbf{b}_k$  with  $\mathbf{b}_{k-1}$  */
    set(bb[k], bb[k-1]);
    set(bb[k-1], temp);
    set_i(temp_i, H[k]);   /* swap  $H_k$  with  $H_{k-1}$  */
    set_i(H[k], H[k-1]);
    set_i(H[k-1], temp_i);
    double t, m;          /* temporary scalars */
    if (k > 2) {
        for (int j = 1; j ≤ k - 2; ++j) {
            t = mu[k][j];   /* swap  $\mu_{k,j}$  with  $\mu_{k-1,j}$  */
            mu[k][j] = mu[k-1][j];
            mu[k-1][j] = t;
        }
    }
    m = mu[k][k-1];
    t = B[k] + m * m * B[k-1];
    mu[k][k-1] = m * B[k-1]/t;
    set(tempb, bb_star[k-1]);
    scale(temp, m, tempb);
    add(bb_star[k-1], bb_star[k], temp);
    scale(tempb, B[k]/t, tempb);
    scale(temp, -1.0 * mu[k][k-1], bb_star[k]);
    add(bb_star[k], temp, tempb);
    B[k] = B[k-1] * B[k]/t;
    B[k-1] = t;
    for (int i = k + 1; i ≤ k_max; ++i) {
        t = mu[i][k];
        mu[i][k] = mu[i][k-1] - m * t;
        mu[i][k-1] = t + mu[k][k-1] * mu[i][k];
    }
    /* phew! */

```

This code is used in section 4.

10. Input-output functionality. These components of the *main* function format the input and print the output to the console.

11. $\langle \text{Format input into global variables 11} \rangle \equiv$

```

double input_lattice[DIM][DIM] = INPUT_BASIS;
double input_quad[DIM][DIM] = INPUT_QUAD;
for (int i = 0; i < n; ++i) {
    for (int j = 0; j < n; ++j) {
        bb[i + 1][j + 1] = input_lattice[i][j];
        Q[i + 1][j + 1] = input_quad[i][j];
    }
}
printf("Input_lattice_basis:\n");
(Print bb 13);
printf("Input_Q_matrix:\n");
for (int j = 1; j ≤ n; ++j) {
    for (int i = 1; i ≤ n; ++i) {
        printf("%f", (Q[i][j]));
    }
    printf("\n");
}

```

This code is used in section 2.

12. $\langle \text{Output basis } bb \text{ 12} \rangle \equiv$

```

printf("Reduced_basis:\n");
(Print bb 13);

```

This code is used in section 2.

13. $\langle \text{Print } bb \text{ 13} \rangle \equiv$

```

for (int i = 1; i ≤ n; ++i) {
    printf("(");
    for (int j = 1; j ≤ n; ++j) {
        printf("%f", (bb[i][j]));
        if (j ≠ n) printf(",");
    }
    printf(")\n");
}

```

This code is used in sections 11 and 12.

14. Note that we interchanged i and j in the loops, because $H[i]$ is the i th column of H .

$\langle \text{Output matrix } H \text{ 14} \rangle \equiv$

```

printf("H_matrix:\n");
for (int j = 1; j ≤ n; ++j) {
    for (int i = 1; i ≤ n; ++i) {
        printf("%d", (H[i][j]));
    }
    printf("\n");
}

```

This code is used in section 2.

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LLL-ALGORITHM

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