



THE UNIVERSITY OF BRITISH COLUMBIA

# Towards reliable nuclear matrix elements for neutrinoless double beta decay

- Antoine Belley
- New physics searches at the precision frontier,
- INT 2023
- Collaborators: Jack Pitcher, Takayuki Miyagi, Ragnar Stroberg, Jason Holt









 $2v\beta\beta vs 0v\beta\beta$ 

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Decay	2 uetaeta	0 uetaeta
Diagram	$n \longrightarrow p$ $W \longrightarrow \bar{\nu}$ $W \longrightarrow e$ $n \longrightarrow p$	$n \longrightarrow p \\ e \\ W & e \\ p \\ n \longrightarrow p \\ p$
Half-life	$[T^{2\nu}]^{-1} - C^{2\nu} M^{2\nu}^{2\nu}$	$[ = 0 \\ (m_{ee}) \right)^2$
Formula	$[I_{1/2}] = G  M $	$[T_{1/2}^{0\nu}]^{-1} = G^{0\nu}  M^{0\nu} ^2 \left(\frac{\langle m_{\beta\beta} \rangle}{m_e}\right)$
NME	$M^{2\nu} \approx M_{GT}^{2\nu}$	$M^{0\nu} = M^{0\nu}_{GT} - (\frac{g_v}{g_a})^2 M^{0\nu}_F + M^{0\nu}_T - 2g_{\nu\nu} M^{0\nu}_{CT}$
Formula		
LNV	No	Yes!
Observed	Yes	No

\*NME : Nuclear matrix elements \*\*LNV : Lepton number violation

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Half-life	$[T^{2 u}]^{-1} - G^{2 u}  M^{2 u} ^2$	$[\pi 0\nu] = 1 \qquad \qquad$
Formula	$\begin{bmatrix} \mathbf{I} \\ 1/2 \end{bmatrix} = \mathbf{O} \begin{bmatrix} \mathbf{W} \\ \mathbf{I} \end{bmatrix}$	$[T_{1/2}^{0\nu}]^{-1} = G^{0\nu}  M^{0\nu} ^2 \left(\frac{(-p)p_1}{m_e}\right)$
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Half-life	$[T^{2\nu}]^{-1} - C^{2\nu} M^{2\nu}^{2\nu}$	$[ (m, e) \rangle \rangle^2$
Formula	$\begin{bmatrix} I \\ 1/2 \end{bmatrix} - G \begin{bmatrix} M \end{bmatrix}$	$[T_{1/2}^{0\nu}]^{-1} = G^{0\nu}  M^{0\nu} ^2 \left(\frac{\langle m_{\beta\beta} \rangle}{m_e}\right)$
NME	$M^{2\nu} \sim M^{2\nu}$	$\Lambda \sqrt{2\nu} = \Lambda \sqrt{2\nu} (g_v) 2 \Lambda \sqrt{2\nu} + \Lambda \sqrt{2\nu} 2 q \sqrt{2\nu}$
Formula	$M \sim M_{GT}$	$M^{*} = M_{GT} - \left(\frac{g_{a}}{g_{a}}\right) M_{F} + M_{T} - 2g_{\nu\nu}M_{CT}$
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### **<b>∂**TRIUMF

### **Status of** 0vββ-decay Matrix Elements

Current calculations from phenomenological models have large spread in results.



Compiled values from Engel and Menéndez, Rep. Prog. Phys. 80 046301 (2017); Yao, arXiv:2008.13249 (2020); Brase et al, arXiv:2108.11805 (2021)

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# Ab initio nuclear theory

#### Ab initio nuclear theory: The recipe

- 1. Construct nuclear interaction from first principle (using chiral effective field theory ( $\chi$ -EFT))
- 2. Solve the many-body Schrödinger equation for the nucleus with this interaction

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#### Expansion order by order of the nuclear forces

Reproduces symmetries of low-energy QCD using nucleons as fields and pions as force carriers.



Machleidt and Entem, Phys. Rep., vol.503, no.1, pp.1–75 (2011)



#### **Similarity renormalization group**

The general idea is to simplify the Hamiltonian by using a continuous unitary transformation:

$$\hat{H}(s) = \hat{U}(s)\hat{H}(0)\hat{U}^{\dagger}(s)$$

where s parameterized the continuous transformation, and  $\hat{H}(0)$  is the starting Hamiltonian.





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Valence-Space In Medium Similarity Renormalization Group





#### **VS-IMSRG**

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Valence-Space In Medium Similarity Renormalization Group



Discovery, accelerated

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**Discovery**, accelerated

#### The ab initio revolution



Discovery, accelerated

#### The ab initio revolution



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### The ab initio revolution



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Discovery, accelerated

#### Results

### Ab Initio 0vββ Decay: 48Ca, 76Ge and 82Se



Things to add: valence space variation, two-body currents, IMSRG(3), ...

**Belley**, et al., PRL126.042502 **Belley**, et al., in prep

### Ab Initio 0vββ Decay: <sup>130</sup>Te, <sup>136</sup>Xe

#### <sup>130</sup>Te, <sup>136</sup>Xe major players in global searches with SNO+, CUORE and nEXO

Increased E<sub>3max</sub> capabilities allow first converged ab initio calculations [EM1.8/2.0,  $\Delta_{GO}$ , N3LO<sub>LNL</sub>] <sup>18</sup>





#### **0vββ-decay Matrix Elements: The new picture**



Belley, et al., in prep

### **CRIUMF** Ab Initio 0vββ Decay: Effect on experimental limits



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#### **CRIUMF** Ab Initio 0vββ Decay: Effect on experimental limits



- The many-body method (VS-IMSRG)
- The  $\chi$ -EFT interaction
- The operators

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### **TRIUMF** Benchmarking 0vββ Decay in Light Nuclei: Summary

Benchmark with other ab initio method for fictitious decays in light nuclei



Yao, **Belley**, et al., PhysRevC.103.014315

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**Reasonable to good agreement in all cases** 

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#### **Correlation between observables**

In <sup>76</sup>Ge:

Belley et al., arXiv:2210.05809



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#### **Global sensitivity analysis**

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## **Emulators for many-body methods**

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#### 1. Physics driven

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- Is limited to the purpose it was constructed

Eg: Eigenvector continuation emulator for the Coupled Cluster method.

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- E.g. Neural networks, Gaussian processes

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## **Using Gaussian Process as an emulator**

• Idea behind Gaussian Processes regression is to assume that the function we want to fit can be represented as a multivariate gaussian, i.e.

**REALE** 

 $f(\mathbf{x}) = \mathcal{N}(\mu, K(\mathbf{x}, \mathbf{x}))$ 

where  $\mu$  is a mean function and  $K(\mathbf{x}, \mathbf{x})$  is the covariance matrix between the inputs. By optimizing the hyperparameters of the covariance function, we can obtain a good representation of our function.

- Gaussian Processes regression usually do better than neural networks for small datasets. They also
  have the advantage to come with an uncertainty on the result at each data point.
- Multi-Tasks Gaussian Process: Uses multiple correlated outputs from same inputs by defining the kernel as  $K_{inputs} \otimes K_{outputs}$ . This allows us to increase the number of data points without needing to do more expansive calculations.
- Multi-Fidelity Gaussian Process: Uses few data points of high fidelity (full IMSRG calculations) and many data points of low fidelity (e.g. Hartree-Fock results, lower e<sub>max</sub>). The difference function is fitted by a Gaussian process in order to predict the value of full calculations using the low fidelity data points. This assumes a linear scaling for between the low- and high-fidelity calculations.

## **The MM-DGP algorithm**

- When the relation between low-fidelity and high-fidelity data is complicated, the simple multi-fidelity approach does not produce good results.
- Deep gaussian processes [1] link multiple gaussian processes inside a neural network to improve results.
- This can be used to model the difference function between the low-fidelity and high-fidelity by including outputs of the previous fidelity as an input of higher fidelity by taking a kernel of the form:  $K(\mathbf{x}, \mathbf{x}) = k(\mathbf{x}, \mathbf{x}) \cdot k(f_{prev}(\mathbf{x}), f_{prev}(\mathbf{x})) + k_{bias}(\mathbf{x}, \mathbf{x})$
- This was developed for single-output gaussian processes and we have adapted it for multi-output case, creating the MM-DGP: Multi-output Multi-fidelity Deep Gaussian Process.







#### Using $\Delta$ -full chiral EFT interactions at N2LO:



Belley, Pitcher et al. in prep.



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## The MM-DGP algorithm: GSA



Ground state energies

Belley, Pitcher et al. in prep.

# The MM-DGP algorithm: GSA



Consistent with results of Coupled Cluster and physics based emulator

Belley, Pitcher et al. in prep.

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### **Correlation with phase shifts**



Belley, Pitcher et al. in prep.



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Belley, Pitcher et al. in prep.



### **Correlation with phase shifts**



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Strong correlation for energies > 50 MeV

Belley, Pitcher et al. in prep.

# **Correlation with phase shifts**



Belley, Pitcher et al. in prep.



**Bayesian approach** 

Value of the nuclear matrix elements (what we are interested in)  $\uparrow$  $prob(y | y_k, I) \propto prob(y_k | y, I) \times prob(y | I)$ 

We read prob(A | B) as probability of A given B



Value of the

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elements

(what we are

interested in)

Different values

obtain with

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Any other relevant

information we

have before hand

Bayesian approach

We read prob(A | B) as probability of A given B

#### **Prior**

Assume a uniform prior for low energy constants of natural size. Then use history matching to remove implausible samples from the set. Assume each of the remaining samples to be as likely as the others.



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#### Likelihood

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 $prob(y | y_k, I) \propto prob(y_k | y, I) \times prob(y | I)$ 

Probability that this sample give a results that is representative of experimental values.

Any other relevant

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Chosen to be a multivariate normal centred at the experimental value for few observables we have data on (calibrating observables).



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**Bayesian approach** 

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We read  $prob(A \mid B)$  as probability of A given B

Prior

Assume a uniform prior for low energy constants of natural size. Then use history matching to remove implausible samples from the set. Assume each of the remaining samples to be as likely as the others.

**Posterior distribution** 

Probability distribution for the final value given the data and our previous knowledge (what we want to obtain).

For finite samples, we use sampling/importance resampling to obtain the final PDF.

#### Likelihood

Different values

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# **Posterior distribution of the NMEs**

- Use 8188 "non-implausible" samples obtain by Jiang, W. G. et al. (arXiv:2212.13216)
- Many-body problem is "solved" with the MM-DGP.
- Considers all sources of uncertainties by taking:

$$y = y_{MM-DGP} + \epsilon_{emulator} + \epsilon_{EFT} + \epsilon_{many-body} + \epsilon_{operator}$$

where the  $\epsilon$ 's are the errors coming from different sources and are assumed to be normally distributed and independent.

• Interaction are weighted by the  ${}^{1}S_{0}$  neutron-proton phase shifts at 50, 100 and 200 MeV.



### **Choice of calibration observables**



Belley, Pitcher et al. in prep.



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 Choose np phase shift because it shows correlations at lower energies than pp phase shift and there is little data for the nn phase shift.

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### **Choice of calibration observables**



- Choose np phase shift because it shows correlations at lower energies than pp phase shift and there is little data for the nn phase shift.
- Consider values at 50, 100 and 200 MeV to balance between having a strong correlation with the NMEs and a good description of experimental data.

Belley, Pitcher et al. in prep.

## **Posterior distribution of the NMEs**



Disclaimer: Some of the uncertainty terms are currently estimated and still need to be more carefully looked into.

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# **Posterior distribution of other observables**

Calibration observables:







Validation observables:







## **Changing the calibration**

We can verify that the energies are indeed uncorrelated to the NMEs by adding them to the calibration <sup>40</sup> observables.



Final values change by less the 0.01!
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## **Changing the calibration**

With energies



#### Only noticeable change is seen in the PDF for the energies:





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#### Summary...

- 1.Computed first ever ab initio NMEs of isotopes of experimental interest, which is a first step towards computing NME with reliable theoretical uncertainties.
- 2.Computed NME with multiple interactions for <sup>48</sup>Ca, <sup>76</sup>Ge, <sup>82</sup>Se, <sup>100</sup>Mo, <sup>130</sup>Te and <sup>136</sup>Xe.
- 3.Study of effect of the contact term on the NMEs.
- 4. Studied correlations between multiple operators using a wide range of interactions.
- 5.Developed an emulator for the VS-IMSRG based on Gaussian processes and obtain first statistical uncertainty.

#### ... and outlook

- 1.Include finite momentum 2-body currents and other higher order effects.
- 2.Large scale ab initio uncertainty analysis with other methods for "final" NMEs.
- 3.Include contact term to the statistical uncertainty.
- 4.Study other exotic mechanism proposed for  $0\nu\beta\beta$ .



# Discovery, accelerateo



### Questions?

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