



# Precision mass measurement of lightweight self-conjugate nucleus $^{80}\text{Zr}$

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**Protons and neutrons in the atomic nucleus move in shells analogous to the electronic shell structures of atoms. The nuclear shell structure varies as a result of changes in the nuclear mean field with the number of neutrons  $N$  and protons  $Z$ , and these variations can be probed by measuring the mass differences between nuclei. The  $N=Z=40$  self-conjugate nucleus  $^{80}\text{Zr}$  is of particular interest, as its proton and neutron shell structures are expected to be very similar, and its ground state is highly deformed. Here we provide evidence for the existence of a deformed double-shell closure in  $^{80}\text{Zr}$  through high-precision Penning trap mass measurements of  $^{80-83}\text{Zr}$ . Our mass values show that  $^{80}\text{Zr}$  is substantially lighter, and thus more strongly bound than predicted. This can be attributed to the deformed shell closure at  $N=Z=40$  and the large Wigner energy. A statistical Bayesian-model mixing analysis employing several global nuclear mass models demonstrates difficulties with reproducing the observed mass anomaly using current theory.**

Understanding the mechanisms of structural evolution, especially for nuclei far from the beta stability line, is a major challenge in nuclear science<sup>1,2</sup>. In this context, a rich territory for studies of basic nuclear concepts is the neutron-deficient region around mass number  $A=80$  (ref. <sup>3</sup>). The properties of the nuclei in this region change rapidly with varying proton and neutron numbers. Indeed, some of these nuclei are among the most deformed in the nuclear chart and exhibit collective behaviour, while others show non-collective excitation patterns characteristic of spherical systems.

The appearance of strongly deformed configurations around  $^{80}\text{Zr}$  has been attributed to the population of the intruder  $g_{9/2}$  orbitals separated by the spherical  $N=Z=40$  subshell closure from the upper  $pf$  shell. This particular shell structure results in coexisting configurations of different shapes predicted by theory<sup>4-9</sup>. In particular, for the nucleus  $^{80}\text{Zr}$ , spherical and deformed (prolate, oblate and triaxial) structures are expected to coexist at low energies, and their competition strongly depends on the size of the calculated spherical  $N=Z=40$  gap<sup>10</sup>. Experimentally,  $^{80}\text{Zr}$  has a very large quadrupole deformation parameter  $\beta_2 \approx 0.4$  (refs. <sup>11,12</sup>) indicating that the nucleus is prolate in shape. Within the mean-field theory, this has been attributed to the appearance of a large deformed gap at  $N=Z=40$  in the deformed single-particle spectrum<sup>5</sup>. Consequently, the nucleus  $^{80}\text{Zr}$  can be viewed as a deformed doubly magic system.

In addition to shape-coexistence effects,  $^{80}\text{Zr}$  is a great laboratory for isospin physics. Having equal numbers of protons and neutrons, this nucleus is self-conjugate, so it offers a unique venue to study proton-neutron pairing, isospin breaking effects and the Wigner energy reflecting an additional binding in self-conjugate nuclei and their neighbours<sup>13,14</sup>.

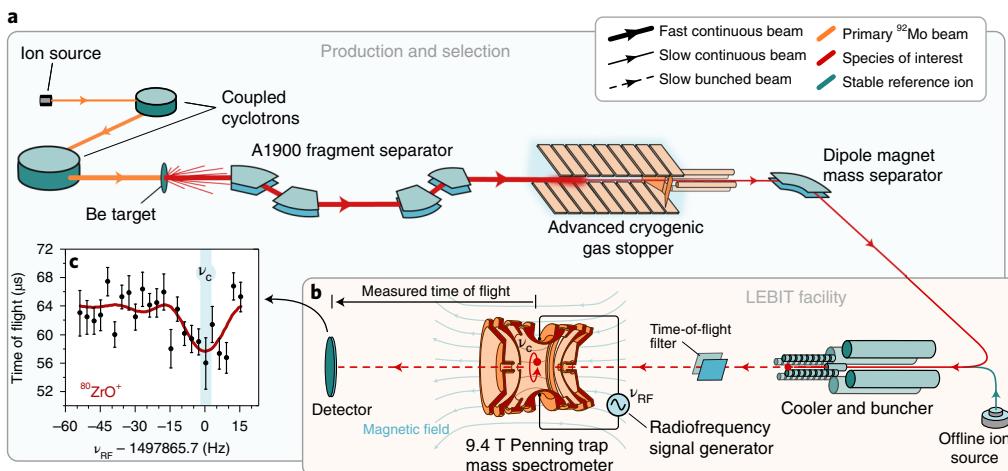
The mass of an isotope is a sensitive indicator of the underlying shell structure as it reflects the net energy content of a nucleus,

including the binding energy. Hence, doubly magic nuclei are substantially lighter, or more bound, than their neighbours. Owing to a lack of precision mass measurement data on  $^{80}\text{Zr}$  and its neighbours, it is difficult to characterize the size of the shell effect responsible for the large deformation of  $^{80}\text{Zr}$ . To this end, we performed high-precision Penning trap mass spectrometry of four neutron-deficient zirconium isotopes ( $^{80-83}\text{Zr}$ ) and analysed the local trends of the binding-energy surface by studying several binding-energy indicators. To quantify our findings, the experimental patterns were interpreted using global nuclear mass models augmented by a Bayesian model averaging (BMA) analysis<sup>15</sup>, as described in Methods.

## Experimental procedure

The  $^{80-83}\text{Zr}$  isotopes are highly neutron-deficient unstable radioisotopes of zirconium with half-lives ranging between 4.6 s and 42 s (ref. <sup>16</sup>), so they must be produced in specialized facilities and probed using fast and sensitive instrumentation. A schematic of the experimental set-up and procedure is shown in Fig. 1. The Zr isotopes were produced at the National Superconducting Cyclotron Laboratory's Coupled Cyclotron Facility via projectile fragmentation of a 140 MeV  $\text{u}^{-1}$   $^{92}\text{Mo}$  primary beam impinged on a thin Be target. The produced Zr nuclei were separated from other fragments by the A1900 fragment separator<sup>17</sup> and sent to the advanced cryogenic gas stopper<sup>18</sup>, where they were stopped as ions. The ions were extracted from the gas stopper as a low-energy (30 keV  $\text{Q}^{-1}$ ) continuous beam and selected by their mass-to-charge ratio ( $A/Q$ ) using a dipole magnet. The ions were then sent to the Low Energy Beam and Ion Trap (LEBIT) facility<sup>19</sup>.  $^{80,82}\text{Zr}$  ions were sent as singly charged oxides ( $A/Q=96$  and 98, respectively) and  $^{81,83}\text{Zr}$  ions were sent bare and doubly charged ( $A/Q=40.5$  and 41.5, respectively).

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**Fig. 1 | The experimental procedure.** **a**, The radioactive Zr isotopes are produced from the fragmentation of an accelerated  $^{92}\text{Mo}$  beam as it collides with a Be target. The fast fragments of interest are separated, stopped and delivered at low energies to the LEBIT facility, where the experiment is performed. **b**, At LEBIT, the ion beam is accumulated into low-emittance bunches, which are sent to the Penning trap mass spectrometer for a mass measurement. In the trap, the ion is subjected to a radiofrequency field and then expelled towards a timing detector. When the frequency of the applied field matches the ion's cyclotron frequency ( $\nu_c$ ), the motion of the ion in the trap is resonantly excited, which translates into a shorter time of flight to the detector. **c**, Sample time-of-flight spectrum of an  $^{80}\text{Zr}^{16}\text{O}^+$  molecular ion obtained by scanning the applied radiofrequency field. The dip in time of flight allows for the determination of the ion's cyclotron frequency, and thus its mass. The red curve is an analytical fit to the data. The error bars represent the statistical uncertainty of the time-of-flight measurement, and the light blue band shows the  $1\sigma$  uncertainty of the cyclotron frequency determination. See main text and Methods for details.

**Table 1 | Results from our mass measurements**

| Isotope          | Ion                             | Ion ref.           | $\bar{R}$            | Mass excess     | AME20 <sup>23</sup>        | Difference |
|------------------|---------------------------------|--------------------|----------------------|-----------------|----------------------------|------------|
| $^{80}\text{Zr}$ | $^{80}\text{Zr}^{16}\text{O}^+$ | $^{85}\text{Rb}^+$ | 1.129,829,01 (99)    | -55,128 (80)    | -54,760 (300) <sup>a</sup> | -370 (310) |
| $^{81}\text{Zr}$ | $^{81}\text{Zr}^{2+}$           | $^{41}\text{K}^+$  | 0.987,971,08 (13)    | -57,556 (10)    | -57,524 (92)               | -32 (93)   |
| $^{82}\text{Zr}$ | $^{82}\text{Zr}^{16}\text{O}^+$ | $^{87}\text{Rb}^+$ | 1.126,770,338 (31)   | -63,618.6 (2.5) | -63,614.1 (1.6)            | -4.5 (3.0) |
| $^{83}\text{Zr}$ | $^{83}\text{Zr}^{2+}$           | $^{41}\text{K}^+$  | 1.012,274,829,7 (85) | -65,916.33 (65) | -65,911.7 (6.4)            | -4.7 (6.5) |

The mass excesses are relative to the mass number of the isotopes of interest. The weighted average frequency ratio,  $\bar{R}$ , between the ion of interest (Ion) and the reference ion (Ion ref.) is presented. The results are compared with the mass excesses recommended by the AME20<sup>23</sup>. All mass excesses are in kiloelectronvolts (keV).  $1\sigma$  uncertainties are shown in parentheses. <sup>a</sup>Extrapolated value based on trends of the mass surface.

On entering the LEBIT facility, the ions first passed through the cooler and buncher<sup>20</sup>, where they were accumulated, cooled and released as short bunches to the LEBIT 9.4 T Penning trap<sup>21</sup>. A series of purification techniques (described in Methods) were used to ensure that nearly pure samples of the ion of interest were used for the measurement. A schematic of the LEBIT set-up is shown in Fig. 1b.

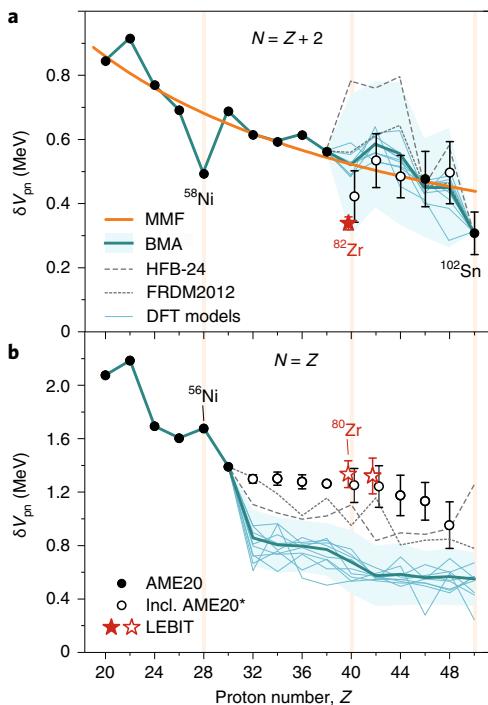
In the Penning trap, the mass  $m_{\text{ion}}$  of an ion with charge  $q$  was determined by measuring the cyclotron frequency  $\nu_c = qB/(2\pi m_{\text{ion}})$  of the ion's motion about the trap's magnetic field, which has a strength  $B$ . The cyclotron frequency  $\nu_c$  was measured using the time-of-flight ion cyclotron resonance (TOF-ICR) technique<sup>22</sup>, as shown in Fig. 1 and described in Methods. The theoretical line shapes<sup>22</sup> for the TOF-ICR spectra were fit to the data, allowing determination of the cyclotron frequency. A sample  $^{80}\text{Zr}^{16}\text{O}^+$  TOF-ICR spectrum and its theoretical line shape are shown in Fig. 1c.

Before and after each measurement of the ion of interest, measurements of a reference ion were performed to calibrate the magnetic field. The reference ions ( $^{41}\text{K}^+$ ,  $^{85,87}\text{Rb}^+$ ) were provided by an offline ion source. The masses of the ions of interest were obtained from the ratio ( $R$ ) of the cyclotron frequencies of the reference ion ( $\nu_{c,\text{ref}}$ ) and the ion of interest:

$$R = \frac{\nu_{c,\text{ref}}}{\nu_c} = \frac{m_{\text{ion}}/q_{\text{ion}}}{(m_{\text{ref}} - q_{\text{ref}} m_e)/q_{\text{ref}}}, \quad (1)$$

where  $q_{\text{ion}}$  is the charge state of the ion of interest,  $m_e$  is the mass of the electron and  $m_{\text{ref}}$  and  $q_{\text{ref}}$  are the atomic mass and charge state of the reference species. The atomic mass  $m$  of the Zr isotope of interest is calculated from the mass of the measured ion, accounting for removed electrons and molecular counterparts, where applicable. The results of the measurements are presented in Table 1 and compared with the atomic mass evaluation of 2020 (AME20)<sup>23</sup>. Further details on the measurement, calibration and uncertainty determination procedures are provided in Methods.

Our mass measurement results are in good agreement with the mass values recommended by AME20<sup>23</sup>, and provide an improvement of one order of magnitude or more to the precision of the  $^{80,81,83}\text{Zr}$  masses. The AME20 values for  $^{81-83}\text{Zr}$  are derived mainly from previous high-precision mass measurements. Penning trap mass measurements of  $^{82,83}\text{Zr}$  form the basis of the AME20 mass values for these isotopes<sup>24,25</sup>, while a recent storage ring measurement<sup>26</sup> dominates the AME20 mass of  $^{81}\text{Zr}$ . Our measurement of  $^{82}\text{Zr}$  has the largest discrepancy from AME20, with a value  $1.5\sigma$  lower. The mass of  $^{80}\text{Zr}$  listed in AME20 is an extrapolated value calculated from neighbouring known nuclei using smooth trends of the mass surface. It is worth noting that two previous mass measurements of  $^{80}\text{Zr}$  have not been included in the AME. A measurement with only a single event<sup>27</sup> yielded a mass excess of -55.5 (1.5) MeV. The second measurement<sup>28</sup>, albeit more precise with a mass excess of -55,647 (150) keV, has not been included in the AME, because



**Fig. 2 | Comparison of experimental results with theoretical predictions.**

**a,b**, The effect of the anomalous mass of  $^{80}\text{Zr}$  on the mass indicator  $\delta V_{\text{pn}}$ : a substantial decrease from the baseline in the  $N=Z+2$  sequence (**a**) and a slight increase in the  $N=Z$  sequence (**b**), which mirrors the behaviour of other doubly magic nuclei (for example,  $^{56}\text{Ni}$  and  $^{100}\text{Sn}$ ). Black circles represent mass data from the AME20<sup>23</sup>. Red stars include data from this work. Filled symbols (both circles and stars) include only experimental mass values from AME20<sup>23</sup>. Open symbols include mass extrapolations (AME20\*) from AME20<sup>23</sup>. All symbols include  $1\sigma$  error bars. In many cases the error bars are too small to see. The MMF prediction is shown as an orange line in **a**. The thick teal line is the BMA result based on several nuclear models (thin solid lines, DFT models; thin dashed lines, HFB-24 and FRDM2012 models, which include the Wigner energy correction) and the light teal band represents the uncertainty of the BMA approach. See Methods for details about the BMA. The vertical bands denote the magic numbers 28 and 50 as well as the proton number of Zr,  $Z=40$ .

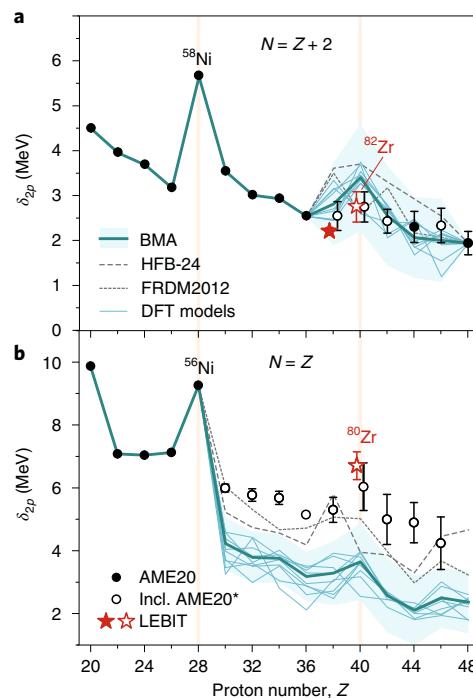
other isotopes measured in the same experiment were in disagreement with more recent high-precision results.

### The anomalous mass of $^{80}\text{Zr}$

Our mass measurement of  $^{80}\text{Zr}$  reveals that this nucleus is substantially more bound than expected from systematic trends. Indeed, high-quality extrapolations of the mass surface towards  $^{80}\text{Zr}$  have been produced by the AME collaboration and others; this has been especially motivated by the astrophysical importance of this nucleus for X-ray bursts<sup>29</sup>. Our mass value is 370 (310) keV/c<sup>2</sup> more bound than the extrapolated value from AME20<sup>23</sup>, and 950 (260) keV/c<sup>2</sup> more bound than the Lanzhou extrapolated value<sup>26</sup>.

To study the impact of our measurement, we employed various binding-energy differences (described in Methods), adopting our mass values for  $^{80-83}\text{Zr}$ . All other masses used in the calculations were taken from AME20 unless stated otherwise. Along the  $N=Z$  line, nuclei are known to be exceptionally well bound as neutrons and protons occupy the same shell model orbitals. Therefore, a useful indicator is the double mass difference  $\delta V_{\text{pn}}$  (refs. <sup>30,31</sup>), as defined in Methods.

In Fig. 2a,b, we show  $\delta V_{\text{pn}}$  for the  $N=Z+2$  and  $N=Z$  sequences, respectively. For nuclei away from  $N=Z$ , the overall behaviour of

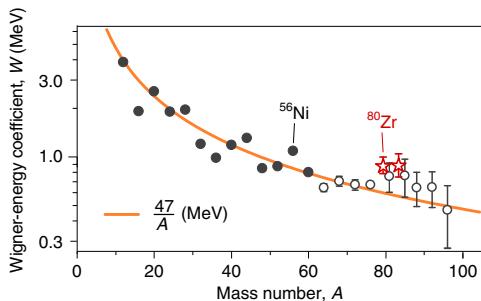


**Fig. 3 | Two-proton shell gap.** **a,b**, The effect of the anomalous mass of  $^{80}\text{Zr}$  on the mass indicator  $\delta_{2p}$ : a decrease from the baseline in the  $N=Z+2$  sequence (**a**) and a corresponding increase in the  $N=Z$  sequence (**b**). Black circles represent mass data from AME20<sup>23</sup>. Red stars include data from this work. Filled symbols (both circles and stars) include only experimental mass values from AME20<sup>23</sup>. Open symbols include mass extrapolations (AME20\*) from AME20<sup>23</sup>. All symbols include  $1\sigma$  error bars. In many cases the error bars are too small to see. The thick teal line is the BMA result based on several nuclear models (thin solid lines, DFT models; thin dashed lines, HFB-24 and FRDM2012 models, which include the Wigner-energy correction) and the light teal band represents the uncertainty of the BMA approach. See Methods for details about the BMA. The vertical bands denote the magic number 28 and the proton number of Zr,  $Z=40$ .

$\delta V_{\text{pn}}$  is well described by the macroscopic mass formula<sup>31,32</sup> (MMF),  $\delta V_{\text{pn}} \approx 2(a_{\text{sym}} + a_{\text{ssym}} A^{-1/3})/A$ , where  $a_{\text{sym}}$  and  $a_{\text{ssym}}$  are, respectively, the symmetry and surface-symmetry energy coefficients. In the MMF plotted in Fig. 2a, we used  $a_{\text{sym}} = 35$  MeV and  $a_{\text{ssym}} = -59$  MeV, which were determined by a fit to the data, neglecting the outliers at  $A=58, 82$  and  $102$ . Along the  $N=Z$  sequence,  $\delta V_{\text{pn}}$  is strongly impacted by the Wigner energy<sup>13</sup>, the behaviour of which is more convoluted. Moreover, mass data beyond  $N=Z$  are scarce in the investigated region. Consequently, if some masses required for the  $\delta V_{\text{pn}}$  determination were not experimentally available, we used the recommended values from AME20<sup>23</sup> instead.

Although  $\delta V_{\text{pn}}$  is expected to vary smoothly overall, fluctuations around the average trend carry important structural information<sup>30,31,33</sup>. Binding-energy outliers, especially those found in magic nuclei along the  $N=Z$  line, result in  $\delta V_{\text{pn}}$  deviations for both  $N=Z$  and  $N=Z+2$  sequences. Considering the  $N=Z+2$  results with our masses, the value of  $\delta V_{\text{pn}}$  for  $^{82}\text{Zr}$  (which is reliant on the mass of  $^{80}\text{Zr}$ ) is a clear outlier, being 185 keV lower than the MMF trend. This anomaly is similar to those found in  $^{58}\text{Ni}$  and  $^{102}\text{Sn}$  that are associated with the increased binding energies of the doubly magic self-conjugate nuclei  $^{56}\text{Ni}$  and  $^{100}\text{Sn}$ . The increased binding energy of  $^{80}\text{Zr}$  also impacts the  $N=Z$  trends, resulting in increasing values of  $\delta V_{\text{pn}}$  for Zr and Mo.

Analogous outliers can also be found by inspecting other mass filters at  $^{80}\text{Zr}$ , such as the two-proton shell gap  $\delta_{2p}$ , commonly



**Fig. 4 | Wigner energy.** The Wigner-energy coefficient  $W(A)$  extracted from  $\delta V_{pn}$  values according to ref. <sup>13</sup>. Black circles represent mass data from AME20<sup>23</sup>. Red stars include data from this work. Open symbols include AME20 mass extrapolations (AME20\*). The average trend of ref. <sup>13</sup> is shown by a thick orange line. All symbols include  $1\sigma$  error bars. In many cases the error bars are too small to see.

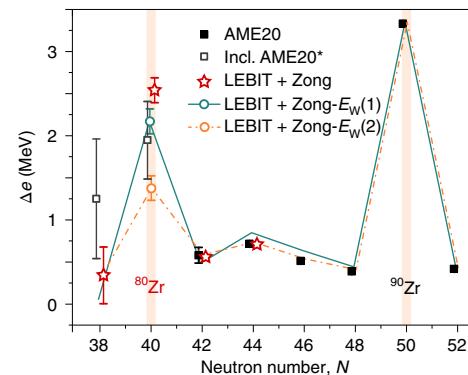
employed in tests of shell closures<sup>34,35</sup>. The  $\delta_{2p}$  mass filter as a function of proton number for both the  $N=Z$  and  $N=Z+2$  sequences is shown in Fig. 3 (additional discussion is provided in Methods).

The results shown in Fig. 2 provide compelling empirical evidence for the existence of a deformed shell closure in <sup>80</sup>Zr. One needs to bear in mind, however, that <sup>80</sup>Zr is a self-conjugate system and some additional contribution to its binding energy comes from the Wigner energy. Usually, the Wigner term in even–even nuclei is parameterized as  $E_w = a_w |N-Z|/A$ . As discussed in ref. <sup>13</sup> and Methods, the Wigner-energy coefficient  $W(A) = a_w/A$  can be empirically extracted from the values of  $\delta V_{pn}$ . Our data, shown in Fig. 4, indicate that the value of  $W(A)$  at <sup>80</sup>Zr and <sup>56</sup>Ni is locally enhanced, in contrast to the gradually decreasing trend for heavier  $N=Z$  nuclei that is well captured by the value of  $a_w=47$  MeV obtained in ref. <sup>13</sup>. A note of caution is in order: some contribution to the local increase of the empirical value of  $W$  in <sup>80</sup>Zr and <sup>56</sup>Ni can be attributed to the enhanced binding due to their shell structures. The contributions of the Wigner energy and shell structure will be disentangled with another mass filter in the following paragraph.

Experimental masses offer a way to assess the size of the deformed  $N=40$  single-particle gap. This can be done by employing the filter  $\Delta e(N=2n)$ <sup>36</sup>, which provides an estimate of the single-particle energy gap  $e_{n+1} - e_n$  at the Fermi level. Figure 5 shows  $\Delta e$  for the Zr isotopic chain (see ref. <sup>37</sup> for applications of  $\Delta e$  to the K and Ca chains). Some masses of proton-rich Zr isotopes needed to determine  $\Delta e$  are not known experimentally, so these have been taken from mass relations of mirror nuclei by Zong and others<sup>38</sup>. It is seen that  $\Delta e$  reaches a maximum for <sup>90</sup>Zr at the spherical magic number  $N=50$  and a local maximum for <sup>80</sup>Zr at the deformed magic number  $N=40$ . Because the latter value can be affected by the Wigner energy, we removed the binding-energy contribution from  $E_w$  by applying two models:  $E_w(1)$ <sup>39</sup> and  $E_w(2)$ <sup>13</sup>. The resulting correction to  $\Delta e$  practically affects only the  $N=40$  value. As discussed in Methods, the expression  $E_w(1)$  is well localized at  $N=Z$  and reduces  $\Delta e$  by  $\sim 300$  keV. The expression  $E_w(2)$  decreases linearly with the neutron excess, and the corresponding reduction of  $\Delta e$  is  $\sim 1.1$  MeV. Even in this case, the energy gap at  $N=40$  is a factor of 2–3 larger than  $\Delta e$  for  $42 \leq N \leq 48$ . Although the size of this gap is reduced compared to the spherical  $N=50$  gap, it is characteristic of a deformed shell closure. The strong shell effect comes from the self-conjugate nature of <sup>80</sup>Zr as the deformed proton and neutron shell effects reinforce one another.

### Bayesian analysis of mass models

To obtain improved theoretical mass predictions in the <sup>80</sup>Zr region, we conducted a Bayesian statistical analysis combining Gaussian



**Fig. 5 | Single-particle energy splitting.** The empirical single-particle energy gap  $\Delta e(N)$  at the Fermi level for the chain of even–even Zr isotopes extracted from nuclear binding energies according to ref. <sup>36</sup>. Black squares represent mass data from AME20<sup>23</sup>. Open grey squares include AME20 mass extrapolations (AME20\*). Open stars represent the data from this work augmented by mass extrapolations from ref. <sup>38</sup>. These values of  $\Delta e$  were further corrected by removing contributions from the Wigner-energy term  $E_w(1)$  (solid line; ref. <sup>39</sup>) or  $E_w(2)$  (dash-dotted line; ref. <sup>13</sup>). See Methods for the definition of  $E_w$ . No uncertainty is assigned to  $E_w(1)$  or  $E_w(2)$ , so the error bars for the corrected  $\Delta e$  values match those of the corresponding uncorrected values. The corrected  $\Delta e$  error bars are only shown for <sup>80</sup>Zr. All error bars represent  $1\sigma$  uncertainty. In many cases the error bars are too small to see. The vertical bands denote shell closures at  $N=40$  and  $N=50$ .

process extrapolation and BMA<sup>40</sup> of 11 theoretical global mass models following the same procedure as in refs. <sup>15,41</sup>. The BMA framework uses the collective wisdom of the models, constrained by data, to make predictions and quantify uncertainties. Details of the individual models and the BMA methodology are provided in Methods.

The BMA predictions for  $\delta V_{pn}$  are shown in Fig. 2a,b. The predictions for  $N=Z+2$  are well constrained outside the region  $38 < Z < 50$  due to the wealth of experimental mass data. In the region  $38 \leq Z \leq 50$ , the BMA results are consistent with the AME20 data and the MMF trend. At  $Z=40$ , the experimental  $\delta V_{pn}$  value, which includes our <sup>80,82</sup>Zr mass results, falls just within the error band. The BMA result for  $\delta V_{pn}$  along the  $N=Z$  line in the region  $Z > 30$  does not agree with either the AME20 extrapolations or the experimental value at  $Z=40$ . Two of the models, FRDM2012<sup>42</sup> and HFB-24<sup>39</sup>, which include the phenomenological Wigner term, perform slightly better than the density functional theory (DFT) models. However, they still fall short of the experimental trends, probably due to underestimation of the Wigner energy. Indeed, the value of  $a_w$  in FRDM2012<sup>42</sup> is 30 MeV, which is much less than the  $a_w=47$  MeV representing the average trend seen in Fig. 4. The Wigner energy  $E_w(1)$  of HFB-24 is even smaller. The BMA predictions for  $\delta_{2p}$  are shown in Fig. 3a,b and trends similar to those seen in the  $\delta V_{pn}$  results are observed.

In summary, the interplay between theory and experiment was crucial in understanding this region of the nuclear chart. Although the deformed shell gap at  $N=Z=40$  was predicted over 30 years ago<sup>45</sup>, a lack of precise experimental data has prevented a quantitative assessment of the gap's size until now. To further refine the deformed shell closure, high-precision mass measurements in this region are needed, which will be made possible with next-generation radioactive ion beam facilities and mass measurement techniques.

### Online content

Any methods, additional references, Nature Research reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of

author contributions and competing interests; and statements of data and code availability are available at <https://doi.org/10.1038/s41567-021-01395-w>.

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## Methods

**The TOF-ICR technique for cyclotron frequency determination.** In a Penning trap, an ion is confined in space by the superposition of a weak axially harmonic electric potential and a strong homogeneous magnetic field, oriented in the axial direction. In the absence of the electric field, the ion performs a circular motion about the axis of the magnetic field at cyclotron frequency  $\nu_c$ , the measurement of which allows the determination of the mass of the particle. The introduction of the electric field disturbs the cyclotron motion, which is split into two independent radial components: the reduced cyclotron and the much slower magnetron precession (with frequencies  $\nu_+$  and  $\nu_-$ , respectively). The 'free' cyclotron frequency is determined by measurement of the  $\nu_c = \nu_+ + \nu_-$  sideband. This quantity is nearly invariant with respect to fluctuations in the trapping electric field, which grants Penning trap mass spectrometry great accuracy<sup>43</sup>.

In the TOF-ICR technique, the sideband is determined by applying an external quadrupole radiofrequency field (with frequency  $\nu_{RF}$ ) to the ion, which converts one eigenmotion into another. The ion is initially prepared in a pure magnetron motion, which, at LEBIT, is done through the Lorentz steering technique<sup>44</sup>. On application of the external field, if the resonant condition  $\nu_{RF} = \nu_+ + \nu_-$  is met, the conversion from pure magnetron motion to pure reduced cyclotron motion occurs. The conversion is probed by measuring the ion's time of flight from the trap to a microchannel plate detector outside the magnetic field. If the ion in the trap is in a pure reduced cyclotron motion, which holds greater kinetic energy, the time of flight is reduced. Figure 1b provides a schematic of the TOF-ICR set-up.

In a typical TOF-ICR procedure,  $\nu_{RF}$  is scanned to characterize the resonant reduction of the time of flight, generating spectra such as the one shown in Fig. 1c. The width of the resonance, which determines the precision of the  $\nu_c$  measurement, is inversely proportional to the time for which the external excitation field is applied. In the measurements described herein, both continuous<sup>22</sup> and Ramsey<sup>45</sup> radiofrequency quadrupolar excitation schemes were used, with excitation times ranging from 50 ms to 1 s. The cyclotron frequency is determined through an analytical fit to the time-of-flight spectrum, the line shapes of which are described in the literature for both used excitation schemes<sup>22,45</sup>.

**Mass determination from cyclotron frequencies.** Here we describe in greater detail the procedure used to extract atomic mass values for the isotopes of interest from the measured cyclotron frequencies. As explained in the main text, each measurement of the cyclotron frequency  $\nu_c$  of the ion of interest is interleaved by measurements of the cyclotron frequency of the reference ion,  $\nu_{c,ref}$ . Reference ions were chosen as singly ionized species of widely available stable alkali atoms whose masses ( $m_{ref}$ ) are well known in the literature<sup>43</sup>, as well as whose  $A/Q$  is close to the ion of interest to avoid large mass-dependent systematic shifts in the calibration procedure. The frequency ratio (1) for each measurement of  $\nu_c$  was calculated using the time-interpolated cyclotron frequency from the reference measurements to the time of the measurement of the ion of interest. In total, three measurements of  $R$  were performed for the  $^{83}\text{Zr}^{2+}-^{41}\text{K}^+$  pair, six for the  $^{82}\text{ZrO}^+-^{87}\text{Rb}^+$  pair, five for the  $^{81}\text{Zr}^{2+}-^{41}\text{K}^+$  pair and four for the  $^{80}\text{ZrO}^+-^{85}\text{Rb}^+$  pair. The masses of each ion of interest ( $m_{ion}$ ) presented in Table 1 were calculated with equation (1), using the average of multiple frequency ratios ( $\bar{R}$ ) weighted by their uncertainties.

The atomic masses ( $m$ ) of the Zr isotopes of interest were calculated using  $m = m_{ion} + qm_e - m_{mol}$ , where  $m_{mol}$  is the atomic mass of the molecular counterpart ( $^{16}\text{O}$  in the case of  $^{80,82}\text{Zr}$  only). The electron binding energies and molecular binding energies of  $^{80,82}\text{ZrO}^+$  were disregarded as they are on the order of electronvolts, which is several orders of magnitude lower than the statistical uncertainty of the measurement. Mass excesses, defined as the difference between the atomic mass and the isotope's mass number, are reported in Table 1 for the measured Zr isotopes.

**Evaluation of uncertainties.** Uncertainties related to the extraction of cyclotron frequencies from the fits dominate the statistical error budget. Systematic errors arise from magnetic field inhomogeneities, trapping potential imperfections and a possible misalignment between the trap and magnetic field<sup>46</sup>. These errors result in a shift in the average frequency ratio, which scales linearly with the difference in mass between the ion of interest and the reference ion. The mass-dependent shifts in  $\bar{R}$  have been measured at the LEBIT facility and found to be  $\Delta\bar{R} = 2 \times 10^{-10} \text{ u}^{-1}$  (ref. <sup>47</sup>). This shift has been folded into the ratios and uncertainties reported in Table 1.

Other systematic errors on the individual measured frequency ratios  $R$  must be taken into account separately. Nonlinear magnetic field fluctuations in time can result in calibration errors. This effect has been studied at LEBIT and leads to a shift in  $R$  at a level below  $1 \times 10^{-9}$  per hour<sup>48</sup>. Measurement times ranged from 3 h for  $^{80}\text{Zr}$  to 15 min for  $^{83}\text{Zr}$ . This uncertainty was folded into the ratio uncertainties, although it had a negligible effect on the final error estimate. Special relativity can have an effect on the cyclotron frequency ratios<sup>49</sup>, but this error was negligible compared to the statistical uncertainty. Ion–ion interactions were minimized using several methods. Before entering the trap, the ion bunches from the cooler and buncher were purified using a time-of-flight filter to only allow ions with a specific mass-to-charge ratio to enter the trap. Once captured in the trap, ions were further purified against isobaric contamination using targeted dipole cleaning<sup>50</sup> and the stored waveform inverse Fourier transform (SWIFT) technique<sup>51</sup>. Additional

ion–ion interactions were taken into account by performing a count-rate class analysis on each dataset whenever possible<sup>52</sup>. The count-rate class analysis only led to a shift in the  $^{83}\text{Zr}$  ratio ( $\Delta R = 9.8(7) \times 10^{-9}$ ). This shift has been included in the value reported in Table 1. Finally, Birge ratios were calculated to determine whether inner or outer uncertainties were reported for the final mass uncertainties<sup>53</sup>.

**Binding-energy indicators.** To extract quantities of interest for the experimental mass surface, we used various binding-energy differences (mass filters)<sup>54,55</sup>. These include the following.

The double mass difference  $\delta V_{pn}$  (refs. <sup>30,31,33</sup>) is given by

$$\begin{aligned} \delta V_{pn}(N, Z) &= \frac{1}{4} [B(N, Z) - B(N - 2, Z) \\ &\quad - B(N, Z - 2) + B(N - 2, Z - 2)] \\ &= \frac{1}{4} [S_{2p}(N, Z) - S_{2p}(N - 2, Z)]. \end{aligned} \quad (2)$$

The Wigner energy coefficient in an even–even nucleus with  $N = Z = A/2$  (ref. <sup>13</sup>) is given by

$$\begin{aligned} W(A) &= \delta V_{pn}(A/2, A/2) \\ &\quad - \frac{1}{2} [\delta V_{pn}(A/2, A/2 - 2) + \delta V_{pn}(A/2 + 2, A/2)]. \end{aligned} \quad (3)$$

The two-proton shell gap  $\delta_{2p}$  (refs. <sup>34,35</sup>) is given by

$$\begin{aligned} \delta_{2p}(N, Z) &= 2B(N, Z) - B(N, Z + 2) - B(N, Z - 2) \\ &= S_{2p}(N, Z) - S_{2p}(N, Z + 2). \end{aligned} \quad (4)$$

The three-point mass difference  $\Delta_n^{(3)}$  (ref. <sup>36</sup>) is given by

$$\begin{aligned} \Delta_n^{(3)}(N, Z) &= \frac{(-1)^N}{2} [2B(N, Z) - B(N - 1, Z) - B(N + 1, Z)] \\ &= \frac{(-1)^N}{2} [S_n(N, Z) - S_n(N + 1, Z)] \end{aligned} \quad (5)$$

The single-particle energy splitting  $\Delta e$  (ref. <sup>36</sup>) is given by

$$\begin{aligned} \Delta e(N, Z) &= e_{n+1} - e_n = 2 [\Delta_n^{(3)}(N = 2n, Z) - \Delta_n^{(3)}(N = 2n + 1, Z)] \\ &= (-1)^N [S_n(N, Z) - S_n(N + 2, Z)]. \end{aligned} \quad (6)$$

In the above equations,  $B$  is the (positive) nuclear binding energy, obtained from the atomic mass of the nucleus.  $S_{2p}$  is the two-proton separation energy

$$S_{2p}(N, Z) = B(N, Z) - B(N, Z - 2), \quad (7)$$

and  $S_n$  is the one-neutron separation energy

$$S_n(N, Z) = B(N, Z) - B(N - 1, Z). \quad (8)$$

**Wigner-energy parameterizations.** The Wigner-energy contribution to the total binding energy produces an additional binding for nuclei close to  $N = Z$ . In the HFB-24 mass model<sup>59</sup>, the Wigner term has been parameterized as

$$E_W(1) = V_W e^{-\lambda_W \left( \frac{N-Z}{A} \right)^2} + V'_W |N - Z| e^{-\left( \frac{A}{A_0} \right)^2}, \quad (9)$$

where  $V_W = 1.8 \text{ MeV}$ ,  $\lambda_W = 380$ ,  $V'_W = -0.84 \text{ MeV}$  and  $A_0 = 26$ . In this model,  $E_W$  rapidly decreases with  $|N - Z|$  when moving away from the  $N = Z$  line. In the traditional parameterization of  $E_W$ :

$$E_W(2) = -a_W \frac{|N - Z|}{A}, \quad (10)$$

one assumes that  $E_W = 0$  at  $N = Z$  and linearly decreases with the neutron excess. In this work, we adopt the value of  $a_W = 47 \text{ MeV}$  from ref. <sup>13</sup>.

**Nuclear models.** In this study we considered nine models based on nuclear DFT: SkM<sup>56</sup>, SkP<sup>57</sup>, SLy4<sup>58</sup>, SV-min<sup>59</sup>, UNEDF0<sup>60</sup>, UNEDF1<sup>61</sup>, UNEDF2<sup>62</sup>, D1M<sup>63</sup> and BCPM<sup>64</sup>. Two additional mass models commonly used in nuclear astrophysics studies were also considered: FRDM2012<sup>12</sup> and HFB-24<sup>39</sup>.

Three of these models (SkM\*, UNEDF0 and FRDM2012) predict large, prolate ground-state deformation for  $^{80}\text{Zr}$  around  $\beta_2 = 0.39$ , in agreement with experiments. HFB-24 predicts an oblate deformed ground state, whereas all the remaining models predict a spherical ground state. Such variations in the predicted ground-state deformation are manifestations of the near-lying coexisting configurations with different shapes expected theoretically, as discussed in the main text. It is important to notice that, although the relative positions of the different minima strongly depend on the underlying interaction<sup>10</sup> and beyond-DFT correlations<sup>8</sup>, the energy shifts between the deformed ground-state configuration

and the spherical minimum are relatively small<sup>10</sup>. As a consequence, the absolute impact of shape coexistence in the predicted mass value is expected to be minor and can be absorbed by the statistical correction.

**Bayesian model averaging.** The binding energies  $B(N, Z)$  predicted by nuclear mass models were used to compute the two-proton separation energies (equation (7)), which were then used to compute the  $\delta V_{pn}$  mass differences.

For each model employed, we construct the statistical emulator  $\delta_{S_{2p}}^{\text{em}}$  of separation energy residuals:

$$\delta_{S_{2p}}^{\text{em}}(N, Z) := S_{2p}^{\text{exp}}(N, Z) - S_{2p}^{\text{th}}(N, Z). \quad (11)$$

The predicted separation energies are then given by  $S_{2p}^{\text{em}}(N, Z) = S_{2p}^{\text{th}}(N, Z) + \delta_{S_{2p}}^{\text{em}}$ . The Bayesian analysis (training and testing) was performed using only experimental data from AME20<sup>23</sup>, without the inclusion of AME20 extrapolated values. Seven nuclei (<sup>48</sup>Ni, <sup>54</sup>Zn, <sup>84</sup>Zr, <sup>86</sup>Mo, <sup>90</sup>Ru, <sup>92</sup>Ru and <sup>94</sup>Pd) placed at the dataset outer boundary were excluded from the training set and were used as independent testing data to compute the BMA evidence weights. For <sup>48</sup>Ni and <sup>54</sup>Zn we employed the experimental  $Q_{2p}$  values from ref. <sup>65</sup> and ref. <sup>66</sup>, respectively. Our dataset thus consists of 152 points  $(x_i, y_i)$ , where  $x_i := (N_i, Z_i)$  and  $y_i := \delta_{S_{2p}}^{\text{em}}(x_i)$ . Following the Bayesian methodology described in ref. <sup>15</sup>, we constructed emulators for separation energy residuals  $\delta^{\text{GP}}(N, Z)$  using Gaussian processes (GPs),  $\delta^{\text{GP}}(x) \sim \mathcal{GP}(\mu, k_{\eta, \rho}(x, x'))$ , over the bi-dimensional domain  $x$ . The GP is characterized by its mean function and covariance kernel, taken respectively as a constant  $\mu$  and squared-exponential covariance kernel

$$k_{\eta, \rho}(x, x') := \eta^2 e^{-\frac{(z-z')^2}{\rho_z^2} - \frac{(N-N')^2}{\rho_N^2}},$$

where  $\rho_z$  and  $\rho_N$  are the correlation ranges along the proton and neutron directions, respectively. The advantage of considering the mean  $\mu$  as a GP hyperparameter has been discussed in ref. <sup>41</sup>.

We add to the model a term accounting for statistical uncertainties, assumed independent, identically distributed and scaled by a parameter  $\sigma$ . Because the experimental uncertainty is small compared to the model uncertainty, following ref. <sup>67</sup>, we have chosen to fix the parameter  $\sigma$  to the experimental errors from AME20. This yields

$$y_i = \delta^{\text{GP}}(x_i) + \sigma \epsilon_i. \quad (12)$$

Thus our GP model is parameterized by the five-dimensional vector  $\theta := (\mu, \eta, \rho_z, \rho_N, \sigma)$ .

Posterior distributions for the  $\mathcal{GP}$  parameters are obtained via Bayes' equation:

$$p(y|\theta) := \frac{p(\theta|y)\pi(\theta)}{\int p(\theta|y)\pi(\theta)d\theta}, \quad (13)$$

where  $p(\theta|y)$  is the likelihood of the statistical model (equation (12)) and  $\pi(\theta)$  the prior on its parameters. Priors were taken as weakly informative, as described in ref. <sup>15</sup>. Samples from the posterior distributions of the  $\mathcal{GP}$  parameters were drawn from iterations of a Monte Carlo Markov chain. These samples of the residuals' emulators were in turn used to produce samples of two-proton separation energies and mass filters, as well as derive statistical predictions (averages and corresponding correlated uncertainties along with full covariance matrices).

In a second stage of the analysis, we ensemble the emulators built from each individual nuclear model according to their BMA weights, namely the posterior probability for each model to be the hypothetical true model, assuming it is one of them, given priors on model weights and data. Although the classical BMA literature<sup>68</sup> relies on the same data  $y$  as used for the individual model's training, for this step we prefer to use new 'testing' data  $y^*$  (<sup>48</sup>Ni, <sup>54</sup>Zn, <sup>84</sup>Zr, <sup>86</sup>Mo, <sup>90</sup>Ru, <sup>92</sup>Ru and <sup>94</sup>Pd) located at the outer boundary of the training set and excluded from the GP training. This ensures that the weights better reflect the extrapolative power of the models and reduces overfitting. Formally, we can write<sup>15</sup> these BMA weights as

$$w_k = p(\mathcal{M}_k|y^*) = \frac{p(y^*|\mathcal{M}_k)\pi(\mathcal{M}_k)}{\sum_{\ell=1}^{11} p(y|\mathcal{M}_\ell)\pi(\mathcal{M}_\ell)}, \quad (14)$$

where  $\pi(\mathcal{M}_k)$  are prior model weights and  $p(y|\mathcal{M}_k)$  are the model evidences obtained by integrating the likelihood equation over the parameter space. For our GP emulators, this gives

$$p(y|\mathcal{M}_k) = \int p(y|\theta_k, \mathcal{M}_k)\pi(\theta_k, \mathcal{M}_k)d\theta_k. \quad (15)$$

We assume uniform prior weights, which are, from a statistical standpoint, the unique non-informative prior distribution in this set-up. To speed up computations and increase stability<sup>69</sup>, the evidence integrals are calculated using the Laplace

approximation<sup>68</sup>, where it is assumed that the posterior is Gaussian with the same mean and standard deviation. The resulting model evidences are

$$p(y|\mathcal{M}_k) \approx \exp \left[ - \sum_i \frac{(y_i^{\text{exp}} - y^{(k)}(x_i))^2}{2\sigma_{y_k}(x_i)^2} \right], \quad (16)$$

where  $y^{(k)}$  are the individual model emulators' predictions,  $\sigma_{y_k}(x)$  the corresponding uncertainties and  $i$  runs over the retained set of nuclei<sup>69</sup>.

The model weights (rounded to two decimal digits) are  $w_k = 0.01$  (SkM\*), 0.04 (SkP), 0.12 (SLy4), 0.16 (SV-min), 0.07 (UNEDF0), 0.11 (UNEDF1), 0.20 (UNEDF2), 0.05 (BCPM), 0.21 (D1M), 0.00 (FRDM) and 0.00 (HFB-24). The final BMA predictions are calculated as

$$y(x) = \sum_k w_k y^{(k)}(x) \quad (17)$$

and the associated uncertainties as

$$\sigma_y^2(x) = \sum_k w_k (y^{(k)}(x) - y(x))^2 + \sum_k w_k \sigma_{y_k}^2(x). \quad (18)$$

This last equation conveniently splits the uncertainties into the uncertainty on the model choice and the uncertainty on the individual models' parameters, and highlights what would be lost if a single model were used. The estimated  $S_{2p}$  values with corresponding uncertainties and covariances are then employed to calculate  $\delta V_{pn}$  and  $\delta_{2p}$  using equations (2), (4) and (7).

Finally, Fig. 3 displays the two-proton shell gap  $\delta_{2p}$  (4). For the  $N=Z+2$  sequence, the BMA prediction agrees with experiment within the estimated uncertainty. For  $N=Z$ , the anomalous mass of <sup>80</sup>Zr results in an increase of  $\delta_{2p}$  above the baseline. Similar to what is seen in Fig. 2b, the HFB-24 and FRDM2012 models that include the Wigner-energy correction lie slightly below the data points. As discussed earlier, this suggests that the Wigner energy term is underestimated by both models.

## Data availability

The data that support the plots within this paper and other findings of this study are available from the corresponding author upon reasonable request.

## Code availability

Our unpublished computer codes used to generate the results reported in this paper and central to its main claims will be made available upon request.

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## Author contributions

A.H., E.L., G.B., K.L., C.R.N., D.P., R.R., C.S.S. and I.T.Y. performed the experiment. A.H., E.L., D.P. and I.T.Y. performed the data analysis. A.H., E.L., W.N., S.A.G. and L.N. prepared the manuscript. R.J., S.A.G., W.N. and L.N. performed the Bayesian analysis. All authors discussed the results and provided comments on the manuscript.

## Competing interests

The authors declare no competing interests.

## Additional information

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