

# Project Overview

Goal: analyzing macroscopic properties of atoms in a system using MD trajectories

## **Task 1: Computing the fluctuations**

**Sought:** replace the ensemble average by a time average

**Based on:** Ergodic theory

$$\langle x \rangle = \bar{x} = \frac{1}{N_x} \sum_{i=1}^{N_x} x_i$$

**Implementation:** compute the averages and the **fluctuations** during each time step while running the MD program

### **Algorithm 1.1: Inaccurate computation [formula 42]**

$$\sigma_x^2 = \frac{1}{N_x - 1} \left( \sum_{i=1}^{N_x} x_i^2 - \frac{1}{N_x} \left( \sum_{i=1}^{N_x} x_i \right)^2 \right)$$

### **Algorithm 1.2: accurate computation [formula 43, 45]**

$$\sigma_x^2 = \frac{Q_{N_x}}{N_x - 1} \quad \text{For } i = 2, 3, \dots, N_x :$$
$$Q_i = Q_{i-1} + \frac{(S_{i-1} - (i-1)x_i)^2}{i(i-1)}$$
$$S_i = S_{i-1} + x_i$$

## **Task 2: Computation of correlation functions**

**Sought:** discretization of the correlation function

**Based on:** Convolution theorem, linearity of FFT

**Implementation:** obtain the correlations calculated at each time frame by post-processing the wanted property (i.e. velocity)

### **Algorithm 2.1: Direct method [formula 49]**

$$C(n\Delta t) = (N_{\text{MD}} - n)^{-1} \sum_{k=0}^{N_{\text{MD}}-n-1} x(k\Delta t)x((k+n)\Delta t)$$

### **Algorithm 2.2: FFT method with zero padding [formula 53, 54]**

$$C(n\Delta t) = \frac{1}{2N_{\text{MD}}(N_{\text{MD}} - n)} \sum_{m=0}^{2N_{\text{MD}}-1} \hat{x}(m\Delta\omega)^* \hat{x}(m\Delta\omega) e^{-im\Delta\omega n\Delta t}$$
$$\Delta\omega = \frac{2\pi}{2N_{\text{MD}}\Delta t}$$

# Implementation

## Task 1: Computing the fluctuations

```
void Calculator::inaccurate_fluctuation(double x_i, int m){
    S(m) += x_i;
    Ssq(m) += std::pow(x_i, 2);
}

void Calculator::accurate_fluctuation(double x_i, int m){
    Q(m) += (S(m)-(index-1)*x_i) * (S(m)-(index-1)*x_i) / (index*(index-1));
    S(m) += x_i;
}

// getter
double Calculator::getFluctuation_inaccurate(int m) const{
    double var = (Ssq(m)-S(m)*S(m)/numMDSteps)/(numMDSteps-1);
    return std::sqrt(var);
}

double Calculator::getFluctuation_accurate(int m) const{
    double var = Q(m)/(numMDSteps-1);
    return std::sqrt(var);
}

void MDRun::run(std::vector<double> &x, std::vector<double> &v) {
    forces.resize(x.size());
    synchronizedPositions.resize(x.size());
    radialDistribution.setZero();

    initializeVariables();
    initializeTemperature(v);

    output.printInitialTemperature(properties[1] / fac);
    output.printIterationStart();

    /* dynamics step */
    Calculator calculator(par.numberMDSteps, numberProperties);
    calculator.set_mode(false); // is_accurate = true

    double time = par.initialTime;
    for (int nstep = 0; nstep < par.numberMDSteps; nstep++) {
        performStep(x, v, nstep, time, calculator);
        time += par.timeStep;
    }

    printAverages(time, calculator);
}
```

## Task 2: Computation of correlation functions

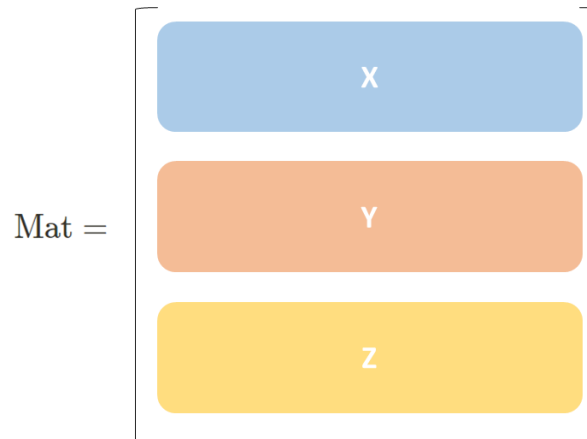
```
// formula 49
void CorrelationCalculator::computeCorrelation_direct(){
    double S;

    // looping through all steps
    for(int n = 0; n < numMDSteps; ++n){
        S = 0.;

        for(int k = 0; k < numMDSteps - n; ++k){
            S += (Mat.col(k)).dot(Mat.col(k + n));
        }

        C_direct(n) = S / ( numMDSteps - n);
    }

    C_direct /= C_direct(0); // normalization
}
```



Data structure used for storing velocities  
from the MDprogram

```
// formula 53
Eigen::VectorXcd CorrelationCalculator::getC_i(const Eigen::VectorXd& v) {
    int size = v.size();

    // zero padding
    Eigen::VectorXcd vec_padded;
    vec_padded.setZero(size * 2);
    vec_padded.head(size) = v;

    // FFT
    Eigen::FFT<double> fft;
    auto temp = fft.fwd(vec_padded);
    // squared modulus
    auto transformed = temp.cwiseProduct(temp.conjugate()).eval();

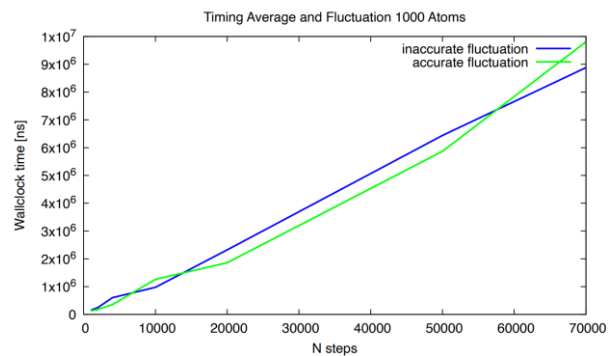
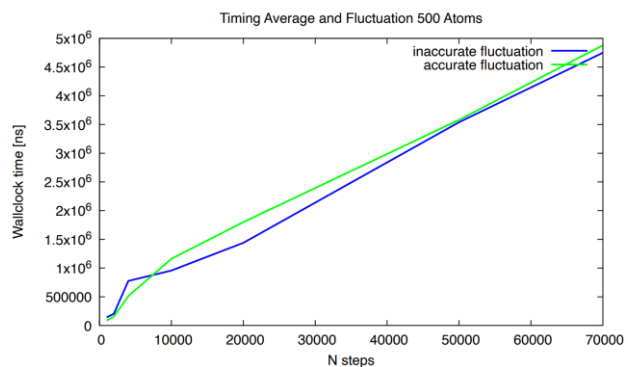
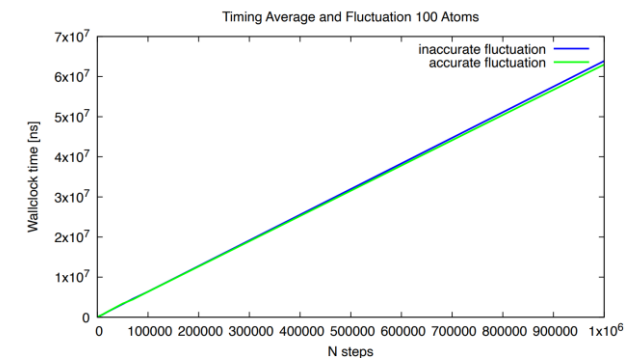
    // IFFT
    return fft.inv(transformed).real().head(size);
}

void CorrelationCalculator::computeCorrelation_FFT(){
    // looping through all atoms
    for(int k = 0; k < numberAtoms; ++k){
        C_FFT += getC_i(Mat.row(k).transpose());
    }

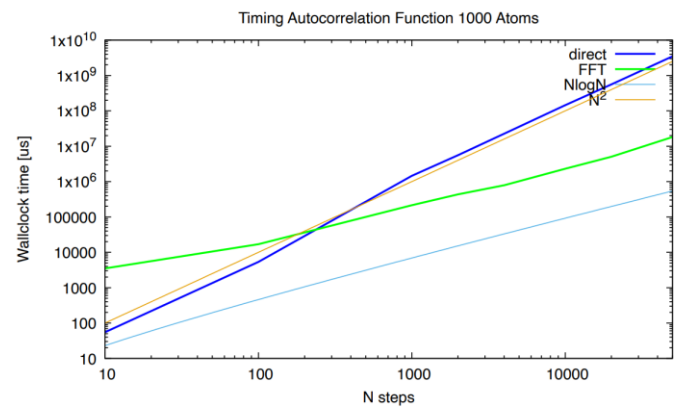
    C_FFT = C_FFT.cwiseQuotient(divisor);
    C_FFT /= C_FFT(0); // normalization
}
```

# Results & Conclusion

## Performance of fluctuation computation:



## Performance of VAC:



## Results of VAC:

