

Goals of this tutorial

- How to reach publication quality results
- Calculate the binding energy of bilayer hBN
- How to write a reusable script in Nexus
- Finite size extrapolation in 2D systems

Funding: U.S. Department of Energy, Office of Science, Basic Energy Sciences, Materials Sciences and Engineering Division, as part of the Computational Materials Sciences Program and Center for Predictive Simulations of Functional Materials



DMC Convergence for publication quality results

Statistical convergence

- Equilibration period
- Sampling length
- Autocorrelation

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Session 3 (S3) has in-depth information.

Should always be controlled. Mainly postprocessing and can be system dependent.

Nexus is very helpful.

Systematic convergence

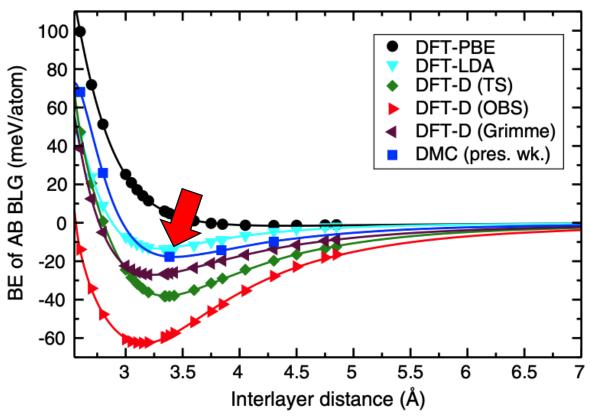
- Time step convergence (S3)
- Population control (walker count) (\$4)
- Pseudopotentials (S3)
- Trial wavefunction quality and representation (S3, S4, S5)
- Localization approximation (S3)
- Finite-size effects (1 and 2 body) (S5)

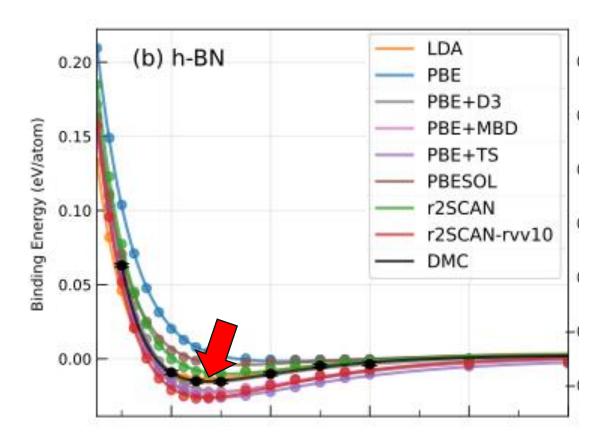
Requires an intuition and understanding of how DMC works.





Accuracy of interlayer binding energy depends on the DFT functional



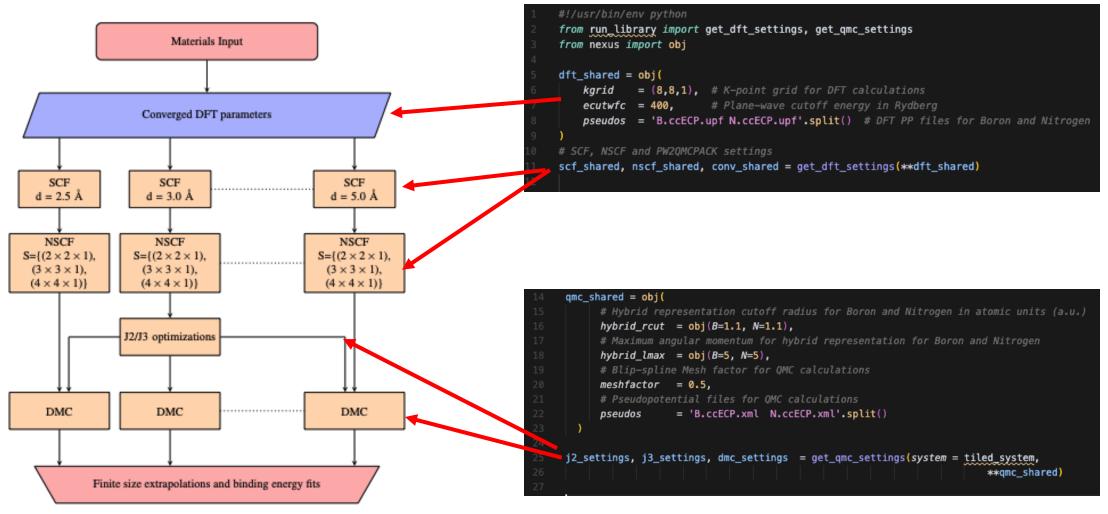


Mostaani et al. Phys. Rev. Lett. 115, 115501 (2015)



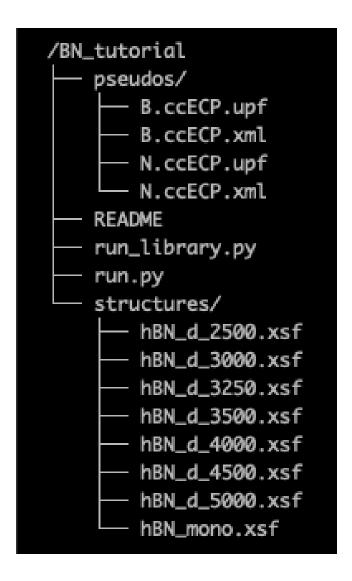
How to write reusable scripts in Nexus

run.py run_library.py





Contents of tutorial directory



run.py

Supercell vectors

Corresponding

twist grids

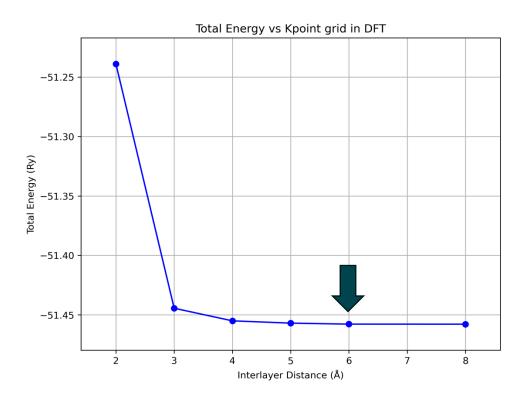
```
#!/usr/bin/env python
# user library imports
from run_library import get_dft_settings, get_qmc_settings
# nexus imports
from nexus import run_project, read_structure, obj
from nexus import generate_physical_system
from nexus import generate_pwscf
from nexus import generate_pw2qmcpack
from nexus import generate_qmcpack
# structure files and interlayer separations in Angstroms
structures = {3.0: 'structures/hBN_d_3000.xsf',
           2.5: 'structures/hBN_d_2500.xsf',
            3.25: 'structures/hBN_d_3250.xsf',
           3.5: 'structures/hBN_d_3500.xsf',
           4.0: 'structures/hBN d 4000.xsf',
            4.5: 'structures/hBN_d_4500.xsf',
           5.0: 'structures/hBN_d_5000.xsf',
            'mono' : 'structures/hBN mono.xsf'}
interlayer_separations = list(structures.keys())
# Supercell tiling vectors and respective kgrids
tiling_vectors
                        = [(2,2,1), (3,3,1), (4,4,1)]
tiling kgrids
                        = \{(2,2,1): (4,4,1),
                          (3,3,1):(2,2,1),
                          (4,4,1):(2,2,1)}
# DFT and QMC settings shared across all calculations
system_shared = obj(
             = 3.
                         # Boron PP valency
                         # Nitrogen PP valency
             = 5,
                         # Net spin of the system
    net_spin = 0
```

DFT convergence guides twist grid run.py

```
#!/usr/bin/env python
# user library imports
from run_library import get_dft_settings, get_qmc_settings
# nexus imports
from nexus import run_project, read_structure, obj
from nexus import generate_physical_system
from nexus import generate_pwscf
from nexus import generate_pw2qmcpack
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            3.5: 'structures/hBN_d_3500.xsf',
            4.0: 'structures/hBN_d_4000.xsf',
            4.5: 'structures/hBN_d_4500.xsf',
            5.0: 'structures/hBN_d_5000.xsf',
            'mono' : 'structures/hBN_mono.xsf'}
interlayer_separations = list(structures.keys())
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tiling_vectors
                        = [(2,2,1), (3,3,1), (4,4,1)]
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             = 3,
                         # Boron PP valency
             = 5.
                         # Nitrogen PP valency
                         # Net spin of the system
    net_spin = 0
```

Supercell vectors

Corresponding
twist grids





Settings common to all DFT and QMC calculations run.py

```
dft_shared = obj(
    kgrid = (6,6,1), # K-point grid for DFT calculations
    ecutwfc = 400, # Plane-wave cutoff energy in Rydberg
    pseudos = 'B.ccECP.upf N.ccECP.upf'.split() # DFT PP files for Boron and Nitrogen
)

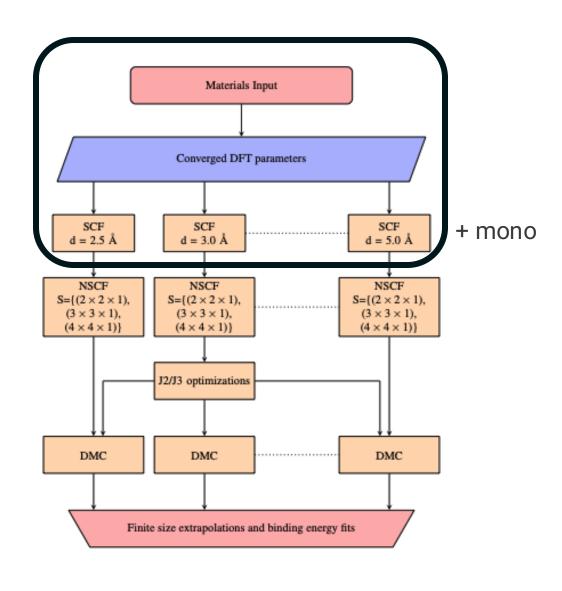
qmc_shared = obj(
    # Hybrid representation cutoff radius for Boron and Nitrogen in atomic units (a.u.)
    hybrid_rcut = obj(B=1.1, N=1.1),
    # Maximum angular momentum for hybrid representation for Boron and Nitrogen
    hybrid_lmax = obj(B=5, N=5),
    # Blip-spline Mesh factor for QMC calculations
    meshfactor = 0.5,
    # Pseudopotential files for QMC calculations
    pseudos = 'B.ccECP.xml N.ccECP.xml'.split()
)
```



SCF calculations

run.py

```
# SCF, NSCF and PW2QMCPACK settings
scf_shared, nscf_shared, conv_shared = get_dft_settings(***dft_shared)
# Binding energy workflow start
for d in interlayer_separations:
    # Convert interlayer separation to an int for file naming
    if isinstance(d, (int, float)):
        d_name = int(d*1000)
    else:
        d_name = d
    scf_path = 'scf_{}'.format(d_name)
    # Generate the primitive cell system
    prim_system = generate_physical_system(
        structure = read_structure(structures[d]),
        **system_shared
    # SCF calculation
    scf_run = generate_pwscf(
        system = prim_system,
        path = scf_path,
        **scf_shared
```

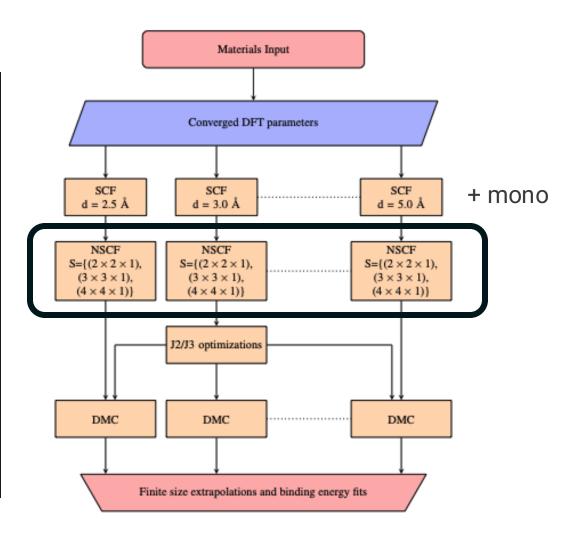




NSCF/CONV calculations

run.py

```
for t in tiling_vectors:
   # Directory for the NSCF calculation
   nscf_path = 'nscf_{}_{\}'.format(d_name, t[0])
   # Generate the supercell system
   tiled_system = generate_physical_system(
       structure = read_structure(structures[d]),
       tiling = t,
       kgrid = tiling_kgrids[t],
       **system_shared
   # NSCF calculation
   nscf_run = generate_pwscf(
       system = tiled_system,
       path = nscf_path,
       **nscf_shared
   # PW2QMCPACK conversion calculation
   conv_run = generate_pw2qmcpack(
       path
                    = nscf_path,
                                    # Use the same path as the NSCF calculation
       dependencies = (nscf_run, 'orbitals'),
       **conv_shared
```

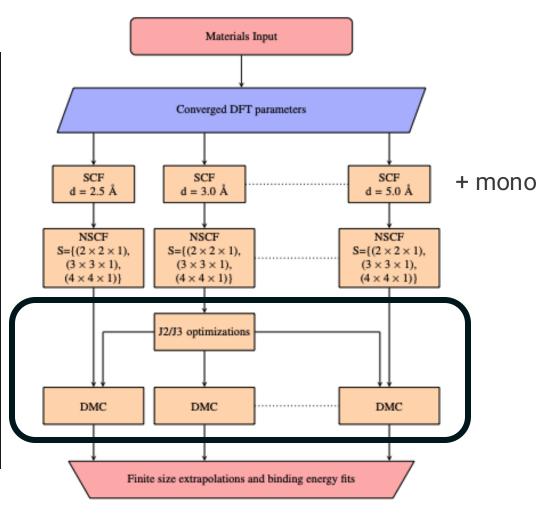




VMC/DMC calculations

run.py

```
dmc_path = 'dmc_{}_{}'.format(d_name, t[0])
       # In this example, this is d == 3.0 since dictionary keys are always ordered in Python 3.7+
       j2_settings, j3_settings, dmc_settings = get_qmc_settings(system = tiled_system,
                                                                       **gmc shared)
       if d == interlayer_separations[0]:
           j2_path = 'j2_{}_{}'.format(d_name, t[0])
           j3_path = 'j3_{}_{}'.format(d_name, t[0])
           # J2, J3 optimizations and DMC calculation settings
           # Here each "settings" object is specific to the system size
           # J2 optimization calculation
           j2_run = generate_qmcpack(path = j2_path,
                                   dependencies = (conv_run, 'orbitals'),
                                   **j2_settings)
           # J3 optimization calculation
           j3_run = generate_qmcpack(path = j3_path,
                                   dependencies = [(j2_run, 'jastrow'), (conv_run, 'orbitals')],
                                   **j3_settings)
       # DMC calculation
       dmc_run = generate_qmcpack(path = dmc_path,
                                   dependencies = [(j3_run, 'jastrow'),(conv_run, 'orbitals')],
                                   **dmc_settings)
run_project()
```





DFT settings run_library.py

```
#!/usr/bin/env python
from nexus import Job, obj
from nexus import settings
from nexus import linear, loop, vmc, dmc
from qmcpack_input import spindensity
# general settings for nexus
settings(
   pseudo_dir = './pseudos',
   status_only = 0,
                                         # only show status of runs
                                         # only make input files
   generate_only = 0,
   sleep
                 = 3,
                 = 'perlmutter',
   machine
                                         # Perlmutter NERSC machine
                 = '<account name>',
                                         # User account name
    account
def get_dft_settings(kgrid
               ecutwfc = None,
               pseudos = None.
               start_mag = None,
               hubbard = None,
               tot_magnetization = None):
   if settings.machine == 'perlmutter':
       qe_modules = '' # Modules used to build QE
       ge bin
                = '' # QE build directory
       dft_{job} = Job(cores = 4,
                   threads= 1,
                   hours = 12,
                   app = qe_bin+'/pw.x',
                   constraints = 'cpu', # Default
                   presub= qe_modules)
       conv_job = Job(cores=1,
                       hours=1.
                       app='/pw2qmcpack.x',
                       constraints = 'cpu',
                       presub=qe_modules)
       print('Error: Unknown computer for DFT, using {}'.format(settings.machine))
       exit()
```

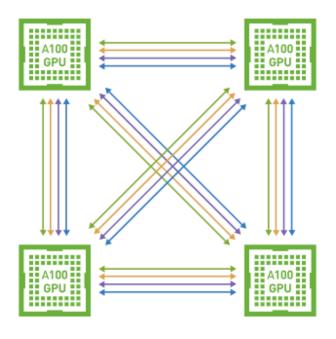
```
qe_shared = obj(
    iob
                = dft_job,
    input_type = 'generic',
    ecutwfc
                = ecutwfc,
                                    # DFT planewave energy cutoff
                = 'PBE',
                                    # DFT functional
    input DFT
    conv_thr
                = 1e-8,
    wf collect = True,
                                    # write orbitals
    pseudos
                                    # QE Pseudopotentials
                = pseudos,
    start_mag
                                    # Starting magnetization
                = start_mag,
    hubbard
                = hubbard,
                                    # Hubbard U parameters
    occupations = 'smearing',
                                    # Occupation scheme
                = 'gauss',
                                    # Smearing type
    smearing
    degauss
                = 0.001,
                                    # Smearing widt
    tot_magnetization = tot_magnetization
scf_shared = obj(
                = False.
                                    # use symmetry
    nosym
    identifier = 'scf'.
                                    # identifier/file prefix
    calculation = 'scf',
                                    # perform scf calculation
                                    # Converged DFT k-grid
    kgrid
                = kgrid.
    **qe_shared
nscf_shared = obj(
                = True,
    nosym
                                    # don't use symmetry
    identifier = 'nscf',
                                    # identifier/file prefix
    calculation = 'nscf',
                                    # perform nscf calculation
    diagonalization = 'cg',
                                    # Diagonalization method
    **ge shared
conv shared = obj(
       identifier = 'conv',
                                        # identifier/file prefix
                    = conv_job,
                                        # Job object for PW2QMCPACK
       write_psir = False,
                                        # Don't write psir
return scf_shared, nscf_shared, conv_shared
```

DMC is more sensitive to phase factor than DFT (S5)

run_library.py

```
def get_qmc_settings(system
                                = None,
               hybrid_rcut = None,
               hybrid_lmax = None,
               meshfactor = 1.0,
               pseudos
                           = None):
   if settings.machine == 'perlmutter':
       gmcpack_modules = ''
                               # Modules used to build OMCPACK
       qmcpack_bin
                               # QMCPACK build directory
       qmcpack_exec
                       = qmcpack_bin+'/qmcpack_complex'
       opt_job = Job(nodes = 12,
                   threads = 16,
                   hours = 12,
                   constraint = 'gpu',
                           = qmcpack_exec,
                   presub = qmcpack_modules)
       dmc_job = Job(nodes = 24,
                   threads = 16,
                   hours = 12,
                   constraint = 'gpu',
                           = qmcpack_exec,
                   presub = qmcpack_modules)
    else:
       print('Error: Unknown computer for QMC, using {}'.format(settings.machine))
       exit()
```

Perlmutter architecture



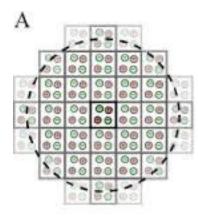
- Single <u>AMD EPYC 7763</u> (Milan) CPU
- 64 cores per CPU
- Four <u>NVIDIA A100</u> (Ampere) GPUs

https://docs.nersc.gov/systems/perlmutter/architecture/



run_library.py

```
system.structure.change_units('B')
rwigner = system.structure.rwigner()
qmc_settings = obj(
    system
                    = system,
                                    # PhysicalSystem object containing structural info
    input type
                    = 'basic',
                                    # Simple input format for QMCPACK
   pseudos
                    = pseudos,
                                    # Pseudopotential files for QMC
    driver
                    = 'batched',
                                    # Use batched driver in OMCPACK
   hybrid_rcut
                    = hybrid_rcut,
   hybrid_lmax
                    = hybrid_lmax,
                                    # Max angular momentum for hybrid orbitals
    meshfactor
                    = meshfactor,
    lr_handler
                    = 'ewald',
                                    # Use Ewald summation for long-range interactions
   lr_dim_cutoff = 30,
                                    # Cutoff for long-range Ewald sums
    spin_polarized = True,
                                    # Enable spin-polarized calculations
opt_parameters = obj(
    num\ varmin\ j2 = 12,
                             # Number of variance minimization iterations for 2-body Jastrow
   num_emin_j2
                    = 8.
                             # Number of energy minimization iterations for 2-body Jastrow
                             # Number of energy minimization iterations for 3-body Jastrow
   num emin j3
                    = 6,
    j2_init
                    = "rpa", # Initialize 2-body Jastrow with Random Phase Approximation
   num_j1_jastrows = 10,
                             # Number of 1-body Jastrow parameters to optimize
   num_j2_jastrows = 10,
                             # Number of 2-body Jastrow parameters to optimize
    num_j3_jastrows = 3,
                             # Number of 3-body Jastrow parameters to optimize
                   = 4.0 if rwigner > 4.0 else rwigner, # 3-body Jastrow cutoff radius (min of 4.0 or Wigner radius)
    j3_rcut
    timestep
                    = 1.0
opt_settings = obj(
    job
                    = opt_job,
    twistnum
opt_settings = opt_settings.set(qmc_settings)
```



J. Chem. Phys. 124, 234104 (2006)

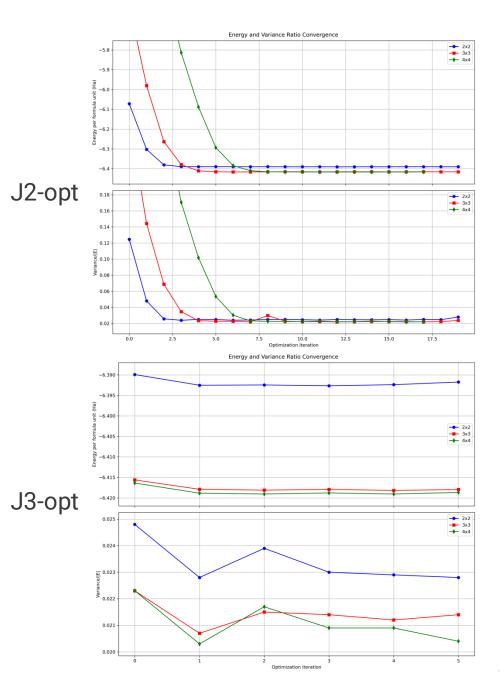
- 1 J2-varmin
- 2. J2-emin
- 3. J2+J3-emin



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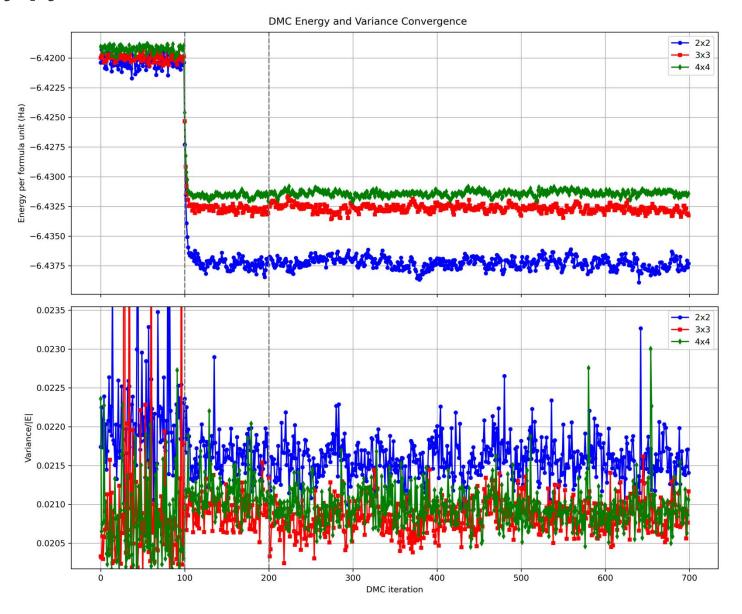
run_library.py

```
# Variance minimization settings
       varmin = linear(
                                                    # Weight for energy minimization (\theta = pure variance min)
           energy
                               = 0.0.
           unreweightedvariance = 1.0,
                                                     # Weight for unreweighted variance minimization
           reweightedvariance = 0.0,
                                                    # Weight for reweighted variance minimization
           minwalkers
                               = 1e-4.
                                                    # Lower bound of the effective walker weight
           shift_i
                               = 0.05.
                                                    # (OneShiftOnly Optimizer) Direct stabilizer shift
           shift_s
                               = 1.0,
                                                    # (OneShiftOnly Optimizer) Stabilizer shift based on overlap matrix
                                                    # Number of steps before measurements begin
           warmupsteps
                               = 200,
           blocks
                               = 100,
                                                    # Number of statistical measurement blocks
                               = 1.
                                                    # Steps per block
           steps
           timestep
                                                    # VMC timestep
                               = 1.0,
           minmethod
                               = "OneShiftOnly",
                                                    # Minimization algorithm to use
           substeps
                               = 10,
                                                    # Number of MC steps between parameter updates
       # Energy minimization settings
       emin = varmin.copy() # Copy from varmin
       emin.minwalkers
                                  = 0.5 # Use larger minwalkers, since varmin provides a better starting point
                                  = 0.95 # Mixed cost function 0.95 energy / 0.05 variance
       emin.energy
       emin.unreweightedvariance = 0.0
       emin.reweightedvariance
                                  = 0.05
                                  = 0.01 # Reduced shift_i, since we are closer to the minimum
       emin.shift_i
                      = obj(
       j2_settings
           calculations = [loop(max=opt_parameters.num_varmin_j2, qmc=varmin),
                          J1_size = opt_parameters.num_j1_jastrows,
           J2_size = opt_parameters.num_j2_jastrows,
           J1_rcut = rwigner,
           J2_rcut = rwigner,
           J2_init = opt_parameters.j2_init,
           **opt_settings
       j3_settings
                       = obj(
           calculations = [loop(max=opt_parameters.num_emin_j3, qmc=emin)],
           J3=True,
           J3_isize = opt_parameters.num_j3_jastrows,
           J3_esize = opt_parameters.num_j3_jastrows,
           J3_rcut = opt_parameters.j3_rcut,
           **opt_settings
OAK KIDGE
```



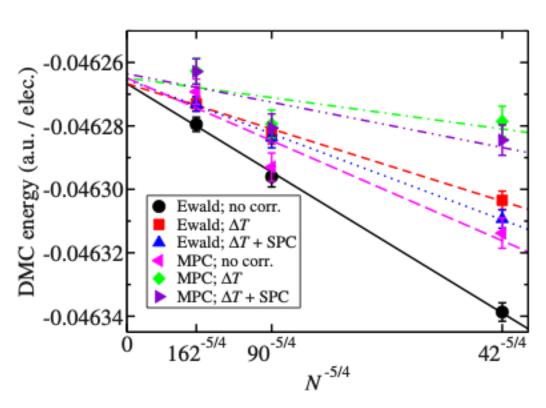
run_library.py

```
vmcdt
                        = 0.3,
                                  # VMC timestep in atomic units
                        = 25,
                                   # Number of VMC blocks to equilibrate
    vmcwarmup
    vmcblocks
                        = 100,
                                   # Number of VMC measurement blocks
                        = 4,
                                   # VMC steps between measurements
    vmcsubsteps
    dmc_eq_dt
                        = 0.02.
                                  # DMC equilibration timestep
    dmc_eq_blocks
                        = 100,
                                  # DMC production timestep
    dmcblocks
                                   # Number of DMC production blocks
                        = 100,
    dmcwarmup
   vmc_walkers_per_rank = 240,
                                   # Number of VMC walkers per MPI rank
    dmc_walkers_per_rank = 240,
                                   # Number of DMC walkers per MPI rank
    nonlocalmoves
                        = False, # Use T-moves for non-local pseudopotentials
vmc_dmc = obj
   warmupsteps = dmc_parameters.vmcwarmup,
               = dmc_parameters.vmcblocks,
    steps
               = 1,
              = dmc_parameters. (function) vmcsubsteps: Any
    substeps = dmc_parameters.vmcsubsteps,
    walkers_per_rank = dmc_parameters.vmc_walkers_per_rank
dmc_eq = obj
    warmupsteps = dmc_parameters.dmcwarmup,
               = dmc_parameters.dmc_eq_blocks,
               = dmc_parameters.dmcsteps,
   timestep = dmc_parameters.dmc_eq_dt,
    walkers_per_rank = dmc_parameters.dmc_walkers_per_rank,
    nonlocalmoves = dmc_parameters.nonlocalmoves,
dmc_stat = obj(
   warmupsteps = dmc_parameters.dmcwarmup,
               = dmc_parameters.dmcblocks,
               = dmc_parameters.dmcsteps,
   timestep = dmc_parameters.dmcdt,
   walkers_per_rank = dmc_parameters.dmc_walkers_per_rank,
    nonlocalmoves = dmc_parameters.nonlocalmoves,
dmc_settings = obj(
    calculations = [vmc(**vmc_dmc), dmc(**dmc_eq), dmc(**dmc_stat)],
    estimators = [spindensity(dr=3*[0.3])],
   **qmc_settings
return j2_settings, j3_settings, dmc_settings
```



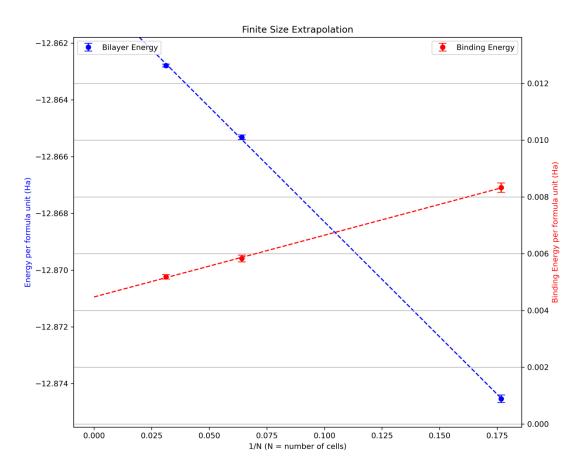


Finite size extrapolation in 2D



Drummond et al, PRB 78, 125106 (2008)

hBN d = 2.5 A



Next session: Running on GPUs and Surrogate Hessian Geom. Opt.

