

Supporting Information for:

Liquid electrolyte informatics by exhaustive search with linear regression

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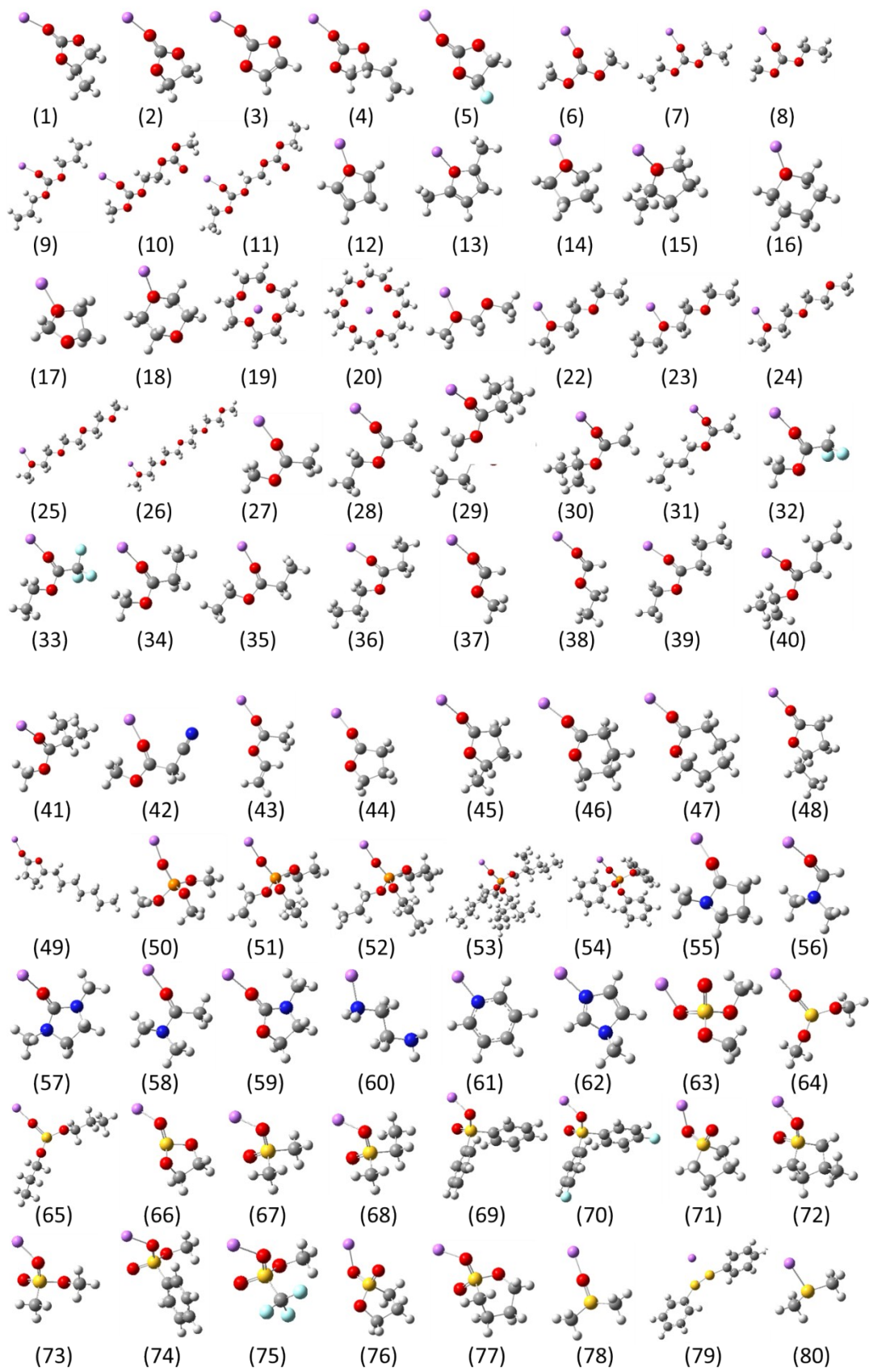
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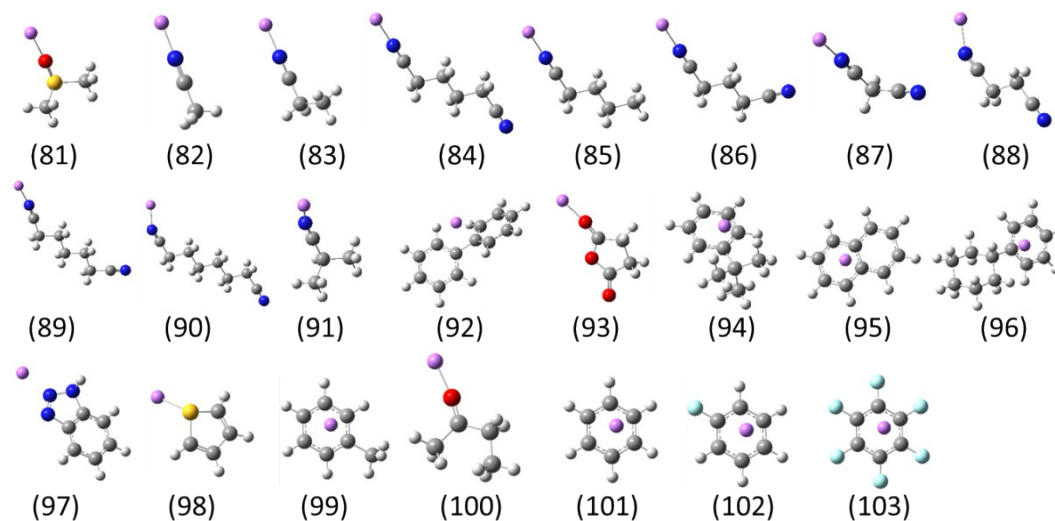
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Scheme S1. 103 solvent molecules for the data-base (Li, purple; O, red; N, blue; C, grey; F, light blue; S, yellow; P, orange; Cl, light blue; H, white).

(1.PC, 2.EC, 3.VC, 4.VEC, 5.FEC, 6.DMC, 7.DEC, 8.EMC, 9.DAC, 10.Dimethyl2,5-dioxahexanedioate, 11.Diethyl 2,5-dioxahexanedioate, 12.Furan, 13.2,5-Dimethyl furane, 14.THF, 15.2-MeTHF, 16.THP, 17.DOL, 18.DIOX, 19.12-Crown 4-ether, 20.18-Crown 6-ether, 21.DMM, 22.DME, 23.DEE, 24.Diglyme, 25.Triglyme, 26.Tetraglyme, 27.MA, 28.EA, 29.PA, 30.iPA, 31.BA, 32.MFA, 33.EFA, 34.MP, 35.EP, 36.PP, 37.MF, 38.EF, 39.EB, 40.iPB, 41.MiB, 42.MCA, 43.VA, 44.GBL, 45.GVL, 46. δ -Valero lactone, 47. ϵ -Capro lactone, 48. γ -Hexano lactone, 49. γ -Undeca lactone, 50.TMP, 51.TEP, 52.Tri n-propyl phosphate, 53.TOP, 54.TPhP, 55.NMP, 56.DMF, 57.DMI, 58.DMAC, 59.3-Methyl-2-oxazolidinone, 60.Ethylene diamine, 61.Pyridine, 62.N-Methyl imidazole, 63.Dimethyl sulfate, 64.Dimethyl sulfite, 65.Dipropyl sulfite, 66.ES, 67.Dimethyl sulfone, 68.ethylmethyl sulfone, 69.Diphenyl sulfone, 70.Bis(4-Fluoro phenyl sulfone), 71.SL, 72.3-MeSL, 73.Methanesulfonic acid methyl ester, 74.Benzen sulfonic acid methyl ester, 75.Trifluoromethane sulfonic acid methyl ester, 76.PS, 77.BS, 78.DMSO, 79.Diphenly disulfide, 80.Dimethyl sulfide, 81.Diethyl sulfide, 82.AN, 83.PN,84.Adiponitrile, 85.Valeronitrile, 86.Glutaronitrile, 87.Malononitrile, 88.Succinonitrile, 89.Pimelonitrile, 90.Suberonitrile, 91.Isobutyronitrile, 92.Biphenyl, 93.Succinic Anhydride, 94.t-Butyl benzene, 95.Naphthalene, 96.Cyclohexyl benzene, 97.Benzo triazole, 98.Thiophene, 99.Toluene, 100.MEK, 101.Benzene, 102.Fluoro benzene, 103.Hexafluoro benzene).

Table S1(a). Calculated values of 49 solvent molecules for database

abbreviation	solvent name	E_{coord} (kcal/mol)	HOMO (eV)	LUMO (eV)	Dipole moment (Debye)	Mulliken charge	R(Li-O) (Å)
PC	Propylene carbonate	-57.4	-7.930	0.946	5.26	-0.243	1.747
EC	Ethylene carbonate	-55.9	-8.017	0.919	5.07	-0.240	1.752
VC	Vinylene carbonate	-51.7	-6.973	-0.137	4.37	-0.231	1.760
VEC	Vinyl ethylene carbonate	-57.6	-7.829	-0.720	5.28	-0.240	1.746
FEC	Fluoroethylene carbonate	-51.2	-8.468	0.493	4.49	-0.222	1.763
DMC	Dimethyl carbonate	-50.0	-7.774	1.115	0.34	-0.306	1.747
DEC	Diethyl carbonate	-52.6	-7.654	1.217	0.61	-0.308	1.740
EMC	Ethyl methyl carbonate	-51.3	-7.713	1.168	0.51	-0.307	1.744
DAC	Diallyl carbonate	-51.9	-7.419	-0.238	0.49	-0.306	1.740
Dimethyl 2,5-dioxahexanedioate	Dimethyl 2,5-dioxahexanedioate	-49.8	-7.933	0.922	0.00	-0.300	1.749
Diethyl 2,5-dioxahexanedioate	Diethyl 2,5-dioxahexanedioate	-51.4	-7.856	0.990	0.00	-0.301	1.745
Furan	Furan	-31.7	-6.265	0.296	0.51	-0.170	1.866
2,5-Dimethyl furane	2,5-Dimethyl furane	-36.5	-5.621	0.514	0.03	-0.217	1.848
THF	Tetrahydrofuran	-48.7	-6.832	1.380	1.43	-0.323	1.808
2-MeTHF	2-Methyl tetrahydrofuran	-50.0	-6.535	1.454	1.54	-0.347	1.807
THP	Tetrahydropyran	-47.2	-6.711	1.537	1.30	-0.324	1.804
DOL	1,3-Dioxolane	-43.2	-6.955	1.493	1.32	-0.315	1.818
DIOX	1,4-Dioxane	-43.2	-6.483	1.773	0.00	-0.326	1.810
12-Crown 4-ether	12-Crown 4-ether	-101.1	-6.655	1.965	0.00	-0.331	1.889
18-Crown 6-ether	18-Crown 6-ether	-104.6	-6.491	1.674	0.00	-0.319	2.021
DMM	Dimethoxy methane	-64.4	-6.846	1.459	2.17	-0.298	1.905
DME	Dimethoxy ethane	-45.1	-6.863	1.669	0.10	-0.334	1.826
DEE	1,2-Diethoxy ethane	-47.1	-6.839	1.665	0.00	-0.340	1.818
Diglyme	Diglyme	-44.7	-6.898	1.616	1.13	-0.334	1.827
Triglyme	Triglyme	-44.6	-6.907	1.610	0.00	-0.334	1.827
Tetraglyme	Tetraglyme	-44.6	-6.915	1.575	1.13	-0.334	1.827
MA	Methyl acetate	-52.0	-7.371	0.339	1.73	-0.265	1.755
EA	Ethyl acetate	-53.4	-7.304	0.380	1.88	-0.267	1.751
PA	Propyl acetate	-53.8	-7.299	0.385	1.94	-0.266	1.750
iPA	Isopropyl acetate	-53.9	-7.280	0.380	1.79	-0.269	1.749
BA	Butyl acetate	-54.1	-7.290	0.391	1.93	-0.266	1.749
MFA	Methyl difluoroacetate	-55.4	-8.032	-0.734	1.52	-0.249	1.888
EFA	Ethyl trifluoroacetate	-51.6	-8.259	-0.830	3.09	-0.231	1.881
MP	Methyl propionate	-52.2	-7.376	0.372	1.61	-0.267	1.785
EP	Ethyl propionate	-53.5	-7.310	0.414	1.76	-0.269	1.787
PP	Propyl propionate	-53.9	-7.304	0.418	1.83	-0.269	1.787
MF	Methyl formate	-52.7	-7.688	0.089	3.90	-0.231	1.768
EF	Ethyl formate	-54.2	-7.603	0.105	4.00	-0.234	1.763
EB	Ethyl butyrate	-54.3	-7.303	0.414	1.68	-0.270	1.795
iPB	Isopropyl butyrate	-55.0	-7.279	0.414	1.61	-0.273	1.793
MiB	Methyl Isobutyrate	-53.1	-7.299	0.294	1.67	-0.267	1.794
MCA	Methyl cyanoacetate	-58.6	-8.134	-0.371	5.22	-0.231	1.909
VA	Vinyl acetate	-54.7	-6.941	-0.496	3.66	-0.217	1.761
GBL	g-Butyro lactone	-56.8	-7.269	0.254	4.30	-0.237	1.758
GVL	g-Valero lactone	-58.1	-7.208	0.304	4.33	-0.239	1.753
d-Valero lactone	d-Valero lactone	-60.2	-7.092	0.155	4.46	-0.240	1.751
e-Capro lactone	e-Capro lactone	-60.2	-7.074	0.288	4.45	-0.239	1.753
g-Hexano lactone	g-Hexano lactone	-58.6	-7.186	0.314	4.39	-0.240	1.752
g-Undeca lactone	g-Undeca lactone	-59.3	-7.159	0.335	4.56	-0.240	1.752

Table S1(b). Calculated values of 54 solvent molecules for database

abbreviation	solvent name	E_{cond} (kcal/mol)	HOMO (eV)	LUMO (eV)	Dipole moment (Debye)	Mulliken charge	R(Li-O) (Å)
TMP	Trimethyl phosphate	-65.1	-7.765	1.112	3.36	-0.467	1.740
TEP	Triethyl phosphate	-67.7	-7.650	1.130	3.43	-0.470	1.733
Tri n-propyl phosphate	Tri n-propyl phosphate	-68.5	-7.633	1.253	3.43	-0.470	1.733
TOP	Trioctyl phosphate	-69.2	-7.622	1.103	3.39	-0.473	1.730
TPhP	triphenyl phosphate	-68.8	-6.649	-0.566	3.16	-0.436	1.831
NMP	N-Methyl-2-pyrrolidone	-63.9	-6.421	0.842	3.61	-0.299	1.724
DMF	N,N-Dimethyl formamide	-61.2	-6.623	0.731	3.70	-0.297	1.736
DMI	1,3-Dimethyl 2- Imidazolidinone	-64.9	-6.216	1.337	3.60	-0.325	1.712
DMAC	N,N-Dimethyl acetamide	-63.3	-6.411	0.800	3.55	-0.301	1.723
3-Methyl-2-oxazolidinone	3-Methyl-2-oxazolidinone	-62.8	-6.805	1.066	4.76	-0.283	1.748
Ethylene diamine	Ethylene diamine	-48.7	-6.244	1.469	10.80	-0.183	1.969
Pyridine	Pyridine	-49.4	-6.985	-0.796	8.72	-0.223	1.941
N-Methyl imidazole	N-Methyl imidazole	-58.3	-6.135	0.640	7.99	-0.238	1.912
Dimethyl sulfate	Dimethyl sulfate	-50.2	-8.195	0.341	3.40	-0.392	2.029
Dimethyl sulfite	Dimethyl sulfite	-56.7	-7.416	-0.327	1.41	-0.456	1.901
Dipropyl sulfite	Dipropyl sulfite	-60.8	-7.292	-0.248	1.55	-0.456	1.901
ES	Ethylene sulfite	-53.0	-7.725	-0.823	3.12	-0.423	1.758
Dimethyl sulfone	Dimethyl sulfone	-61.0	-7.683	0.905	4.47	-0.460	2.023
ethylmethyl sulfone	ethylmethyl sulfone	-62.6	-7.567	0.889	4.38	-0.464	2.013
Diphenyl sulfone	Diphenyl sulfone	-66.2	-7.222	-1.538	5.08	-0.455	2.001
Bis(4-Fluoro phenyl sulfone)	Bis(4-Fluoro phenyl sulfone)	-62.6	-7.204	-1.610	3.49	-0.453	2.005
SL	Sulfolane	-63.7	-7.383	0.826	5.09	-0.459	2.014
3-MeSL	3-Methyl sulfolane	-64.3	-7.366	0.737	5.09	-0.461	2.012
Methanesulfonic acid methyl ester	Methanesulfonic acid methyl ester	-54.6	-8.252	0.696	4.13	-0.438	2.064
Benzen sulfonic acid methyl ester	Benzen sulfonic acid methyl ester	-58.5	-7.618	-1.442	5.01	-0.436	2.050
Trifluoromethane sulfonic acid methyl ester	Trifluoromethane sulfonic acid methyl ester	-43.4	-8.981	0.016	3.21	-0.408	1.812
PS	1,3-Propane sultone	-57.3	-7.917	0.549	5.47	-0.426	2.034
BS	1,4-Butane sultone	-58.6	-8.017	0.410	5.38	-0.431	2.033
DMSO	Dimethyl sulfoxide	-67.8	-6.010	0.963	3.82	-0.542	1.718
Diphenyl disulfide	Diphenyl disulfide	-42.2	-6.111	-1.108	1.60	0.004	2.413
Dimethyl sulfide	Dimethyl sulfide	-34.0	-5.895	1.107	1.49	-0.070	2.389
Diethyl sulfide	Diethyl sulfide	-37.2	-5.809	0.833	1.50	-0.056	2.369
AN	Acetonitrile	-47.0	-8.933	0.898	3.74	-0.181	1.920
PN	Propionitrile	-48.4	-8.802	0.587	3.83	-0.185	1.914
Adiponitrile	Adiponitrile	-45.3	-8.976	0.312	0.00	-0.176	1.916
Valeronitrile	Valeronitrile	-49.7	-8.704	0.728	4.06	-0.183	1.908
Glutaronitrile	Glutaronitrile	-44.2	-9.081	-0.136	3.72	-0.170	1.921
Malononitrile	Malononitrile	-38.5	-9.544	-0.510	3.62	-0.153	1.945
Succinonitrile	Succinonitrile	-41.1	-9.310	-0.097	0.00	-0.165	1.929
Pimelonitrile	Pimelonitrile	-46.7	-8.858	0.346	3.73	-0.177	1.914
Suberonitrile	Suberonitrile	-47.3	-8.789	0.497	0.00	-0.180	1.912
Isobutyronitrile	Isobutyronitrile	-49.5	-8.727	0.642	3.85	-0.189	1.973
Biphenyl	Biphenyl	-38.0	-6.236	-0.917	0.00	0.034	2.230
Succinic Anhydride	Succinic Anhydride	-48.1	-7.794	-0.866	4.23	-0.199	1.784
t-Butyl benzene	t-Butyl benzene	-44.0	-6.580	-0.142	0.36	0.100	2.360
Naphthalene	Naphthalene	-41.7	-5.977	-1.197	0.00	0.017	2.336
Cyclohexyl benzene	Cyclohexyl benzene	-44.6	-6.543	-0.132	0.43	0.064	2.352
Benzo triazole	Benzo triazole	-56.8	-6.694	-1.325	3.79	-0.058	2.022
Thiophene	Thiophene	-36.7	-6.474	-0.408	0.47	0.139	2.518
Toluene	Toluene	-41.9	-6.571	-0.125	0.38	0.041	2.324
MEK	Methyl ethyl ketone	-53.0	-6.601	-0.386	2.77	-0.225	1.759
Benzene	Benzene	-39.1	-6.893	-0.177	0.00	0.032	2.355
Fluoro benzene	Fluoro benzene	-34.0	-6.805	-0.499	1.35	0.012	2.409
Hexafluoro benzene	Hexafluoro benzene	-11.7	-7.483	-1.005	0.00	0.142	2.532

Table S2. Estimated and first-principles calculation values of coordination energies of solvents (kcal/mol)

	TRUE	MLR	LASSO	ES-LR		TRUE	MLR	LASSO	ES-LR	
PC	-57.4	-52.7	-52.1	-55.1		TMP	-65.1	-58.8	-64.7	-64.6
EC	-55.9	-57.1	-50.6	-55.8		TEP	-67.6	-57.8	-64.0	-64.6
VC	-51.8	-51.8	-51.1	-53.4		TOP	-69.2	-116.9	-65.2	-70.8
FEC	-51.1	-49.3	-49.6	-52.6		NMP	-63.9	-56.9	-55.5	-59.2
DMC	-50.0	-54.7	-55.7	-53.3		DMF	-61.2	-56.2	-55.5	-58.2
DEC	-52.6	-52.1	-55.2	-53.7		DMI	-64.9	-55.4	-57.9	-61.3
EMC	-51.3	-52.9	-55.7	-53.8		DMAC	-63.3	-58.2	-56.2	-59.7
Furan	-31.8	-40.3	-49.5	-48.1		Ethylene diamine	-48.7	-53.6	-49.6	-49.6
2,5-Dimethyl furane	-36.5	-52.3	-52.6	-54.0		Pyridine	-49.3	-45.7	-51.9	-50.5
THF	-48.8	-54.0	-57.0	-53.7		N-Methyl imidazole	-58.4	-63.4	-52.2	-56.0
2-MeTHF	-49.9	-52.5	-56.9	-54.7		Dimethyl sulfate	-50.2	-49.0	-59.7	-55.7
THP	-47.2	-51.0	-56.4	-53.0		SL	-63.8	-54.5	-62.0	-59.4
DOL	-43.2	-61.3	-57.5	-55.2		Methanesulfonic acid methyl ester	-54.7	-47.6	-50.8	-50.2
DIOX	-43.2	-54.0	-57.2	-54.0		Benzen sulfonic acid methyl ester	-58.5	-186.1	-64.3	-63.3
12-Crown 4-ether	-101.2	-68.6	-56.4	-57.9		PS	-57.4	-63.3	-62.8	-61.9
18-Crown 6-ether	-104.5	-58.5	-55.4	-54.8		BS	-58.5	-62.6	-61.9	-60.7
DMM	-64.4	-51.3	-53.4	-49.1		DMSO	-67.8	-63.9	-68.1	-67.6
DME	-45.1	-55.3	-57.5	-54.3		Diphenyl disulfide	-42.2	-38.2	-39.1	-44.6
DEE	-47.1	-57.5	-57.6	-56.5		Dimethyl sulfide	-33.9	-32.6	-38.3	-32.7
Diglyme	-44.7	-56.9	-58.0	-57.6		Diethyl sulfide	-37.2	-36.8	-42.9	-39.3
Triglyme	-44.6	-60.2	-57.7	-60.3		AN	-47.0	-48.9	-46.5	-42.5
Tetraglyme	-44.6	-61.4	-57.4	-62.2		PN	-48.4	-44.2	-45.0	-43.9
MA	-52.0	-48.9	-52.3	-50.3		Adiponitrile	-45.3	-38.8	-46.6	-48.4
EA	-53.4	-49.9	-52.3	-50.3		Valeronitrile	-49.7	-45.6	-45.7	-46.6
PA	-53.8	-50.1	-52.7	-51.6		Glutaronitrile	-44.2	-44.9	-47.1	-48.9
iPA	-53.9	-52.0	-53.3	-52.5		Malononitrile	-38.5	-52.6	-45.4	-47.5
MP	-52.2	-51.1	-52.5	-50.8		Succinonitrile	-41.0	-53.6	-46.4	-50.6
EP	-53.5	-51.7	-52.6	-51.2		Suberonitrile	-47.3	-72.4	-47.5	-52.8
PP	-53.9	-51.9	-52.8	-51.2		Isobutyronitrile	-49.5	-46.5	-47.1	-43.0
MF	-52.7	-46.6	-50.3	-46.8		Biphenyl	-38.0	-40.0	-37.4	-42.4
EF	-54.2	-49.5	-50.6	-48.0		Succinic Anhydride	-48.1	-55.7	-49.7	-55.6
EB	-54.3	-51.0	-53.2	-52.1		t-Butyl benzene	-44.0	-29.8	-30.8	-31.4
MiB	-53.2	-51.3	-52.6	-50.9		Naphthalene	-41.7	-36.6	-36.7	-39.3
MCA	-58.6	-52.8	-50.8	-52.3		Toluene	-41.9	-30.2	-35.7	-33.8
VA	-54.7	-55.9	-64.2	-61.1		MEK	-53.0	-50.0	-49.6	-50.2
GBL	-56.8	-52.3	-51.3	-54.7		Benzene	-39.2	-35.8	-35.8	-33.0
GVL	-58.1	-52.5	-51.0	-54.3		Fluoro benzene	-33.9	-39.4	-43.7	-36.7
d-Valero lactone	-60.2	-52.7	-51.8	-56.3		Hexafluoro benzene	-11.7	-38.6	-38.3	-27.9
e-Capro lactone	-60.2	-53.6	-51.1	-55.0						
g-Hexano lactone	-58.6	-52.7	-51.0	-54.3						

Figure S1. Bar graph of absolute value of coefficients about coordination energy prediction with MLR, LASSO, and ES-LiR.

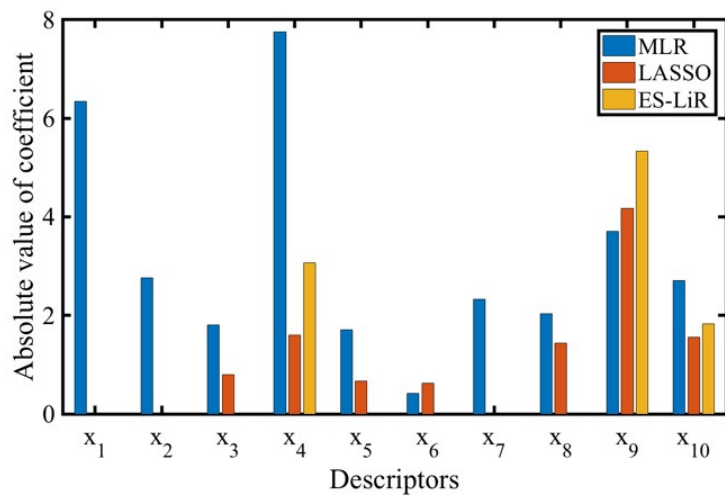


Figure S2. All indicator weight diagram for coordination energy prediction.

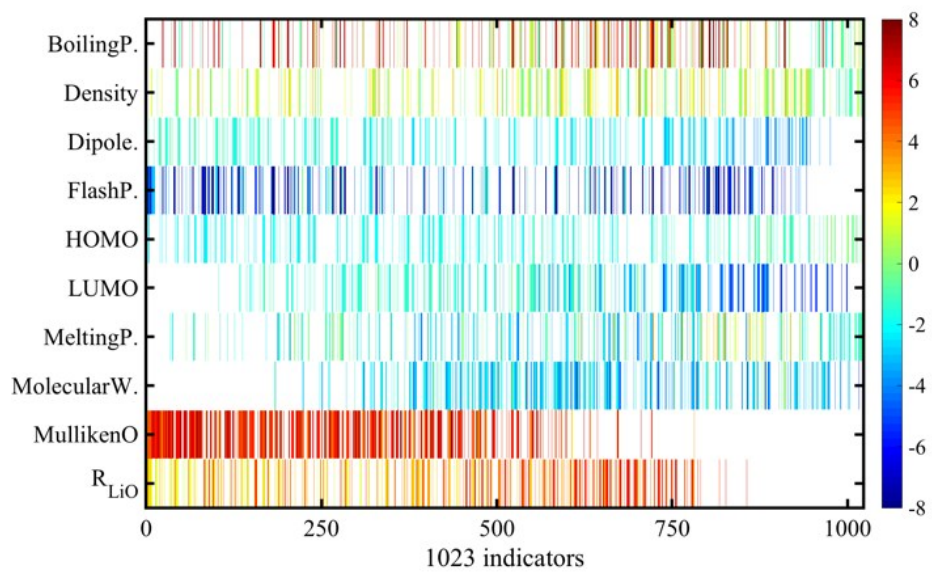


Figure S3. All indicator weight diagram for melting point prediction.

