# Recent and ongoing developments and applications of TDDFT for large molecular and materials systems

## **Real-Time (RT) TDDFT Approach**

Explicit propagation of the time-dependent Kohn-Sham (KS) equations in time.



The second order Magnus propagator:

$$\mathbf{P}'(t + \Delta t) = e^{-i\mathbf{F}'(t + \Delta t/2)\Delta t} \mathbf{P}'(t) e^{i\mathbf{F}'(t + \Delta t/2)\Delta t}$$

All electronic modes are induced simultaneously with a narrow Gaussian electric field kick

$$\mathbf{E}(t) = \kappa \exp\left[\frac{-(t-t_0)^2}{2w^2}\right]\hat{d}$$

The applied field excites the system through a dipole coupling term added to the Fock matrix

$$\mathbf{V}_{\mu\nu}^{\text{app}}(t) = -\mathbf{D}_{\mu\nu} \cdot \mathbf{E}(t)$$
$$\mathbf{D}_{\mu\nu}^{x} = \int \phi_{\mu}^{*}(\mathbf{r}) x \phi_{\nu}(\mathbf{r}) d\mathbf{r}$$

**Pros:** 

+ Efficient implementation of a wide range of functionals within RT-TDDFT scheme

+ Only requires first derivatives of the exchange-correlation functionals

- + Can be used as a diagnostic for potential-driven DFT
- + Wide range absorption spectrum and for spectra involving high density of states + Non-linear optical properties
- + Real-time dynamics
- + Resonant excitation simulations
- + Efficient for large systems

Cons:

- Time consuming for small systems

### **Computational Details**

### **NWChem 6.3/dev** and **Gaussian 09 (linear response results for meta functionals)** 8 density functionals were tested

3 local functionals: BLYP, M06L and M11L with dual-range DFT exchange;

3 global hybrid functionals: B3LYP, M06 and M06-2X with 20, 27 and 54% of Hartree-Fock (HF) exchange, respectively; 2 range-separated hybrid functional CAM-B3LYP and M11, comprising 19 and 42.8% HF exchange in the short-range and 65 and 100% in the long-range, respectively.

### **Ground state DFT calculations**: tight density convergence to avoid numerical error accumulation: RMS difference less than 10<sup>-9</sup>.

Geometry optimization at B3LYP/6-31G\* for dyes 1-10, P3B2 and f-coronene BHLYP-D3/def2-SVP (11) and B3LYP/def2-SVP (12)

### **Real-time TDDFT simulations**: B3LYP/6-31G\*

 $\Delta t = 0.2$  au = 0.0048 fs, t=1000 au = 24.2 fs or N=5000 time steps.  $\delta$ -kick with  $\kappa$ =2·10<sup>-5</sup> au = 10 mV/nm, peaks were broadened by artificially damping the time signal by  $e^{-t/\tau}$ , where  $\tau = 200$  au = 6 fs before taking the Fourier transform.

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### **Dye Benchmark**



2,3,5-trifluorobenzaldehyde (1), dibenzonaphthyridindione (2), coronene (3), coumarin 153 (4), 4'-hydroxybenzylidene-2,3-dimethylimidazoline (5), indigo (6), naphtacene (7), oligoporphyrin dimer (8), phtalocyanine (9), zinc phthalocyanine (10), 3',4'-dibutyl-2-phenyl-2,2':5',2"-terthiophene-5"-carboxylic acid (11), cis-[Ru(4,4'- $COOH-2,2'-bpy)_2(NCS)_2$  complex or N3 (12).

1         3.75         4.31         4.69         4.04         4.40         4.83         4.15         4.88           3.73         4.30         4.69         4.03         4.38         4.81         4.15         4.87           2         2.70         3.11         3.55         2.89         3.23         3.53         2.86         3.74           2.69         3.10         3.53         2.89         3.22         3.52         2.86         3.67           3         3.75         4.15         4.66         3.95         4.20         4.63         3.87         4.91           4         2.95         3.36         3.78         3.16         3.43         3.76         3.11         3.98           2.94         3.36         3.76         3.15         3.44         3.76         3.13         3.91           5         3.25         3.54         3.79         3.46         3.58         3.78         3.42         3.86           6         2.04         2.30         2.59         2.20         2.40         2.57         2.18         2.66           2.04         2.30         2.59         2.20         2.40         2.57         2.18 <td< th=""><th></th><th>BLYP*</th><th><b>B3LYP</b></th><th>CAM- B3LYP</th><th><b>M061</b></th><th><b>M06</b></th><th>M06- 2X</th><th>M11L</th><th>M11</th></td<>		BLYP*	<b>B3LYP</b>	CAM- B3LYP	<b>M061</b>	<b>M06</b>	M06- 2X	M11L	M11
3.73         4.30         4.69         4.03         4.38         4.81         4.15         4.87           2         2.70         3.11         3.55         2.89         3.23         3.53         2.86         3.74           2.69         3.10         3.53         2.89         3.22         3.52         2.86         3.67           3         3.75         4.15         4.66         3.95         4.20         4.63         3.87         4.91           4         2.95         3.36         3.78         3.16         3.43         3.76         3.11         3.98           2.94         3.36         3.76         3.15         3.44         3.76         3.13         3.91           5         3.25         3.54         3.79         3.47         3.57         3.78         3.42         3.86           6         2.04         2.30         2.59         2.20         2.40         2.57         2.18         2.66           2.04         2.30         2.59         2.20         2.40         2.57         2.18         2.64           7         2.21         2.49         2.84         2.32         2.50         2.86         2.23	1	3.75	4.31	4.69	4.04	4.40	4.83	4.15	4.88
2         2.70         3.11         3.55         2.89         3.23         3.53         2.86         3.74           2.69         3.10         3.53         2.89         3.22         3.52         2.86         3.67           3         3.75         4.15         4.66         3.95         4.20         4.63         3.87         4.91           3.74         4.15         4.65         3.94         4.19         4.63         3.87         4.91           4         2.95         3.36         3.78         3.16         3.43         3.76         3.11         3.98           2.94         3.36         3.76         3.15         3.44         3.76         3.13         3.91           5         3.25         3.54         3.79         3.47         3.57         3.78         3.42         3.86           6         2.04         2.32         2.61         2.21         2.41         2.58         2.18         2.66           2.04         2.30         2.59         2.20         2.40         2.57         2.18         2.64           7         2.21         2.49         2.85         2.32         2.49         2.86         2.23		3.73	4.30	4.69	4.03	4.38	4.81	4.15	4.87
2.69         3.10         3.53         2.89         3.22         3.52         2.86         3.67           3         3.75         4.15         4.66         3.95         4.20         4.63         3.87         4.91           3.74         4.15         4.65         3.94         4.19         4.63         3.87         4.91           4         2.95         3.36         3.78         3.16         3.43         3.76         3.11         3.98           2.94         3.36         3.76         3.15         3.44         3.76         3.13         3.91           5         3.25         3.54         3.79         3.47         3.57         3.78         3.42         3.86           6         2.04         2.32         2.61         2.21         2.41         2.58         2.18         2.64           7         2.21         2.49         2.84         2.32         2.60         2.57         2.18         2.64           7         2.21         2.49         2.85         2.32         2.40         3.00         2.93         3.01           8         2.07         2.41         3.06         2.16         2.44         3.00         2.9	2	2.70	3.11	3.55	2.89	3.23	3.53	2.86	3.74
3         3.75         4.15         4.66         3.95         4.20         4.63         3.87         4.91           3.74         4.15         4.65         3.94         4.19         4.63         3.87         4.91           4         2.95         3.36         3.78         3.16         3.43         3.76         3.11         3.98           2.94         3.36         3.76         3.15         3.44         3.76         3.13         3.91           5         3.25         3.54         3.79         3.47         3.57         3.78         3.42         3.86           6         2.04         2.32         2.61         2.21         2.41         2.58         2.18         2.66           2.04         2.30         2.59         2.20         2.40         2.57         2.18         2.64           7         2.21         2.49         2.84         2.32         2.50         2.86         2.23         3.06           8         2.07         2.41         3.06         2.16         2.49         2.86         2.23         3.06           9         1.99         2.41         3.06         2.16         2.46         3.02         2.1		2.69	3.10	3.53	2.89	3.22	3.52	2.86	3.67
3.74         4.15         4.65         3.94         4.19         4.63         3.87         4.91           4         2.95         3.36         3.78         3.16         3.43         3.76         3.11         3.98           2.94         3.36         3.76         3.15         3.44         3.76         3.13         3.91           5         3.25         3.54         3.79         3.47         3.57         3.78         3.42         3.86           6         2.04         2.32         2.61         2.21         2.41         2.58         2.18         2.66           2.04         2.30         2.59         2.20         2.40         2.57         2.18         2.64           7         2.21         2.49         2.84         2.32         2.50         2.86         2.23         3.06           8         2.07         2.41         3.06         2.16         2.49         2.86         2.23         3.06           9         1.99         2.08         2.07         2.05         2.02         2.11         1.99         1.98           1.96         2.06         1.99         2.06         2.02         2.11         1.99	3	3.75	4.15	4.66	3.95	4.20	4.63	3.87	4.91
4       2.95       3.36       3.78       3.16       3.43       3.76       3.11       3.98         2.94       3.36       3.76       3.15       3.44       3.76       3.13       3.91         5       3.25       3.54       3.79       3.47       3.57       3.78       3.42       3.87         3.25       3.54       3.79       3.46       3.58       3.78       3.42       3.86         6       2.04       2.32       2.61       2.21       2.41       2.58       2.18       2.66         2.04       2.30       2.59       2.20       2.40       2.57       2.18       2.64         7       2.21       2.49       2.84       2.32       2.50       2.86       2.23       3.06         8       2.07       2.41       3.06       2.16       2.46       3.02       2.13       3.28         9       1.99       2.08       2.07       2.05       2.04       2.00       2.07       1.98       1.91         1.96       2.06       1.99       2.05       2.04       2.00       2.07       1.98       1.91       1.99       2.00         10       1.99       2.06<		3.74	4.15	4.65	3.94	4.19	4.63	3.87	4.91
2.94       3.36       3.76       3.15       3.44       3.76       3.13       3.91         5       3.25       3.54       3.79       3.47       3.57       3.78       3.42       3.87         3.25       3.54       3.79       3.46       3.58       3.78       3.42       3.86         6       2.04       2.32       2.61       2.21       2.41       2.58       2.18       2.66         2.04       2.30       2.59       2.20       2.40       2.57       2.18       2.64         7       2.21       2.49       2.84       2.32       2.50       2.86       2.24       3.06         2.20       2.49       2.85       2.32       2.49       2.86       2.23       3.06         8       2.07       2.41       3.06       2.16       2.46       3.02       2.13       3.28         9       1.99       2.08       2.07       2.05       2.04       3.00       2.09       3.11       3.28         19       1.96       2.06       1.99       2.05       2.02       2.11       1.99       1.98         1.91       1.96       2.06       1.99       2.06       2.	4	2.95	3.36	3.78	3.16	3.43	3.76	3.11	3.98
5         3.25         3.54         3.79         3.47         3.57         3.78         3.42         3.87           3.25         3.54         3.79         3.46         3.58         3.78         3.42         3.86           6         2.04         2.32         2.61         2.21         2.41         2.58         2.18         2.66           2.04         2.30         2.59         2.20         2.40         2.57         2.18         2.64           7         2.21         2.49         2.84         2.32         2.50         2.86         2.24         3.06           2.00         2.49         2.85         2.32         2.49         2.86         2.23         3.06           8         2.07         2.41         3.06         2.16         2.46         3.02         2.13         3.28           9         1.99         2.08         2.07         2.05         2.00         2.09         3.11         3.28           9         1.99         2.08         2.07         2.05         2.02         2.11         1.99         1.98           1.96         2.06         1.99         2.06         2.02         2.11         1.99		2.94	3.36	3.76	3.15	3.44	3.76	3.13	3.91
3.25       3.54       3.79       3.46       3.58       3.78       3.42       3.86         6       2.04       2.32       2.61       2.21       2.41       2.58       2.18       2.66         7       2.21       2.49       2.59       2.20       2.40       2.57       2.18       2.64         7       2.21       2.49       2.84       2.32       2.50       2.86       2.24       3.06         2.20       2.49       2.85       2.32       2.49       2.86       2.23       3.06         8       2.07       2.41       3.06       2.16       2.46       3.02       2.13       3.28         9       1.99       2.40       3.04       2.17       2.44       3.00       2.09       3.11         3.28       2.05       2.40       3.04       2.17       2.44       3.00       2.09       3.11         9       1.99       2.06       1.99       2.04       2.00       2.07       1.98       1.91         1.99       2.09       2.05       2.06       2.02       2.11       1.99       1.99         10       1.99       2.09       2.04       2.06       2.02<	5	3.25	3.54	3.79	3.47	3.57	3.78	3.42	3.87
6       2.04       2.32       2.61       2.21       2.41       2.58       2.18       2.66         2.04       2.30       2.59       2.20       2.40       2.57       2.18       2.64         7       2.21       2.49       2.84       2.32       2.50       2.86       2.24       3.06         2.20       2.49       2.85       2.32       2.49       2.86       2.23       3.06         8       2.07       2.41       3.06       2.16       2.46       3.02       2.13       3.28         2.05       2.40       3.04       2.17       2.44       3.00       2.09       3.11         9       1.99       2.08       2.07       2.05       2.02       2.11       1.99       1.98         1.96       2.06       1.99       2.04       2.00       2.07       1.98       1.91       2.00         10       1.99       2.10       2.06       2.07       2.02       2.11       1.99       1.99       2.00         10       1.99       2.09       2.04       2.06       2.02       2.11       1.99       1.99         1.99       2.09       2.04       2.06       2		3.25	3.54	3.79	3.46	3.58	3.78	3.42	3.86
2.04       2.30       2.59       2.20       2.40       2.57       2.18       2.64         7       2.21       2.49       2.84       2.32       2.50       2.86       2.24       3.06         2.20       2.49       2.85       2.32       2.49       2.86       2.23       3.06         8       2.07       2.41       3.06       2.16       2.46       3.02       2.13       3.28         2.05       2.40       3.04       2.17       2.44       3.00       2.09       3.11         2.05       2.40       3.04       2.17       2.44       3.00       2.09       3.11         9       1.99       2.08       2.07       2.05       2.02       2.11       1.99       1.98         1.96       2.06       1.99       2.04       2.00       2.07       1.98       1.91         1.99       2.09       2.05       2.06       2.02       2.11       1.99       1.99         1.0       1.99       2.09       2.04       2.06       2.02       2.11       1.99       1.99         1.99       2.09       2.04       2.06       2.02       2.11       1.99       1.98     <	6	2.04	2.32	2.61	2.21	2.41	2.58	2.18	2.66
7       2.21       2.49       2.84       2.32       2.50       2.86       2.24       3.06         8       2.20       2.49       2.85       2.32       2.49       2.86       2.23       3.06         8       2.07       2.41       3.06       2.16       2.46       3.02       2.13       3.28         2.05       2.40       3.04       2.17       2.44       3.00       2.09       3.11         9       1.99       2.08       2.07       2.05       2.04       3.00       2.09       3.11         1.96       2.06       1.99       2.05       2.05       2.02       2.11       1.99       1.98         1.96       2.06       1.99       2.05       2.06       2.07       2.12       1.98       1.91         1.99       2.09       2.05       2.06       2.02       2.11       1.99       1.99         1.91       1.99       2.09       2.04       2.06       2.02       2.11       1.99       1.99         1.99       2.09       2.04       2.06       2.02       2.11       1.99       1.98         1.99       2.09       2.04       2.06       2.02       <		2.04	2.30	2.59	2.20	2.40	2.57	2.18	2.64
2.20       2.49       2.85       2.32       2.49       2.86       2.23       3.06         8       2.07       2.41       3.06       2.16       2.46       3.02       2.13       3.28         2.05       2.40       3.04       2.17       2.44       3.00       2.09       3.11         9       1.99       2.08       2.07       2.05       2.02       2.11       1.99       1.98         1.96       1.99       2.06       1.99       2.04       2.00       2.07       2.07       1.98       1.91         1.96       2.09       2.09       2.05       2.04       2.00       2.07       1.98       1.91         1.99       2.09       2.05       2.06       2.02       2.11       1.99       1.99         1.99       2.09       2.05       2.06       2.02       2.11       1.99       1.99         1.99       2.09       2.04       2.06       2.02       2.11       1.99       1.98         1.99       2.09       2.04       2.06       2.02       2.11       1.99       1.98         11       2.75       3.23       3.70       2.93       3.31       3.71	7	2.21	2.49	2.84	2.32	2.50	2.86	2.24	3.06
8         2.07         2.41         3.06         2.16         2.46         3.02         2.13         3.28           2.05         2.40         3.04         2.17         2.44         3.00         2.09         3.11           9         1.99         2.08         2.07         2.05         2.02         2.11         1.99         1.98           1.96         2.06         1.99         2.05         2.04         2.00         2.07         1.98         1.91           1.96         2.09         2.05         2.06         2.00         2.07         1.98         1.91           1.99         2.09         2.05         2.06         2.02         2.11         1.99         1.99           1.99         2.09         2.05         2.06         2.02         2.11         1.99         1.91           1.99         2.09         2.04         2.06         2.02         2.11         1.99         1.99           1.99         2.09         2.04         2.06         2.02         2.11         1.99         1.98           1.99         2.09         2.04         2.06         2.02         2.11         1.99         1.98           11		2.20	2.49	2.85	2.32	2.49	2.86	2.23	3.06
2.05       2.40       3.04       2.17       2.44       3.00       2.09       3.11         9       1.99       2.08       2.07       2.05       2.02       2.11       1.99       1.98         1.96       2.06       1.99       2.05       2.04       2.00       2.07       1.98       1.91         1.96       2.09       2.05       2.04       2.00       2.07       1.98       1.91         1.99       2.09       2.05       2.04       2.00       2.07       1.98       1.91         1.99       2.09       2.05       2.06       2.02       2.11       1.99       1.99         1.0       1.99       2.10       2.06       2.07       2.02       2.11       1.99       1.99         1.99       2.09       2.04       2.06       2.02       2.11       1.99       1.99         1.99       2.09       2.04       2.06       2.02       2.11       1.99       1.98         11       2.75       3.23       3.70       2.94       3.31       3.71       2.88       3.94	8	2.07	2.41	3.06	2.16	2.46	3.02	2.13	3.28
9         1.99         2.08         2.07         2.05         2.02         2.11         1.99         1.98           1.96         2.06         1.99         2.04         2.00         2.07         1.98         1.91           1.99         2.09         2.05         2.06         2.00         2.07         1.98         1.91           10         1.99         2.10         2.06         2.07         2.11         1.99         2.00           10         1.99         2.10         2.06         2.07         2.11         1.99         1.99           1.99         2.09         2.04         2.06         2.02         2.11         1.99         1.99           1.99         2.09         2.06         2.07         2.02         2.11         1.99         1.99           1.99         2.09         2.04         2.06         2.02         2.11         1.99         1.98           11         2.75         3.23         3.70         2.93         3.31         3.71         2.88         3.94		2.05	2.40	3.04	2.17	2.44	3.00	2.09 2.15	3.11 3.28
1.96 1.992.06 2.091.99 2.052.04 2.062.00 2.022.07 2.121.98 1.991.91 2.00101.99 1.992.10 2.092.06 2.042.07 2.062.02 	9	1.99	2.08	2.07	2.05	2.02	2.11	1.99	1.98
1.992.092.052.062.022.121.992.00101.992.102.062.072.022.111.991.991.992.092.042.062.022.111.991.98112.753.233.702.943.313.722.783.932.743.223.702.933.313.712.883.94		1.96	2.06	1.99	2.04	2.00	2.07	1.98	1.91
10         1.99         2.10         2.06         2.07         2.02         2.11         1.99         1.99           1.99         2.09         2.04         2.06         2.02         2.11         1.99         1.99           11         2.75         3.23         3.70         2.94         3.31         3.72         2.78         3.93           2.74         3.22         3.70         2.93         3.31         3.71         2.88         3.94		1.99	2.09	2.05	2.06	2.02	2.12	1.99	2.00
1.992.092.042.062.022.111.991.98112.753.233.702.943.313.722.783.932.743.223.702.933.313.712.883.94	10	1.99	2.10	2.06	2.07	2.02	2.11	1.99	1.99
11         2.75         3.23         3.70         2.94         3.31         3.72         2.78         3.93           2.74         3.22         3.70         2.93         3.31         3.71         2.88         3.94		1.99	2.09	2.04	2.06	2.02	2.11	1.99	1.98
2.74 3.22 3.70 2.93 3.31 3.71 2.88 3.94	11	2.75	3.23	3.70	2.94	3.31	3.72	2.78	3.93
		2.74	3.22	3.70	2.93	3.31	3.71	2.88	3.94
12     1.55     1.76     -     1.69     1.90     1.96     1.52     -	12	1.55	1.76	-	1.69	1.90	1.96	1.52	-
1.55 1.77 - 1.65 1.91 1.96 1.54 -		1.55	1.77	-	1.65	1.91	1.96	1.54	_

\*Numbers in bold and regular forms are RT and LR-TDDFT results, correspondingly.

-Excellent agreement between LR- and RT-TDDFT calculated vertical singlet excitation energies was achieved. The largest deviation does not exceed 0.07 eV, corresponding to  $\approx 2\%$ .

-Efficient calculation of the wide range absorption spectrum of a large dye molecule (more than 1000 basis functions) employing RT-TDDFT.

## Wide Excitation Spectra of Large Dye Molecules

Porphyrins – building blocks of molecular wires

Spectral resolution of the RT approach is limited by the time step  $\omega_{max} = \pi/\Delta t_{max}$ 





Absorption spectrum of P3B2, 130 atoms, 1364 basis functions (6-31G\*), B3LYP

**B3LYP** 

## (Fe<sub>1-x</sub>Cr<sub>x</sub>)<sub>2</sub>O<sub>3</sub> Solid Solutions

Finite QM embedded cluster approach
Host environment $ ightarrow$ non-polarizable point ch
Infinite Ewald consistent electrostatic potentia
~100 atoms, ~700 electrons, ~1200 basis func
Anti-ferromagnetic system
Very high DOS
Linear-response (frequency domain) TDDFT
Span ~5.5 eV: ~5000 roots
Windowing procedure is not clear cut
Real-time TDDFT
Delta-function electric field (x,y,z)
Three simulations per cluster
Simultaneously excites all the modes
Full absorption spectrum
Weak electric field
Time step 0.005 fs (total time ~12 fs)
$\begin{array}{c} 2.0  3.0  4.0  5.0 \\ \hline e_{2}O_{3} \\ O \ p \ (III) \rightarrow Fe \ e_{g}^{*} \\ O \ p \ (III) \rightarrow Fe \ e_{g}^{*} \\ O \ p \ (III) \rightarrow Fe \ e_{g}^{*} \\ O \ p \ (II) \rightarrow Fe \ e_{g}^{*} \\ O \ p \ (II) \rightarrow Fe \ e_{g}^{*} \\ Cr \ t_{2g} \rightarrow Fe \ t_{2g}^{*} \\ Cr \ t_{2g} \rightarrow Cr \ 3d^{*} \\ \end{array}$

▶ Optical band gap in FeCrO<sub>3</sub> (~ 2 eV): Cr  $t_{2q} \rightarrow$  Fe  $t_{2q}^*$ 

Chamberlin, et al , J. Phys.: Condens. Matter **25** 392002 (2013) Wang et al, J. Phys. Chem C, DOI: 10.1021/jp407496w (2013)













Absorption spectrum of f-coronene, 162 atoms, 1764 basis functions (6-31G\*),

P3B2

Convergence



the absorption Fragment of spectrum of P3B2 for different (600, 800, 1000 and 1500 a.u.) total simulation times.

narge ctions

### **Projected Conjugate Gradient Method** for Casida Eigenvalue Problem in Linear-Response (LR) TDDFT

$$H_{LR} = \begin{pmatrix} A & B \\ -B & -A \end{pmatrix}, A^{T} = A, B^{T} = B,$$
  
•  $A + B$  positive definite

- $A \pm B$  positive definite
- Structured eigenpairs: if  $\lambda$  is an eigenvalue with eigenvector  $(x^T y^T)^T$ , then  $-\lambda$  is also an eigenvalue with eigenvector  $(y^T x^T)^T$
- A special class of Hamiltonian eigenvalue problem
- Only need to compute (positive) half of the eigenvalues
- Matrix available through matrix-vector multiplication subroutines only

### **Equivalent Formulation**

 $\begin{pmatrix} 0 & K \\ M & 0 \end{pmatrix} \begin{pmatrix} x \\ y \end{pmatrix} = \lambda \begin{pmatrix} x \\ y \end{pmatrix},$ 

- K = A B, M = A + B;
- $KMy = \lambda^2 y$  and  $MKx = \lambda^2 x$ ;
- $\min_{x^T y=1} x^T K x + y^T M y$

### **Projected Conjugate Gradient**

- Current approximation  $X = (x_1, x_2, ..., x_k)$
- Projected gradient:  $R = (I XX^T)(AX X(X^TAX)) =$  $(r_1, r_2, ..., r_k)$
- $\hat{x}_i = \operatorname{argmin}_{x \in \{x_i, r_i, p_i\}} x^T A x$
- Project  $\hat{X} = (\hat{x}_1, \hat{x}_2, ..., \hat{x}_k)$  onto the orthonormality constraint



