# Direct Inversion in the Iterative Subspace (DIIS)

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### The Self-Consistent Field Procedure

- Calculate all one- and two-electron integrals.
- Generate a suitable start guess for the MO coefficients.
- Form the initial density matrix.
- Form the Fock matrix as the core (one-electron) integrals + the density matrix times the two-electron integrals.
- Diagonalize the Fock matrix. The eigenvectors contain the new MO coefficients.
- Form the new density matrix. If it is sufficiently close to the previous density matrix, we are done, otherwise go to step 4.

### The Self-Consistent Field Procedure

$$\mathsf{SL}_{S} = \mathsf{L}_{S} \Lambda_{S} \tag{1}$$

$$\mathbf{S}^{-1/2} \equiv \mathbf{L}_S \Lambda^{-1/2} \widetilde{\mathbf{L}}_S \tag{2}$$

$$\mathbf{F}_0' \equiv \widetilde{\mathbf{S}}^{-1/2} \mathbf{H}^{\text{core}} \mathbf{S}^{-1/2} \tag{3}$$

$$\mathbf{F}_0'\mathbf{C}_0' = \mathbf{C}_0'\epsilon_0 \tag{4}$$

$$\mathbf{C}_{0} = \mathbf{S}^{-1/2} \mathbf{C}_{0}^{\prime} \tag{5}$$

$$(\mathbf{D}_0)_{\mu\nu} = \sum_{m}^{\text{occ}} (\mathbf{C}_0)_{\mu}^m (\mathbf{C}_0)_{\nu}^m \tag{6}$$

$$E_{\text{elec}}^{0} = \sum_{\mu\nu}^{\text{AO}} D_{\mu\nu}^{0} (H_{\mu\nu}^{\text{core}} + F_{\mu\nu}) = \text{tr}(\mathbf{D}^{0} (\mathbf{H}^{\text{core}} + \mathbf{F}^{0}))$$
 (7)

$$\mathbf{F}' \equiv \widetilde{\mathbf{S}}^{-1/2} \mathbf{F} \mathbf{S}^{-1/2} \tag{8}$$

Rinse and repeat from steps 4-8 until your chosen error metric is acceptable.



# Techniques for SCF Convergence

- Damping
- Level Shifting
- Extrapolation
- Direct Minimzation

### Some Working Equations

$$\mathbf{F}' = \sum_{i} c_i \mathbf{F}_i \tag{9}$$

$$\mathbf{e}' = \sum_{i} c_{i} \mathbf{e}_{i} \tag{10}$$

$$\approx \mathbf{0}$$

where

$$\mathbf{e}_i \equiv \mathbf{F}_i \mathbf{P}_i \mathbf{S} - \mathbf{S} \mathbf{P}_i \mathbf{F}_i \tag{11}$$

$$= [\mathbf{F}_i, \mathbf{P}_i] \tag{12}$$

Suppose we have a vector from the *i*th step of an iterative procedure that can be formed as the sum of the final quantity plus some error

$$\mathbf{p}_i = \mathbf{p}_f + \mathbf{e}_i \tag{13}$$

and that a good approximation to the final vector is a linear combination of the previous guesses

$$\mathbf{p} = \sum_{i}^{m} c_{i} \mathbf{p}_{i} \tag{14}$$

where m is a fixed integer (defaults: ORCA 5, GAMESS 10, Q-Chem 15). Every time there isn't a limit on the sum, assume it's m.

Make a substitution for  $\mathbf{p}_i$ 

$$\mathbf{p} = \sum_{i} c_i (\mathbf{p}_f + \mathbf{e}_i) \tag{15}$$

$$= \mathbf{p}_f \sum_i c_i + \sum_i c_i \mathbf{e}_i. \tag{16}$$

At convergence, the error must drop to zero, leaving us with

$$\mathbf{p} = \mathbf{p}_f \sum_i c_i \tag{17}$$

$$= \mathbf{p}_f. \tag{18}$$

So, we must minimize  $\mathbf{e}'$  under the constraint  $\sum_i c_i = 1$ .

Constrained minimization? Lagrange multipliers! To minimize the norm of the error

$$\langle \mathbf{e} \, | \, \mathbf{e} \rangle = \sum_{ij}^{m} c_i^* c_j \, \langle \mathbf{e}_i \, | \, \mathbf{e}_j \rangle \,,$$
 (19)

define the Lagrangian

$$\mathcal{L} = \mathbf{c}^{\dagger} \mathbf{B} \mathbf{c} - \lambda \left( 1 - \sum_{i}^{m} c_{i} \right)$$
 (20)

where

$$B_{ij} = \langle \mathbf{e}_i \, | \, \mathbf{e}_i \rangle \,. \tag{21}$$

The messy part is minimizing the Lagrangian

$$\frac{\partial \mathcal{L}}{\partial c_k} = 0 = \sum_i c_j B_{kj} + \sum_i c_i B_{ik} - \lambda$$
 (22)

$$=2\sum_{i}c_{i}B_{ki}-\lambda, \tag{23}$$

where the 2 can be absorbed into  $\lambda$  and the coefficients are assumed to be real. We now need to solve m+1 linear equations

$$\begin{pmatrix} B_{11} & B_{12} & \cdots & B_{1m} & -1 \\ B_{21} & B_{22} & \cdots & B_{2m} & -1 \\ \vdots & \vdots & \ddots & \vdots & -1 \\ B_{m1} & B_{m2} & \cdots & B_{mm} & -1 \\ -1 & -1 & \cdots & -1 & 0 \end{pmatrix} \begin{pmatrix} c_1 \\ c_2 \\ \vdots \\ c_m \\ \lambda \end{pmatrix} = \begin{pmatrix} 0 \\ 0 \\ \vdots \\ 0 \\ -1 \end{pmatrix}$$
(24)

### Some More Working Equations

All of this results in solving the linear system

$$\mathbf{Bc} = \mathbf{z},\tag{25}$$

where  ${f z}$  is the "zero vector". Finding the  $\{c_m\}$  as

$$\mathbf{c} = \mathbf{B}^{-1}\mathbf{z} \tag{26}$$

is done with a math library, typically involving a call to the LAPACK routine DGESV.

### A 1-by-1 Example

$$\begin{pmatrix} B_{11} & -1 \\ -1 & 0 \end{pmatrix} \begin{pmatrix} c_1 \\ \lambda \end{pmatrix} = \begin{pmatrix} 0 \\ -1 \end{pmatrix} \tag{27}$$

$$\begin{pmatrix} c_1 \\ \lambda \end{pmatrix} = \begin{pmatrix} 0 & -1 \\ -1 & -B_{11} \end{pmatrix} \begin{pmatrix} 0 \\ -1 \end{pmatrix} \tag{28}$$

Surprise,  $c_1$  is 1!

### A 2-by-2 Example

$$\begin{pmatrix} B_{11} & B_{12} & -1 \\ B_{21} & B_{22} & -1 \\ -1 & -1 & 0 \end{pmatrix} \begin{pmatrix} c_1 \\ c_2 \\ \lambda \end{pmatrix} = \begin{pmatrix} 0 \\ 0 \\ -1 \end{pmatrix}$$
 (29)

Results in the following set of equations:

$$c_1 B_{11} + c_2 B_{12} - \lambda = 0 (30)$$

$$c_1 B_{21} + c_2 B_{22} - \lambda = 0 (31)$$

$$-c_1 - c_2 = -1 (32)$$

### Outline of the algorithm

- Compute the Error Matrix in Each Iteration
- Build the B Matrix and Solve the Linear Equations
- Compute the New Fock Matrix

### Computing the Error Matrix

```
/*!
     * Obrief Build the DIIS error matrix.
3
    * The formula for the error matrix at the ith iteration is:
    * e_i = F_i D_i S - S D_i F_i
    */
   arma::mat build_error_matrix(const arma::mat &F,
8
                                   const arma::mat &D,
                                   const arma::mat &S) {
9
      return (F*D*S) - (S*D*F):
10
11
```

### Building the B Matrix

```
1 /*!
   * Obrief Build the DIIS B matrix, or "A" in Ax = b.
   */
3
   arma::mat build_B_matrix(const deque< arma::mat > &e) {
     int NErr = e.size();
5
     arma::mat B(NErr + 1, NErr + 1);
6
     B(NErr, NErr) = 0.0;
7
8
     for (int a = 0; a < NErr; a++) {
       B(a, NErr) = B(NErr, a) = -1.0;
9
       for (int b = 0; b < a + 1; b++)
10
         B(a, b) = B(b, a) = arma::dot(e[a].t(), e[b]);
11
     }
12
     return B;
13
14
```

# Computing the New Fock Matrix

```
/*!
     * Obrief Build the extrapolated Fock matrix from the Fock vector.
3
     * The formula for the extrapolated Fock matrix is:
     * F' = \sum_{k}^{m} c_k F_k
    * where there are m elements in the Fock and error vectors.
    */
8
    void build_extrap_fock(arma::mat &F_extrap,
                            const arma::vec &diis_coeffs,
9
                            const deque< arma::mat > &diis_fock_vec) {
10
      const int len = diis_coeffs.n_elem - 1;
11
      F_extrap.zeros();
      for (int i = 0; i < len; i++)
13
        F_extrap += (diis_coeffs(i) * diis_fock_vec[i]);
14
15
```

# Algorithm: Form RHS

```
/*!
    * @brief Build the DIIS "zero" vector, or "b" in Ax = b.
    */
arma::vec build_diis_zero_vec(const int len) {
    arma::vec diis_zero_vec(len, arma::fill::zeros);
    diis_zero_vec(len - 1) = -1.0;
    return diis_zero_vec;
}
```

# Algorithm: Data Structures

```
/*!
    * Prepare structures necessary for DIIS extrapolation.
    */
int NErr;
deque< arma::mat > diis_error_vec;
deque< arma::mat > diis_fock_vec;
int max_diis_length = 6;
arma::mat diis_error_mat;
arma::vec diis_zero_vec;
arma::mat B;
arma::vec diis_coeff_vec;
```

# Algorithm: Main Loop

```
// Start collecting elements for DIIS once we're past the first iteration.
    if (iter > 0) {
      diis_error_mat = build_error_matrix(F, D, S);
3
      NErr = diis_error_vec.size();
4
      if (NErr >= max_diis_length) {
5
6
        diis_error_vec.pop_back();
        diis_fock_vec.pop_back();
      diis_error_vec.push_front(diis_error_mat);
9
      diis_fock_vec.push_front(F);
      NErr = diis error vec.size():
11
      // Perform DIIS extrapolation only if we have 2 or more points.
12
      if (NErr >= 2) {
        diis_zero_vec = build_diis_zero_vec(NErr + 1);
14
        B = build_B_matrix(diis_error_vec);
15
        diis_coeff_vec = arma::solve(B, diis_zero_vec);
16
        build_extrap_fock(F, diis_coeff_vec, diis_fock_vec);
17
18
19
```

#### Results: DIIS Off

#### Water, RHF/STO-3G (7 basis functions)

```
-117 839710375889
                           -117 839710375889
       -70.284216222929
                           -117.839710375889
 1
 2
       -76.045949191625
                              47.555494152959
                                                    1.826673084479
 3
       -74.714598899044
                              -5.761732968696
                                                    0.479570364860
 4
       -74.984773695191
                              1.331350292581
                                                    0.086831688906
       -74 935766125703
                              -0 270174796147
                                                    0.031026136359
 6
       -74.943904016889
                              0.049007569488
                                                    0.010799283179
 7
       -74.942119723104
                              -0.008137891186
                                                    0.005254826831
       -74 942250190433
                              0.001784293785
                                                    0.002438579642
       -74.942136438892
                              -0.000130467329
                                                    0.001177279531
       -74.942111868815
                              0.000113751541
                                                    0.000564543180
10
23
       -74.942079930560
                                                    0.000000043256
                              0.000000005264
24
       -74 942079929335
                              0.000000002540
                                                    0.000000020871
25
       -74.942079928743
                              0.000000001226
                                                    0.00000010070
26
       -74.942079928458
                              0.000000000591
                                                    0.000000004859
27
       -74 942079928320
                              0.000000000285
                                                    0.000000002345
28
       -74.942079928254
                              0.000000000138
                                                    0.000000001131
29
       -74.942079928222
                              0.000000000066
                                                    0.000000000546
30
       -74.942079928206
                              0.000000000032
                                                    0.000000000263
31
       -74.942079928199
                              0.000000000016
                                                    0.000000000127
32
       -74 942079928195
                              0.000000000007
                                                    0.000000000061
33
       -74.942079928193
                              0.000000000004
                                                    0.000000000030
34
       -74.942079928193
                              0.000000000000
                                                    0.00000000014
35
       -74 942079928192
                              0.000000000001
                                                    0.000000000007
36
       -74.942079928192
                              0.000000000000
                                                    0.000000000003
37
       -74.942079928192
                                                    0.0000000000002
                              0.000000000000
38
       -74 942079928192
                              0.000000000000
                                                    0.000000000001
39
       -74.942079928192
                              0.000000000000
                                                    0.0000000000000
40
       -74 942079928192
                              0.000000000000
```

### Results: DIIS On

### Water, RHF/STO-3G (7 basis functions), 6 error vectors

```
-117.839710375889
                           -117.839710375889
1
      -70.284216222929
                           -117.839710375889
      -74.576672718926
                            47.555494152959
                                                   1.826673084479
      -75.105709804074
                             -4.292456495997
                                                   0.403889812696
      -74.954655933663
                             -0.529037085148
                                                   0.088003715430
      -74.938944396782
                              0.151053870411
                                                   0.020519848928
      -74.942105934721
                              0.015711536881
                                                   0.012108640030
7
      -74.942079965219
                             -0.003161537938
                                                   0.000460862177
      -74.942079928865
                              0.000025969502
                                                   0.000001081074
      -74.942079928192
                              0.000000036354
                                                   0.000000052668
      -74.942079928192
                              0.000000000673
10
                                                   0.000000000336
```

### DIIS Error Matrix

#### After iteration 0:

```
-0.0135594
-0.0000000
                         -0.0000000
                                     -0.0102014
                                                  0.0000000
                                                             -0.0646745
                                                                          -0.0646745
 0.0135594
             0.0000000
                        -0.0000000
                                    -0.0072338
                                                              0.1917308
                                                  0.0000000
                                                                           0.1917308
 0.0000000
             0.0000000
                         0.0000000
                                      0.0000000
                                                 -0.0000000
                                                              0.2279110
                                                                          -0.2279110
 0.0102014
             0.0072338
                         -0.0000000
                                     0.0000000
                                                  0.0000000
                                                              0.1787515
                                                                           0.1787515
-0.0000000
            -0.0000000
                         0.0000000
                                     -0.0000000
                                                  0.0000000
                                                              0.0000000
                                                                          -0.0000000
 0.0646745
            -0.1917308
                         -0.2279110
                                    -0.1787515
                                                 -0.0000000
                                                              0.0000000
                                                                           0.0000000
 0.0646745 -0.1917308
                         0.2279110
                                    -0.1787515
                                                  0.0000000
                                                             -0.0000000
                                                                           0.0000000
```

#### After iteration 2:

	1	2	3	4	5	6	7
1	0.0000000	-0.0001491	-0.0000000	0.0005689	-0.0000000	-0.0004437	-0.0004437
2	0.0001491	0.0000000	-0.0000000	-0.0156002	-0.0000000	0.0133253	0.0133253
3	0.0000000	0.0000000	0.0000000	0.0000000	-0.0000000	0.0010536	-0.0010536
4	-0.0005689	0.0156002	-0.0000000	-0.0000000	-0.0000000	-0.0044211	-0.0044211
5	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000	0.0000000
6	0.0004437	-0.0133253	-0.0010536	0.0044211	-0.0000000	0.0000000	0.0000000
7	0 0004437	-0.0133253	0.0010536	0.0044211	_0 0000000	0.0000000	0.0000000

### DIIS B matrix and coefficients

#### After two iterations:

```
1 2 3

1 -0.0850416 0.1611509 -1.0000000 0.7287

2 0.1611509 -0.5000366 -1.0000000 0.2713

3 -1.0000000 -1.0000000 0.0000000 -0.0182
```

#### Just before convergence:

```
-0.0000000
             0.0000000
                          0.0000000
                                      0.0000000
                                                 -0.0000000
                                                               0.0000000
                                                                          -1.0000000
                                                                                         1.9028e+00
 0.0000000
            -0.0000000
                         -0.0000000
                                     -0.0000000
                                                  0.0000000
                                                              -0.0000000
                                                                          -1.0000000
                                                                                       -9.0514e-01
            -0.0000000
                                     -0.0000000
 0.0000000
                         -0.0000000
                                                  0.0000000
                                                               0.0000000
                                                                          -1.0000000
                                                                                         2.0913e-03
 0.0000000
            -0.0000000
                         -0.0000000
                                     -0.0000000
                                                  0.0000000
                                                              -0.0000000
                                                                          -1.0000000
                                                                                         2.2118e-04
-0.0000000
             0.0000000
                         0.0000000
                                      0.0000000
                                                 -0.0000001
                                                              -0.0000005
                                                                          -1.0000000
                                                                                         3.1371e-07
 0.0000000
           -0.0000000
                          0.0000000
                                     -0.0000000
                                                 -0.0000005
                                                              -0.0000142
                                                                          -1.0000000
                                                                                         8.1938e-09
-1 0000000
           -1.0000000
                         -1.0000000
                                     -1.0000000
                                                 -1.0000000
                                                              -1.0000000
                                                                           0.0000000
                                                                                        -1.2659e-27
```

### **GDIIS**

In the case of a nearly quadratic energy function,

$$\mathbf{e}_i = -\mathbf{H}^{-1}\mathbf{g}_i \tag{33}$$

$$\mathbf{x}_{m+1}' = \sum_{i} c_i \mathbf{x}_i \tag{34}$$

$$\mathbf{g}_{m+1}' = \sum_{i} c_i \mathbf{g}_i \tag{35}$$

$$\mathbf{x}_{m+1} = \mathbf{x}'_{m+1} - \mathbf{H}^{-1} \mathbf{g}'_{m+1} \tag{36}$$

#### References

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