

A new descriptor for unconventional superconductivity: calibration and testing

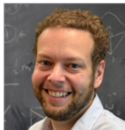
João N. B. Rodrigues

Department of Physics
University of Illinois at Urbana-Champaign

24th August 2018

A new descriptor for unconventional superconductivity: calibration and testing

Lucas K. Wagner
UIUC



Awadhesh Narayan
ETH



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UIUC



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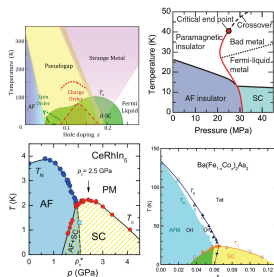
- 1 Unconventional SC may be due to interactions between spin and orbital degrees of freedom
- 2 Charge-spin susceptibility: a way of estimating spin-orbital coupling from first principles
- 3 Testing if charge-spin susceptibility can distinguish uSC from non-uSC
 - Test set
 - Charge-spin susceptibility
 - Classifiers for uSC

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Finding new unconventional superconductors

Finding new unconventional (high- T_c)
superconductors.

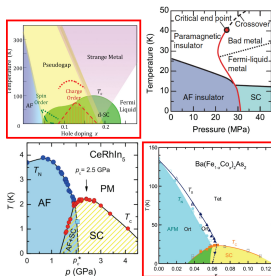
Finding new unconventional superconductors



[Norman, RPP 79, 074502 (2016)]

Heavy fermions, Organic, Cuprates, Iron-based.

Finding new unconventional superconductors

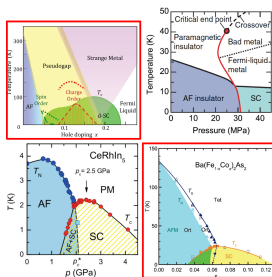


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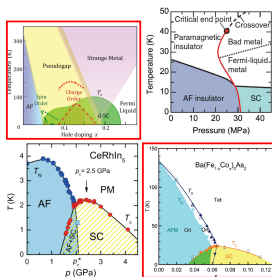
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Data-poor situation!

unlike conventional superconductivity

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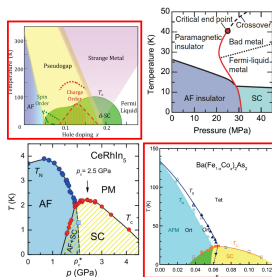


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Finding new unconventional superconductors



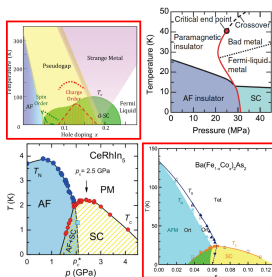
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Main issue we will discuss today.

Finding new unconventional superconductors



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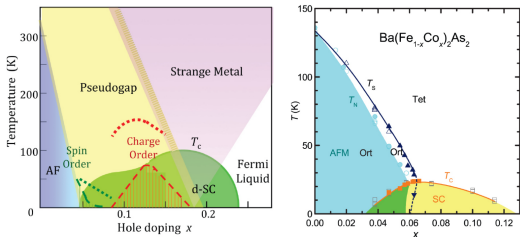
Not clear what to look for!

Up to now, many similarity-based searches.
But no prediction verified so far.

Finding new unconventional superconductors

Commonalities between **cuprates** and **iron-based** superconductors:

- Layered materials with 2D arrays of transition metals.
- Partially filled d-levels \Rightarrow stable local magnetic moments.
- Majority have long-range magnetic order when undoped.
- SC when long-range magn. order \rightarrow paramagnetic.



Adapted from [Norman, RPP 79, 074502 (2016)]

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Crucial role of spin fluctuations in electron pairing.

[Scalapino, RMP **84**, 1383 (2012)]

Finding new unconventional superconductors

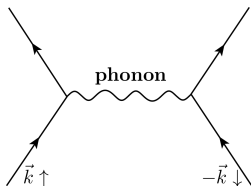
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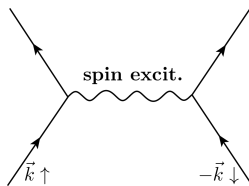
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Conventional (BCS)
Superconductivity



Unconventional
Superconductivity



- 1 Unconventional SC may be due to interactions between spin and orbital degrees of freedom
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"All happy families are alike; each unhappy family is unhappy in its own way."
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Hypothesis: Some ingredients need to be present for high- T_c uSC.

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What should those ingredients be?

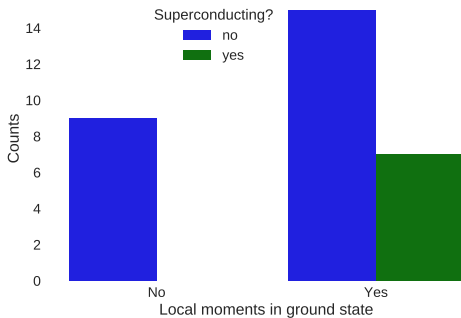
Parent compounds of cuprates and iron-based SCs:

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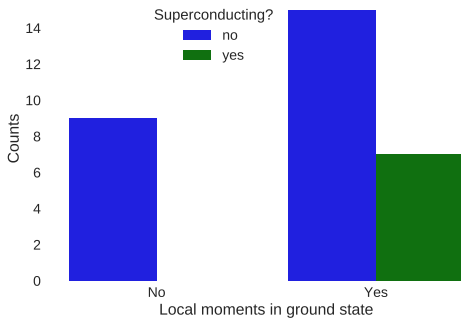
Simplistic classifier: **layered + magnetic**



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Bad at distinguishing uSC from other materials.

Detecting spin-orbital coupling

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For concreteness consider the model Hamiltonian

$$H = H_o + H_S + \lambda H_{oS}$$

with λ coupling orbital and deep spin levels.

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Hole-doped cuprates:

- conduction holes mostly oxygen- p ;
- half-filled Cu- d as local magn. moments;

Iron-pnictides:

- minority spin levels as conduction electrons;
- majority spin levels as local magn. moments;

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Can spin-orbital coupling separate cuprates and iron-based SCs from other materials?

Detecting spin-orbital coupling

Approximate spin-orbital coupling $\frac{\lambda}{w}$ by charge-spin susceptibility χ_{cs}

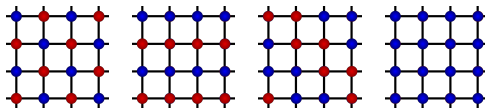
$$\chi_{cs} \equiv \frac{1}{N} \sum_{i=1}^N \chi_i = \frac{1}{N} \sum_{i=1}^N \frac{\Delta\rho_i}{\Delta s_i}$$

N is the number of different magnetic textures considered, $\Delta\rho_i$ (Δs_i) stands for the spatial fluctuations in charge (spin) density relative to that of lowest-energy magnetic order. The former are given by

$$\Delta\rho_i = \int d\mathbf{r} |\rho_i(\mathbf{r}) - \rho_0(\mathbf{r})|$$

$$\Delta s_i = \int d\mathbf{r} |s_i(\mathbf{r}) - s_0(\mathbf{r})|$$

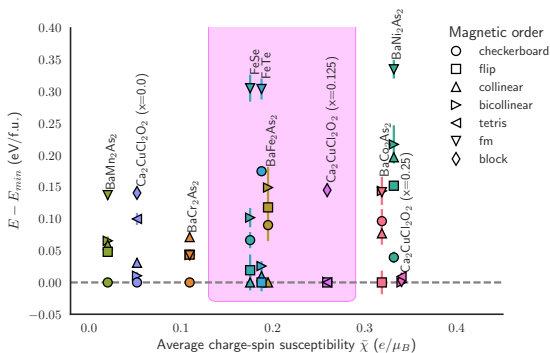
where $\rho_0(\mathbf{r})$ and $s_0(\mathbf{r})$ are the charge and spin distributions of the lowest-energy state.



Detecting spin-orbital coupling

Approximate spin-orbital coupling $\frac{\lambda}{w}$ by charge-spin susceptibility χ_{cs}

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[Narayan et al., arXiv:1705.01008]

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How are we going to calculate these properties?
(Local magnetic moments and charge-spin susceptibility)

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Accurate method (like QMC) is expensive.

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Multiple-DFT calculations to control errors.

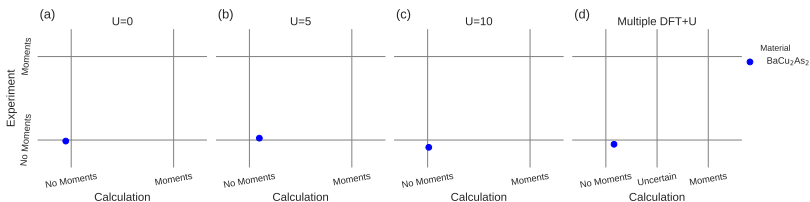
Results

Example: Controlling inaccuracies in magnetic moments prediction with multiple-DFT

Example: Find if there are stable local magnetic moments with multiple DFT+U. [Cococcioni and Gironcoli PRB 71, 035105 (2005)]

Lowest-energy state:

- is non-magnetic \Rightarrow stable magnetic moments absent.
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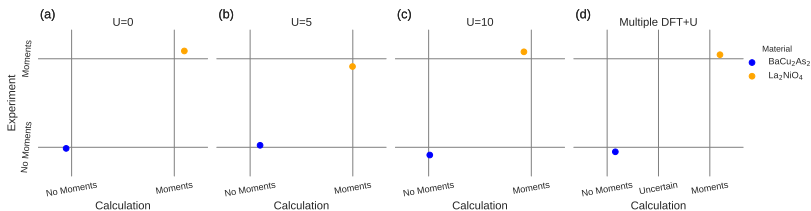
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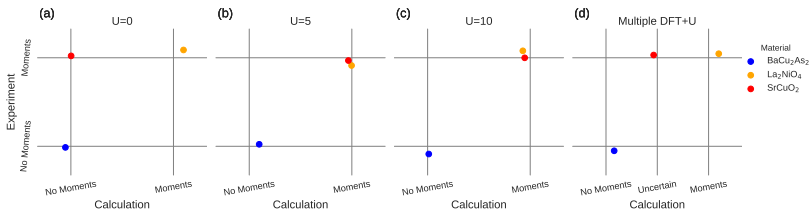
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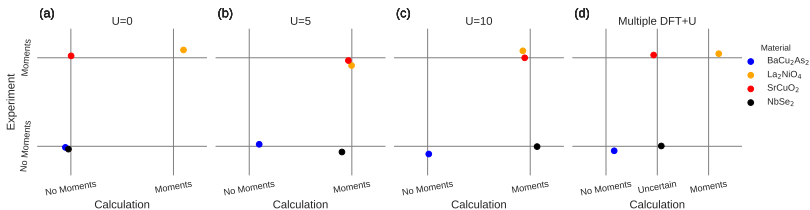
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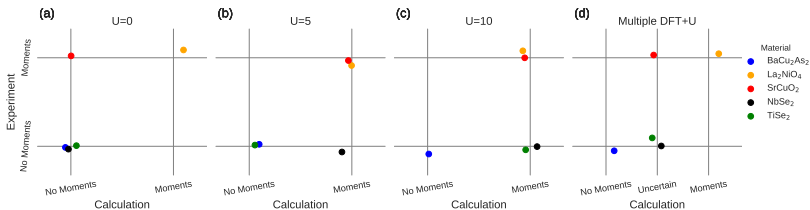
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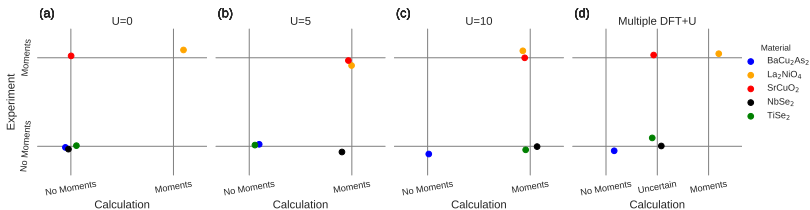
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Lower rate of false positives and false negatives.

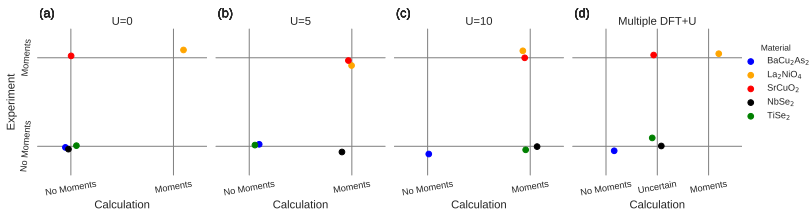
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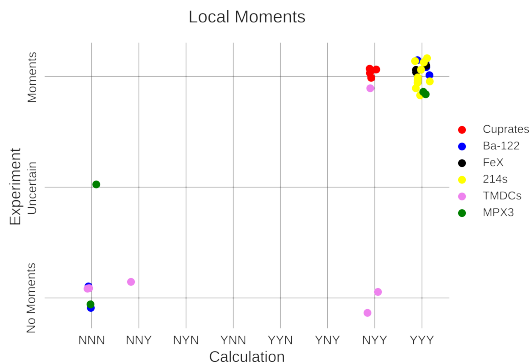
Lower rate of false positives and false negatives.

But large rate of uncertain.

Results

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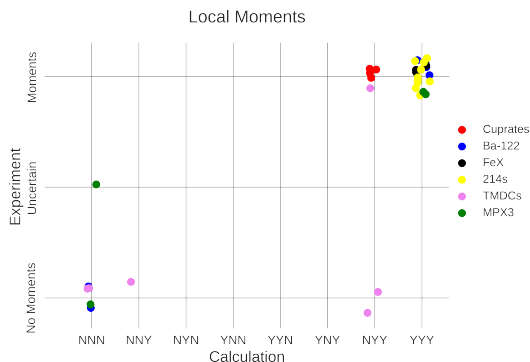
Improved estimator for existence of magnetic moments (multi DFT+U):



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Improved estimator for existence of magnetic moments (multi DFT+U):



$$P(M|NNN \vee NNY) \approx 0.0,$$

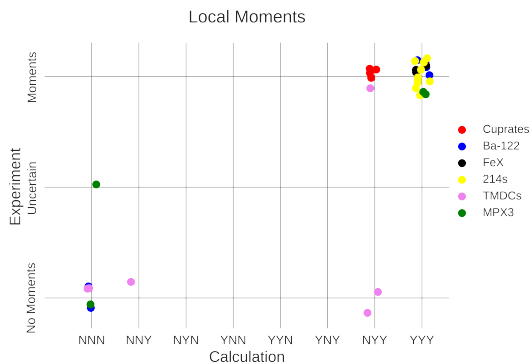
$$P(M|NYY) \approx 0.6,$$

$$P(M|YYY) \approx 1.0.$$

Results

Example: Controlling inaccuracies in magnetic moments prediction with multiple-DFT

Improved estimator for existence of magnetic moments (multi DFT+U):



This is our biggest source of error.

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Test set

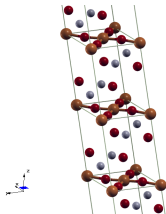
35 pure materials (all layered, some magnetic, some uSC):

Cuprates: CaCuO_2 , SrCuO_2 , $\text{T-La}_2\text{CuO}_4$, $\text{T}'\text{-La}_2\text{CuO}_4$.

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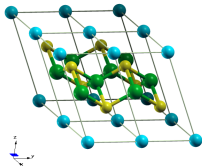
All are antiferromagnetic (AFM) insulators.
All turn superconductor upon doping.

Test set

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Ba-122s: BaM_2As_2 ($\text{M}=\text{Cr}, \text{Mn}, \text{Fe}, \text{Co}, \text{Ni}, \text{Cu}$).



Typically AFM or paramagnetic metals.
BaFe₂As₂ turns superconductor under pressure or doping.

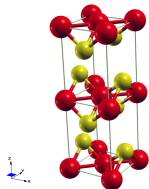
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Ba-122s: BaM_2As_2 (M=Cr, Mn, Fe, Co, Ni, Cu).

FeX: **FeSe**, **FeTe**, **FeS**.



All magnetic metals.

Turn superconductor upon charge doping. FeSe turns SC in pure form.

Test set

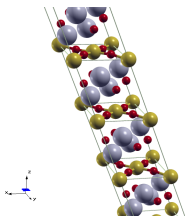
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FeX: FeSe , FeTe , FeS .

214s: La_2MO_4 ($\text{M}=\text{Co}, \text{Ni}$), Sr_2MO_4 ($\text{M}=\text{V}, \text{Cr}, \text{Mn}, \text{Fe}, \text{Co}$)
and K_2MF_4 ($\text{M}=\text{Co}, \text{Ni}, \text{Cu}$).



All are AFM insulators.

Were never made superconducting.

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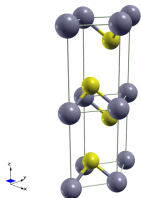
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TMDCs: MSe_2 (M=Ti,Nb,Ta,W) and MS_2 (M=Mo,Ta).



Nonmagnetic metals and insulators.

**Conventional superconductor under
charge doping or pressure.**

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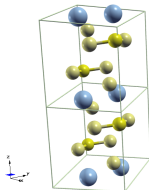
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MPX₃: **VPS₃**, **NiPSe₃**, **CdPSe₃**, **CrGeTe₃**.



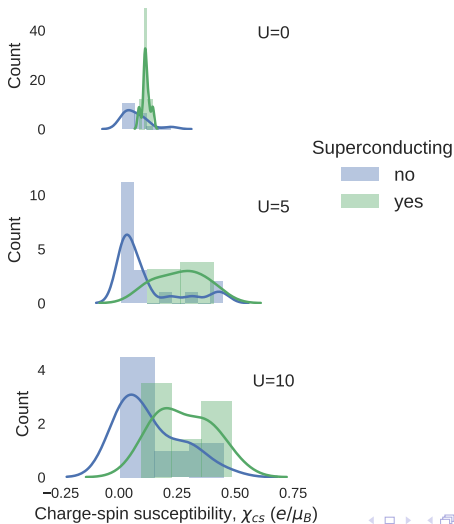
Magnetic and non-magnetic insulators.

Superconductivity unknown. We suspect they **cannot** be made uSC.

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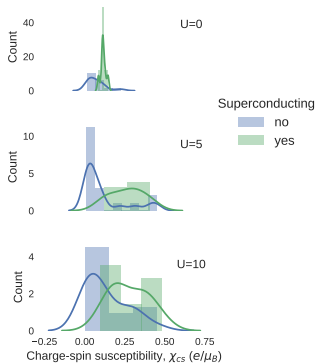
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χ_{cs} distinguishes cuprates and iron-based SCs from other materials!

uSC seems to require **intermediate** spin-orbital coupling.
(similar to e-ph coupling conventional SCs. [Esterlis et al., arXiv:1806.00488])

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Classifiers for unconventional superconductivity

Classifiers for uSC based on three ingredients:

- layered structure (with TMs);
- stable local magnetic moments;
- charge-spin susceptibility;

Quantified as: $P(SC|\chi_{cs}^U, M, 2D) \approx P(SC|\chi_{cs}^U) P(M)$.

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$P(SC|\chi_{cs}^U)$ from charge-spin susceptibility:

$$P(SC|\chi_{cs}^U) = \frac{\rho_{sc}^U}{\rho_{sc}^U + \rho_{\neg sc}^U}$$

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Quantified as: $P(SC|\chi_{cs}^U, M, 2D) \approx P(SC|\chi_{cs}^U) P(M)$.

$P(SC|\chi_{cs}^U)$ from charge-spin susceptibility:

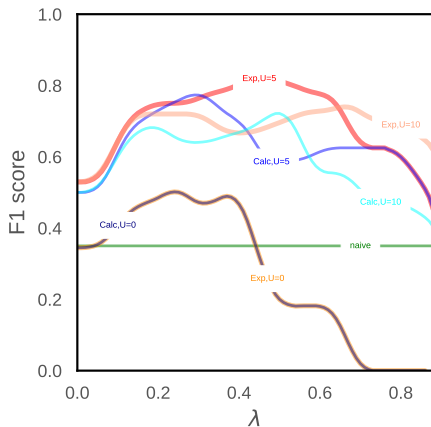
$$P(SC|\chi_{cs}^U) = \frac{\rho_{sc}^U}{\rho_{sc}^U + \rho_{-sc}^U}$$

Probability local moments exist $P(M)$:

From experiment	From DFT+U
$P(M_{\text{exp}}) = 1 \text{ or } 0$	$P(M_{\text{calc}}) \equiv \begin{cases} P(M NNN \vee NNY) \approx 0.0 \\ P(M NYY) \approx 0.6 \\ P(M YYY) \approx 1.0 \end{cases}$

Classifiers for unconventional superconductivity

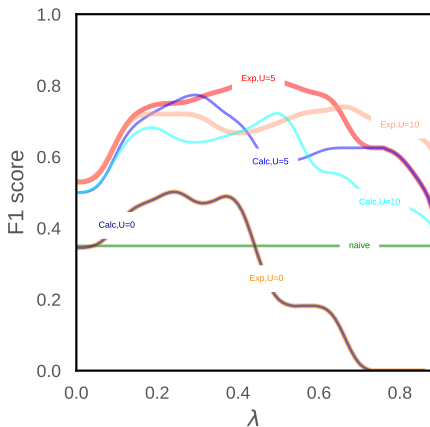
Assessing quality of different classifiers: $F1 = \frac{2TP}{2TP+FP+FN}$.



Best classifier is $P(SC|\chi_{cs}^{U=5}) P(M_{\text{exp}})$.

Classifiers for unconventional superconductivity

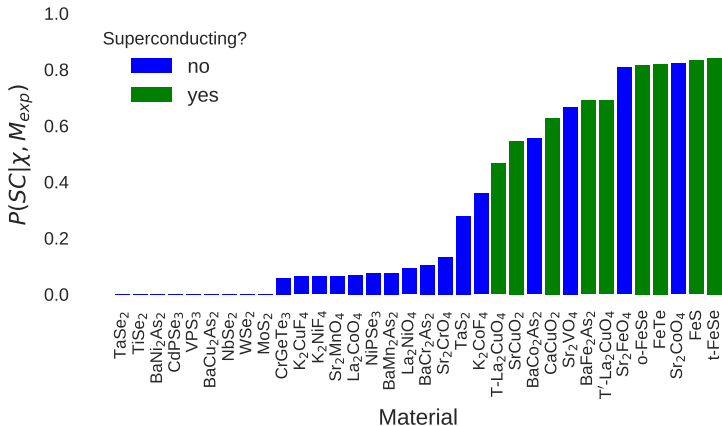
Assessing quality of different classifiers: $F1 = \frac{2TP}{2TP+FP+FN}$.



Best classifier is $P(SC|\chi_{cs}^{U=5}) P(M_{exp})$.
 $P(M_{calc})$ with DFT+U is inaccurate. **QMC can help.**

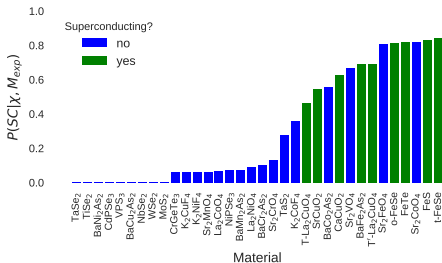
Ranking test set materials

Ranking test set according to **best classifier**: $P(SC|\chi_{cs}^{U=5}) P(M_{exp})$.



Clearly distinguishes known uSCs from other materials!

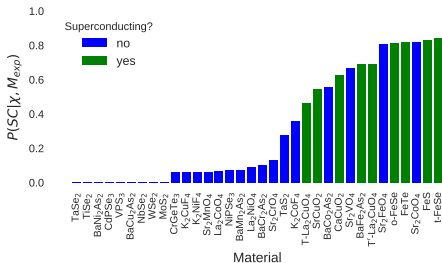
Ranking test set materials



A few comments on highly ranked non-uSCs:

- DFT+U too inaccurate \Rightarrow false prediction. **Clarifiable with QMC.**

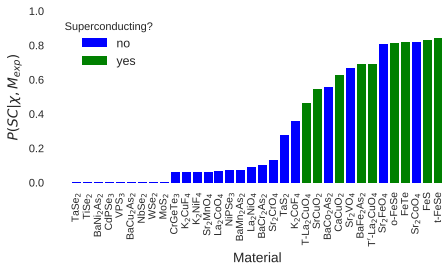
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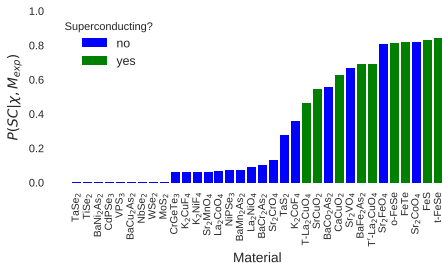
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Ranking test set materials

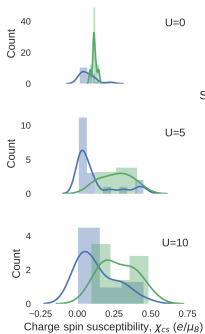


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- DFT+U too inaccurate \Rightarrow false prediction. **Clarifiable with QMC.**
- \exists necessary ingredient (that we didn't consider) and material lacks.
- Good spin-orbital coupling but other instability dominates over SC.
- Charge doping issue:
 - Charge doping degrades spin-orbital coupling.
 - Material not amenable to doping for chemical reasons.
 - **Can be made uSC** (with correct doping) but never attempted.

Summary

- Classifier for uSC with 3 ingredients: layered, LMs and spin-orbital.
- LMs prediction introduces most inaccuracies. **QMC-improvable?**
- Sufficiently specific to distinguish cuprates and iron-based SCs.
- Singles a few non-uSC. **Experimentalists should look at them.**



Superconducting

- no
- yes

Superconducting?

- no
- yes

$P(SC|x, M_{exp})$

