



南開大學  
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计算机学院  
并行程序设计第 4 次作业

## 高斯消去法的 Pthreads 并行化

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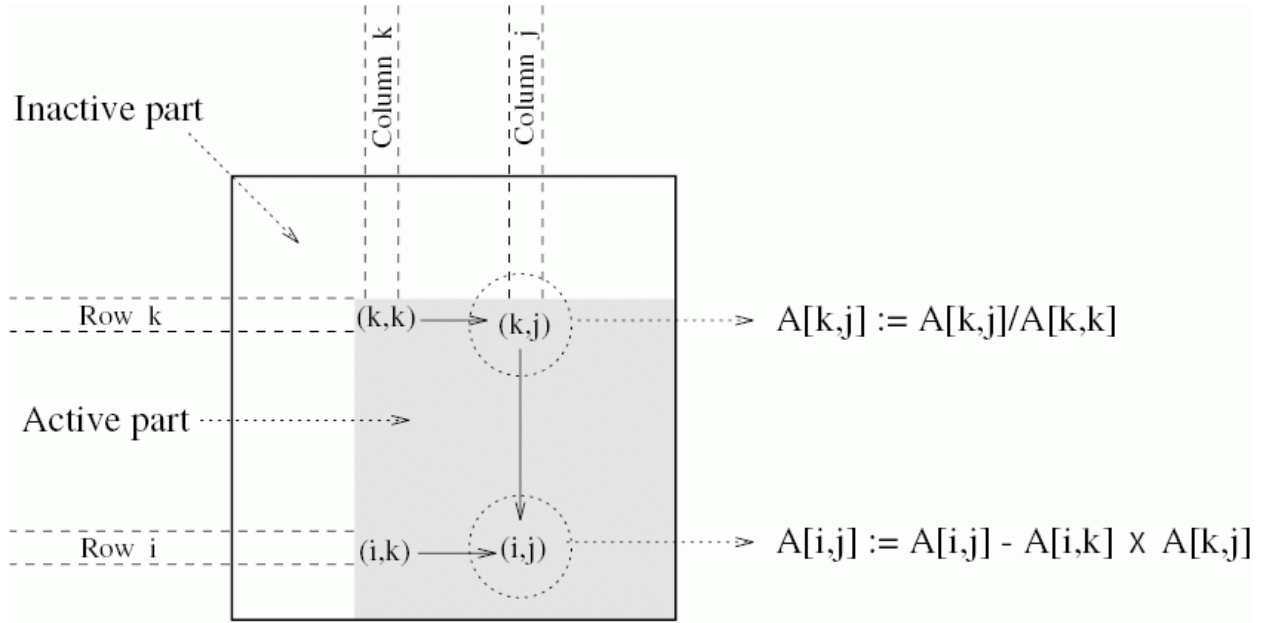


图 1.1: 高斯消去法示意图

## 1 问题描述

高斯消去的计算模式如图 1.1 所示，在第  $k$  步时，对第  $k$  行从  $(k, k)$  开始进行除法操作，并且将后续的  $k + 1$  至  $N$  行进行减去第  $k$  行的操作，串行算法如下面伪代码所示。

---

### Algorithm 1 普通高斯消元算法伪代码

---

```

1: function LU
2:   for  $k := 0$  to  $n$  do
3:     for  $j := k + 1$  to  $n$  do
4:        $A[k, j] := A[k, j] / A[k, k]$ 
5:     end for
6:      $A[k, k] := 1.0$ 
7:     for  $i := k + 1$  to  $n$  do
8:       for  $j := k + 1$  to  $n$  do
9:          $A[i, j] := A[i, j] - A[i, k] * A[k, j]$ 
10:      end for
11:       $A[i, k] := 0$ 
12:    end for
13:  end for
14: end function

```

---

观察高斯消去算法，注意到伪代码第 4, 5 行第一个内嵌循环中的  $A[k, j] := A[k, j] / A[k, k]$  以及伪代码第 8 9 10 行双层 *for* 循环中的  $A[i, j] := A[i, j] - A[i, k] \times A[k, j]$  都是可以进行向量化的循环。可以通过 SIMD 扩展指令对这两步进行并行优化。

## 2 Pthreads 算法设计

源码链接: <https://github.com/ArcanusNEO/Parallel-Programming/tree/master/4>

### 2.1 测试用例的确定

由于测试数据集较大, 不便于各个平台同步, 所以采用固定随机数种子为 12345687 的 mt19937 随机数生成器。经过实验发现不同规模下, 所有元素独立生成, 限制大小在  $[0, 100]$ , 能够生成可以被正确消元的矩阵。

代码如下:

测试数据集生成器

```
1 uniform_real_distribution<float> dist(0, 100);
2 mt19937 mt(12345687);
3 int n;
4 istream iss(argv[1]);
5 iss >> n;
6 cout << n << endl;
7 for (int i = 1; i <= n; ++i)
8     for (int j = 1; j <= n; ++j) cout << dist(mt) << " \n"[j == n];
```

### 2.2 实验环境和相关配置

实验在华为鲲鹏 ARM 集群平台和本地 Arch Linux x86\_64 平台完成;

华为鲲鹏 ARM 集群平台使用毕昇的 clang++ 编译器, 本地 Arch Linux x86\_64 平台使用 GNU GCC 编译器;

使用 cmake 构建项目, 编译开关如下:

---

```
1 set(CMAKE_CXX_FLAGS_RELEASE "-O3")
2 set(THREADS_PREFER_PTHREAD_FLAG ON)
3 find_package(Threads REQUIRED)
```

---

### 2.3 算法设计

#### 2.3.1 默认平凡算法

使用一维数组模拟矩阵, 避免改变矩阵大小时第二维不方便调整、必须设成最大值的问题, 可以减少 cache 失效;

使用 `#define matrix(i, j) arr[(i) * n + (j)]` 宏, 增强可读性;

平凡算法

```
1 #define matrix(i, j) arr[(i) * n + (j)]
2 void func(int& ans, float arr[], int n) {
3     for (int k = 0; k < n; ++k) {
4         for (int j = k + 1; j < n; ++j) matrix(k, j) = matrix(k, j) / matrix(k, k);
```

```

5     matrix(k, k) = 1.0;
6     for (int i = k + 1; i < n; ++i) {
7         for (int j = k + 1; j < n; ++j)
8             matrix(i, j) = matrix(i, j) - matrix(i, k) * matrix(k, j);
9         matrix(i, k) = 0;
10    }
11 }
12 #undef matrix
13 }

```

### 2.3.2 使用 Pthreads 动态创建线程并行化加速

#### 动态创建线程 frame

```

1  #define matrix(i, j) arr[(i) * n + (j)]
2
3  #define MAX_SUB_THREAD 7
4
5  int    n;
6  float* arr;
7
8  struct thread_param_t {
9      int k, t_id;
10 };
11
12 pthread_t      thread_handle[MAX_SUB_THREAD];
13 thread_param_t thread_param[MAX_SUB_THREAD];
14
15 void* thread_func(void* param) {
16     auto p    = (thread_param_t*) param;
17     auto k    = p->k;
18     auto t_id = p->t_id;
19     int    i    = k + t_id + 1;
20     for (int j = k + 1; j < n; ++j)
21         matrix(i, j) = matrix(i, j) - matrix(i, k) * matrix(k, j);
22     matrix(i, k) = 0;
23     pthread_exit(nullptr);
24 }
25
26 void func(int& ans, float arr[], int n) {
27     ::n    = n;
28     ::arr  = arr;
29     for (int k = 0; k < n; ++k) {
30         for (int j = k + 1; j < n; ++j) matrix(k, j) = matrix(k, j) / matrix(k, k);
31         matrix(k, k)    = 1.0;
32         int worker_count = n - 1 - k;
33         for (int offset = 0; offset < worker_count; offset += MAX_SUB_THREAD) {
34             for (int t_id = 0, i = t_id + offset;

```

```

35         i < worker_count && t_id < MAX_SUB_THREAD;
36         ++t_id, i = t_id + offset) {
37         thread_param[t_id] = {k, i};
38         pthread_create(thread_handle + t_id, nullptr, thread_func,
39                         thread_param + t_id);
40     }
41     for (int t_id = 0, i = t_id + offset;
42          i < worker_count && t_id < MAX_SUB_THREAD; ++t_id, i = t_id + offset)
43         pthread_join(thread_handle[t_id], nullptr);
44     }
45 }
46 }
47 #undef matrix
48 }

```

### 2.3.3 使用 Pthreads 线程池和信号量同步并行化加速

线程池 + 信号量同步 + 主线程执行除法

```

1  #define matrix(i, j) arr[(i) * n + (j)]
2
3  #define MAX_SUB_THREAD 7
4
5  int n;
6  float* arr;
7
8  struct thread_param_t {
9      int t_id;
10 };
11
12 sem_t sem_main;
13 sem_t sem_workerstart[MAX_SUB_THREAD];
14 pthread_t handle[MAX_SUB_THREAD];
15 thread_param_t param[MAX_SUB_THREAD];
16
17 void* thread_func(void* param) {
18     auto p = (thread_param_t*) param;
19     auto t_id = p->t_id;
20     for (int k = 0; k < n; ++k) {
21         sem_wait(sem_workerstart + t_id);
22         for (int i = k + 1 + t_id; i < n; i += MAX_SUB_THREAD) {
23             for (int j = k + 1; j < n; ++j)
24                 matrix(i, j) = matrix(i, j) - matrix(i, k) * matrix(k, j);
25             matrix(i, k) = 0;
26         }
27         sem_post(&sem_main);
28     }
29     pthread_exit(nullptr);

```

```

30 }
31
32 void func(int& ans, float arr[], int n) {
33     ::n = n;
34     ::arr = arr;
35     sem_init(&sem_main, 0, 0);
36     for (int i = 0; i < MAX_SUB_THREAD; ++i) sem_init(sem_workerstart + i, 0, 0);
37     for (int t_id = 0; t_id < MAX_SUB_THREAD; ++t_id) {
38         param[t_id].t_id = t_id;
39         pthread_create(handle + t_id, nullptr, thread_func, param + t_id);
40     }
41     for (int k = 0; k < n; ++k) {
42         for (int j = k + 1; j < n; ++j) matrix(k, j) = matrix(k, j) / matrix(k, k);
43         matrix(k, k) = 1.0;
44         for (int t_id = 0; t_id < MAX_SUB_THREAD; ++t_id)
45             sem_post(sem_workerstart + t_id);
46         for (int t_id = 0; t_id < MAX_SUB_THREAD; ++t_id) sem_wait(&sem_main);
47     }
48     for (int t_id = 0; t_id < MAX_SUB_THREAD; ++t_id)
49         pthread_join(handle[t_id], nullptr);
50     sem_destroy(&sem_main);
51     for (int i = 0; i < MAX_SUB_THREAD; ++i) sem_destroy(sem_workerstart + i);
52 }
53 #undef matrix
54 }

```

### 线程池 + 信号量同步 + 工作线程执行除法

```

1  #define matrix(i, j) arr[(i) * n + (j)]
2
3  #define MAX_SUB_THREAD 7
4
5  int n;
6  float* arr;
7
8  struct thread_param_t {
9      int t_id;
10 };
11
12 sem_t sem_leader;
13 sem_t sem_div[MAX_SUB_THREAD - 1];
14 sem_t sem_elim[MAX_SUB_THREAD - 1];
15 pthread_t handle[MAX_SUB_THREAD];
16 thread_param_t param[MAX_SUB_THREAD];
17
18 void* thread_func(void* param) {
19     auto p = (thread_param_t*) param;
20     auto t_id = p->t_id;
21     for (int k = 0; k < n; ++k) {

```

```

22     if (t_id == 0) {
23         for (int j = k + 1; j < n; ++j)
24             matrix(k, j) = matrix(k, j) / matrix(k, k);
25         matrix(k, k) = 1.0;
26     } else sem_wait(sem_div + t_id - 1);
27     if (t_id == 0)
28         for (int i = 0; i < MAX_SUB_THREAD - 1; ++i) sem_post(sem_div + i);
29     for (int i = k + 1 + t_id; i < n; i += MAX_SUB_THREAD) {
30         for (int j = k + 1; j < n; ++j)
31             matrix(i, j) = matrix(i, j) - matrix(i, k) * matrix(k, j);
32         matrix(i, k) = 0.0;
33     }
34     if (t_id == 0) {
35         for (int i = 0; i < MAX_SUB_THREAD - 1; ++i) sem_wait(&sem_leader);
36         for (int i = 0; i < MAX_SUB_THREAD - 1; ++i) sem_post(sem_elim + i);
37     } else {
38         sem_post(&sem_leader);
39         sem_wait(sem_elim + t_id - 1);
40     }
41 }
42 pthread_exit(nullptr);
43 }
44
45 void func(int& ans, float arr[], int n) {
46     ::n = n;
47     ::arr = arr;
48     sem_init(&sem_leader, 0, 0);
49     for (int i = 0; i < MAX_SUB_THREAD - 1; ++i) {
50         sem_init(sem_div + i, 0, 0);
51         sem_init(sem_elim + i, 0, 0);
52     }
53     for (int t_id = 0; t_id < MAX_SUB_THREAD; ++t_id) {
54         param[t_id].t_id = t_id;
55         pthread_create(handle + t_id, nullptr, thread_func, param + t_id);
56     }
57     for (int t_id = 0; t_id < MAX_SUB_THREAD; ++t_id)
58         pthread_join(handle[t_id], nullptr);
59     sem_destroy(&sem_leader);
60     for (int i = 0; i < MAX_SUB_THREAD - 1; ++i) {
61         sem_destroy(sem_div + i);
62         sem_destroy(sem_elim + i);
63     }
64 }
65 #undef matrix

```

### 2.3.4 使用 Pthreads 线程池和 barrier 栅栏同步并行化加速



## 线程池 + 栅栏同步 + 工作线程执行除法

```

1  #define matrix(i, j) arr[(i) * n + (j)]
2
3  #define MAX_SUB_THREAD 7
4
5  int    n;
6  float* arr;
7
8  struct thread_param_t {
9      int t_id;
10 };
11
12 pthread_barrier_t barrier_div;
13 pthread_barrier_t barrier_elim;
14 pthread_t        handle[MAX_SUB_THREAD];
15 thread_param_t    param[MAX_SUB_THREAD];
16
17 void* thread_func(void* param) {
18     auto p    = (thread_param_t*) param;
19     auto t_id = p->t_id;
20     for (int k = 0; k < n; ++k) {
21         if (t_id == 0) {
22             for (int j = k + 1; j < n; ++j)
23                 matrix(k, j) = matrix(k, j) / matrix(k, k);
24             matrix(k, k) = 1.0;
25         }
26
27         pthread_barrier_wait(&barrier_div);
28
29         for (int i = k + 1 + t_id; i < n; i += MAX_SUB_THREAD) {
30             for (int j = k + 1; j < n; ++j)
31                 matrix(i, j) = matrix(i, j) - matrix(i, k) * matrix(k, j);
32             matrix(i, k) = 0.0;
33         }
34
35         pthread_barrier_wait(&barrier_elim);
36     }
37     pthread_exit(nullptr);
38 }
39
40 void func(int& ans, float arr[], int n) {
41     ::n    = n;
42     ::arr  = arr;
43     pthread_barrier_init(&barrier_div, nullptr, MAX_SUB_THREAD);
44     pthread_barrier_init(&barrier_elim, nullptr, MAX_SUB_THREAD);
45
46     for (int t_id = 0; t_id < MAX_SUB_THREAD; ++t_id) {
47         param[t_id].t_id = t_id;
48         pthread_create(handle + t_id, nullptr, thread_func, param + t_id);

```

```
49     }
50     for (int t_id = 0; t_id < MAX_SUB_THREAD; ++t_id)
51         pthread_join(handle[t_id], nullptr);
52
53     pthread_barrier_destroy(&barrier_div);
54     pthread_barrier_destroy(&barrier_elim);
55 }
56 #undef matrix
57 }
```

### 3 实验及结果分析