## Supplemental Information

The Github repository containing the code used to create the models in this paper can be found here: GitHub repository Addition ('add'), multiplications ('mult'), subtraction ('subs') and quotient ('divi') of hfus, polzbl, first\_ion\_en, mol\_vol, bp, mp, therm\_cond and voro\_coord, atom\_rad, elec\_aff, X, and atom\_mass were performed to give additional chemical descriptors.

Predictions for the MXenes in the "Pivotal Role of Surface Terminations in MXene Thermodynamic Stability" dataset can be found in .csv format here: "Pivotal Role of Surface Terminations in MXene Thermodynamic Stability" dataset predictions

Predictions for the MXenes in the aNANt dataset can be found in .csv format here: aNANt dataset predictions

cfid input feature list containing 438 input features (see supplemental information from "Atomistic Line Graph Neural Network for improved materials property predictions" for more information)

TABLE I: Details of element based chemical descriptors. Here is a list of the types of input features in the cfid feature set with their corresponding definitions. Addition ('add'), multiplications ('mult'), subtraction ('subs') and quotient ('divi') of hfus, polzbl, first\_ion\_en, mol\_vol, bp, mp, therm\_cond and voro\_coord, atom\_rad, elec\_aff, X, and atom\_mass were performed to give additional chemical descriptors.

Descriptor_name	Details
jv_enp	Energy per atom of an element from JARVIS-DFT
KV	Bulk modulus of an element from JARVIS-DFT
GV	Shear modulus of an element from JARVIS-DFT
C-m	(m=0 to 35) Elastic constants of an element from JARVIS-DFT (total 36)
op_eg	OptB88vdW bandgap during SCF for an element
mop_eg	OptB88vdW bandgap during linear optics for an element
voro_coord	Voronoi coordination number of an elemental-crystal structure
ndunfilled	Number of unfilled d-orbitals
ndvalence	Number of valence d-orbitals
nsunfilled	Number of unfilled s-orbitals
nsunfilled	Number of valence s-orbitals
npunfilled	Number of unfilled p-orbitals
npvalence	Number of valence p-orbitals
nfunfilled	Number of unfilled f-orbitals
nfvalence	Number of valence f-orbitals
first_ion	First ionization energy of an element
oq_bg	OQMD bandgap for an element
elec_aff	Electron affinity
vol_pa	Volume per atom of an element
hfus	Heat of fusion of an element
oq_enp	OQMD energy per atom
Polariz	Polarizability
Z	Atomic number
X	Electronegativity
row	Row number in the periodic table
column	Column number in the periodic table
max_oxid_s	Maximum oxidation state
min_oxid_s	Minimum oxidation state
block	s,p,d,f block assigned to 0,1,2,3 blocks
is_alkali	Is it alkali element 0/1
is_alkaline	Is it alkaline element 0/1
is_metalloid	Is it metalloid element 0/1
is_noble_gas	Is it noble gas element 0/1
is_transition_metal	Is it transition element 0/1
is_metalloid	Is it metalloid element 0/1
is_halogen	Is it halogen element 0/1
is lanthanoid	Is it lanthanoid element 0/1
is_actinoid	Is it actinoid element 0/1
atom_mass	Atomic mass
atom_rad	Atomic radii
therm_cond	Thermal conductivity
mol_vol	Molar volume
	Boiling point
bp	Melting point
mp	
avg_ion_rad	Average ionic radii
polzbl	Polarizability
e1	Static dielectric function in x-direction from JARVIS-DFT using OptB88vdW functional
e2	Static dielectric function in y-direction from JARVIS-DFT using OptB88vdW functional
e3	Static dielectric function in z-direction from JARVIS-DFT using OptB88vdW functional
me1	Static dielectric function in x-direction from JARVIS-DFT using TB-mBJ potential
me2	Static dielectric function in y-direction from JARVIS-DFT using TB-mBJ potential
	Static dielectric function in z-direction from JARVIS-DFT using TB-mBJ potential

atom_mass	avg_ion_rad
atom_mass_add_atom_rad	block
atom_mass_add_therm_cond	bp
atom_mass_add_voro_coord	bp_add_atom_mass
atom_mass_add_X	bp_add_atom_rad
atom_mass_divi_atom_rad	bp_add_mp
atom_mass_divi_bp	bp_add_therm_cond
atom_mass_divi_first_ion_en	bp_add_voro_coord
atom_mass_divi_hfus	bp_add_X
atom_mass_divi_mol_vol	bp_divi_atom_mass
atom_mass_divi_mp	bp_divi_atom_rad
atom_mass_divi_polzbl	bp_divi_first_ion_en
atom_mass_divi_therm_cond	bp_divi_hfus
atom_mass_divi_voro_coord	bp_divi_mol_vol
atom_mass_mult_atom_rad	bp_divi_mp
atom_mass_mult_therm_cond	bp_divi_polzbl
atom_mass_mult_voro_coord	bp_divi_therm_cond
atom_mass_mult_X	bp_divi_voro_coord
atom_mass_subs_atom_rad	bp_mult_atom_mass
atom_mass_subs_bp	bp_mult_atom_rad
atom_mass_subs_elec_aff	bp_mult_mp
atom_mass_subs_first_ion_en	bp_mult_therm_cond
atom_mass_subs_hfus	bp_mult_voro_coord
atom_mass_subs_mol_vol	bp_mult_X
atom_mass_subs_mp	bp_subs_atom_mass
atom_mass_subs_polzbl	bp_subs_atom_rad
atom_mass_subs_therm_cond	bp_subs_elec_aff
atom_mass_subs_voro_coord	bp_subs_first_ion_en
atom_mass_subs_X	bp_subs_hfus
atom_rad	bp_subs_mol_vol
atom_rad_add_therm_cond	bp_subs_mp
atom_rad_add_voro_coord	bp_subs_polzbl
atom_rad_add_X	bp_subs_therm_cond
atom_rad_divi_atom_mass	bp_subs_voro_coord
atom_rad_divi_bp	bp_subs_X
atom_rad_divi_first_ion_en	C-0
atom_rad_divi_hfus	C-0 C-1
atom_rad_divi_mol_vol	C-10
atom_rad_divi_mp	C-10 C-11
atom_rad_divi_nip atom_rad_divi_polzbl	C-11 C-12
atom_rad_divi_therm_cond	C-12 C-13
	C-13 C-14
atom_rad_divi_voro_coord	C-14 C-15
atom_rad_mult_therm_cond	
atom_rad_mult_voro_coord	C-16
atom_rad_mult_X	C-17
atom_rad_subs_atom_mass	C-18
atom_rad_subs_bp	C-19
atom_rad_subs_elec_aff	C-2
atom_rad_subs_first_ion_en	C-20
atom_rad_subs_hfus	C-21
atom_rad_subs_mol_vol	C-22
atom_rad_subs_mp	C-23
atom_rad_subs_polzbl	C-24
atom_rad_subs_therm_cond	C-25
atom_rad_subs_voro_coord	C-26
atom_rad_subs_X	C-27

C-28	first_ion_en_add_X
C-29	first_ion_en_divi_atom_mass
C-3	first_ion_en_divi_atom_rad
C-30	first_ion_en_divi_bp
C-31	first_ion_en_divi_hfus
C-32	first_ion_en_divi_mol_vol
C-33	first_ion_en_divi_mp
C-34	first_ion_en_divi_polzbl
C-35	first_ion_en_divi_therm_cond
C-4	first_ion_en_divi_voro_coord
C-5	first_ion_en_mult_atom_mass
C-6	first_ion_en_mult_atom_rad
C-7	first_ion_en_mult_bp
C-8	first_ion_en_mult_elec_aff
C-9	first_ion_en_mult_mol_vol
coulmn	first_ion_en_mult_mp
e1	first_ion_en_mult_therm_cond
e2	first_ion_en_mult_voro_coord
e3	first_ion_en_mult_X
elec_aff	first_ion_en_subs_atom_mass
elec_aff_add_atom_mass	first_ion_en_subs_atom_rad
elec_aff_add_atom_rad	first_ion_en_subs_bp
elec_aff_add_bp	first_ion_en_subs_elec_aff
elec_aff_add_mol_vol	first_ion_en_subs_hfus
elec_aff_add_mp	first_ion_en_subs_mol_vol
elec_aff_add_therm_cond	first_ion_en_subs_mp
elec_aff_add_voro_coord	first_ion_en_subs_polzbl
elec_aff_add_X	first_ion_en_subs_therm_cond
elec_aff_mult_atom_mass	first_ion_en_subs_voro_coord
elec_aff_mult_atom_rad	first_ion_en_subs_X
elec_aff_mult_bp	GV
elec_aff_mult_mol_vol	hfus
elec_aff_mult_mp	hfus_add_atom_mass
elec_aff_mult_therm_cond	hfus_add_atom_rad
elec_aff_mult_voro_coord	hfus_add_bp
elec_aff_mult_X	hfus_add_elec_aff
elec_aff_subs_atom_mass	hfus_add_first_ion_en
elec_aff_subs_atom_rad	hfus_add_mol_vol
elec_aff_subs_bp	hfus_add_mp
elec_aff_subs_first_ion_en	hfus_add_polzbl
elec_aff_subs_hfus	hfus_add_therm_cond
elec_aff_subs_mol_vol	hfus_add_voro_coord
elec_aff_subs_mp	hfus_add_X
elec_aff_subs_polzbl	hfus_divi_atom_mass
elec_aff_subs_therm_cond	hfus_divi_atom_rad
elec_aff_subs_voro_coord	hfus_divi_bp
elec_aff_subs_X	hfus_divi_first_ion_en
first_ion_en	hfus_divi_mol_vol
first_ion_en_add_atom_mass	hfus_divi_mp
first_ion_en_add_atom_rad	hfus_divi_polzbl
first_ion_en_add_bp	hfus_divi_therm_cond
first_ion_en_add_elec_aff	hfus_divi_voro_coord
first_ion_en_add_mol_vol	hfus_mult_atom_mass
first_ion_en_add_mp	hfus_mult_atom_rad
first_ion_en_add_therm_cond	hfus_mult_bp
first_ion_en_add_voro_coord	hfus_mult_elec_aff

hfus\_mult\_first\_ion\_en  $mol\_vol\_mult\_X$ hfus\_mult\_mol\_vol mol\_vol\_subs\_atom\_mass hfus\_mult\_mp mol\_vol\_subs\_atom\_rad hfus\_mult\_polzbl mol\_vol\_subs\_bp hfus\_mult\_therm\_cond mol\_vol\_subs\_elec\_aff hfus\_mult\_voro\_coord mol\_vol\_subs\_first\_ion\_en hfus mult X mol\_vol\_subs\_hfus hfus subs atom mass mol vol subs mp hfus subs atom rad mol\_vol\_subs\_polzbl hfus subs bp mol vol subs therm cond hfus\_subs\_elec\_aff mol\_vol\_subs\_voro\_coord hfus subs first ion en mol vol subs X hfus subs mol vol mop\_eg hfus\_subs\_mp mp hfus\_subs\_polzbl mp\_add\_atom\_mass hfus\_subs\_therm\_cond mp\_add\_atom\_rad hfus\_subs\_voro\_coord mp\_add\_therm\_cond  $hfus\_subs\_X$ mp\_add\_voro\_coord is actinoid mp\_add\_X is alkali mp\_divi\_atom\_mass is\_alkaline mp\_divi\_atom\_rad is\_halogen mp\_divi\_bp is\_lanthanoid mp\_divi\_first\_ion\_en is metalloid mp\_divi\_hfus is noble gas mp divi mol vol is transition metal mp\_divi\_polzbl jv enp mp divi therm cond KV mp\_divi\_voro\_coord max\_oxid\_s mp\_mult\_atom\_mass me1 mp mult atom rad me2 mp mult therm cond me3 mp\_mult\_voro\_coord min\_oxid\_s mp\_mult\_X mol\_vol mp\_subs\_atom\_mass mol\_vol\_add\_atom\_mass mp\_subs\_atom\_rad mol\_vol\_add\_atom\_rad mp\_subs\_bp mol\_vol\_add\_bp mp\_subs\_elec\_aff mol\_vol\_add\_mp mp\_subs\_first\_ion\_en mol\_vol\_add\_therm\_cond mp\_subs\_hfus mol\_vol\_add\_voro\_coord mp\_subs\_mol\_vol  $mol\_vol\_add\_X$ mp\_subs\_polzbl mol vol divi atom mass mp subs therm cond mol vol divi atom rad mp\_subs\_voro\_coord mol vol divi bp mp subs X mol\_vol\_divi\_first\_ion\_en ndunfill ndvalence mol vol divi hfus mol\_vol\_divi\_mp nfunfill nfvalence mol\_vol\_divi\_polzbl mol\_vol\_divi\_therm\_cond npunfill mol\_vol\_divi\_voro\_coord npvalence mol\_vol\_mult\_atom\_mass nsunfill mol\_vol\_mult\_atom\_rad nsvalence mol\_vol\_mult\_bp op\_eg mol\_vol\_mult\_mp oq\_bg mol\_vol\_mult\_therm\_cond oq\_enp mol\_vol\_mult\_voro\_coord polzbl

polzbl\_add\_atom\_mass polzbl\_add\_atom\_rad polzbl\_add\_bp polzbl\_add\_elec\_aff polzbl\_add\_first\_ion\_en polzbl\_add\_mol\_vol polzbl\_add\_mp polzbl add therm cond polzbl\_add\_voro\_coord polzbl add X polzbl\_divi\_atom\_mass polzbl divi atom rad polzbl divi bp polzbl\_divi\_first\_ion\_en polzbl\_divi\_hfus polzbl\_divi\_mol\_vol polzbl\_divi\_mp polzbl\_divi\_therm\_cond polzbl\_divi\_voro\_coord polzbl\_mult\_atom\_mass polzbl\_mult\_atom\_rad polzbl\_mult\_bp polzbl\_mult\_elec\_aff polzbl\_mult\_first\_ion\_en polzbl mult mol vol polzbl\_mult\_mp polzbl mult therm cond polzbl\_mult\_voro\_coord polzbl mult X polzbl subs atom mass polzbl\_subs\_atom\_rad polzbl\_subs\_bp polzbl\_subs\_elec\_aff polzbl\_subs\_first\_ion\_en polzbl\_subs\_hfus polzbl\_subs\_mol\_vol polzbl\_subs\_mp polzbl\_subs\_therm\_cond polzbl\_subs\_voro\_coord polzbl\_subs\_X row therm cond therm\_cond\_add\_voro\_coord therm cond add X therm\_cond\_divi\_atom\_mass therm cond divi atom rad therm\_cond\_divi\_bp therm\_cond\_divi\_first\_ion\_en therm\_cond\_divi\_hfus therm\_cond\_divi\_mol\_vol therm\_cond\_divi\_mp therm\_cond\_divi\_polzbl therm\_cond\_divi\_voro\_coord therm\_cond\_mult\_voro\_coord therm\_cond\_mult\_X therm\_cond\_subs\_atom\_mass

therm\_cond\_subs\_atom\_rad therm\_cond\_subs\_bp therm\_cond\_subs\_elec\_aff therm\_cond\_subs\_first\_ion\_en therm\_cond\_subs\_hfus therm\_cond\_subs\_mol\_vol therm\_cond\_subs\_mp therm cond subs polzbl therm\_cond\_subs\_voro\_coord therm cond subs X voro\_coord voro\_coord\_divi\_atom\_mass voro coord divi atom rad voro coord divi bp voro\_coord\_divi\_first\_ion\_en voro\_coord\_divi\_hfus voro\_coord\_divi\_mol\_vol voro\_coord\_divi\_mp voro\_coord\_divi\_polzbl voro\_coord\_divi\_therm\_cond voro\_coord\_subs\_atom\_mass voro\_coord\_subs\_atom\_rad voro\_coord\_subs\_bp voro\_coord\_subs\_elec\_aff voro coord subs first ion en voro\_coord\_subs\_hfus voro coord subs mol vol voro\_coord\_subs\_mp voro\_coord\_subs\_polzbl voro coord subs therm cond voro\_coord\_subs\_X X X\_add\_voro\_coord X\_mult\_voro\_coord X\_subs\_atom\_mass X\_subs\_atom\_rad X\_subs\_bp X\_subs\_elec\_aff X\_subs\_first\_ion\_en X\_subs\_hfus X\_subs\_mol\_vol X subs mp X\_subs\_polzbl X subs therm cond X\_subs\_voro\_coord Z

CGCNN input features: