

DE LA RECHERCHE À L'INDUSTRIE

KineCluE: hands-on tutorial

CECAM 2024: Long time multi-scale simulations of activated events: from theory to pratice

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Thermodynamics of Irreversible Processes

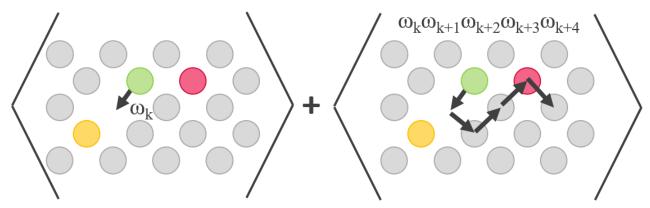


The *Onsager equation* is a thermodynamic formulation of fluxes in out-of-equilibrium systems

$$\vec{J_i} = -\sum_j L_{ij} \vec{\nabla} \mu_j$$

To compute the flux you need to know the *transport coefficients* (L_{ij} 's) which are *equilibrium properties* (fluctuation-dissipation theorem) independent of driving forces

L_{ij}'s represent the average mobility of a given atomic species. It is related to atomic jump frequencies + the kinetic correlations which arise from the integration of all possible trajectories



Our aim today, and the aim of KineCluE is to provide a framework to compute these transport coefficients from atomic-scale data (jump mechanisms and jump rates)

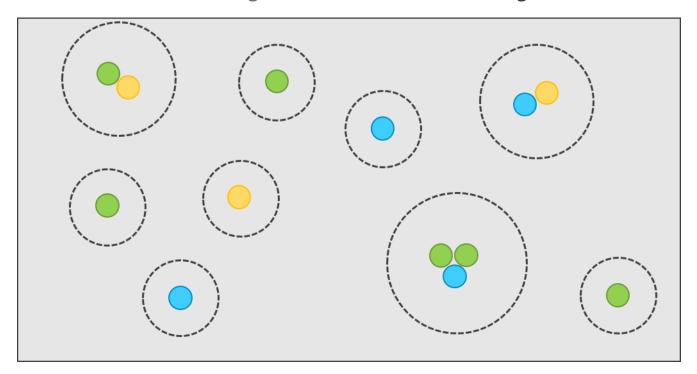
If we compute transport coefficients once, we can have the flux for any driving force. But transport coefficients depend on temperature and local composition...



KineCluE = Kinetic Cluster Expansion



In *dilute alloys*, at any time, we can split the system into isolated sub-systems which we call *clusters* using some interaction range which we call *kinetic range*



$$L_{ij} = \sum_{c} [c] L_{ij}(c)$$

This way we decouple the thermodynamic calculation (cluster concentrations) from the kinetic calculation (cluster transport coefficients)

Each KineCluE calculation allows to compute one cluster transport coefficient $L_{ij}(c)$

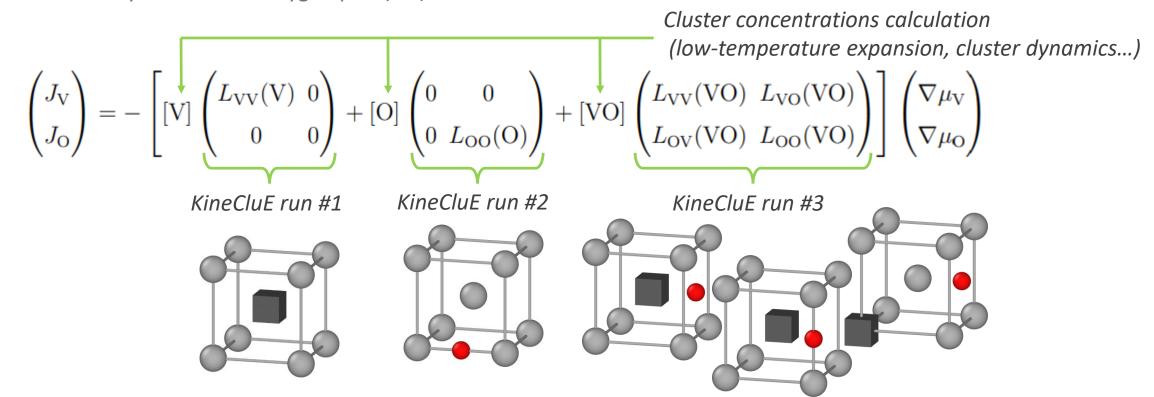


Example: Vacancy-oxygen interaction in BCC Fe



The Fe matrix is not accounted for explicitely. If vacancy and oxygen atoms are dilute we can apply our formalism to this system. Today we will consider the following clusters:

- Fe-vacancy monomer (V)
- Interstitial oxygen monomer (O)
- Fe-vacancy + interstitial oxygen pair (VO)





Example of solving for cluster concentrations at equilibrium



Mass-balance equations for each species

$$\begin{cases} [V]_{\text{tot}} = [V] + [VO] = Y_{V} + Y_{V}Y_{O}Z_{VO} \\ [O]_{\text{tot}} = [O] + [VO] = 3Y_{O} + Y_{V}Y_{O}Z_{VO} \end{cases}$$

Variables of these equations

$$Y_{\alpha} = \exp\left(\frac{\mu_{\alpha}}{k_B T}\right)$$

Pair partition function (total interaction probability)

$$Z_{\text{VO}} = \sum_{i \in \text{VO}} g_i \exp\left(\frac{E_b(i)}{k_B T}\right)$$

Rewriting the first equation we get

$$Y_{\rm V} = \frac{[\rm V]_{\rm tot}}{1 + Y_{\rm O} Z_{\rm VO}}$$

Replacing Y_V in the second equation we get a second order equation for Y_O and the solution reads

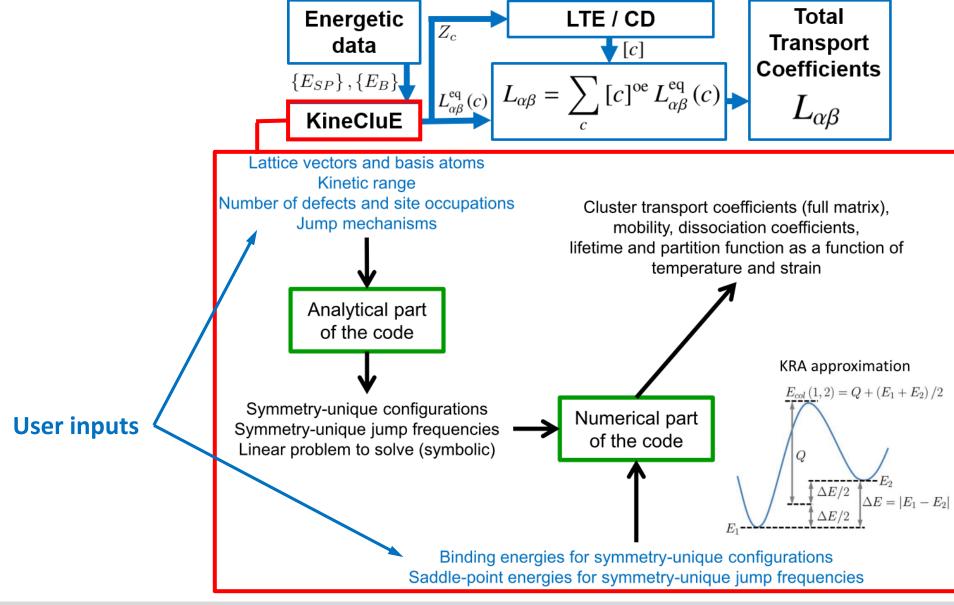
$$Y_{\rm O} = \frac{3 + Z_{\rm VO} ([{\rm V}]_{\rm tot} - [{\rm O}]_{\rm tot})}{6Z_{\rm VO}} \left(-1 + \sqrt{1 + \frac{12Z_{\rm VO}[{\rm O}]_{\rm tot}}{[3 + Z_{\rm VO} ([{\rm V}]_{\rm tot} - [{\rm O}]_{\rm tot})]^2}} \right)$$



The open-source KineCluE code

Schuler, Messina, Nastar, Comp. Mat. Sci. 172 109191 (2020)







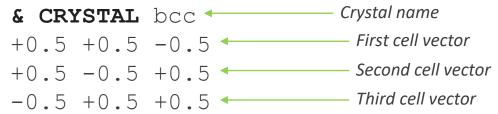
Ex. 1: vacancy in BCC Fe, minimal input for the analytical part

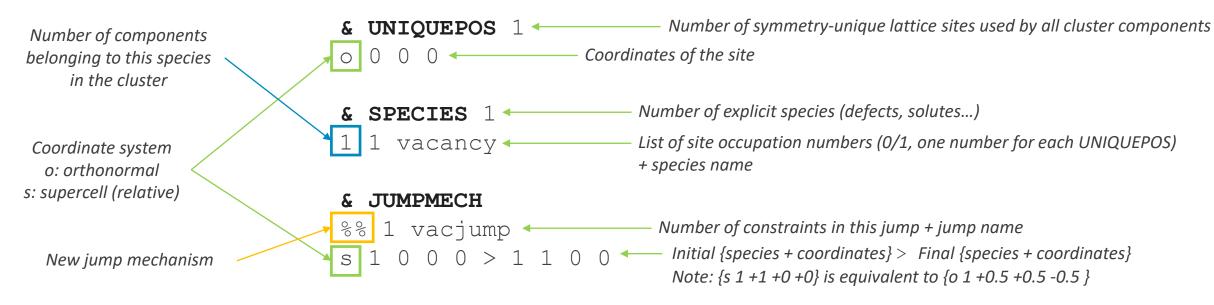


There are **two input files** to write: one for the analytical part of the code, and one for the numerical part

Each input file is a text file containing **keywords** spotted by the « & » symbol

For each keyword there is a given number of <u>arguments</u> to provide







Ex. 1: output log from the analytical part (1/3)



```
KineCluE v1.0 - 13/09/2018 |
T. Schuler, L. Messina, M. Nastar |
```

KineCluE - Copyright (C) 2018 CEA, École Nationale Supérieure des Mines de Saint-Étienne

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You are required to cite the following paper when using KineCluE or part of KineCluE:

T. Schuler, L. Messina and M. Nastar, Computational Materials Science (2019) [doi: https://doi.org/10.1016.j.commatsci.2019.109191]

Calculation date: 2021-04-09 15:43

Working in directory: ./CALC/

Kinetic range is set to 1.01 lattice parameters

Thermodynamic range is set to 1.01 lattice parameters

!! Bravais lattice because (BASIS keyword not found)

Creating 3D crystal bcc

Searching for symmetry operations in crystal without strain...

Found 48 symmetry operations (48 point group op. and 0 space groups op.)

!! Unstrained calculation (STRAIN keyword not found)

!! Setting default CPG direction as [1,0,0] in supercell basis. Might not be optimal (CPG keyword not found)

CPG direction (supercell, cartesian) [1.155 0.000 0.000]; [0.577 0.577 -0.577]

!! Cluster transport coefficients are computed along the cpg direction only (NORMAL keyword not found)

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Ex. 1: output log from the analytical part (2/3)



```
Searching for symmetry operations valid for the cpg...
 Found 12 symmetries that include the cpg.
Creating list of species and components, starting at 1.131 s
 Defect 0 on sublattice [0. 0. 0.] has 1 symmetry equivalent.
 Species 1 is a vacancy and can be in sublattices [0]
  Component 0 is a vacancy
Creating list of jumps, starting at 1.134 s
 Found 1 jump mechanisms
  Found 8 symmetry equivalent jump mechanisms for vacjump
Computing jump symmetry equivalent and average species displacements.. (starts at 1.138 s)
Checking if exploration space is connected.. (starts at 1.240 s)
Setting up initial configuration.. (starts at 1.240 s)
!! Automatically generating the initial configuration, starting at 1.240 s
New initial configuration (orthonormal coordinates):
 ['vacancy: [ 0.0000 0.0000 0.0000]']
8 valid jumps from initial configuration (orthonormal coordinates)
vacjump [ 0.5000  0.5000  -0.5000]
 vacjump [-0.5000 -0.5000 0.5000]
 vacjump [-0.5000 -0.5000 -0.5000]
 vacjump [-0.5000 0.5000 -0.5000]
 vacjump [-0.5000 0.5000 0.5000]
 vacjump [ 0.5000 -0.5000 -0.5000]
 vacjump [ 0.5000 -0.5000 0.5000]
 vacjump [ 0.5000 0.5000 0.5000]
```

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Ex. 1: output log from the analytical part (3/3)



Creating configuration space (starts at 1.242 s)

Found 1 configurations

Found 1 thermodynamic interaction classes (including 0 dissociated)

Found 0 kinetic interaction classes (and 0 site interactions)

!! Thermodynamic interaction range not specified or equal to or larger than the kinetic range

Searching for jump frequencies (starts at 1.244 s)

Found 1 jump frequencies

!! Will not be able to perform the convergence study (KIRALOOP keyword not found)

Writing symbolic equations (starts at 1.249 s)

T matrix contains 0 non-zero elements

Computing non-correlated matrix (starts at 1.249 s)

Computing partition function (starts at 1.249 s)

Writing configuration values file (starts at 1.250 s)

Writing jump frequency values file (starts at 1.250 s)

Saving objects to file (starts at 1.250 s)

Execution time: 1.251 s.

Peak memory usage: 95.695 MB.



Ex. 1: Files created by the analytical part of the code



In CALC folder (default)

analytical_kineclue_output.pkl	•	— Calculation results (unreadable) to be used by the numerical part of the code
configurations.txt	•	— List of symmetry unique cluster configurations
crystal_bcc.pkl	•	— Crystal object (unreadable) to be reused
Exo1_analytical.txt	•	— Copy of the input file used for this calculation
jump_frequencies.txt	•	— List of symmetry unique cluster jump frequencies between cluster configurations
kineclue_main.log	•	— Copy of the output log

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26 juin 2024



Ex. 1: vacancy in BCC Fe, minimal input for the numerical part of the code

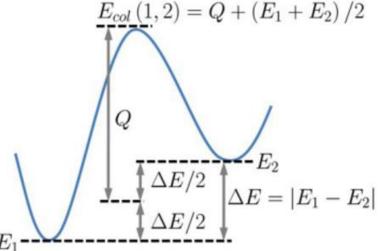


There are three ways to provide numerical data to KineCluE (in order of priority)

- 1) Directly fill-in configuration.txt and jump_frequency.txt files (!! CAUTION !! These files are overwritten each time the analytical part of the code runs)
- 2) Use a separate **INTERACTIONMODEL** file with a list of configuration and jump frequencies. KineCluE will try to relate these to the ones found in the analytical part of the code
- 3) Rely on the **KRAACTIVATION** keyword which provides a default value to all jump frequencies



KRA approximation





Ex. 1: output log from the numerical part (1/2)



| KineCluE v1.0 - 13/09/2018 | | T. Schuler, L. Messina, M. Nastar |

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You are required to cite the following paper when using KineCluE or part of KineCluE:

T. Schuler, L. Messina and M. Nastar, Computational Materials Science (2019) [doi:

https://doi.org/10.1016.j.commatsci.2019.109191]

Calculation date: 2021-04-12 09:17

Working in directory: ./CALC/

Read numerical input file (starts at 0.002 s)

Reading output file from analytical results (starts at 0.002 s)

Will print results with 6 decimal digits.

The cluster contains:

1 vacancy

!! Will not perform automatic convergence study (KIRALOOP keyword not found in the numerical input)

Lambdify matrices (starts at 0.004 s)

Reading configuration file (starts at 0.007 s)



Ex. 1: output log from the numerical part (2/2)



Reading jump frequency values from the file (starts at 0.008 s)

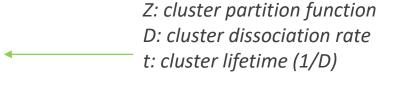
Lambdify jump frequencies and configuration probabilities (starts at 0.044 s)

Cluster transport coefficients are output in units of m2/s

Total number of configurations Z0 = 1.0

Computing Onsager matrices (starts at 0.047 s)

Computing cluster transport coefficients...



Cluster Onsager matrix

Temperature = 500.0 K - Strain = 0.000 % Z=1.000E+00 D=0.000E+00 t= INF

[9.99999999999e-09]

Temperature = 700.0 K - Strain = 0.000 % Z=1.000E+00 D=0.000E+00 t= INF

9.999999999999e-09]

Note: cluster transport coefficients are proportional to lattice parameter squared (default 1ang) times attempt frequency (default 1 THz)

Execution time: 0.055 s.

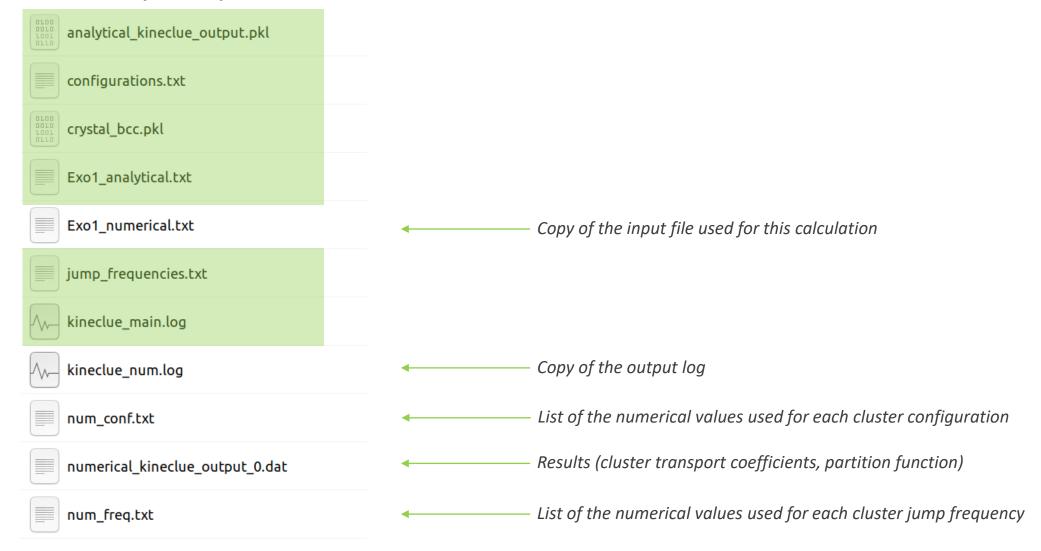
Peak memory usage: 133.190 MB.



Ex. 1: Files created by the numerical part of the code



In CALC folder (default)



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Ex. 2: divacancy in BCC Fe, input for the analytical part of the code



```
& CRYSTAL bcc
+0.5 +0.5 -0.5
+0.5 -0.5 +0.5
-0.5 +0.5 +0.5
```

& KINETICRANGE 1.8

\$ SPECIES 1
2 1 vacancy

& JUMPMECH

%% 1 vacjump s 1 0 0 0 > 1 1 0 0

& DIRECTORY V2

& CPG ○ 1 0 0

```
[\ldots]
Working in directory: V2/
Kinetic range is set to 1.81 lattice parameters
Thermodynamic range is set to 1.81 lattice parameters
[...]
Searching for symmetry operations valid for the cpg...
 Found 16 symmetries that include the cpg.
[...]
 Species 1 is a vacancy and can be in sublattices [0]
  Component 0 is a vacancy
  Component 1 is a vacancy
New initial configuration (orthonormal coordinates):
 ['vacancy: [ 0.0000 0.0000 0.0000]', 'vacancy: [ -0.5000 -0.5000 0.5000]']
16 valid jumps from initial configuration (orthonormal coordinates)
[...]
Creating configuration space (starts at 1.249 s)
 Found 31 configurations
 Found 7 thermodynamic interaction classes (including 1 dissociated)
 Found 0 kinetic interaction classes (and 0 site interactions)
!! Thermodynamic interaction range not specified or equal to or larger than the kinetic range
Searching for jump frequencies (starts at 1.290 s)
 Found 10 jump frequencies
```

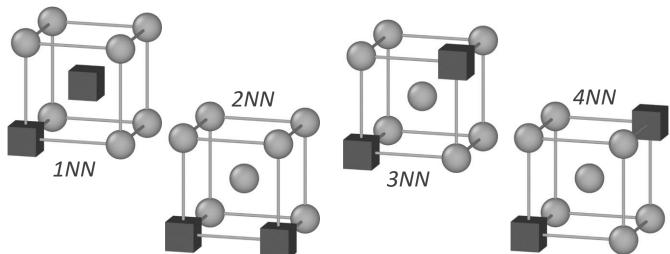
[...]

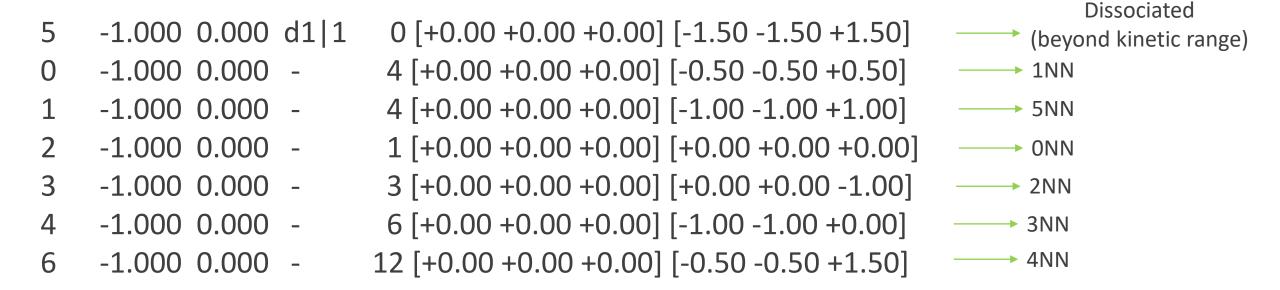


Ex. 2: divacancy in BCC Fe, configurations.txt



- 1) Configuration class;
- 2) Entropy prefactor (no units);
- 3) Binding energy (eV, >0 means attraction);
- 4) Dissociated;
- 5) Number of symmetry equivalents;
- 6) Position of each defect in orthonormal coordinates





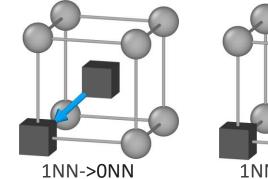


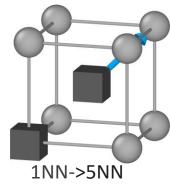
Ex. 2: divacancy in BCC Fe, jump_frequencies.txt

1NN->3NN



- 1) *Jump frequency number;*
- 2) Jump prefactor (no units);
- 3) Saddle-point energy (eV);
- Configuration class 1;
- 5) Configuration class 2;
- 6) Jump mechanism name;
- 7) *Number of symmetry equivalent jumps*
- -1.000 0.000 0 1NN -> 5NN 0 vacjump
- -1.000 0.000 1NN -> 0NN vacjump 4
- -1.000 0.000 12 3 vacjump 1NN -> 2NN
- 3 12 -1.000 0.000 vacjump → 1NN -> 3NN
- -1.000 0.000 5NN -> dissociated 4 5 vacjump 4
- 5 -1.000 0.000 12 vacjump 5NN -> 4NN
- -1.000 0.000 6 12 vacjump 2NN -> 4NN 6
- 3NN -> dissociated 12 -1.000 0.000 5 vacjump
- -1.000 0.000 8 vacjump 24 3NN -> 4NN
- 9 12 -1.000 0.000 vacjump 4NN -> dissociated





1NN->2NN

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From configuration.txt,

0=1NN

1=5NN

2=0NN

3=2NN

4=3NN

5=dissociated

6=4NN

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Ex. 2b: divacancy in BCC Fe, input for the analytical part of the code



```
& CRYSTAL bcc
+0.5 + 0.5 - 0.5
                                      [...]
+0.5 -0.5 +0.5
                        Thermal range
                                      Kinetic range is set to 1.81 lattice parameters
-0.5 + 0.5 + 0.5
                                      Thermodynamic range is set to 1.01 lattice parameters
& KINETICRANGE 1.8
                                      Found 1 jump mechanisms
                                        Found 8 symmetry equivalent jump mechanisms for vacjump
  UNIQUEPOS 1
                                      [...]
     0 0
                                      Creating configuration space (starts at 1.228 s)
                                       Found 30 configurations
  SPECIES 1
                                       Found 6 thermodynamic interaction classes (including 1 dissociated)
  1 vacancy
                       Additional
                                       Found 0 kinetic interaction classes (and 0 site interactions)
                       jump
                                      Using the thermodynamical range to reduce the number of variables (starts at 1.269 s)
                       constraint
  JUMPMECH
                                       Now 3 configuration variables are left
   2 vacjump
                                      Searching for jump frequencies (starts at 1.269 s)
       0 0 > 1 1 0 0
                                       Found 5 jump frequencies
s 0 1 0 0 > 0 0 0
                                      [...]
  DIRECTORY V2
```

& CPG o 1 0 0



Ex. 2b: divacancy in BCC Fe, configurations.txt



Dissociated

Previous:

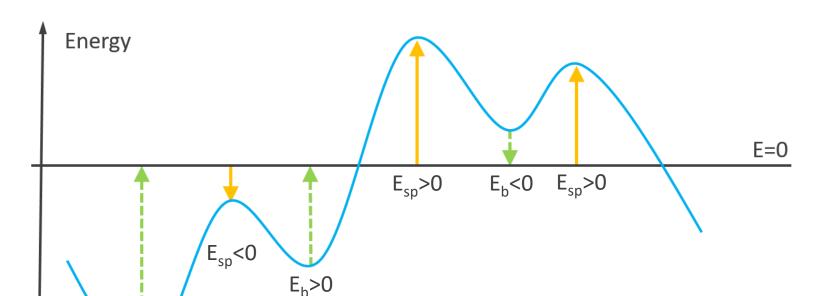
			Dissociated
5	-1.000 0.000 d1 1	0 [+0.00 +0.00 +0.00] [-1.50 -1.50 +1.50]	(beyond kinetic range)
0	-1.000 0.000 -	4 [+0.00 +0.00 +0.00] [-0.50 -0.50 +0.50]	→ 1NN
1	-1.000 0.000 -	4 [+0.00 +0.00 +0.00] [-1.00 -1.00 +1.00]	→ 5NN —
2	-1.000 0.000 -	1 [+0.00 +0.00 +0.00] [+0.00 +0.00 +0.00]	ONIN
3	-1.000 0.000 -	3 [+0.00 +0.00 +0.00] [+0.00 +0.00 -1.00]	→ 2NN
4	-1.000 0.000 -	6 [+0.00 +0.00 +0.00] [-1.00 -1.00 +0.00]	→ 3NN —
6	-1.000 0.000 -	12 [+0.00 +0.00 +0.00] [-0.50 -0.50 +1.50]	→ 4NN

New:



A word on energies and energy reference





Energy reference configuration:

all cluster components

dissociated as monomers.

Therefore the energy difference between any conference and the reference is a *binding energy*.

We choose the convention Eb > 0 means attraction.

As a consequence, the migration energy reads $E_{sp}+E_{b}$ and

high energy saddle-points will have a large positive value;

---- high energy configurations will have a large negative value;

 $E_b > 0$



Ex. 3: O monomer in BCC Fe, input for the analytical



& CRYSTAL bcc

+0.5 +0.5 -0.5

+0.5 -0.5 +0.5

-0.5 + 0.5 + 0.5

& KINETICRANGE 1.8 1.0

& CPG o 100

& DIRECTORY O

& UNIQUEPOS 2

0000

o 0.5 0 0

& SPECIES 2

0 1 0 vacancy

101 oxygen

& JUMPMECH

%% 2 vacjump

s 1 0 0 0 > 1 1 0 0

s 0 1 0 0 > 0 0 0 0

%% 2 ojump

o 2 0.5 0 0 > 2 0.5 0.5 0

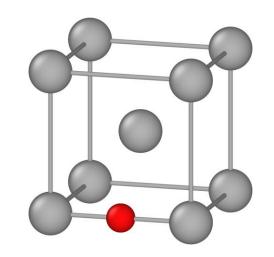
o 0 0.5 0.5 0 > 0 0.5 0 0

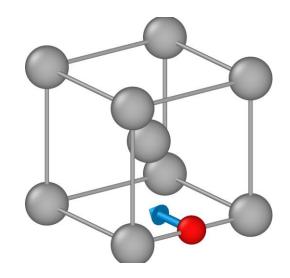
We are adding a second lattice position (interstitial octaedral sites in the BCC lattice). By symmetry, the code will automatically find all the equivalent sites (which you can check with keyword PRINTSYMEQS)

Removing the vacancy (setting the first number to 0) and adding a zero to say that the vacancy is not allowed to go on interstitial sites

Adding 1 oxygen atom to the cluster. It can go to interstitial sites but not to substitutional sites

Adding the jump mechanism for oxygen atom, between two nearby interstitial octaedral sites. The equivalent jumps will be find automatically using crystal symmetries (again you can check with the keyword PRINTSYMEQS)







Ex. 3: O monomer in BCC Fe, log from the analytical part



Creating list of species and components, starting at 1.069 s

Defect 0 on sublattice [0. 0. 0.] has 1 symmetry equivalent.

Defect 1 on sublattice [0.5 0.5 0.] has 3 symmetry equivalent.

Species 1 is a vacancy and can be in sublattices [0]

Species 2 is a oxygen and can be in sublattices [1]

Component 0 is a oxygen

Creating list of jumps, starting at 1.084 s

!! Jump vacjump is not taken into account because it requires components that are not part of the cluster Found 1 jump mechanisms

Found 12 symmetry equivalent jump mechanisms for ojump

[...]

New initial configuration (orthonormal coordinates):

['oxygen: [0.5000 0.0000 0.0000]']

4 valid jumps from initial configuration (orthonormal coordinates)

ojump [0.5000 0.5000 0.0000]

ojump [0.5000 -0.5000 0.0000]

ojump [0.5000 0.0000 -0.5000]

ojump [0.5000 0.0000 0.5000]

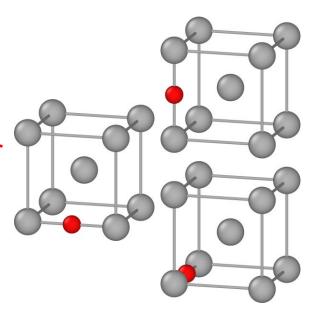
Creating configuration space (starts at 1.381 s)

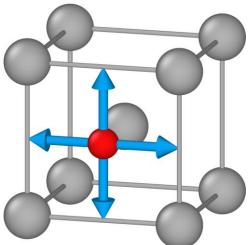
Found 3 configurations

Found 1 thermodynamic interaction classes (including 0 dissociated)

[...]

Found 1 jump frequencies







Ex. 4: VO pair in BCC Fe, input and log for the analytical part



```
Species 1 is a vacancy and can be in sublattices [0]
& CRYSTAL bcc
                                   Component 0 is a vacancy
+0.5 +0.5 -0.5
                                  Species 2 is a oxygen and can be in sublattices [1]
+0.5 -0.5 +0.5
                                   Component 1 is a oxygen
-0.5 + 0.5 + 0.5
                                 Creating list of jumps, starting at 1.141 s
& KINETICRANGE 1.8 1.0
                                  Found 2 jump mechanisms
& CPG o 100
                                   Found 8 symmetry equivalent jump mechanisms for vacjump
& DIRECTORY VO
                                   Found 12 symmetry equivalent jump mechanisms for ojump
& UNIQUEPOS 2
                                 New initial configuration (orthonormal coordinates):
0000
                                  ['vacancy: [ 0.0000 0.0000 0.0000]', 'oxygen: [ 0.5000 0.0000 0.0000]']
0 0.5 0 0
                                 12 valid jumps from initial configuration (orthonormal coordinates)
& SPECIES 2
                                  vacjump [ 0.5000  0.5000  -0.5000  , 0.5000  0.0000  0.0000]
                                                                                                   8x
1 1 0 vacancy
                                  ojump [ 0.0000 0.0000 0.0000, 0.5000 0.5000 0.0000]
                                                                                                   x4
101 oxygen
                                 Creating configuration space (starts at 1.581 s)
& JUMPMECH
                                  Found 145 configurations
%% 2 vacjump
                                  Found 9 thermodynamic interaction classes (including 1 dissociated)
s 1 0 0 0 > 1 1 0 0
                                  Found 13 kinetic interaction classes (and 0 site interactions)
                                                                                                                   Correlations!
                                 Using the thermodynamical range to reduce the number of variables (starts at 1.642 s)
s 0 1 0 0 > 0 0 0 0
                                  Now 3 configuration variables are left
%% 2 ojump
                                 Searching for jump frequencies (starts at 1.643 s)
0 2 0.5 0 0 > 2 0.5 0.5 0
                                  Found 9 jump frequencies
0 0 0.5 0.5 0 > 0 0.5 0 0
```



Ex. 4b: VO pair in BCC Fe, adding specific jumps

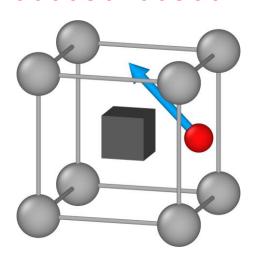


& JUMPMECH

%% 2 vacjump s 1 0 0 0 > 1 1 0 0 s 0 1 0 0 > 0 0 0 0

%% 2 ojump o 2 0.5 0 0 > 2 0.5 0.5 0 o 0 0.5 0.5 0 > 0 0.5 0 0

%% 3 ojump2nn o 2 0.5 0 0 > 2 0 0.5 0 o 1 0 0 0 > 1 0 0 0 o 0 0 0.5 0 > 0 0.5 0 0



Found 3 jump mechanisms Found 8 symmetry equivalent jump mechanisms for vacjump Found 12 symmetry equivalent jump mechanisms for ojump Found 24 symmetry equivalent jump mechanisms for ojump2nn 16 valid jumps from initial configuration (orthonormal coordinates) vacjump [0.5000 0.5000 -0.5000 , 0.5000 0.0000 0.0000] **8**x ojump [0.0000 0.0000 0.0000, 0.5000 0.5000 0.0000] **x4** ojump2nn [0.0000 0.0000 0.0000 , 0.0000 0.5000 0.0000] ojump2nn [0.0000 0.0000 0.0000, 0.0000 -0.5000 0.0000] ojump2nn [0.0000 0.0000 0.0000, 0.0000 0.0000 -0.5000] ojump2nn [0.0000 0.0000 0.0000, 0.0000 0.0000 0.5000] Creating configuration space (starts at 2.069 s) Found 145 configurations Found 9 thermodynamic interaction classes (including 1 dissociated) Found 13 kinetic interaction classes (and 0 site interactions) Using the thermodynamical range to reduce the number of variables (starts at 2.132 s) Now 3 configuration variables are left Searching for jump frequencies (starts at 2.132 s) Found 10 jump frequencies



Ex. 5: Kinetic Cluster Expansion with 3 clusters (V, O and VO): input for the numerical part of the code



The idea is to use the same input to run the numerical part of each cluster, changing only the working directory

- & DIRECTORY VOb # choose a directory where an analytical calculation has already ran
- & KRAACTIVATION # set activation energy for each jump mechanism for default value calculations vacjump 0.67 # only one number: activation energy (i.e. prefactor set to 1.0) ojump 0.149 0.56 # two numbers: prefactor then activation energy ojump2nn 0.149 0.40
- & TEMPERATURES 300 1000 20 # temperature loop
- & UNITS cm2/s # change the units
- & PREFACTOR 82 # jump frequency prefator common to all frequencies (in THz)
- & LATTPARAM 2.856 # lattice parameter (in angstroms)
- & MOB # cluster mobility (without dissociation) as in cluster dynamics
- **& OUTOPTIONS** CF # output a file with a direct calculation of cluster correlation factors
- & OUTPUT numout # base-name of the output files
- & INTERACTIONMODEL fevo.txt # use an external file to provide numerical information



Ex. 5: Kinetic Cluster Expansion with 3 clusters (V, O and VO): interaction model file



The interaction model file is the easiest way to provide energetic data (for instance obtained using DFT calculations) to the code

& new entry

C or **J**: configuration or jump frequency

o or s: coordinate system

Number of constraints

Prefactor, energy, elastic dipole

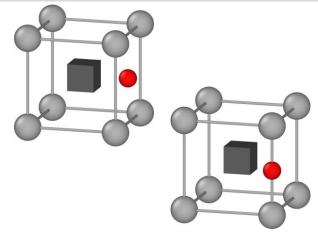
then 1 line per constraint with format

species position (for configuration) OR

species initial position > final position (for jump)

& C o 2 1.33 # 1NN configuration vacancy 0.0 0.0 0.0 oxygen 0.5 0.0 0.0

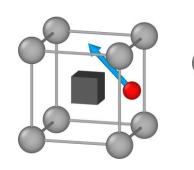
& C o 2 0.56 # 2NN configuration vacancy 0.0 0.0 0.0 oxygen 0.5 0.5 0.0

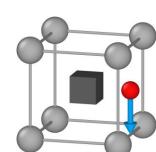


& J o 3 0.0 0.0 # 2NN to 1NN jump (vacancy jump), forbiden (prefactor=0)

vacancy 0.0 0.0 0.0 > 0.5 0.5 0.5 oxygen 0.5 0.5 0.0 > 0.5 0.5 0.0 bulk 0.5 0.5 0.5 > 0.0 0.0 0.0

& J o 3 -1.03 # 1NN to 1NN jump around V vacancy 0.0 0.0 0.0 > 0.0 0.0 0.0 0.0 oxygen 0.5 0.0 0.0 > 0.0 0.0 0.5 bulk 0.0 0.0 0.5 > 0.5 0.0 0.0





& J o 3 -0.49 # 1NN to 2NN jump (oxygen jump) vacancy 0.0 0.0 0.0 > 0.0 0.0 0.0 oxygen 0.5 0.0 0.0 > 0.5 0.5 0.0

bulk 0.5 0.5 0.0 > 0.5 0.0 0.0



Ex. 5: outputs for cluster VO



Pair cluster Onsager matrix Diagonal coefficients must be positive, matrix must be symmetric

```
Temperature = 620.0 K - Strain = 0.000 %
Z=3.884E+11 D=4.535E+03 t=2.205E-04

[ 9.51837760928254e-16 7.74490791208072e-16 ]
[ 7.74490791208104e-16 8.70685251804943e-16 ]
```

```
Temperature = 640.0 K - Strain = 0.000 % Z=1.784E+11 D=1.435E+04 t=6.967E-05
```

[2.63228254006413e-15 2.06514294966142e-15] [2.06514294966153e-15 2.36572754184721e-15]

[6.87221980097542e-15 5.18184793884052e-15] [5.18184793884046e-15 6.05862622254524e-15] The order of the coefficients depends on the order of the species. We defined V as the first species and O as the second species, therefore we are looking at the matrix

 $\begin{pmatrix} L_{\rm VV}({\rm VO}) & L_{\rm VO}({\rm VO}) \\ L_{\rm OV}({\rm VO}) & L_{\rm OO}({\rm VO}) \end{pmatrix}$

All these results are also written in numout_0.dat and numout_0CF.dat contains correlation factors

We now use the same input and change only the directory to get consistent results for V and O, and use the cluster concentrations to weigh each cluster contribution

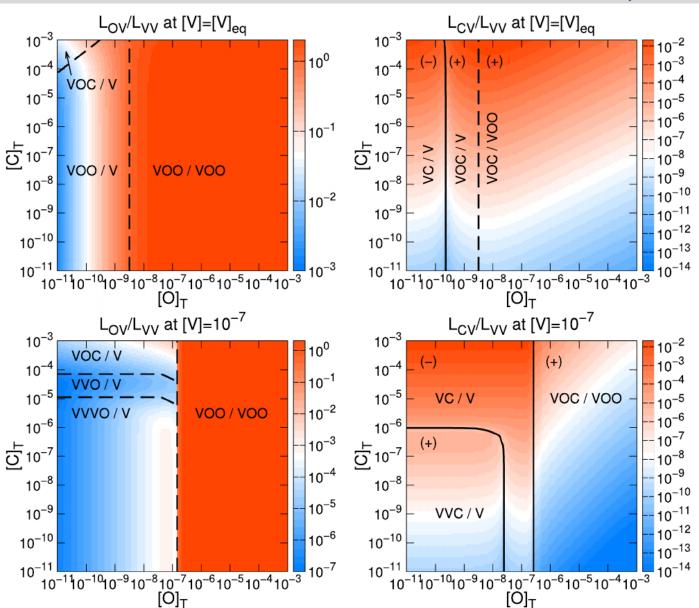


Adding in more clusters...



For instance, with 21 clusters in the FeVO system, you can get quantitative results on the effect of nominal concentration and vacancy concentration on the flux coupling properties in this system, and be able to tell which cluster drives the flux coupling...

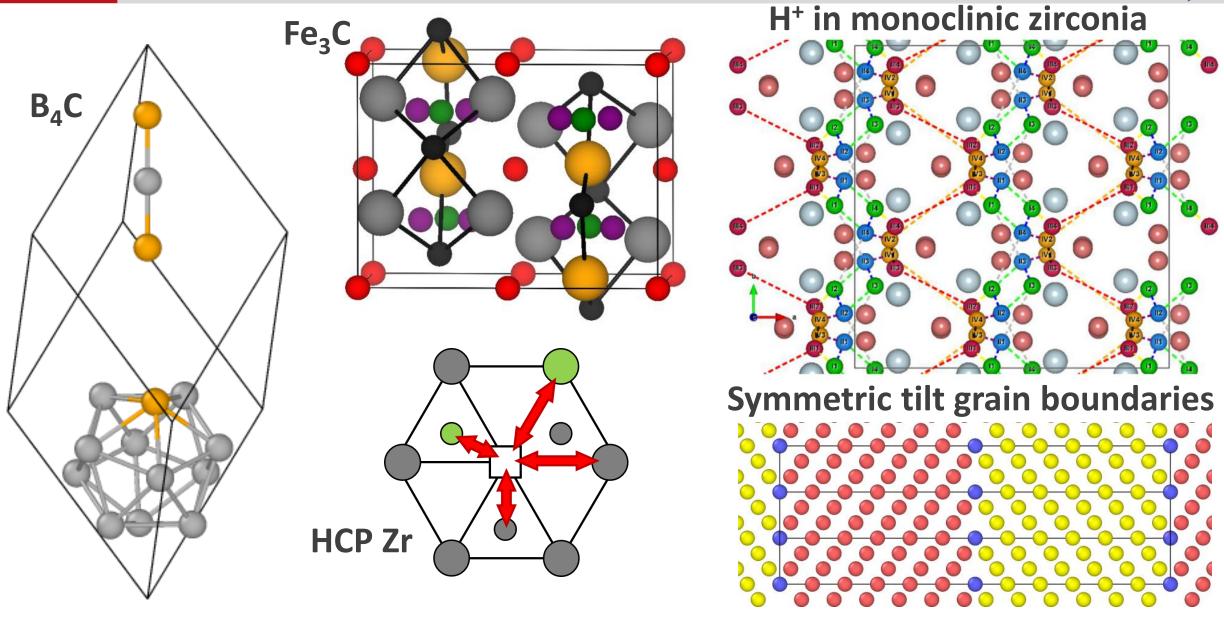
See « Mass-transport properties of ternary Fe(C,O) alloys revealed by multicomponent cluster synergies » T. Schuler, M. Nastar, and L. Messina, Phys. Rev. Materials 4, 020401(R) –2020





More complicated crystal structures





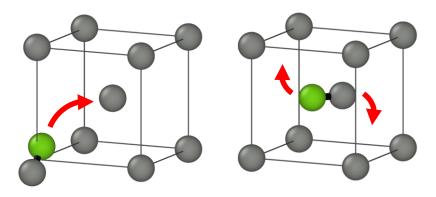
Thomas SCHULER – CEA/DES/ISAS/DMN/SRMP



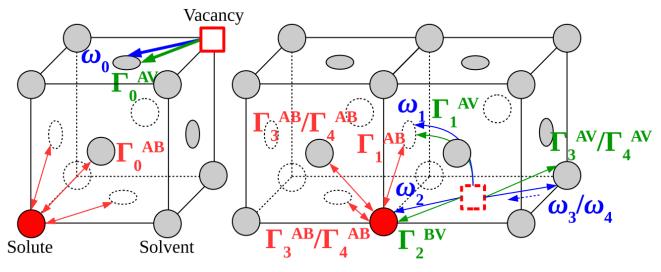
More complex jump mechanisms



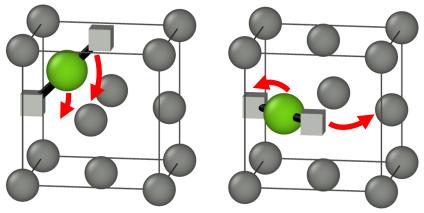
Dumbbell-solute in BCC structures



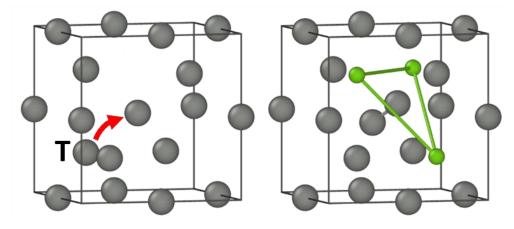
Ballistic mixing (no microscopic reversibility)



Vacancy-oversized solute in FCC structures



Interstitial kick-out mechanisms in diamond structures





Additional information



- The choice of the kinetic radius is important. It is done by looking at the convergence of the off-diagonal cluster transport coefficients. The KIRALOOP keyword automates this study
- A sensitivity study is available to identify the most important jump frequencies, i.e. those which should be computed as accurately as possible (DFT...)
- A batch calculation is available to see how various parameters affect cluster transport coefficients by efficiently sweeping through various values
- Including strain effects is easily done with the STRAIN keyword and by adding elastic dipole tensor to the configurations and jump frequencies defined in the interaction model file.



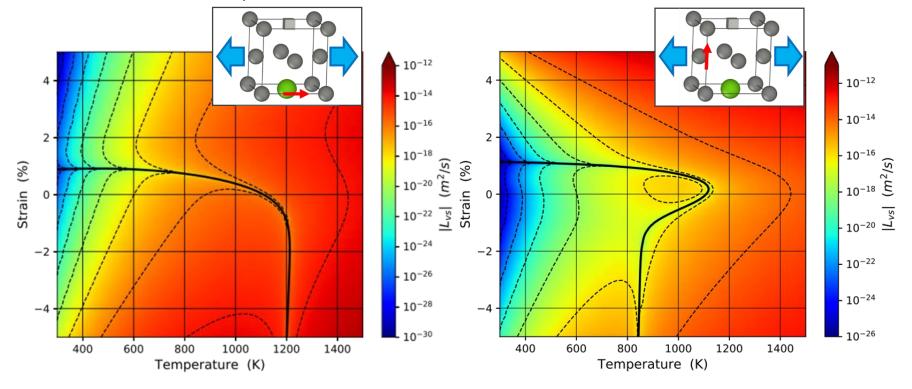
Diffusion in strained systems: Vacancy-mediated diffusion of Si in Ni



Homogeneous stress/strain fields affect tranport coefficients because it modifies :

- The energetic landscape :
 Linear elasticity, elastic dipole approximation
- $E_i(\varepsilon) = E_i(0) \mathbf{P_i} : \mathbf{S}$

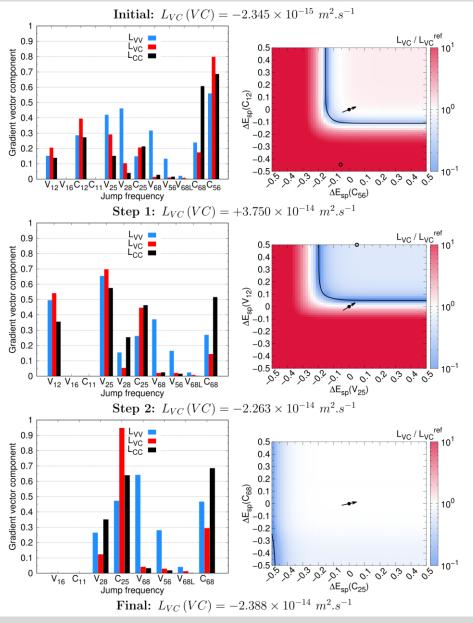
- Kinetic correlations
- Jump vectors orientation/length $\vec{v}\left(arepsilon
 ight)=\left(\mathbf{I}+\mathbf{S}\right)\vec{v}$ This may create normal diffusion, for instance under shear strain
- Relative cluster probabilities





Sensitivity analysis





Goal: identification of **key input parameters** (jump frequencies)

We compute the **gradient** of cluster transport coefficients in **jump frequency space**:

$$\nabla \mathbf{L}_d = \left(\frac{\partial \mathbf{L}_d}{\partial \omega_i} \Big|_{\mathbf{W}_0} \right)$$

We have **analytic expressions** for this gradient => does not cost much computation time

Iterative process because the analysis is only local

