第5章作业

一. 雅可比推导

安装误差 T (下三角形式),刻度系数误差K,零偏B

$$T = \begin{bmatrix} 1 & 0 & 0 \\ s_{xz} & 1 & 0 \\ -s_{xy} & s_{yx} & 1 \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 \\ s_1 & 1 & 0 \\ -s_2 & s_3 & 1 \end{bmatrix}$$

$$K'_a = \begin{bmatrix} K'_{ax} \\ K'_{ay} \\ K'_{az} \end{bmatrix} = K_a^{-1} = \begin{bmatrix} \frac{1}{K_{ax}} \\ \frac{1}{K_{ev}} \\ \frac{1}{K_{az}} \end{bmatrix} = \begin{bmatrix} k_1 & 0 & 0 \\ 0 & k_2 & 0 \\ 0 & 0 & k_3 \end{bmatrix}$$

$$T = \begin{bmatrix} 1 & 0 & 0 \\ s_1 & 1 & 0 \\ -s_2 & s_3 & 1 \end{bmatrix} \quad K = \begin{bmatrix} k_1 & 0 & 0 \\ 0 & k_2 & 0 \\ 0 & 0 & k_3 \end{bmatrix} \quad B = \begin{bmatrix} b_x \\ b_y \\ b_z \end{bmatrix}$$

待估计参数如下

给定加速度读数为 X, 对应的真实值为 X', 其计算公式如下:

$$X' = T * K * (X - B)$$

残差:

$$f(\theta^{acc}) = ||g||_2 - ||X'||_2$$

雅可比按照链式求导分解:

$$\frac{\partial f}{\partial \theta^{acc}} = \frac{\partial f}{\partial \|X'\|_{2}} \frac{\partial \|X'\|_{2}}{\partial X'} \frac{\partial X'}{\partial \theta^{acc}}$$

$$X = \begin{bmatrix} A_{x} \\ A_{y} \\ A_{z} \end{bmatrix} \quad X' = T * K * (X - B) = \begin{bmatrix} k_{1} (A_{x} - b_{x}) \\ s_{1}k_{1} (A_{x} - b_{x}) + k_{2} (A_{y} - b_{y}) \\ -s_{2}k_{1} (A_{x} - b_{x}) + s_{3}k_{2} (A_{y} - b_{y}) + k_{3} (A_{z} - b_{z}) \end{bmatrix}$$

$$\frac{\partial f}{\partial \|X'\|_{2}} = \frac{\partial (\|g\|_{2} - \|X'\|_{2})}{\partial \|X'\|_{2}} = -1$$

$$\frac{\partial \|X'\|_{2}}{\partial X'} = \frac{X'}{\|X'\|_{2}}$$

$$\frac{\partial X'}{\partial \theta^{acc}} = \begin{bmatrix} 0 & 0 & 0 & A_x - b_x & 0 & 0 & -k_1 & 0 & 0 \\ k_1 \left(A_x - b_x \right) & 0 & 0 & s_1 \left(A_x - b_x \right) & A_y - b_y & 0 & -s_1 k_1 & -k_2 & 0 \\ 0 & -k_1 \left(A_x - b_x \right) & k_2 \left(A_y - b_y \right) & -s_2 \left(A_x - b_x \right) & s_3 \left(A_y - b_y \right) & A_z - b_z & s_2 k_1 & -s_3 k_2 & -k_3 \end{bmatrix}$$

二.标定实验

代码补全

FILE: IMU_TK/src/calibration.cpp

TOD01

加速度残差自动求导修改为下三角模型:

```
template <typename _T1> struct MultiPosAccResidual
{
 MultiPosAccResidual(
   const _T1 &g_mag,
   const Eigen::Matrix< _T1, 3 , 1> &sample
 ) : g_mag_(g_mag), sample_(sample){}
 template <typename _T2>
 bool operator() (
   const _T2* const params,
   _T2* residuals
 ) const {
   Eigen::Matrix<_T2, 3, 1> raw_samp(
     _{T2}(sample_{(0)}),
     _{T2}(sample_{1}),
     _T2(sample_(2))
   );
   /* Apply undistortion transform to accel measurements
        mis_mat_ << _T(1) , -mis_yz , mis_zy ,</pre>
                      mis_xz, _T(1), -mis_zx,
                     -mis_xy, mis_yx, _T(1);
      scale_mat_ << s_x , _T(0) , _T(0) ,
                     _{T}(0) , s_{y} , _{T}(0) ,
                     _{T}(0) , _{T}(0) , _{S}_{z} ;
       bias_vec_ << b_x , b_y , b_z ;
       define:
          ms_mat_ = mis_mat_*scale_mat_
       then the undistortion transform:
               X' = T*K*(X - B)
       can be implemented as:
      unbias_data = ms_mat_*(raw_data - bias_vec_)
    * assume body frame same as accelerometer frame,
    * so bottom left params in the misalignment matrix are set to zero */
   // CalibratedTriad_<_T2> calib_triad(
       // TODO: implement lower triad model here
   //
   //
   // // mis_yz, mis_zy, mis_zx:
   // params[0], params[1], params[2],
   // // mis_xz, mis_xy, mis_yx:
       _{T2}(0), _{T2}(0), _{T2}(0),
```

```
// // s_x, s_y, s_z:
   // params[3], params[4], params[5],
      // b_x, b_y, b_z:
   // params[6], params[7], params[8]
   //);
      CalibratedTriad_<_T2> calib_triad(
                                                         // 12 个内参
     // TODO: implement lower triad model here
                                                初始化内参
                                                  安装误差
     // mis_yz, mis_zy, mis_zx:
     _{T2}(0), _{T2}(0), _{T2}(0),
                                                       // 因为使用的是没有
转台的模式,所以可以省去安装误差3个参数
     // mis_xz, mis_xy, mis_yx:
     params[0], params[1], params[2],
     // s_x, s_y, s_z:
     params[3], params[4], params[5], // 标度因素
     // b_x, b_y, b_z:
                                       // 零偏
     params[6], params[7], params[8]
   );
   // apply undistortion transform:
   Eigen::Matrix< _T2, 3 , 1> calib_samp = calib_triad.unbiasNormalize(
raw_samp );
   residuals[0] = _T2 (g_mag_) - calib_samp.norm();
   return true;
 }
```

TODO2

```
// TODO: implement lower triad model here 实现下三角模型
   //
     //origin 安装误差 上三角模型
   // acc_calib_params[0] = init_acc_calib_.misYZ();
   // acc_calib_params[1] = init_acc_calib_.misZY();
   // acc_calib_params[2] = init_acc_calib_.misZX();
   /*new 按照课程的公式,推导,改为下三角模型*/
   acc_calib_params[0] = init_acc_calib_.misxz();
   acc_calib_params[1] = init_acc_calib_.misXY();
   acc_calib_params[2] = init_acc_calib_.misYX();
   acc_calib_params[3] = init_acc_calib_.scaleX();
                                                                   // 标度
因素
   acc_calib_params[4] = init_acc_calib_.scaleY();
   acc_calib_params[5] = init_acc_calib_.scaleZ();
   acc_calib_params[6] = init_acc_calib_.biasX();
                                                                   // 零偏
   acc_calib_params[7] = init_acc_calib_.biasY();
   acc_calib_params[8] = init_acc_calib_.biasZ();
```

```
acc_calib_ = CalibratedTriad_<_T>(
  // TODO: implement lower triad model here
  //
  // min_cost_calib_params[0],
  // min_cost_calib_params[1],
  // min_cost_calib_params[2],
  // 0,0,0,
  // min_cost_calib_params[3],
  // min_cost_calib_params[4],
  // min_cost_calib_params[5],
  // min_cost_calib_params[6],
  // min_cost_calib_params[7],
  // min_cost_calib_params[8]
     0,0,0,
  min_cost_calib_params[0],
  min_cost_calib_params[1],
  min_cost_calib_params[2],
  min_cost_calib_params[3],
  min_cost_calib_params[4],
  min_cost_calib_params[5],
  min_cost_calib_params[6],
  min_cost_calib_params[7],
  min_cost_calib_params[8]
);
```

解析式求导

```
template <typename _T1>
class MultiPosAccResidual_Analytical : public ceres::SizedCostFunction<1,</pre>
9> {
           // 优化参数维度 residual[0]: 1 输入维度: 9
public:
       const _T1 g_mag_;
       const Eigen::Matrix< _T1, 3 , 1> sample_;
       MultiPosAccResidual_Analytical( const _T1 &g_mag,
                          const Eigen::Matrix<_T1,3,1>&sample)
                                          sample_(sample)
                       : g_mag_(g_mag),
virtual
       bool
                Evaluate(double const *const *parameters,
              double
                     *residuals,
              double
                     **jacobians ) const
                                                                          //
 定义残差模型
{
                                                      // 观测数据
       Eigen::Matrix<double, 3, 1> raw_samp(
     double(sample_(0)),
     double(sample_(1)),
     double(sample_(2))
   );
```

```
CalibratedTriad_<double> calib_triad(
                                                  // 12 个内参
     //
     // TODO: implement lower triad model here
                                                 初始化内参
     // mis_yz, mis_zy, mis_zx:
                                                   安装误差
     double(0), double(0), double(0),
                                                               // 因为
使用的是没有转台的模式, 所以可以省去安装误差3个参数
     // mis_xz, mis_xy, mis_yx:
     parameters \hbox{\tt [0][0], parameters [0][1], parameters [0][2],}\\
     // s_x, s_y, s_z:
     parameters[0][3], parameters[0][4], parameters[0][5],
                                                       // 标度因素
     // b_x,
                b_y, b_z:
     parameters[0][6], parameters[0][7], parameters[0][8]
                                                             // 零偏
   );
     // apply undistortion transform:
   Eigen::Matrix< double, 3 , 1> calib_samp = calib_triad.unbiasNormalize(
raw_samp );
   residuals[0] = (double)g_mag_ - calib_samp.norm(); // 残差
   if(jacobians != nullptr)
               if (jacobians[0] != nullptr)
               {
                     /*计算雅克比*/
                          // 安装误差
                       double S1 = parameters[0][0];
                                    parameters[0][1];
                       double S2 =
                       double S3 = parameters[0][2];
                       // 标度因素
                                    parameters[0][3];
                       double K1 =
                       double K2 = parameters[0][4];
                       double K3 = parameters[0][5];
                       // 零偏
                                    parameters[0][6];
                       double Bx =
                                    parameters[0][7];
                       double By =
                       double Bz = parameters[0][8];
                       // 计算出的真值输出
                       double Ax = raw_samp[0];
                       double Ay = raw_samp[1];
                       double Az = raw_samp[2];
                       Eigen::Matrix< double, 1, 9> Jacobian ;
                      Eigen::Vector3d samp_norm = calib_samp /
(calib_samp.norm()); // 输入数据的单位向量
                       Eigen::Matrix< double, 3, 9> J_theta =
Eigen::Matrix<double, 3, 9>::Zero();
                       J_{theta}(0,3) = (Ax - Bx);
                       J_{theta}(0,6) = -K1;
                       J_{theta}(1,0) = K1*(Ax - Bx);
                       J_{theta}(1,3) = S1*(Ax - Bx);
```

```
J_{theta}(1,4) = Ay - By;
                          J_{theta}(1,6) = -S1*K1;
                          J_{\text{theta}}(1,7) = -K2;
                          J_{theta(2,1)} = -K1*(Ax - Bx);
                          J_{theta(2,2)} = K2*(Ay - By);
                          J_{theta(2,3)} = -S2*(Ax - Bx);
                          J_{theta(2,4)} = S3*(Ay - By);
                          J_{theta}(2,5) = Az - Bz;
                          J_{theta(2,6)} = S2*K1;
                          J_{theta(2,7)} = -S3*K2;
                          J_{\text{theta}(2,8)} = -K3;
                          Jacobian = - samp_norm.transpose() * J_theta ;
                          jacobians[0][0] = Jacobian(0,0);
                          jacobians[0][1] = Jacobian(0,1);
                          jacobians[0][2] = Jacobian(0,2);
                          jacobians[0][3] = Jacobian(0,3);
                          jacobians[0][4] = Jacobian(0,4);
                          jacobians[0][5] = Jacobian(0,5);
                          jacobians[0][6] = Jacobian(0,6);
                          jacobians[0][7] = Jacobian(0,7);
                          jacobians[0][8] = Jacobian(0,8);
                  }
    return true;
}
} ;
```

调用

使用宏,若#define autograde则使用自动求导,反之使用解析式求导

```
#ifdef autograde
    ceres::CostFunction* cost_function = MultiPosAccResidual<_T>::Create (
        g_mag_, static_samples[i].data()
        );
    #else
        ceres::CostFunction *cost_function = new
MultiPosAccResidual_Analytical<_T>(
        g_mag_, static_samples[i].data());
#endif
```

运行

代码运行命令:

```
./test_imu_calib ./test_data/xsens_acc.mat ./test_data/xsens_gyro.mat
```

效果

解析式求导

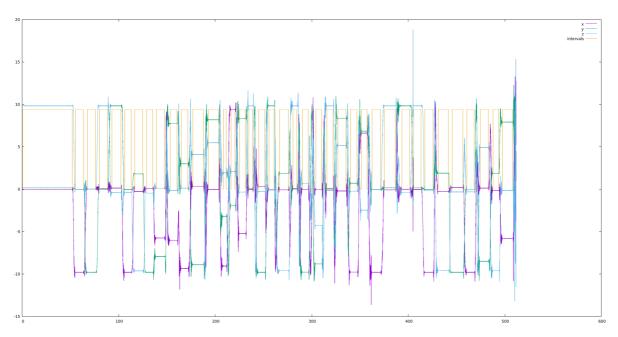
```
Importing IMU data from the Matlab matrix file : ./test_data/xsens_acc.mat
Importing IMU data from the Matlab matrix file : ./test_data/xsens_gyro.mat
Accelerometer Calibration: Calibrating...
Accelerometers Calibration: Extracted 42 intervals using threshold multiplier 2 -
> Trying calibrate...
iter
      cost
                 cost_change |gradient| |step|
                                                  tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.399567e+10 0.00e+00 3.17e+10 0.00e+00
                                                  0.00e+00 1.00e+04
   6.12e-04 8.60e-04
  1 2.700191e+03 3.40e+10 5.32e+06 2.63e+00
                                                  1.00e+00 3.00e+04
   1.29e-03 2.17e-03
  2 2.278048e+01 2.68e+03 6.95e+05
                                       7.16e+02
                                                  9.92e-01 9.00e+04
1 1.05e-03
             3.23e-03
  3 1.366645e-01 2.26e+01 7.18e+03 3.18e+01
                                                  1.00e+00 2.70e+05
  1.05e-03 4.29e-03
  4 1.347244e-01
                  1.94e-03 1.18e+00 4.74e-01 1.00e+00 8.10e+05
   1.07e-03 5.36e-03
residual 0.134724
Accelerometers Calibration: Extracted 40 intervals using threshold multiplier 3 -
> Trying calibrate...
       cost
                cost_change |gradient| |step|
                                                  tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.189931e+10 0.00e+00 2.76e+10 0.00e+00
                                                  0.00e+00 1.00e+04
   5.72e-04 7.62e-04
  1 2.343289e+03 3.19e+10 3.46e+06 2.60e+00
                                                  1.00e+00 3.00e+04
   1.01e-03 1.78e-03
  2 2.118105e+01 2.32e+03 6.06e+05
                                       7.18e+02
                                                  9.91e-01 9.00e+04
  1.01e-03 2.80e-03
  3 1.332983e-01 2.10e+01 6.87e+03 3.17e+01
                                                  1.00e+00 2.70e+05
  1.01e-03 3.81e-03
  4 1.313451e-01
                              1.04e+00 4.89e-01
                                                  1.00e+00 8.10e+05
                  1.95e-03
1
    1.01e-03 4.82e-03
residual 0.131345
Accelerometers Calibration: Extracted 39 intervals using threshold multiplier 4 -
> Trying calibrate...
        cost
                cost_change |gradient| |step|
                                                  tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.112881e+10
                 0.00e+00
                              2.73e+10 0.00e+00
                                                  0.00e+00 1.00e+04
  5.57e-04 7.03e-04
  1 2.310335e+03 3.11e+10 3.40e+06
                                      2.61e+00
                                                  1.00e+00 3.00e+04
    9.86e-04
            1.70e-03
  2 2.117401e+01 2.29e+03
                              6.06e+05
                                       7.18e+02
                                                  9.91e-01 9.00e+04
   9.74e-04
             2.68e-03
  3 1.279232e-01 2.10e+01 6.76e+03
                                       3.00e+01
                                                  1.00e+00 2.70e+05
   1.05e-03 3.73e-03
  4 1.261258e-01
                  1.80e-03
                              9.99e-01
                                        4.65e-01
                                                  1.00e+00 8.10e+05
    1.07e-03
             4.81e-03
residual 0.126126
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 5 -
> Trying calibrate...
        cost
                cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
```

```
0 3.020722e+10 0.00e+00 2.59e+10 0.00e+00 0.00e+00 1.00e+04
0 5.47e-04 7.57e-04
   1 2.236142e+03 3.02e+10 2.96e+06 2.60e+00
                                               1.00e+00 3.00e+04
  9.71e-04 1.74e-03
  2 2.057339e+01
                  2.22e+03
                            5.82e+05 7.19e+02
                                                9.91e-01 9.00e+04
1 1.02e-03 2.77e-03
   3 1.223695e-01 2.05e+01 6.81e+03 3.01e+01 1.00e+00 2.70e+05
  1.10e-03 3.87e-03
   4 1.205582e-01 1.81e-03 1.02e+00 4.70e-01 1.00e+00 8.10e+05
    1.10e-03 4.98e-03
residual 0.120558
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 6 -
> Trying calibrate...
iter cost cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.020735e+10 0.00e+00 2.59e+10 0.00e+00 0.00e+00 1.00e+04
0 8.51e-04 1.04e-03
   1 2.236228e+03 3.02e+10 2.96e+06 2.60e+00
                                                1.00e+00 3.00e+04
1 1.19e-03 2.27e-03
  2 2.057615e+01 2.22e+03 5.82e+05 7.19e+02
                                                9.91e-01 9.00e+04
1 9.54e-04 3.23e-03
   3 1.219430e-01 2.05e+01 6.81e+03 3.01e+01 1.00e+00 2.70e+05
  9.53e-04 4.19e-03
  4 1.201312e-01 1.81e-03 1.02e+00 4.70e-01 1.00e+00 8.10e+05
    1.10e-03 5.30e-03
residual 0.120131
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 7 -
> Trying calibrate...
iter cost cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.020749e+10 0.00e+00 2.59e+10 0.00e+00 0.00e+00 1.00e+04
0 6.07e-04 7.82e-04
  1 2.236258e+03 3.02e+10 2.96e+06 2.60e+00
                                               1.00e+00 3.00e+04
1 1.06e-03 1.85e-03
  2 2.058955e+01 2.22e+03 5.82e+05 7.19e+02 9.91e-01 9.00e+04
1 1.01e-03 2.87e-03
   3 1.223945e-01 2.05e+01 6.80e+03 3.00e+01 1.00e+00 2.70e+05
  9.54e-04 3.83e-03
   4 1.205858e-01 1.81e-03 1.02e+00 4.70e-01 1.00e+00 8.10e+05
1
   1.04e-03 4.87e-03
residual 0.120586
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 8 -
> Trying calibrate...
      cost cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
   0 3.020772e+10 0.00e+00 2.59e+10 0.00e+00
                                               0.00e+00 1.00e+04
   5.48e-04 7.60e-04
  1 2.236155e+03 3.02e+10 2.96e+06 2.60e+00
                                               1.00e+00 3.00e+04
   1.14e-03 1.91e-03
  2 2.059116e+01 2.22e+03 5.82e+05 7.19e+02
                                               9.91e-01 9.00e+04
1 9.52e-04 2.87e-03
   3 1.231485e-01 2.05e+01 6.81e+03 3.00e+01
                                               1.00e+00 2.70e+05
  9.50e-04 3.82e-03
   4 1.213383e-01
                 1.81e-03
                            1.02e+00 4.70e-01 1.00e+00 8.10e+05
1
    9.95e-04 4.82e-03
residual 0.121338
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 9 -
```

> Trying calibrate...

```
iter cost cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.020772e+10 0.00e+00 2.59e+10 0.00e+00
                                               0.00e+00 1.00e+04
0 6.81e-04 8.90e-04
  1 2.236261e+03 3.02e+10 2.96e+06 2.60e+00
                                               1.00e+00 3.00e+04
1 1.16e-03 2.06e-03
  2 2.058975e+01 2.22e+03 5.82e+05 7.19e+02 9.91e-01 9.00e+04
1 1.07e-03 3.15e-03
  3 1.232319e-01 2.05e+01 6.81e+03 3.00e+01 1.00e+00 2.70e+05
   1.06e-03 4.22e-03
  4 1.214222e-01 1.81e-03 1.02e+00 4.70e-01 1.00e+00 8.10e+05
1 1.02e-03 5.25e-03
residual 0.121422
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 10
-> Trying calibrate...
       cost cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.020750e+10 0.00e+00 2.59e+10 0.00e+00 0.00e+00 1.00e+04
0 5.49e-04 6.97e-04
  1 2.237162e+03 3.02e+10 2.96e+06 2.61e+00
                                               1.00e+00 3.00e+04
1 9.70e-04 1.68e-03
  2 2.065169e+01 2.22e+03 5.83e+05 7.19e+02 9.91e-01 9.00e+04
1 9.50e-04 2.63e-03
  3 1.400352e-01 2.05e+01 6.78e+03 2.99e+01 1.00e+00 2.70e+05
   9.52e-04 3.59e-03
  4 1.382403e-01 1.79e-03 1.05e+00 4.67e-01 1.00e+00 8.10e+05
  9.54e-04 4.55e-03
residual 0.13824
Accelerometers calibration: Better calibration obtained using threshold
multiplier 6 with residual 0.120131
Misalignment Matrix
        1
                 -0
                            0
-0.00354989
                 1
                           -0
-0.00890444 -0.0213032
Scale Matrix
0.00241267
           0
       0 0.00242659
       0
           0 0.00241232
Bias Vector
33124.2
33275.2
32364.4
Accelerometers calibration: inverse scale factors:
414.478
412.102
```

414.538



自动求导

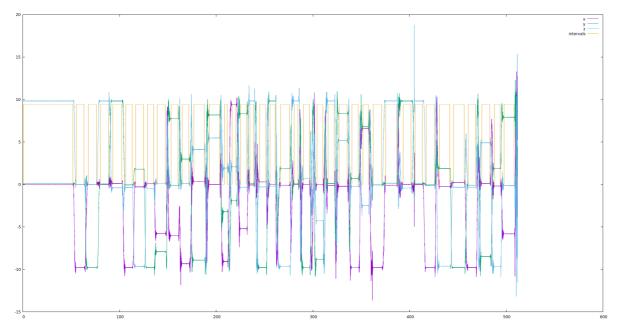
```
Importing IMU data from the Matlab matrix file : ./test_data/xsens_acc.mat
Importing IMU data from the Matlab matrix file : ./test_data/xsens_gyro.mat
Accelerometer Calibration: Calibrating...
Accelerometers Calibration: Extracted 42 intervals using threshold multiplier 2 -
> Trying calibrate...
                   cost_change |gradient|
iter
         cost
                                           |step|
                                                      tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.399567e+10
                   0.00e+00
                                3.17e+10
                                           0.00e+00
                                                      0.00e+00 1.00e+04
                5.45e-03
   5.18e-03
  1 2.700191e+03
                     3.40e+10
                                5.32e+06
                                           2.63e+00
                                                      1.00e+00 3.00e+04
   5.77e-03
                1.12e-02
  2 2.278048e+01
                     2.68e+03
                                6.95e+05
                                           7.16e + 02
                                                      9.92e-01 9.00e+04
   5.65e-03
              1.69e-02
  3 1.366645e-01
                     2.26e+01
                                7.18e+03
                                           3.18e+01
                                                      1.00e+00 2.70e+05
   5.63e-03
               2.25e-02
   4 1.347244e-01
                     1.94e-03
                                 1.18e+00
                                           4.74e-01
                                                      1.00e+00 8.10e+05
    5.59e-03
               2.81e-02
residual 0.134724
Accelerometers Calibration: Extracted 40 intervals using threshold multiplier 3 -
> Trying calibrate...
iter
         cost
                   cost_change |gradient|
                                           |step|
                                                      tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.189931e+10
                     0.00e+00
                                2.76e+10
                                           0.00e+00
                                                      0.00e+00 1.00e+04
  4.95e-03
               5.11e-03
   1 2.343289e+03
                     3.19e+10
                                3.46e+06
                                           2.60e+00
                                                      1.00e+00 3.00e+04
  5.32e-03
                1.04e-02
  2 2.118105e+01
                     2.32e+03
                                6.06e+05
                                           7.18e+02
                                                      9.91e-01 9.00e+04
    5.30e-03
                1.58e-02
  3 1.332983e-01
                     2.10e+01
                                 6.87e+03
                                           3.17e+01
                                                      1.00e+00 2.70e+05
   5.38e-03
                2.11e-02
   4 1.313451e-01
                                 1.04e+00
                     1.95e-03
                                           4.89e-01
                                                      1.00e+00 8.10e+05
    5.32e-03
               2.65e-02
residual 0.131345
Accelerometers Calibration: Extracted 39 intervals using threshold multiplier 4 -
> Trying calibrate...
                   cost_change |gradient| |step| tr_ratio tr_radius
iter
         cost
ls_iter iter_time total_time
```

```
0 3.112881e+10 0.00e+00 2.73e+10 0.00e+00 0.00e+00 1.00e+04
0 4.75e-03 4.92e-03
   1 2.310335e+03 3.11e+10 3.40e+06 2.61e+00
                                                1.00e+00 3.00e+04
  5.14e-03 1.01e-02
  2 2.117401e+01
                  2.29e+03 6.06e+05 7.18e+02
                                                9.91e-01 9.00e+04
   5.20e-03 1.53e-02
   3 1.279232e-01 2.10e+01 6.76e+03 3.00e+01 1.00e+00 2.70e+05
  5.17e-03 2.04e-02
   4 1.261258e-01 1.80e-03 9.99e-01 4.65e-01 1.00e+00 8.10e+05
    5.30e-03 2.58e-02
residual 0.126126
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 5 -
> Trying calibrate...
iter cost cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.020722e+10 0.00e+00 2.59e+10 0.00e+00 0.00e+00 1.00e+04
0 4.66e-03 4.82e-03
   1 2.236142e+03 3.02e+10 2.96e+06 2.60e+00
                                                1.00e+00 3.00e+04
1 5.05e-03 9.88e-03
  2 2.057339e+01 2.22e+03 5.82e+05 7.19e+02
                                                9.91e-01 9.00e+04
1 5.04e-03 1.49e-02
   3 1.223695e-01 2.05e+01 6.81e+03 3.01e+01 1.00e+00 2.70e+05
  5.14e-03 2.01e-02
  4 1.205582e-01 1.81e-03 1.02e+00 4.70e-01 1.00e+00 8.10e+05
    5.09e-03 2.52e-02
residual 0.120558
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 6 -
> Trying calibrate...
iter cost cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.020735e+10 0.00e+00 2.59e+10 0.00e+00 0.00e+00 1.00e+04
0 4.62e-03 4.78e-03
  1 2.236228e+03 3.02e+10 2.96e+06 2.60e+00
                                                1.00e+00 3.00e+04
1 5.04e-03 9.83e-03
  2 2.057615e+01 2.22e+03 5.82e+05 7.19e+02 9.91e-01 9.00e+04
1 5.04e-03 1.49e-02
   3 1.219430e-01 2.05e+01 6.81e+03 3.01e+01 1.00e+00 2.70e+05
  5.05e-03 1.99e-02
   4 1.201312e-01 1.81e-03 1.02e+00 4.70e-01 1.00e+00 8.10e+05
1
    5.15e-03 2.51e-02
residual 0.120131
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 7 -
> Trying calibrate...
      cost
               cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
   0 3.020749e+10 0.00e+00 2.59e+10 0.00e+00
                                                0.00e+00 1.00e+04
   4.63e-03 4.79e-03
  1 2.236258e+03 3.02e+10 2.96e+06 2.60e+00
                                                1.00e+00 3.00e+04
   5.06e-03 9.85e-03
  2 2.058955e+01 2.22e+03 5.82e+05 7.19e+02
                                                9.91e-01 9.00e+04
1 5.04e-03 1.49e-02
   3 1.223945e-01 2.05e+01 6.80e+03 3.00e+01
                                                1.00e+00 2.70e+05
  5.00e-03 1.99e-02
   4 1.205858e-01
                 1.81e-03
                            1.02e+00 4.70e-01 1.00e+00 8.10e+05
1
    5.01e-03 2.49e-02
residual 0.120586
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 8 -
```

> Trying calibrate...

```
iter cost cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.020772e+10 0.00e+00 2.59e+10 0.00e+00
                                               0.00e+00 1.00e+04
  4.64e-03 4.80e-03
  1 2.236155e+03 3.02e+10 2.96e+06 2.60e+00
                                               1.00e+00 3.00e+04
1 5.08e-03 9.89e-03
  2 2.059116e+01 2.22e+03 5.82e+05 7.19e+02 9.91e-01 9.00e+04
1 5.04e-03 1.49e-02
  3 1.231485e-01 2.05e+01 6.81e+03 3.00e+01 1.00e+00 2.70e+05
   5.05e-03 2.00e-02
  4 1.213383e-01 1.81e-03 1.02e+00 4.70e-01 1.00e+00 8.10e+05
  4.99e-03 2.50e-02
residual 0.121338
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 9 -
> Trying calibrate...
       cost cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.020772e+10 0.00e+00 2.59e+10 0.00e+00 0.00e+00 1.00e+04
  4.59e-03 4.75e-03
  1 2.236261e+03 3.02e+10 2.96e+06 2.60e+00
                                               1.00e+00 3.00e+04
1 5.04e-03 9.80e-03
  2 2.058975e+01 2.22e+03 5.82e+05 7.19e+02 9.91e-01 9.00e+04
1 5.04e-03 1.48e-02
  3 1.232319e-01 2.05e+01 6.81e+03 3.00e+01 1.00e+00 2.70e+05
   4.99e-03 1.98e-02
  4 1.214222e-01 1.81e-03 1.02e+00 4.70e-01 1.00e+00 8.10e+05
  5.07e-03 2.49e-02
residual 0.121422
Accelerometers Calibration: Extracted 38 intervals using threshold multiplier 10
-> Trying calibrate...
       cost cost_change |gradient| |step| tr_ratio tr_radius
ls_iter iter_time total_time
  0 3.020750e+10 0.00e+00 2.59e+10 0.00e+00 0.00e+00 1.00e+04
0 4.60e-03 4.75e-03
  1 2.237162e+03 3.02e+10 2.96e+06 2.61e+00 1.00e+00 3.00e+04
1 5.00e-03 9.76e-03
  2 2.065169e+01 2.22e+03 5.83e+05 7.19e+02 9.91e-01 9.00e+04
1 5.00e-03 1.48e-02
  3 1.400352e-01 2.05e+01 6.78e+03 2.99e+01 1.00e+00 2.70e+05
1 5.04e-03 1.98e-02
  4 1.382403e-01 1.79e-03 1.05e+00 4.67e-01 1.00e+00 8.10e+05
    5.05e-03 2.49e-02
residual 0.13824
Accelerometers calibration: Better calibration obtained using threshold
multiplier 6 with residual 0.120131
Misalignment Matrix
        1
                 -0
                            0
-0.00354989
                 1
                           -0
-0.00890444 -0.0213032
Scale Matrix
0.00241267 0
       0 0.00242659
       0
           0 0.00241232
Bias Vector
33124.2
33275.2
32364.4
```

Accelerometers calibration: inverse scale factors:
414.478
412.102
414.538



总结和思考、疑问

- 1. 自动求导和解析式求导得到的标定结果一致,但是自动求导的时间稍微多那么一些。
- 2. 关于第5章IMU内参的标定,好像在kititi数据集中并不需要内参的标定,那么对于自己搭的一台小车,我该如何进行imu内参的标定以及标定后如何在多传感器融合中使用到内参。
- 3. 怎么实时进行一些内参的标定。具体来说就是怎么将第5章和第6章的一些工程代码运用到自己搭的小车上去,进行内参的标定。