

Supporting Information for Machine-Learning Assisted High-Throughput Discovery of Solid-State Electrolytes for Li-ion Batteries

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Li^+ conductivity of known lithium-ion conductors

Table S1: Li^+ conductivity of selected known lithium-ion conductors.

Material	Exp. (mS/cm)	Ref
$\text{Li}_4\text{P}_2\text{S}_6$	2.38×10^{-4}	¹
LiZnPS_4	$\sim 10^{-4}$	²
$\text{Li}_{10}\text{GeP}_2\text{S}_{12}$	12	³
$\text{Li}_{10}\text{SiP}_2\text{S}_{12}$	2.3	⁴
$\text{Li}_{10}\text{SnP}_2\text{S}_{12}$	4	⁵
$\text{Li}_7\text{P}_3\text{S}_{11}$	1.5	⁶
$\text{Li}_{10}\text{Si}_{1.5}\text{P}_{1.5}\text{S}_{11.5}\text{Cl}_{0.5}$	25	⁷
$\text{Li}_6\text{PS}_5\text{Cl}$	3.15	⁸
$\text{Li}_7\text{La}_3\text{Zr}_2\text{O}_{12}$ (LLZO)	$\sim 10^{-1}$	⁹
$\text{Li}_2\text{La}_2\text{Ti}_3\text{O}_{10}$ (LLTO)	$\sim 10^{-2}$	¹⁰
$\text{Li}_3\text{OCl}_{0.5}\text{Br}_{0.5}$	~ 1	¹¹
Li_3YCl_6	0.51	¹²
Li_3YBr_6	1.70	¹²
LiFePO_4	$10^{-8} \sim 10^{-7}$	^{13,14}
NCM111	$10^{-2} \sim 10^{-3}$	¹⁵
LiCoO_2	$10^{-2} \sim 1$	¹⁶⁻¹⁸

Benchmark of electronic band gaps

Table S2: Calculated band gaps of common solid-state electrolytes, obtained from density functional theory (DFT) calculations, using the Perdew–Burke–Ernzerhof (PBE) and Heyd–Scuseria–Ernzerhof (HSE) functionals, and machine-learning (ML) predictions using the HSE 4-fi-MEGNet model.

material	E_g (eV)		
	DFT-PBE	DFT-HSE	ML-HSE
c–Na ₃ PS ₄	2.29	3.38	3.17
LiZnPS ₄	2.73	3.86	3.69
LiAl(PS ₃) ₂	2.75	3.74	3.58
Li ₄ P ₂ S ₆	0	-	3.27
Li ₁₀ GeP ₂ S ₁₂	2.06	-	3.14
Li ₁₀ SiP ₂ S ₁₂	2.38	-	3.54
Li ₁₀ SnP ₂ S ₁₂	2.0	-	3.16
Li ₇ P ₃ S ₁₁	2.41	-	3.44
Li ₅ PS ₄ Cl ₂	2.78	3.57	3.57
Li ₁₀ Si _{1.5} P _{1.5} S _{11.5} Cl _{0.5}	2.31	-	3.56
Li ₃ PS ₄	2.81	-	3.44
Li ₇ La ₃ Zr ₂ O ₁₂ (LLZO)	4.33	4.12	5.43
Li ₂ La ₂ Ti ₃ O ₁₀ (LLTO)	2.84	3.34	3.33

Statistics of screening process

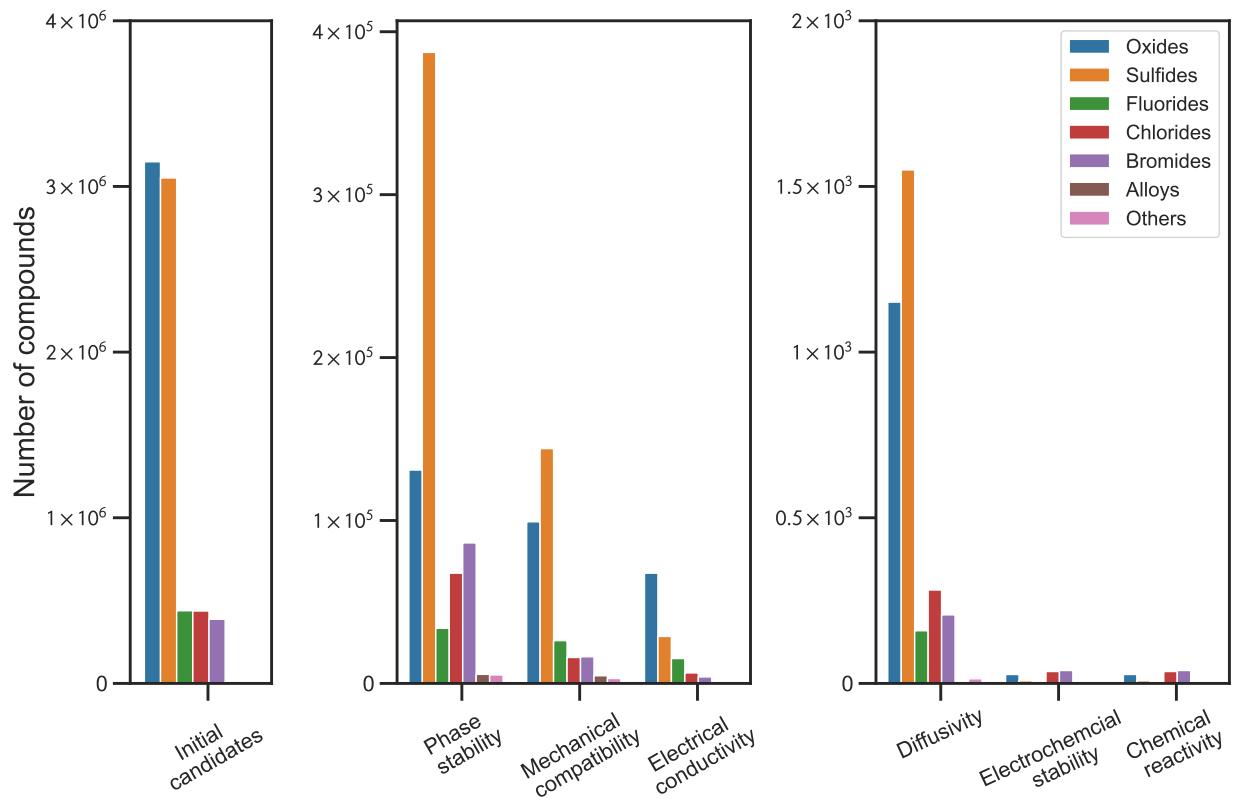


Figure S1: Histogram of numbers of compounds for each category that pass each filter in the high-throughput identification.

Table S3: Statistical analysis of lithium-based compounds from the Inorganic Crystal Structure Database(ICSD), Materials Project and Mattaverse database. This analysis quantifies the materials from the Materials Project and Mattaverse database that meet the phase stability screening criterion, defined as energy above the hull (E_{hull-m}) being less than 30 meV/atom. The analysis was limited to ordered structures only.

	ICSD	Materials Project	Mattaverse
Oxides	1,497	3,258	13,097
Sulfides	110	206	38,735
Fluorides	157	320	3,382
Chlorides	47	98	6,767
Bromides	29	47	8,624
Alloys	260	756	556
Others	789	594	448

Tree-based Classification Model on Li⁺ conductivities

Leveraging the dataset (10,769 data point) produced in our high-throughput calculations, we developed a machine learning tree-based classification model to elucidate the structure-chemistry-conductivity relationship. According to our benchmark results, solid electrolytes with an $\text{MSD}_{800K} > 5 \text{ \AA}^2$ demonstrate baseline Li⁺ conductivities. We thus classified the candidates into two groups : materials with MSD_{800K} below 5 \AA^2 are designated as having no Li⁺ conduction (Probability of Li⁺ conduction = 0), while materials with MSD_{800K} exceeding 5 \AA^2 are identified as displaying baseline Li⁺ conductivity (Probability of Li⁺ conduction = 1).

87 physically-informed features were created for each material to describe their properties of composition, crystal structure and crystal sites. For example, the channel size of Li⁺ is characterized by the maximum packing efficiency, the packing fraction and volume of the given material. Maximum packing efficiency is defined as the maximum spatial occupancy of an atom within its local environment in a crystal structure. This efficiency is quantified by $\sum_N \frac{4}{3} \cdot \pi \cdot r_{max}^3$, where V represents the volume of the structure, N is the number of sites in the structure, and r_{max} is the radius of the largest possible atom for each site. The value of r_{max} is determined by the distance from the center of the cell to the nearest Voronoi face.¹⁹ The packing fraction evaluates the ratio of the volume occupied by atoms to the total crystal lattice volume, calculated as $\sum_N \frac{4}{3} \cdot \pi \cdot r_{atomic}^3$, with r_{atomic} denoting the atomic radius of each atom in the structure. The connectivity of the channel size for Li⁺ within a structure is derived from its volume and packing fraction. A higher packing fraction indicates less void space within the structure, potentially decreasing the connectivity of Li⁺ conduction channels. In contrast, a larger volume suggests more void space, implying enhanced connectivity for Li⁺ conduction channels.

For features exhibiting a high degree of correlation with one another—specifically, those with a Pearson correlation coefficient greater than 0.75—the feature yielding better perfor-

mance was selected to construct the model, as shown in Figure S2. The developed classification model demonstrates an accuracy score of 0.975 and a Jaccard score of 0.962, indicating its high accuracy in distinguishing Li^+ baseline conductivities.

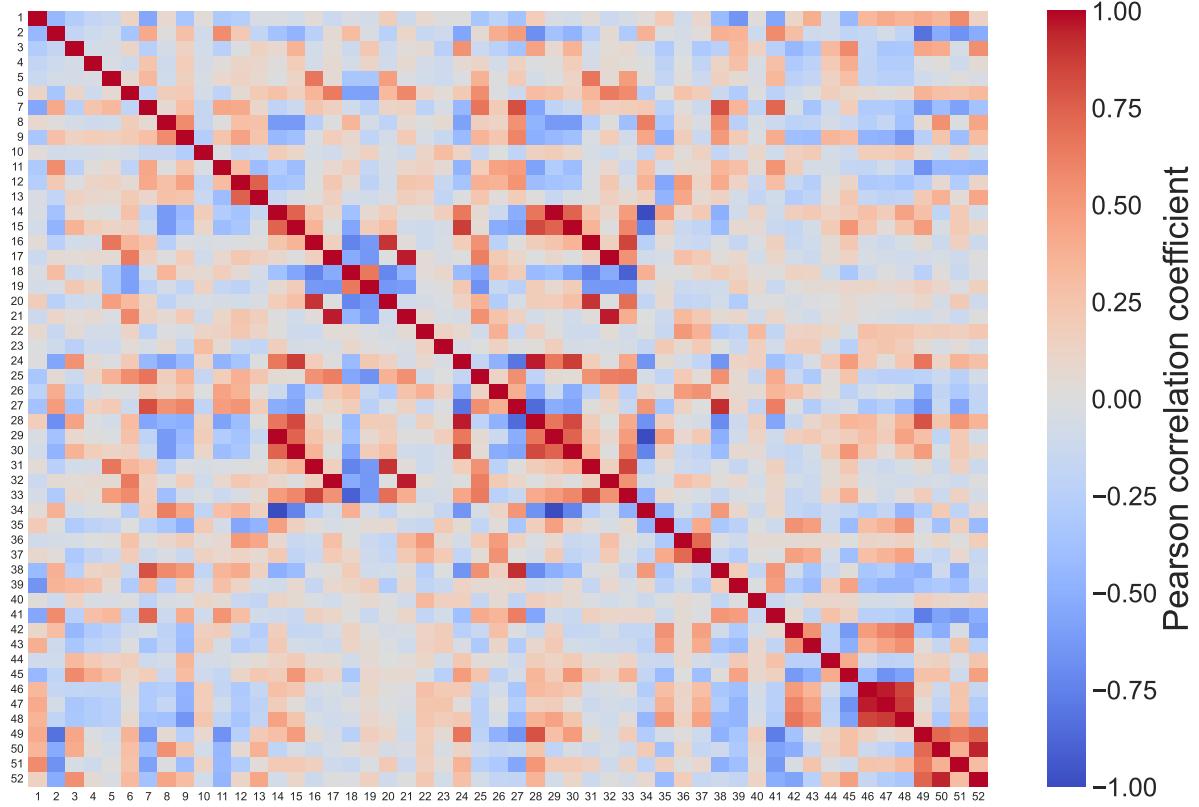


Figure S2: Calculated Pearson correlation coefficients of the pairs of features. The features are 1.Li-O bond fraction; 2.Li-S bond fraction; 3.Li-F bond fraction; 4.Li-Cl bond fraction; 5.Li-Br bond fraction; 6.Density; 7.Volume per atom; 8.Packing fraction; 9.Maximum packing efficiency; 10.Structural complexity per cell; 11.HOMO energy; 12.LUMO energy; 13.Atomic orbitals; 14.Average number of s valence electrons; 15.Average number of p valence electrons; 16.Average number of d valence electrons; 17.Average number of f valence electrons; 18.Fraction of s valence electrons; 19.Fraction of p valence electrons; 20.Fraction of d valence electrons; 21.Fraction of f valence electrons; 22.Transition metal fraction; 23.Stoichiometry 0-norm; 24.Band center; 25.MagpieData mean atomic weight; 26.Mean melting T; 27.Mean covalent radius; 28.Mean electronegativity; 29.Mean number of s valence electrons; 30.Mean number of p valence electrons; 31.Mean number of d valence electrons; 32.Mean number of f valence electrons; 33.Mean number of valence electrons; 34.Mean number of unfilled s orbitals; 35.Mean number of unfilled p orbitals;; 36.Mean number of unfilled d orbitals;; 37.Mean number of unfilled orbitals; 38.Ground state volume per atom; 39.Mean ground state bandgap; 40.Mean ground state magmom; 41.Average bond length Li-X; 42.Mean Li interstice area; 43.Mean Li interstice volume; 44.Coordination number; 45.Minimum oxidation state; 46.Maximum oxidation state; 47.Range of oxidation state; 48.Standard deviation of oxidation state; 49.Maximum ionic charge; 50.Average ionic charge; 51.Average anion electron affinity; 52.Mean electronegativity difference

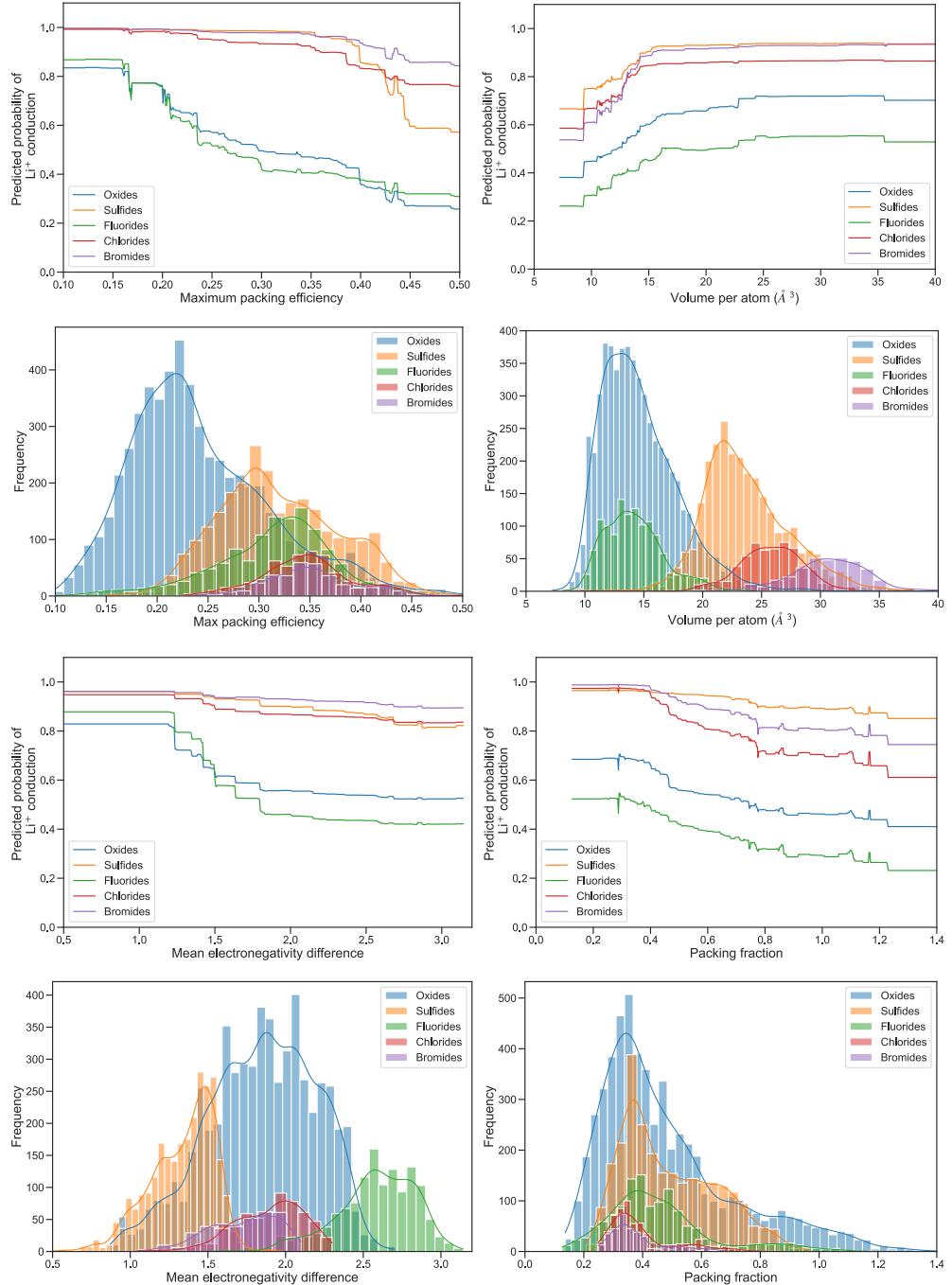


Figure S3: Partial dependence plots illustrating the influence of different features, (a) Maximum packing efficiency, (b) Packing fraction, (c) Volume per atom, and (d) Electronegativity difference, on the classification of Li^+ diffusions. The accompanying histogram displays the frequency distribution of the datasets according to the feature values.

According to Figure S3, it is found that sulfides have in general larger volume than oxides and fluorides, suggesting that sulfides are more likely to form connected Li^+ diffusion channels. Meanwhile, sulfides exhibit the smallest mean electronegativity difference with respect to Li, indicating minimized interactions of Li^+ with neighboring anions while hopping. Similarly, chlorides and bromides also tend to form crystals with large volumes, enabling fast Li^+ transportation. In contrast, oxides and fluorides tend to form crystals with relatively small volume, which may reduce the connection between individual Li^+ diffusion channels. The large mean electronegativity difference in fluorides may result in sluggish Li^+ diffusion. Therefore, the likelihood of finding fast Li^+ conductors is higher in sulfides, chlorides, and bromides than it is in oxides and fluorides.

Structure prototypes of the 130 identified promising candidate materials.

Table S4: Structure prototypes for the 130 promising candidate materials for solid electrolytes are represented in two ways: (i) the parent structure from which the candidate materials are derived through substitution; and (ii) the structure type of the parent structure as listed in the Inorganic Crystal Structure Database (ICSD).^{20,21} The symbol '—' denotes the absence of a structure type in the ICSD.

Promising candidates			Parent Structures		Structure type
Material	Space group	Material ID	Material	ICSD ID	
LiCl	P6_3mc(186)	mp-1185319	LiCl	-	-
LiBr		mv-25910967	LiBr		
Cs ₂ LiScCl ₆	Fm-3m(225)	mp-1113004	Cs ₂ LiScCl ₆	-	-
SrLi ₂ SiO ₄	Pnma(62)	mv-25910959	Li ₂ CdSiO ₄	1113	Li ₃ PO ₄
SrLi ₂ GeO ₄		mv-25910967			
SrLiLuCl ₆	P2_1/m(11)	mv-23258662	KHoBeF ₆	2143	-
LiLuCl ₄	P2_12_12_1(19)	mv-31579856	NaAlCl ₄	2307	NaAlCl ₄
SrLiScCl ₆	P321(150)	mv-23989007	LiMgAlF ₆	5007	Na ₂ SiF ₆
SrLiScBr ₆		mv-23989008			
SrLiLuBr ₆		mv-23989089			
BaLiLuCl ₆		mv-23989643			
SrLiLuCl ₆		mv-23989088			
Li ₂ BeF ₄	I-4(82)	mv-5203013	Ag ₂ HgI ₄	6069	CdAl ₂ S ₄ #CdGa ₂ S ₄
Rb ₂ LiYBr ₆	P-3m1(164)	mv-28307133	Cs ₂ LiGaF ₆	9004	-
NaLi ₂ LuBr ₆		mv-28300644			
K ₂ LiScBr ₆		mv-28304448			
LiH ₃ O ₂	C2/m(12)	mp-27281	LiH ₃ O ₂	9138	LiOH ₂ O
LiLu ₂ Cl ₇	C2/c(15)	mv-19344575	CsSb ₂ F ₇	14119	CsSb ₂ F ₇
LiAl ₂ F ₇		mv-19344508			
Li ₄ Ca ₂ Si ₃ O ₁₀	C2/c(15)	mv-13090933	Na ₄ Cd ₂ Si ₃ O ₁₀	20185	Na ₄ Cd ₂ Si ₃ O ₁₀
Rb ₃ LiCaBr ₆	R-3m(166)	mv-16033288	K ₃ NaFeCl ₆	23182	K ₄ CdCl ₆
LiB(HO) ₄	Pbca(61)	mp-23662	LiB(HO) ₄	23837	LiB(OH) ₄

Table S4: Continued

Promising candidates			Parent Structures		Structure type
Material	Space group	Material ID	Material	ICSD ID	
LiLuCl ₄	P2_1/c(14)	mv-31586317	NaSbF ₄	24750	LaTaO ₄
CsLiCl ₂	Cmcm(63)	mv-31595624	RbLiBr ₂	30719	RbLiBr2
KLiCl ₂		mv-31595564			
KLi ₇ (SiO ₄) ₂	C2/m(12)	mv-8803250	RbLi ₇ (SiO ₄) ₂	33864	-
Rb ₇ LiHf ₂ O ₈		mv-8805837			
NaLi ₇ (GeO ₄) ₂		mv-8803210			
KLi ₇ (GeO ₄) ₂		mv-8803254			
LiLuCl ₄	P2/c(13)	mv-31568835	LiAuF ₄	33953	-
K ₂ LiLuBr ₆	Pa-3(205)	mv-28933317	K ₂ NaAlF ₆	34201	Ba ₂ CrUO ₆
Li ₃ ScCl ₆	Pna2_1(33)	mv-22830798	Li ₃ AlF ₆	34672	-
Li ₃ LuCl ₆		mv-22830879			
K ₃ LiSiS ₄	P2_1/c(14)	mv-15996940	Rb ₃ NaPbO ₄	35416	Rb ₃ NaTiO ₄
SrLiScBr ₆	P6_322(182)	mv-24115725	LiSmAlF ₆	36538	LiSmAlF ₆
SrLiLuBr ₆		mv-24115806			
BaLiScCl ₆		mv-24116279			
BaLiLuCl ₆		mv-24116360			
LiLu ₂ Cl ₇	P2_1/c(14)	mv-20883250	KDy ₂ Cl ₇	37007	-
Li ₃ Lu ₂ Br ₉	P321(150)	mv-15922265	Cs ₃ As ₂ Cl ₉	45733	Cs ₃ Bi ₂ Cl ₉ (hP14)
K ₅ Li(SiS ₃) ₃	P2_1/m(11)	mv-15353762	Cs ₅ Si ₃ AgO ₉	51508	-
RbLi ₂ Cl ₃	P2_1/m(11)	mv-18416575	CsCu ₂ ICl ₂	60960	SbPO ₄ #SbAsO ₄
CsLi ₂ Cl ₃		mv-18417331			
Rb ₅ LiBe ₈ S ₁₁	P-1(2)	mv-15858566	RbNa ₅ Be ₈ O ₁₁	65482	-
Li ₃ LuCl ₆	P-31m(162)	mv-23180659	NbHg ₃ F ₆	62027	Hg ₃ NbF ₆
Li ₃ ScBr ₆		mv-23179688			
Li ₃ LuBr ₆		mv-23180660			
LiSc ₆ Tl ₂ Br ₂₁	C2(5)	mv-7289445	Rb ₂ NaAl ₆ F ₂₁	68555	-
Na ₂ Li(Sc ₂ Br ₇) ₃		mv-7289436			
NaLi ₂ (Sc ₂ Br ₇) ₃		mv-7289447			
Na ₂ LiLu ₆ Br ₂₁		mv-7301100			

Table S4: Continued

Promising candidates			Parent Structures		Structure type
Material	Space group	Material ID	Material	ICSD ID	
NaLi ₂ Lu ₆ Br ₂₁		mv-7301111			
KLi ₂ (Sc ₂ Br ₇) ₃		mv-7289471			
Sr ₂ LiLuCl ₈	P2_1/c(14)	mv-26367164	NaSr ₂ CrF ₈	69032	-
Sr ₂ LiLuBr ₈		mv-26367165			
Ba ₂ LiLuBr ₈		mv-26367720			
NaLi ₂ PO ₄	Pnma(62)	mp-558045	NaLi ₂ PO ₄	69967	Li ₃ PO ₄
K ₂ LiTaO ₄		mv-26169630			
NaLiHfF ₆	Pnma(62)	mv-23751362	KNaSiF ₆	71334	KNaSiF ₆
LiScBr ₄	P2_1/c(14)	mv-31583403	NaMnF ₄	71455	LiMnF ₄
SrLiScCl ₆	P2_12_12_1(19)	mv-24237717	NaSrFeF ₆	71577	Nd ₂ WO ₆ (oP36)
SrLiScBr ₆		mv-24237718			
BaLiLuCl ₆		mv-24238353			
BaLiLuBr ₆		mv-24238354			
Rb ₄ LiNbO ₅	P-1(2)	mv-955162	KLi ₄ NbO ₅	73124	-
Ba ₇ Li ₂ Lu ₆ Cl ₃₄	C2/m(12)	mv-16242402	Na ₂ Sr ₇ Al ₆ F ₃₄	78488	-
Sr ₇ Li ₂ Lu ₆ Cl ₃₄		mv-16242397			
SrLiLuCl ₆	Pnma(62)	mv-24203184	NaAlCdF ₆	80559	-
BaLiLuCl ₆		mv-24203199			
Na ₂ Li(ScBr ₄) ₃	C2/c(15)	mv-6302369	Cs ₂ KMn ₃ F ₁₂	83873	-
Na ₂ LiLu ₃ Br ₁₂		mv-6302396			
K ₂ Li(ScBr ₄) ₃		mv-6305033			
Cs ₄ Li ₂ Al ₄ S ₉	P-1(2)	mv-16124360	K ₂ Dy ₄ Cu ₄ S ₉	97562	K ₂ Dy ₄ Cu ₄ S ₉
LiInO ₂	P-1(2)	mv-27283190	AgCO ₂	109601	Ag ₂ C ₂ O ₄
Li ₂ HfCl ₆	C2/c(15)	mv-28216780	Li ₂ ZrF ₆	155020	-
SrLiScCl ₆	P4_2nm(102)	mv-24018901	LiMnVF ₆	167073	LiFe ₂ F ₆
SrLiLuCl ₆		mv-24018982			
SrLiScBr ₆		mv-24018902			
SrLiLuBr ₆		mv-24018983			
LiCaScBr ₆		mv-24017903			

Table S4: Continued

Promising candidates			Parent Structures		Structure type
Material	Space group	Material ID	Material	ICSD ID	
BaLiLuCl ₆		mv-24019537			
KLiSiO ₃	Iba2(45)	mv-27371981	TlAgTeO ₃	169995	-
SrLi(BO ₂) ₃	P-1(2)	mv-17202210	KZn(BO ₂) ₃	174357	KZnB ₃ O ₆
SrLi ₂ GeO ₄	P2_1/c(14)	mv-25943051	Li ₂ FeSiO ₄	186519	-
Li ₂ CaBr ₄	Ama2(40)	mv-20014595	Rb ₂ Cd(IBr) ₂	194236	Sr ₂ GeSe ₄
LiLu ₃ F ₁₀	P222_1(17)	mv-8011123	RbIn ₃ F ₁₀	200052	-
Li ₂ LuBr ₂ Cl ₃	P-1(2)	mv-5349815	Rb ₂ SbCl ₃ F ₂	200497	-
LiLuBr ₄	P2_1/c(14)	mv-31587649	NaSbF ₄	200573	LiTaO ₄
LiLuCl ₄	P2_1/c(14)	mv-31635209	TlSbF ₄	201084	-
Li ₂ HfF ₆	P2_1/c(14)	mv-22716062	K ₂ TeClF ₅	201603	Sn ₃ BrF ₅
Li ₂ HfClF ₅		mv-22716067			
KLi ₂ ScBr ₆	C2/c(15)	mv-28459714	CsK ₂ BiCl ₆	201983	Rb ₃ YCl ₆
K ₂ LiLuBr ₆		mv-28471345			
Rb ₅ LiZr ₂ S ₇	C2/c(15)	mv-12207323	Na ₅ AgGe ₂ S ₇	237455	Na ₆ Ge ₂ Se ₇
LiScBr ₄	C2/c(15)	mv-31284828	AlTlF ₄	202455	NH ₄ AlF ₄
LiLuCl ₄		mv-31285788			
Sr ₃ Li ₂ Lu ₂ Cl ₁₄	I2_13(199)	mv-3242974	Na ₂ Ca ₃ Al ₂ F ₁₄	202657	-
Ba ₃ Li ₂ Lu ₂ Cl ₁₄		mv-3243154			
K ₃ Li ₂ F ₅	Fmm2(42)	mv-9126917	Cs ₃ Li ₂ F ₅	245964	-
Rb ₂ Li ₃ Br ₅	Amm2(38)	mv-8407962	Cs ₂ Li ₃ F ₅	245966	-
Rb ₂ Li ₃ Cl ₅		mv-8407950			
Rb ₂ Li ₃ Br ₅	Imm2(44)	mv-7977990	Cs ₂ Li ₃ Cl ₅	245973	-
RbLi ₃ Br ₄	Cmcm(63)	mv-22499633	CsLi ₃ Cl ₄	245975	-
SrLiVO ₄	Pnma(62)	mv-30437085	LiCoPO ₄	258957	Olivine#Mg ₂ SiO ₄
Na ₂ Li(ScBr ₄) ₃	P2_1/m(11)	mv-6704684	Cs ₂ KTi ₃ F ₁₂	259399	Cs ₂ NaTi ₃ F ₁₂
NaLi ₂ Lu ₃ Br ₁₂		mv-6703544			
Na ₂ LiLu ₃ Br ₁₂		mv-6704765			
K ₂ Li(ScBr ₄) ₃		mv-6707348			

Table S4: Continued

Promising candidates			Parent Structures		Structure type
Material	Space group	Material ID	Material	ICSD ID	
Cs ₂ LiPO ₄	Fddd(70)	mv-24746431	Cs ₂ LiVS ₄	414186	K ₂ CuNbSe ₄
LiLu ₂ Cl ₇	P-1(2)	mv-21560230	TlBi ₂ Cl ₇	421318	-
RbLiCl ₂	C2/c(15)	mv-31397981	CsLiCl ₂	423634	-
RbLiLuCl ₅	P2_1/c(14)	mv-22089781	KLiTmF ₅	428536	LiKYF ₅
Li ₃ Ca(BO ₂) ₅	P-1(2)	mv-1332650	Na ₃ Sr(BO ₂) ₅	260005	Na ₃ SrB ₅ O ₁₀
SrLiLuCl ₆	P2_1/c(14)	mv-8065139	BaLiAlF ₆	260011	LiBaCrF ₆
SrLiScBr ₆		mv-8065059			
SrLiLuBr ₆		mv-8065140			
Rb ₃ Li ₄ Y ₂ Cl ₁₃	Pn-3(201)	mv-15830245	Rb ₃ Tm ₂ Cu ₄ Br ₁₃	402503	-
Rb ₃ Li ₄ Lu ₂ Cl ₁₃		mv-15830965			
Li ₇ Lu ₂ Cl ₁₃		mv-15824305			
K ₃ Li ₄ Lu ₂ Cl ₁₃		mv-15828301			
Cs ₃ Li ₄ Lu ₂ Cl ₁₃		mv-15834961			
Na ₃ Li ₄ Sc ₂ Br ₁₃		mv-15824666			
Na ₃ Li ₄ Lu ₂ Br ₁₃		mv-15825638			
Li ₇ Lu ₂ Br ₁₃		mv-15824306			
K ₃ Li ₄ Lu ₂ Br ₁₃		mv-15828302			
Cs ₃ Li ₄ Al ₂ Cl ₁₃		mv-15833881			
Na ₃ Li ₄ Sc ₂ Cl ₁₃		mv-15824665			
Na ₃ Li ₄ Y ₂ Cl ₁₃		mv-15824917			
Na ₃ Li ₄ Lu ₂ Cl ₁₃		mv-15825637			
K ₃ Li ₄ Y ₂ Cl ₁₃		mv-15827581			

Calculated properties of identified promising solid-state electrolytes ($\sigma_{300K} < 10$ mS/cm)

Table S5: Calculated properties of identified promising solid-state electrolytes with Li⁺ conductivities lower than 10 mS/cm at 300 K. These properties include the composition of candidate material, phase stability (E_{hull-m}), shear modulus (G), Pugh's ratio (G/K), HSE band gap (E_g), electrochemical stability window, Li⁺ conductivity at 300 K and material's ID in the Matterverse database. The data is sorted by the predicted E_{hull-m} value. For materials do not exhibit diffusive behaviors in long-time MD simulations at 300 K, their σ_{300K} s were marked as "-".)

Material	E_{hull-m} (meV/atom)	G (GPa)	G/K	E_g (eV)	Electrochemical window (V)	σ_{300K} (mS/cm)	Material ID
K ₃ LiSiS ₄	-187	12.63	0.45	2.96	1.10~3.56	0.01	mv-15996940
Cs ₄ Li ₂ Al ₄ S ₉	-166	9.54	0.38	3.05	0.79~3.64	0.47	mv-16124360
Rb ₄ LiNbO ₅	-115	16.44	0.51	2.82	1.09~3.67	0.15	mv-955162
Rb ₅ LiZr ₂ S ₇	-110	8.83	0.40	2.53	0.75~3.25	2.55	mv-12207323
Rb ₅ LiBe ₈ S ₁₁	-95	11.47	0.44	3.22	0.81~4.11	0.02	mv-15858566
K ₂ LiTaO ₄	-87	11.82	0.41	3.66	0.81~3.25	-	mv-26169630
Rb ₇ LiHf ₂ O ₈	-70	10.75	0.49	2.53	1.37~3.82	0.33	mv-8805837
K ₃ Li ₄ Lu ₂ Br ₁₃	-28	8.86	0.51	3.69	0.62~3.38	6.23	mv-15828302
K ₂ LiLuBr ₆	-16	9.43	0.54	3.54	0.67~3.39	0.01	mv-28933317
K ₂ Li(ScBr ₄) ₃	-14	8.47	0.41	2.96	0.89~3.48	0.04	mv-6305033
LiSc ₆ Tl ₂ Br ₂₁	-13	8.46	0.38	2.95	1.19~3.32	-	mv-7289445
K ₂ LiLuBr ₆	-12	8.70	0.48	2.41	0.68~3.26	6.06	mv-28471345
SrLiLuCl ₆	-11	11.23	0.41	4.76	0.70~4.36	-	mv-23989088
LiLu ₂ Cl ₇	-11	8.93	0.54	4.65	0.72~4.37	1.2	mv-19344575
Li ₂ HfF ₆	-9	9.69	0.32	6.42	1.16~6.40	0.61	mv-22716062
K ₃ Li ₄ Lu ₂ Cl ₁₃	-8	10.22	0.47	4.88	0.62~4.33	0.19	mv-15828301
K ₂ LiScBr ₆	-7	9.05	0.57	3.06	0.90~3.29	-	mv-28304448
BaLiLuCl ₆	-6	9.33	0.57	4.80	0.72~4.31	-	mv-24116360
SrLi ₂ GeO ₄	-6	37.72	0.60	3.54	1.09~3.41	0.37	mv-25910967
BaLiLuCl ₆	-6	9.82	0.41	4.83	0.72~4.31	2.71	mv-24238353
SrLiLuCl ₆	-6	10.81	0.40	4.75	0.72~4.31	-	mv-24018982

Table S5: Continued

Material	E_{hull-m} (meV/atom)	G (GPa)	G/K	E_g (eV)	Electrochemical window (V)	σ_{300K} (mS/cm)	Material ID
SrLiLuBr ₆	-5	9.47	0.45	4.02	0.71~3.28	-	mv-23989089
Rb ₃ Li ₄ Lu ₂ Cl ₁₃	-4	10.17	0.45	5.07	0.67~4.3	2.99	mv-15830965
SrLiLuBr ₆	-4	10.04	0.48	4.00	0.71~3.27	-	mv-24018983
LiLuCl ₄	-4	8.72	0.38	4.58	0.73~4.29	-	mv-31285788
SrLiLuBr ₆	-4	9.86	0.45	3.98	0.71~3.26	2.89	mv-24115806
LiLuCl ₄	-3	8.83	0.37	4.56	0.73~4.28	-	mv-31568835
LiLuCl ₄	-3	11.00	0.45	4.86	0.73~4.28	-	mv-31586317
Li ₃ LuCl ₆	-3	13.08	0.48	4.84	0.73~4.27	3.41	mv-22830879
BaLiLuBr ₆	-2	8.67	0.41	3.90	0.72~3.24	-	mv-24238354
Cs ₃ Li ₄ Lu ₂ Cl ₁₃	-1	9.47	0.46	5.07	0.64~4.27	5.66	mv-15834961
Ba ₂ LiLuBr ₈	0	9.02	0.39	3.96	0.72~3.23	1.82	mv-26367720
KLi ₂ (Sc ₂ Br ₇) ₃	0	8.50	0.41	3.01	0.92~3.23	0.27	mv-7289471
SrLi ₂ GeO ₄	1	36.95	0.58	3.60	1.14~3.36	-	mv-25943051
BaLiLuCl ₆	1	9.05	0.44	4.80	0.74~4.26	-	mv-23989643
Na ₃ Li ₄ Lu ₂ Br ₁₃	2	11.27	0.60	3.78	0.72~3.23	4.37	mv-15825638
LiScBr ₄	2	8.51	0.42	3.06	0.92~3.23	-	mv-31284828
LiCaScBr ₆	3	10.64	0.46	3.18	0.92~3.23	-	mv-24017903
LiLu ₂ Cl ₇	5	11.19	0.44	4.03	0.74~4.26	-	mv-20883250
Li ₂ LuBr ₂ Cl ₃	5	9.78	0.43	4.23	0.74~3.24	-	mv-5349815
Li ₃ LuBr ₆	5	11.47	0.52	3.86	0.72~3.23	-	mv-23180660
SrLiScBr ₆	6	9.00	0.38	3.20	0.92~3.23	-	mv-23989008
LiH ₃ O ₂	7	16.36	0.57	4.46	1.39~3.46	-	mp-27281
SrLiScBr ₆	8	8.84	0.35	3.16	0.92~3.23	0.2	mv-24115725
Cs ₂ LiScCl ₆	8	10.97	0.54	3.71	0.66~4.3	-	mp-1113004
NaLi ₂ PO ₄	9	32.54	0.52	4.98	0.71~4.01	0.02	mp-558045
SrLiScBr ₆	9	10.23	0.44	3.21	0.92~3.23	0.14	mv-24018902
LiBr	9	8.50	0.47	4.33	0.01~3.23	0.02	mp-976280
Rb ₂ LiYBr ₆	9	8.42	0.56	3.76	0.55~3.34	0.65	mv-28307133
BaLiLuCl ₆	9	9.06	0.40	4.79	0.74~4.26	0.15	mv-24019537

Table S5: Continued

Material	E_{hull-m} (meV/atom)	G (GPa)	G/K	E_g (eV)	Electrochemical window (V)	σ_{300K} (mS/cm)	Material ID
Na ₂ LiLu ₆ Br ₂₁	9	9.68	0.58	3.68	0.72~3.23	-	mv-7301100
Rb ₃ Li ₄ Y ₂ Cl ₁₃	10	9.67	0.43	4.69	0.59~4.26	1.12	mv-15830245
SrLiScBr ₆	11	10.65	0.43	3.13	0.92~3.23	-	mv-24237718
Na ₂ Li(Sc ₂ Br ₇) ₃	11	10.00	0.51	3.11	0.92~3.23	-	mv-7289436
Li ₃ LuCl ₆	12	13.68	0.48	4.97	0.74~4.26	-	mv-23180659
SrLiLuCl ₆	12	8.92	0.36	4.71	0.74~4.26	-	mv-23258662
SrLiLuCl ₆	14	10.72	0.48	4.66	0.74~4.26	-	mv-8065139
KLi ₇ (GeO ₄) ₂	14	39.28	0.68	3.93	1.02~3.35	6.5	mv-8803254
Sr ₂ LiLuCl ₈	14	12.55	0.47	4.75	0.74~4.26	-	mv-26367164
LiB(HO) ₄	14	18.12	0.53	5.47	1.44~3.58	-	mp-23662
NaLi ₂ (Sc ₂ Br ₇) ₃	14	9.54	0.49	3.04	0.92~3.23	-	mv-7289447
CsLi ₂ Cl ₃	16	9.40	0.59	5.22	0.01~4.26	-	mv-18417331
K ₃ Li ₂ F ₅	16	22.91	0.56	5.56	0.47~5.83	5.1	mv-9126917
SrLiScCl ₆	17	11.54	0.47	3.65	0.92~4.26	-	mv-23989007
Sr ₂ LiLuBr ₈	18	11.22	0.49	3.85	0.72~3.23	-	mv-26367165
LiCl	18	11.91	0.45	5.80	0.01~4.26	-	mp-1185319
SrLiLuBr ₆	18	9.98	0.49	3.80	0.72~3.23	-	mv-8065140
Na ₂ LiLu ₃ Br ₁₂	19	9.85	0.58	3.80	0.72~3.23	-	mv-6704765
LiLuCl ₄	19	9.33	0.53	4.49	0.74~4.26	-	mv-31579856
NaLi ₂ Lu ₃ Br ₁₂	19	9.44	0.55	3.83	0.72~3.23	-	mv-6703544
SrLiScCl ₆	19	11.62	0.49	3.69	0.92~4.26	3.76	mv-24237717
Li ₃ ScBr ₆	19	12.01	0.54	3.15	0.92~3.23	-	mv-23179688
Na ₂ LiLu ₃ Br ₁₂	20	9.54	0.57	3.77	0.72~3.23	-	mv-6302396
Li ₃ ScCl ₆	20	13.36	0.58	3.82	0.92~4.26	-	mv-22830798
Cs ₃ Li ₄ Al ₂ Cl ₁₃	20	11.98	0.52	4.19	1.36~4.26	4.05	mv-15833881
SrLi ₂ SiO ₄	21	43.93	0.64	4.36	0.26~3.48	-	mv-25910959
NaLi ₇ (GeO ₄) ₂	21	38.09	0.64	3.85	1.02~3.34	9.45	mv-8803210
SrLiVO ₄	22	28.34	0.47	3.61	1.42~3.73	0.01	mv-30437085
Na ₃ Li ₄ Lu ₂ Cl ₁₃	22	11.69	0.45	4.80	0.62~3.81	3.71	mv-15825637

Table S5: Continued

Material	E_{hull-m} (meV/atom)	G (GPa)	G/K	E_g (eV)	Electrochemical window (V)	σ_{300K} (mS/cm)	Material ID
LiInO ₂	22	54.27	0.57	1.80	1.40~3.24	-	mv-27283190
Na ₂ Li(ScBr ₄) ₃	23	10.21	0.56	3.14	0.92~3.23	-	mv-6302369
Li ₂ HfCl ₆	23	10.86	0.60	4.48	1.37~4.26	4.53	mv-28216780
RbLiLuCl ₅	23	13.15	0.47	4.46	0.74~4.26	-	mv-22089781
NaLiHfF ₆	23	12.77	0.45	6.77	1.18~6.37	-	mv-23751362
Na ₃ Li ₄ Sc ₂ Cl ₁₃	24	11.58	0.49	3.92	0.90~3.81	0.29	mv-15824665
LiLu ₂ Cl ₇	24	10.64	0.40	3.99	0.74~4.26	-	mv-21560230
Na ₃ Li ₄ Y ₂ Cl ₁₃	24	11.09	0.43	4.62	0.66~3.81	5.59	mv-15824917
KLi ₇ (SiO ₄) ₂	25	41.62	0.67	4.60	0.54~3.38	2.18	mv-8803250
SrLiScCl ₆	25	11.07	0.46	3.66	0.92~4.26	0.15	mv-24018901
SrLi(BO ₂) ₃	26	23.04	0.44	4.36	1.25~3.68	0.2	mv-17202210
BaLiLuCl ₆	26	9.57	0.41	4.81	0.74~4.26	-	mv-24203199
BaLiScCl ₆	26	9.99	0.67	3.70	0.92~4.26	0.72	mv-24116279
Na ₃ Li ₄ Sc ₂ Br ₁₃	26	11.12	0.59	3.23	0.92~3.23	1.06	mv-15824666
LiLu ₃ F ₁₀	26	23.30	0.34	6.03	0.73~6.69	-	mv-8011123
LiLuCl ₄	26	9.59	0.47	4.68	0.74~4.26	-	mv-31635209
LiAl ₂ F ₇	27	25.42	0.43	7.67	1.29~6.48	-	mv-19344508
Li ₄ Ca ₂ Si ₃ O ₁₀	27	36.94	0.55	4.77	0.88~3.59	1.04	mv-13090933
KLiSiO ₃	27	34.05	0.68	4.42	0.83~3.59	-	mv-27371981
SrLiLuCl ₆	27	10.53	0.44	4.67	0.74~4.26	-	mv-24203184
RbLi ₂ Cl ₃	29	10.95	0.64	5.07	0.01~4.26	-	mv-18416575
Li ₃ Ca(BO ₂) ₅	29	30.33	0.5	5.20	1.26~3.68	-	mv-1332650
Li ₂ BeF ₄	30	16.63	0.41	8.08	0.89~6.49	-	mv-5203013

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