

Supplementary Materials for

New tolerance factor to predict the stability of perovskite oxides and halides

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Other Supplementary Material for this manuscript includes the following:

(available at advances.sciencemag.org/cgi/content/full/5/2/eaav0693/DC1)

Table S1 (.csv format). The 576 ABX_3 used for training and testing τ .
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Supplementary Materials

Table S1. The 576 ABX_3 used for training and testing τ . Within this table $-exp\ label = 1$ corresponds with experimentally labeled perovskites and $exp\ label = -1$, nonperovskites; $is\ train = 1$ corresponds with a training set compound and $is\ train = -1$ a test set compound; τ is provided as tau , classification using τ as $tau\ pred$, classification using t as $t\ pred$, and τ -derived probabilities, $P(\tau)$ as $tau\ prob$. A , B , X , n_A , n_B , n_X , r_A , r_B , r_X , and t are also provided and named as they are in the text.

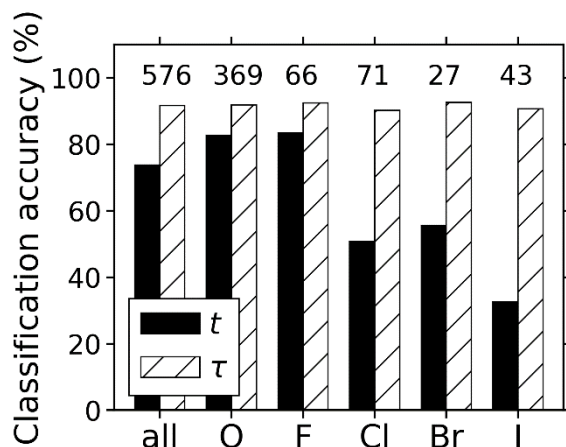


Fig. S1. Comparing the performance of t and τ by composition. Classification accuracy on the full set of 576 experimentally characterized ABX_3 solids (*all*) and by compounds containing $X = O^-$, F^- , Cl^- , Br^- , I^- . The number appearing above each pair of columns corresponds with the number of compounds evaluated within each set.

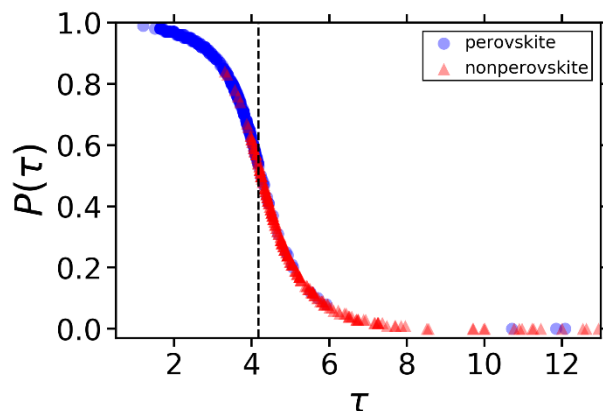


Fig. S2. Sigmoidal relationship between $P(\tau)$ and τ . A comparison of Platt-scaled classification probabilities, $P(\tau)$, versus τ for the 576 experimentally characterized ABX_3 solids. The outlying compounds at $\tau > 10$ that are labeled perovskite yet have small $P(\tau)$ are $PuVO_3$, $AmVO_3$, and $PuCrO_3$, which may indicate poorly defined radii or experimental characterization.

Table S2. Confusion matrices for τ (above) and t (below). N = number of samples; TP = true positives (experimentally realized perovskites which are predicted perovskite); FP = false positives (predicted perovskites which are not experimentally realized perovskites); TN = true negatives (predicted nonperovskites which are experimentally realized nonperovskites); FN = false negatives (predicted nonperovskites which are experimentally realized perovskites); precision = $TP/(TP+FP)$; recall = $TP/(TP+FN)$; F1 score = $(2*precision*recall)/(precision + recall)$; kappa = Cohen's Kappa score; accuracy = $(TP+TN)/N$.

tau:

anion	N	TP	FP	TN	FN	precision	recall	F1 score	kappa	accuracy
all	576	293	28	235	20	0.913	0.936	0.924	0.832	0.917
O	369	217	15	122	15	0.935	0.935	0.935	0.826	0.919
F	66	50	4	11	1	0.926	0.980	0.952	0.768	0.924
Cl	71	18	7	46	0	0.720	1.000	0.837	0.769	0.901
Br	27	5	2	20	0	0.714	1.000	0.833	0.787	0.926
I	43	3	0	36	4	1.000	0.429	0.600	0.557	0.907

t:

anion	N	TP	FP	TN	FN	precision	recall	F1 score	kappa	accuracy
all	576	295	133	130	18	0.689	0.942	0.796	0.453	0.738
O	369	216	48	89	16	0.818	0.931	0.871	0.610	0.827
F	66	49	9	6	2	0.845	0.961	0.899	0.432	0.833
Cl	71	18	35	18	0	0.340	1.000	0.507	0.207	0.507
Br	27	5	12	10	0	0.294	1.000	0.455	0.236	0.556
I	43	7	29	7	0	0.194	1.000	0.326	0.073	0.326

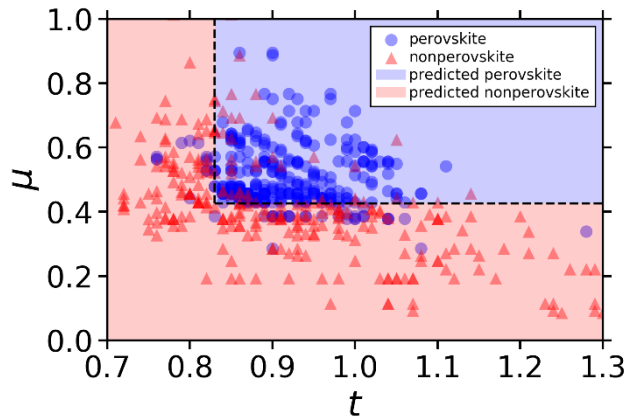


Fig. S3. (t , μ) structure map for 576 ABX_3 solids. A decision tree trained on all compounds finds the optimal bounds for perovskites stability to occur for $t > 0.830$ and $\mu > 0.426$, which results in a classification accuracy of 85%.

Table S3. Additional information associated with Fig. 2D. Columns are named as described for table S1 with the additional columns: *source* – corresponding with the DOI from which the DFT decomposition enthalpy was obtained and *dHdec (meV/atom)* – the PBE-computed decomposition enthalpy of the cubic structure.

Table S4. Double perovskite oxides and halides. All charge-balanced compounds described in the context of Fig. 3 are provided. Columns are named as described for table S1 and table S3. An additional column, *icsd label*, provides the assignment of perovskite/nonperovskite extracted from the ICSD if available.