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Atomic fluctuations lifting the energy degeneracy in Si/SiGe quantum dots

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Electron spins in Si/SiGe quantum wells suffer from nearly degenerate conduction band valleys, which compete with the spin degree of freedom in the formation of qubits. Despite attempts to enhance the valley energy splitting deterministically, by engineering a sharp interface, valley splitting fluctuations remain a serious problem for qubit uniformity, needed to scale up to large quantum processors. Here, we elucidate and statistically predict the valley splitting by the holistic integration of 3D atomic-level properties, theory and transport. We find that the concentration fluctuations of Si and Ge atoms within the 3D landscape of Si/SiGe interfaces can explain the observed large spread of valley splitting from measurements on many quantum dot devices. Against the prevailing belief, we propose to boost these random alloy composition fluctuations by incorporating Ge atoms in the Si quantum well to statistically enhance valley splitting.

Advanced semiconductor manufacturing is capable of integrating billions of transistors onto a single silicon chip. The promise of leveraging the same technology for large-scale integration of qubits into a fault-tolerant quantum processing unit is a key driver for developing electron spin qubits in silicon quantum dots¹. Although these devices bear many similarities to transistors², qubits operate in the single electron regime³, making them more sensitive to electrostatic disorder and noise arising from the surrounding environment. In strained silicon quantum wells, the electronically active part of the device is separated by an epitaxial SiGe barrier from the electronically noisy interface at the gate-stack, offering a quiet system with high mobility and low leakage between the gate and the quantum dots⁴. These properties make strained Si/SiGe heterostructures promising for scalable qubit tiles^{5,6} and have made it possible to define nine quantum dot arrays⁷, run quantum algorithms⁸ and entangle three-spin states⁹ in

natural silicon structures, and achieve two-qubit gate fidelity above 99%^{10,11} in isotopically purified silicon structures.

However, spin-qubits in silicon suffer from a two-fold degeneracy of the conduction band minima (valleys) that creates several non-computational states that act as leakage channels for quantum information¹². These leakage channels increase exponentially with the qubit count¹³, complicating qubit operation and inducing errors during spin transfers. Despite attempts to enhance the valley energy splitting, the resulting valley splittings are modest in Si/SiGe heterostructures, with typical values in the range of 20 to 100 μeV ^{8,14–20} and only in a few instances in the range of 100 to 300 μeV ^{21–23}. Such variability in realistic silicon quantum dots remains an open challenge for scaling to large qubit systems. In particular, the probability of thermally occupying the excited valley state presents a challenge for spin initialization, and, in some cases, intervalley scattering may limit

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the spin coherence²⁴. Furthermore, small valley splitting may affect Pauli spin blockade readout²⁵, which is considered in large-scale quantum computing proposals^{5,6}. Therefore, scaling up to larger systems of single-electron spin qubits requires that the valley splitting of all qubits in the system should be much larger than the typical operation temperatures (20–100 mK).

It has been known for some time that valley splitting depends sensitively on the interface between the quantum well and the SiGe barrier²⁶. Past theoretical studies have considered disorder arising from the quantum well miscut angle²⁷ and steps in the interface^{28–32} demonstrating that disorder of this kind can greatly decrease valley splitting in quantum dots. However, a definitive connection to experiments has proven challenging for a number of reasons. At the device level, a systematic characterisation of valley splitting in Si/SiGe quantum dots has been limited because of poor device yield associated with heterostructure quality and/or device processing. At the materials level, atomic-scale disorder in buried interfaces³³ may be revealed by atom-probe tomography (APT) in three-dimensions (3D) over the nanoscale dimensions comparable to electrically defined quantum dots. However, the current models employed to reconstruct in 3D the APT data can be fraught with large uncertainties due to the assumptions made to generate the three-dimensional representation of the tomographic data³⁴. This results in limited accuracy when mapping heterointerfaces³⁵ and quantum wells^{36–38}. These limitations prevent linking the valley splitting in quantum dots to the relevant atomic-scale material properties and hinder the development of accurate and predictive theoretical models.

Herein we solve this outstanding challenge and establish comprehensive insights into the atomic-level origin of valley splitting in realistic silicon quantum dots. Firstly, we measure valley splitting systematically across many quantum dots, enabled by high-quality heterostructures with a low disorder potential landscape and by improved fabrication processes. Secondly, we establish a new method to analyse APT data leading to accurate 3D evaluation of the atomic-level properties of the Si/SiGe buried interfaces. Thirdly, incorporating the 3D atomic-level details obtained from APT, we simulate valley splitting distributions that consider the role of random fluctuations in the concentration of Si and Ge atoms at each layer of the Si/SiGe interfaces. By comparing theory with experiments, we find that the measured random distribution of Si and Ge atoms at the Si/SiGe interface is enough to account for the measured valley splitting spread in real quantum dots. Based on these atomistic insights, we conclude by proposing a practical strategy to statistically enhance valley splitting above a specified threshold as a route to making spin-qubit quantum processors more reliable—and consequently—more scalable.

Results

Material stacks and devices

Figure 1 overviews the material stack, quantum dot devices, and measurements of valley splitting. To increase statistics, we consider two isotopically purified ²⁸Si/Si_{0.7}Ge_{0.3} heterostructures (quantum wells A and B) designed with the same quantum well width and top-interface sharpness (Methods), which are important parameters determining valley splitting^{23,26}. As shown in high angle annular dark field scanning transmission electron microscopy (HAADF-STEM),

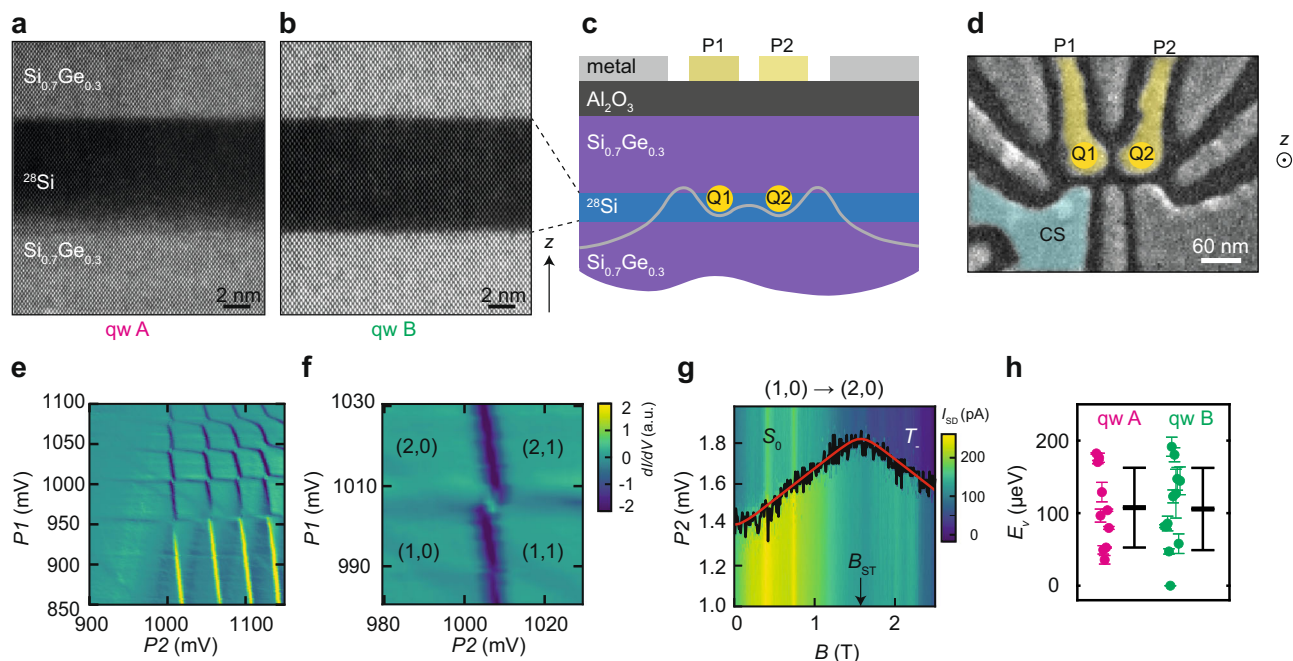


Fig. 1 | Material stack, devices, and valley splitting measurements. **a, b** High-angle annular dark field scanning transmission electron microscopy (HAADF-STEM) of ²⁸Si/SiGe quantum wells A and B, respectively. **c, d** Schematic cross-section of a heterostructure with gate layout and false-coloured scanning electron microscope image of a double quantum dot, respectively. Q1 and Q2 are the quantum dots defined through confinement potentials (schematic, grey line) formed below plunger gates P1 and P2. CS is a nearby quantum dot used as a charge sensor. **e** Typical stability diagram of a double quantum dot formed by plunger gates P1 and P2 and measured by a nearby charge sensor (CS in **d**). **f** Close-up of the stability diagram in the few-electron regime. **g** Typical magnetospectroscopy of the (1,0) → (2,0) transition, used to measure singlet-triplet splittings. An offset of 1082 mV is subtracted for clarity from the gate voltage applied to P2. Black lines show the

location of the maximum of the differentiated charge-sensor signal ($dI_{SD}/dP2$) of the electron charging transition. Red lines show a fit to the data, from which we extract the kink position B_{ST} . The valley splitting E_v is given by $g\mu_B B_{ST}$, where $g=2$ is the gyromagnetic ratio and μ_B is the Bohr magneton. **h** Experimental scatter plots of the valley splittings for quantum wells A (magenta) and B (green), with thick and thin horizontal black lines denoting the mean and two-sigma error bars. For quantum well B, the data point $E_v = 0$ μ eV indicates that the kink in magnetospectroscopy associated with valley splitting was not observed and, consequently, that the valley splitting is below the lower bound of about 23 μ eV set by our experimental measurement conditions (see Supplementary Fig. 6 and Supplementary Table 1).

quantum well A (Fig. 1a) has a sharp $^{28}\text{Si} \rightarrow \text{Si-Ge}$ heterointerface at the top and a diffused $\text{Si-Ge} \rightarrow ^{28}\text{Si}$ heterointerface at the bottom, whereas in quantum well B (Fig. 1b) the growth process was optimized to achieve sharp interfaces at both ends of the quantum well. These heterostructures support a two-dimensional electron gas with high mobility and low percolation density (Supplementary Figs. 1 and 2), indicating a low disorder potential landscape, and high-performance qubits^{10,39} with single- and two-qubit gates fidelity above 99%¹⁰.

We define double-quantum dots electrostatically using gate layers insulated by dielectrics (Methods). A positive gate voltage applied to plunger gates P1 and P2 (Fig. 1c) accumulates electrons in the buried quantum well, while a negative bias applied to other gates tunes the confinement and the tunnel coupling between the quantum dots Q1 and Q2. All quantum dots in this work have plunger gate diameters in the range of 40–50 nm (Fig. 1d and Supplementary Table 1), setting the relevant lateral length scale for atomic-scale disorder probed by the electron wave function.

Valley splitting measurements

We perform magnetospectroscopy measurements of valley splitting E_v in dilution refrigerators with electron temperatures of about 100 mK (Methods). Figure 1e shows a typical charge stability diagram of a double quantum dot with DC gate voltages tuned to achieve the few electron regime, highlighted in Fig. 1f. We determine the 2-electron singlet-triplet energy splitting (E_{ST}) by measuring the gate-voltage dependence as a function of parallel magnetic field B along the $(0,1) \rightarrow (0,2)$ transition (Fig. 1g) and along the $(1,1) \rightarrow (0,2)$ transition (Supplementary Fig. 4). In Fig. 1g, the transition line (black line) slopes upward, because a spin $\uparrow$ electron is added to form a singlet ground state S_0 . Alternatively, a spin down electron can be added to form a T_- -state, with a downward slope. A kink occurs when the S_0 -state is energetically degenerate with the T_- -state, becoming the new ground state of the two-electron-system. From the position of the kink

($B_{\text{ST}} = 1.57$ T) along the theoretical fit (red line) and the relation $E_{\text{ST}} = g\mu_B B_{\text{ST}}$, where $g = 2$ is the electron gyromagnetic ratio and μ_B is the Bohr magneton, we determine $E_{\text{ST}} = 182.3$ μeV for this quantum dot. E_{ST} sets a lower bound on the valley splitting, $E_v \geq E_{\text{ST}}$ ^{21,40}. Due to small size, our dots are strongly confined with lowest orbital energy much larger than E_{ST} (Supplementary Fig. 3), similar to other Si/SiGe quantum dots^{14,18,22}. Therefore, we expect exchange corrections to have negligible effects⁴⁰ and here take $E_v \approx E_{\text{ST}}$.

Here we report measurements of E_v in 10 quantum dots in quantum well A and 12 quantum dots in quantum well B (Supplementary Figs. 5 and 6) and compare the measured values in Fig. 1h. We observe a rather large spread in valley splittings, however we obtain remarkably similar mean values and two-standard-deviation error bars $\bar{E}_v \pm 2\sigma$ of 108 ± 55 μeV and 106 ± 58 μeV for quantum wells A and B, respectively. The quantum dots all have a similar design and hence are expected to have similar electric fields across the devices with a small influence on valley splitting under our experimental conditions. We argue that quantum wells A and B have similar $\bar{E}_v \pm 2\sigma$ because the electronic ground state is confined against the top interface, which is very similar in the two quantum wells.

Atom probe tomography

We now characterise the atomic-scale concentration fluctuations at the quantum well interfaces to explain the wide range of measured valley splittings with informed theoretical and statistical models. To probe the concentrations over the dimensions relevant for quantum dots across the wafer, we perform APT on five samples each from quantum wells A and B, with a field of view of approximately 50 nm at the location of the quantum well (Methods). First, we show how to reliably reconstruct the buried quantum well interfaces, then we use this methodology to characterise their broadening and roughness.

Figure 2a shows a typical point-cloud reconstruction of an APT specimen from quantum well B. Each point represents the estimated

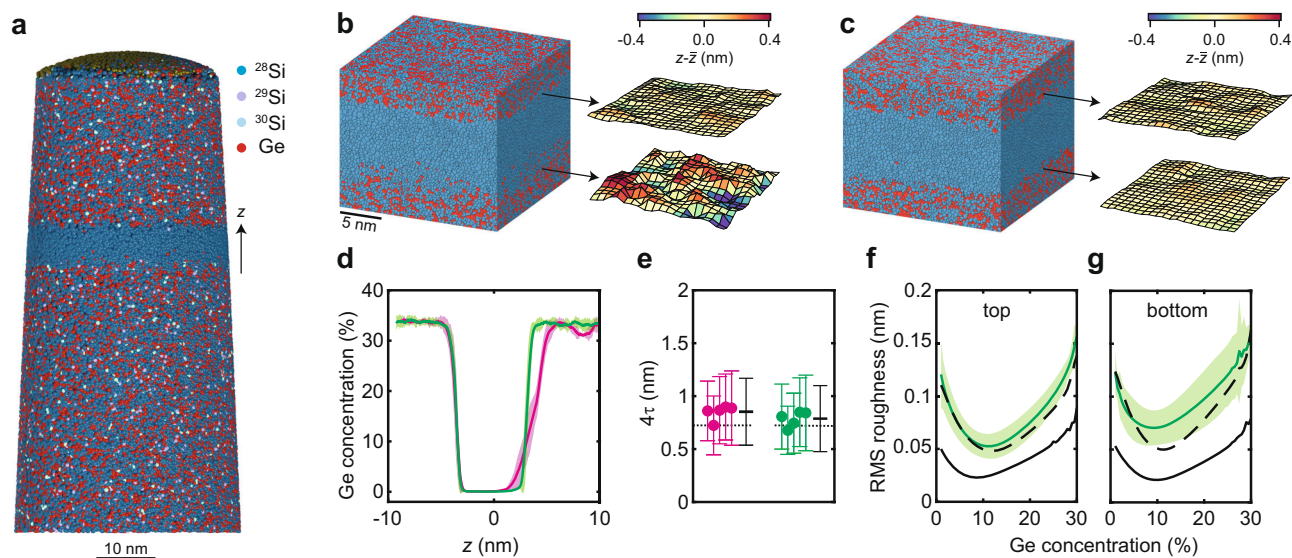


Fig. 2 | Atom probe tomography of $^{28}\text{Si}/\text{SiGe}$ heterostructures. **a** Point-cloud APT reconstruction of quantum well B, showing the ^{28}Si quantum well and surrounding SiGe barriers. Isotopic purification is confirmed by secondary ion mass spectroscopy (Supplementary Fig. 14). **b, c** Voronoi tessellation of the APT reconstructions for quantum wells A and B, respectively, and extracted isosurfaces corresponding to 8% Ge concentration. z is the average position of the 8% Ge concentration across these particular samples. We limit the lateral size of the analysis to $\approx 30\text{nm} \times 30\text{nm}$, reflecting the typical lateral size of a quantum dot (Fig. 1d). **d** Average germanium concentration depth profiles across quantum wells A (magenta) and B (green). Shaded areas mark the 95% confidence interval over each of the sets of five APT samples. **e** Statistical analysis of the top interface width

4τ determined by fitting the data for quantum wells A (magenta) and B (green) to sigmoid functions. Thick and thin horizontal black lines denote the mean and two-standard-deviation error bars for the different APT samples. Dotted black lines show 4τ results from the HAADF-STEM measurements (Supplementary Fig. 13). **f, g** Root mean square (RMS) roughness of the concentration isosurfaces as a function of germanium concentration at the top and bottom interfaces of quantum well B (green line). Shaded areas indicate the 95% confidence interval, averaged over each set of five APT samples. The experimental data are compared to the RMS roughness of a simulated quantum well with the interface properties of (d) (dashed black line) vs. an atomically sharp quantum well (solid black line).

position of an ionized atom detected during the experiment³⁴. Qualitatively, we observe an isotopically enriched ²⁸Si quantum well, essentially free of ²⁹Si, cladded in a SiGe alloy. To probe the interface properties with the highest possible resolution allowed by APT and differently from previous APT studies on Si/SiGe³⁸, we represent the atom positions in the acquired data sets in form of a Voronoi tessellation^{41,42} and generate profiles on an $x-y$ grid of the tessellated data, as described in Supplementary Note 2c. A sigmoid function $[1 + \exp(z - z_0)/\tau)]^{-1}$ ³⁸ is used to fit the profiles of each tile in the $x-y$ grid. Here, z_0 is the inflection point of the interface and 4τ is the interface width. As the Voronoi tessellation of the data set does not sacrifice any spatial information, the tiling in the $x-y$ plane represents the smallest lateral length scale over which we characterise the measured disorder at the interface. Note that we do not average at all over the z axis and hence maintain the inherent depth resolution of APT. We find that for tiles as small as $3 \text{ nm} \times 3 \text{ nm}$ the numerical fitting of sigmoid functions to the profiles converges reliably. Although each tile contains many atoms, their size is still much smaller than the quantum dot diameter, and may therefore be considered to be microscopic. We use the sigmoid fits for each tile stack to visualise and further characterise the interfaces (Supplementary Figs. 8–10). Importantly, Ge concentration isosurfaces as shown in Fig. 2b, c are constructed by determining the vertical position for which each of the sigmoids reaches a specific concentration. Note, that we oversample the interface to improve the lateral resolution by making the $3 \text{ nm} \times 3 \text{ nm}$ tiles partially overlap (Supplementary Note 2c).

In Fig. 2d, we show the average Ge concentration profile and measurement to measurement variations from the tessellated volumes (Supplementary Note 2b, c) of all samples for both quantum wells A and B. APT confirms HAADF-STEM results in Fig. 1a, b: quantum wells A and B have an identical sharp top interface and quantum well A has a broader bottom interface. Furthermore, the shaded colored areas in Fig. 2d reveal narrow 95% confidence levels, pointing to highly uniform concentration profiles when averaged across the wafer. Strong disorder fluctuations emerge at the much smaller tile length scale. In Fig. 2e we show for all samples of a given quantum well the interface width mean value with two standard deviations $4\tau \pm 2\sigma$, obtained by averaging over all the tiles in a given sample. The results indicate uniformity of 4τ , and further averaging across all samples of a given heterostructure ($\mu_{4\tau}$, black crosses) yields similar values of $\mu_{4\tau} = 0.85 \pm 0.32 \text{ nm}$ and $0.79 \pm 0.31 \text{ nm}$ for quantum wells A and B, consistent with our 4τ analysis from HAADF-STEM measurements (black dotted lines). However, the two-standard-deviation errors (2σ) of each data point can be up to 30% of the mean value 4τ .

To pinpoint the root cause of atomic-scale fluctuations at the interface, in Fig. 2f, g we utilize the 3D nature of the APT data sets, calculate, and compare the root mean square (RMS) roughness of the interfaces (solid green lines) as measured by APT on quantum well B to two 3D models (Fig. 2f, g) mimicking the dimensions of an APT data set. Both models are generated with random distributions of Si and Ge in each atomic plane (Supplementary Note 2d). The first model (solid black lines) corresponds to an atomically abrupt interface where the Ge concentration drops from ~33.5% to 0% in a single atomic layer. It hence represents the minimum roughness achievable at each iso-concentration surface given the in-plane randomness of SiGe and the method to construct the interface. The second model (dashed black lines) is generated with the experimentally determined Ge concentration profile along the depth axis (Supplementary Fig. 11). As shown in Fig. 2f, g, the roughness extracted from the second model fits well with the measured data, suggesting that the RMS roughness measured by APT is fully explained by the interface width and shape along the depth axis. Furthermore, as the deviation of each isosurface tile position from the isosurface's average position also matches that of the measured interfaces from the second model (Supplementary Movie 1) the APT data are consistent with a random in-plane

distribution of Ge perpendicular to the interface in all data sets of quantum well B. For 2 out of 5 samples on quantum well A that we analyzed, we observe features that are compatible with correlated disorder from atomic steps (Supplementary Fig. 13). In the following, the alloy disorder observed in the APT concentration interfaces is incorporated into a theoretical model. As shown below, the calculations of valley splitting distributions associated with the 3D landscape of Si/SiGe interfaces can be further simplified into a 1D model that incorporates the in-plane random distribution of Si and Ge atoms.

Valley splitting simulations

We begin by considering an ideal laterally infinite heterostructure with no concentration fluctuations, and we denote the average Si concentration at layer l by $\bar{x}_l$. Due to the finite size of a quantum dot and the randomness in atomic deposition, there will be dot-to-dot concentration fluctuations. We therefore model the actual Si concentration at layer l by averaging the random alloy distribution weighted by the lateral charge density in the quantum dot, giving $x_l^d = \bar{x}_l + \delta_{x_l}$, as described in Supplementary Note 3c. Here, the random variation δ_{x_l} is computed assuming a binomial distribution of Si and Ge atoms. We find that these fluctuations can have a significant impact on the valley splitting.

We explore these effects numerically using 1D tight-binding simulations. We begin with the averaged fitted concentration profiles obtained from the APT analysis in Fig. 2d, which enable us to directly measure the average Ge concentration in a given layer $\bar{x}_l$ (Fig. 3a). The variance of the concentration fluctuations is determined by the size of the quantum dot, which we assume has an orbital excitation energy of $\hbar\omega = 4.18 \text{ meV}$ and corresponding radius $\sqrt{\hbar/m^*\omega}$, as well as the average Si concentration $\bar{x}_l$. Here, m^* is the effective mass of Si. Together, $\bar{x}_l$ and the variance determine the probability distribution of weighted Si and Ge concentrations. Concentration profiles are sampled repeatedly from this distribution, with a typical example shown in Fig. 3b. The valley splitting is then determined from a 1D tight-binding model⁴³. The envelope of the effective mass wavefunction $\psi_{\text{env}}(z)$ is shown in Fig. 3c (grey curve) for an electron confined in the quantum well of Fig. 3b. The procedure is repeated for 10,000 profile samples, obtaining the histogram of valley splittings shown in Fig. 3e. These results agree very well with calculations obtained using a more sophisticated three-dimensional 20-band $\text{sp}^3\text{d}^5\text{s}^*$ NEMO tight-binding model⁴⁴ (Supplementary Note 3b) and confirm that concentration fluctuations can produce a wide range of valley splittings. For comparison, at the top of Fig. 3e, we also plot the same experimental valley splittings shown in Fig. 1h, demonstrating good agreement in both the average value and the statistical spread. These observations support our claim that the valley splitting is strongly affected by composition fluctuations due to random distributions of Si and Ge atoms near the quantum well interfaces, even though the experiments cannot exclude the presence of correlated disorder from atomic steps in quantum dots.

Analytical methods using effective mass theory may also be used to characterise the distribution of valley splittings. First, we model the intervalley coupling matrix element²⁶ as $\Delta = \int e^{-2ik_0z_l} U(z) |\psi_{\text{env}}(z)|^2 dz$, where $k_0 = 0.82 \times 2\pi/a_0$ is the position of the valley minimum in the Si Brillouin zone, $a_0 = 0.357 \text{ nm}$ is length of the Si cubic unit cell, $\psi_{\text{env}}(z)$ is a 1D envelope function, and $U(z)$ is the quantum well confinement potential. The intervalley coupling Δ describes how sharp features in the confinement potential couple the two valley states, which would otherwise be degenerate. In general, Δ is a complex number that can be viewed as the sum of two distinct components: a deterministic piece Δ_0 , arising from the average interface concentration profile, and a random piece $\delta\Delta$, arising from concentration fluctuations. The latter can be expressed as a sum of contributions from individual atomic layers: $\delta\Delta = \sum \delta\Delta_l$, where $\delta\Delta_l$ is proportional to $\delta_{x_l} |\psi_{\text{env}}(z_l)|^2$ (see Methods). To visualize the effects of concentration fluctuations in

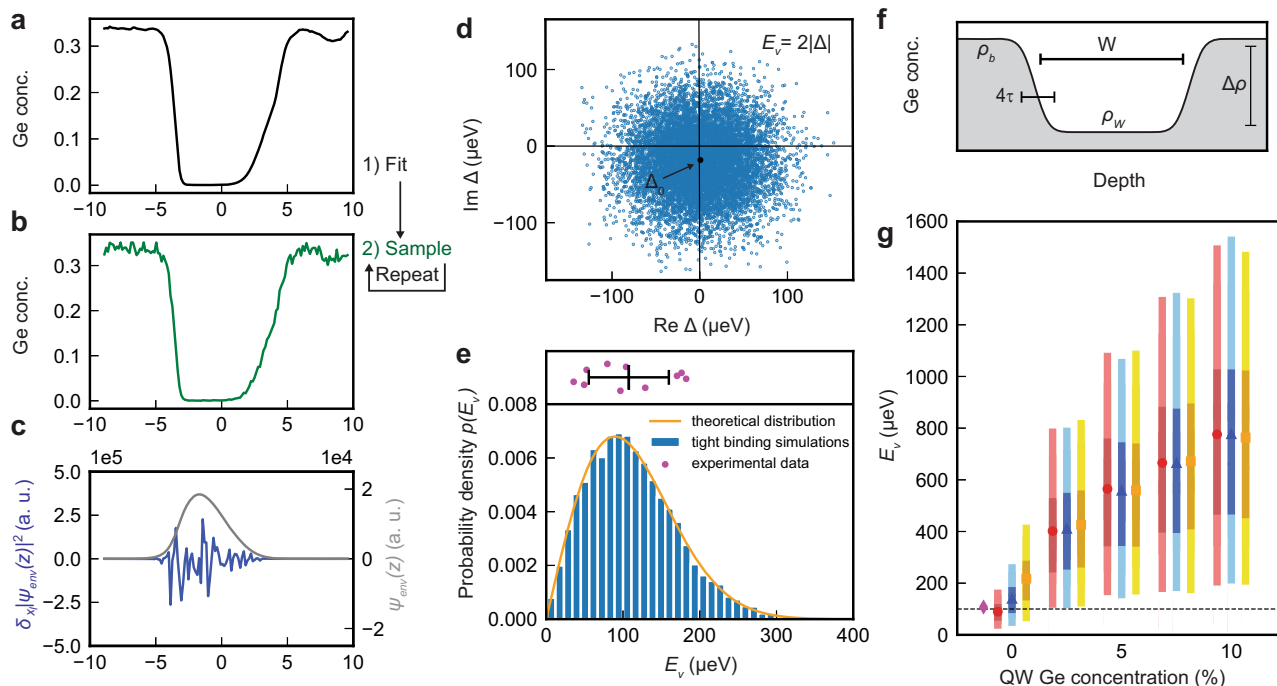


Fig. 3 | Valley-splitting simulations. **a** Average concentration profile obtained from APT data (quantum well A). **b** Typical, randomized Ge concentration profile, derived from **a**. **c** Envelope function $\psi_{\text{env}}(z)$, obtained for the randomized profile in **b** (grey curve), and the corresponding concentration fluctuations weighted by the envelope function squared: $\delta x_i |\psi_{\text{env}}(z_i)|^2$ (blue). Here, the wavefunction is concentrated near the top interface where the concentration fluctuations are also large; the weighted fluctuations are therefore the largest in this regime. **d** Distribution of the intervalley matrix element Δ in the complex plane, as computed using an effective-mass approach, for 10,000 randomized concentration profiles. The black marker indicates the deterministic value of the matrix element Δ_0 , obtained for the experimental profile in **a**. **e** Histogram of the valley splittings from tight-binding simulations with 10,000 randomized profiles. The same profiles may be used to compute valley splittings using effective-mass methods; the orange curve shows a Rice distribution whose parameters are obtained from such

effective-mass calculations (see Methods). **f** Schematic Si/SiGe quantum well with Ge concentrations ρ_w (in the well) and $\rho_b = \rho_w + \Delta\rho$ (in the barriers), with a fixed concentration difference of $\Delta\rho = 25\%$. **g** Distribution of valley splittings obtained from simulations with variable Ge concentrations, corresponding to ρ_w ranging from 0 to 10%, and interface widths $4\tau = 5$ ML (red circles), 10 ML (blue triangles), or 20 ML (orange squares), where ML refers to atomic monolayers. Here, the marker describes the mean valley splitting, while the darker bars represent the 25–75 percentile range and the lighter bars represent the 5–95 percentile range. Each bar reflects 2000 randomized tight-binding simulations of a quantum well of width $W = 120$ ML. The magenta diamond at zero Ge concentration shows the average measured valley splitting of quantum well A. In all simulations reported here, we assume an electric field of $E = 0.0075$ V/nm and a parabolic single-electron quantum-dot confinement potential with orbital excitation energy $\hbar\omega = 4.18$ meV and corresponding dot radius $\sqrt{\hbar/m^* \omega}$.

Fig. 3c, we compute $\delta\Delta_i$ using the randomized density profile of Fig. 3b (blue curve). We see that most significant fluctuations occur near the top interface, where $|\psi_{\text{env}}(z_i)|$ and the Ge content of the quantum well are both large. In Fig. 3d we plot Δ values obtained for 10,000 quantum-well realizations using this effective mass approach. The deterministic contribution to the valley splitting Δ_0 (black dot) is seen to be located near the center of the distribution in the complex plane, as expected. However, the vast majority of Δ values are much larger than Δ_0 , demonstrating that concentration fluctuations typically provide the dominant contribution to intervalley coupling.

The total valley splitting is closely related to the intervalley coupling via $E_v = 2|\Delta|$, and therefore exhibits the same statistical behavior. In Fig. 3e, the orange curve shows the Rice distribution whose parameters are derived from effective-mass calculations of the valley splitting (see Methods), using the same concentration profiles as the histogram data. The excellent agreement between these different approaches confirms the accuracy of our theoretical techniques (Supplementary Note 3d).

Discussion

Based on the results obtained above, we now propose two related methods for achieving large valley splittings (on average), with high yields. Both methods are derived from the key insight of Fig. 3c: due to random alloy fluctuations, the valley splitting is almost always enhanced when the electronic wavefunction overlaps with more Ge atoms. In the first method, we therefore propose to increase the width

of the interface (4τ) as shown in Fig. 3f, since this enhances the wavefunction overlap with Ge atoms at the top of the quantum well. This approach is nonintuitive because it conflicts with the conventional deterministic approach of engineering sharp interfaces. The second method, also shown in Fig. 3f, involves intentionally introducing a low concentration of Ge inside the quantum well. The latter method is likely more robust because it can incorporate both deterministic enhancement of the valley splitting from a sharp interface, and fluctuation-enhanced valley splitting.

We test these predictions using simulations, as reported in Fig. 3g, where different colors represent different interface widths and the horizontal axis describes the addition of Ge to the quantum well. For no intentional Ge in the quantum well, as consistent with the heterostructure growth profile of our measured quantum dots, the calculations show a significant increase in the valley splitting with increasing interface width. Here, the narrowest interface appears most consistent with our experimental results (magenta marker), attesting to the sharp interfaces achieved in our devices. As the Ge concentration increases in the quantum well, this advantage is largely overwhelmed by concentration fluctuations throughout the well. A very substantial increase in valley splitting is observed for all concentration enhancements, even at the low, 5% level. Here, the light error bars represent 5–95 percentiles while dark bars represent 25–75 percentiles. At the 5% concentration level, our simulations indicate that >95% of devices should achieve valley splittings > 100 μeV . This value is more than an order of magnitude larger than the typical operation temperature of spin-

qubits and is predicted to yield a 99% readout fidelity²⁵. This would represent a significant improvement in qubit yield for Si quantum dots. A recent report of SiGe quantum wells with oscillating Ge concentrations provides the first experimental evidence that intentionally placing Ge in the quantum well leads to significant variability and some of the highest recorded values of valley splitting⁴⁵.

In conclusion, we argue for the atomic-level origin of valley splitting distributions in realistic Si/SiGe quantum dots, providing key insights on the inherent variability of Si/SiGe qubits and thereby solving a longstanding problem facing their scaling. We relate 3D atom-by-atom measurements of the heterointerfaces to the statistical electrical characterisation of devices, and ultimately to underlying theoretical models. We observe qualitative and quantitative agreement between simulated valley splitting distributions and measurements from several quantum dots, supporting our theoretical framework. Crucially, we learn that atomic concentration fluctuations of the ²⁸Si → Si-Ge heterointerface are enough to account for the valley splitting spread and that these fluctuations are largest when the envelope of the wavefunction overlaps with more Ge atoms. Moreover, while we have only incorporated random alloy disorder into our theoretical framework so far, we foresee that APT datasets including correlated disorder, such as steps, will be used to further refine our theoretical understanding of valley splitting statistics. Since atomic concentration fluctuations are always present in Si/SiGe devices due to the intrinsic random nature of the SiGe alloy, we propose to boost these fluctuations to achieve on average large valley splittings in realistic silicon quantum dots, as required for scaling the size of quantum processors.

Our proposed approaches are counter-intuitive yet very pragmatic. The interface broadening approach seems viable for hybrid qubits, which require valley splitting to be large enough to be usable but not so large as to be inaccessible. For single-electron spin qubits, which don't use the valley degree of freedom, the direct introduction of Ge in the quantum well appears better suited for targeting the largest possible valley splitting. By adding Ge to the Si quantum well in small concentrations we expect to achieve on average valley splitting in excess of 100 μ eV. Early calculations from scattering theories⁴⁶ suggest that the added scattering from random alloy disorder will not be the limiting factor for mobility in current ²⁸Si/SiGe heterostructures. However, an approximate two-fold reduction in electron mobility was recently reported when an oscillating Ge concentration of about 5% on average is incorporated in the Si quantum well⁴⁵. We speculate that fine-tuning of the Ge concentration in the quantum well will be required for enhancing the average valley splitting while not compromising the low-disorder potential environment, which is important for scaling to large qubit systems. We believe that our results will inspire a new generation of Si/SiGe material stacks that rely on atomic-scale randomness of the SiGe as a new dimension for the heterostructure design.

Methods

Si/SiGe heterostructure growth

The ²⁸Si/SiGe heterostructures are grown on a 100-mm n-type Si(001) substrate using an Epsilon 2000 (ASMI) reduced pressure chemical vapor deposition reactor equipped with a ²⁸SiH₄ gas cylinder (1% dilution in H₂) for the growth of isotopically enriched ²⁸Si. The ²⁸SiH₄ gas was obtained by reducing ²⁸SiF₄ with a residual ²⁹Si concentration of 0.08%⁴⁷. Starting from the Si substrate, the layer sequence for quantum well A comprises a 900 nm layer of Si_{1-x}Ge_x graded linearly from $x = 0$ to 0.3, followed by a 300 nm Si_{0.7}Ge_{0.3} strain-relaxed buffer, an 8 nm tensile strained ²⁸Si quantum well, a 30 nm Si_{0.7}Ge_{0.3} barrier, and a sacrificial Si cap. The layer sequence for quantum well B comprises a 1.4 μ m step-graded Si_(1-x)Ge_x layer with a final Ge concentration of $x = 0.3$ achieved in four grading steps ($x = 0.07, 0.14, 0.21$, and 0.3), followed by a 0.45 μ m Si_{0.7}Ge_{0.3} strain-relaxed buffer, an 8 nm

tensile strained ²⁸Si quantum well, a 30 nm Si_{0.7}Ge_{0.3} barrier, and a sacrificial Si cap. In quantum well A, the Si_{0.7}Ge_{0.3} strain-relaxed buffer and the Si quantum well are grown at 750 °C without growth interruption. In quantum well B the Si_{0.7}Ge_{0.3} strain-relaxed buffer below the quantum well is grown at a temperature of 625 °C, followed by growth interruption and quantum well growth at 750 °C. This modified temperature profile yields a sharper bottom interface for quantum well B as compared to quantum well A.

Atom probe tomography

Samples for APT were prepared in a FEI Helios Nanolab 660 dual-beam scanning electron microscope using a gallium focused ion beam at 30, 16, and 5 kV and using a procedure described in detail in ref. 48. Before preparation, a 150–200 nm thick chromium capping layer was deposited on the sample via thermal evaporation to minimize the implantation of gallium ions into the sample. All APT analyses were started inside this chromium cap with the stack fully intact underneath. APT was carried out using a LEAP 5000XS tool from Cameca. The system is equipped with a laser to generate picosecond pulses at a wavelength of 355 nm. For the analysis, all samples were cooled to a temperature of 25 K. The experimental data are collected at a laser pulse rate of 200–500 kHz at a laser power of 8–10 pJ. APT data are reconstructed using IVAS 3.8.5a34 software and visualized using the AtomBlend add-on to Blender 2.79b and Blender 2.92 software. For the Voronoi tessellation the reconstructed data sets were exported to Python 3.9.2 and then tessellated using the `scipy.spatial.Voronoi` class of SciPy 1.6.2. Note that in these analyses the interfaces are represented as an array of sigmoid functions generated perpendicular to the respective interface on 3 nm × 3 nm tiles that are 1 nm apart. This sacrifices lateral resolution to allow for statistical sampling of the elemental concentrations but preserves the atomic resolution along the depth axis that APT is known to provide upon constructing the interface as shown in Fig. 2a.

Device fabrication

The fabrication process for Hall-bar shaped heterostructure field effect transistors (H-FETs) involves: reactive ion etching of mesa-trench to isolate the two-dimensional electron gas (2DEG); P-ion implantation and activation by rapid thermal annealing at 700 °C; atomic layer deposition of a 10-nm-thick Al₂O₃ gate oxide; deposition of thick dielectric pads to protect gate oxide during subsequent wire bonding step; sputtering of Al gates; electron beam evaporation of Ti:Pt to create ohmic contacts to the 2DEG via doped areas. All patterning is done by optical lithography. Quantum dot devices are fabricated on wafer coupons from the same H-FET fabrication run and share the process steps listed above. Double-quantum dot devices feature a single layer gate metallization and further require electron beam lithography, evaporation of Al (27 nm) or Ti:Pt (3:27 nm) thin film metal gates, and lift-off. For linear quantum dot arrays the gate stack consists of 3 layers of Ti:Pt metallic gates (3:17, 3:27, 3:27 nm) isolated from each other by 5 nm Al₂O₃ dielectric interlayers. The fabrication processes for quantum dot devices are further detailed in ref. 49.

Electrical characterisation of devices

Hall-bar measurements are performed in a Leiden cryogenic dilution refrigerator with a mixing chamber base temperature $T_{MC} = 50$ mK⁵⁰. We apply a source-drain bias of 100 μ V and measure the source-drain current I_{SD} , the longitudinal voltage V_{xx} , and the transverse Hall voltage V_{xy} as function of the top gate voltage V_g and the external perpendicular magnetic field B . From here we calculate the longitudinal resistivity ρ_{xx} and transverse Hall resistivity ρ_{xy} . The Hall electron density n is obtained from the linear relationship $\rho_{xy} = B/en$ at low magnetic fields. The carrier mobility μ is extracted from the relationship $\sigma_{xx} = ne\mu$, where e is the electron charge. The percolation density n_p is extracted by fitting the longitudinal conductivity σ_{xx} to the relation

$\sigma_{xx} \propto (n - n_p)^{1.31}$. Here σ_{xx} is obtained via tensor inversion of ρ_{xx} at $B = 0$. Quantum dot measurements are performed in Oxford and Leiden cryogenic refrigerators with base temperatures ranging from 10 to 50 mK. Quantum dot devices are operated in the few-electron regime. Further details of the 2DEG and quantum dot measurements are provided in the Supplementary Note 1.

Theory and simulations

The quantum-well potential at vertical position z_l is simply defined here as a linear interpolation of the conduction-band offset at the quantum-well interface: $U(z_l) = \frac{x_l^d - x_s}{x_w - x_s} \Delta E_c$, where x_l^d is the average Si concentration in layer l , x_s is the average Si concentration in the strain-relaxed SiGe barriers, x_w is the average Si concentration in the strained quantum well, and ΔE_c is the conduction band offset in the absence of fluctuations. In the effective-mass theory, the intervalley coupling matrix element can then be approximated by the sum

$$\Delta = \frac{a_0}{4} \sum_l e^{-2ik_0 z_l} \frac{x_l^d - x_s}{x_w - x_s} \Delta E_c |\psi_{\text{env}}(z_l)|^2. \quad (1)$$

Defining the local concentration fluctuations as $x_l^d = \bar{x}_l + \delta_{x_l}$, the matrix element can then be split into its deterministic and fluctuating contributions $\Delta = \Delta_0 + \delta\Delta$, where the fluctuating term $\delta\Delta$ contains all dependence on δ_{x_l} :

$$\delta\Delta = \frac{a_0}{4} \frac{\Delta E_c}{x_w - x_s} \sum_l e^{-2ik_0 z_l} \delta_{x_l} |\psi_{\text{env}}(z_l)|^2. \quad (2)$$

The deterministic term Δ_0 represents the matrix element of the ideal, smooth concentration profile, while $\delta\Delta$ describes the fluctuations about this value. For concentration fluctuations δ_{x_l} defined by binomial distributions of Ge and Si atoms, the resulting valley splitting $E_v = 2|\Delta_0 + \delta\Delta|$ corresponds to a Rice distribution with parameters $v = 2|\Delta_0|$ and $\sigma = \sqrt{2\text{Var}[\delta\Delta]}$ ⁵¹. For additional details, see Supplementary Note 3. All simulations and numerical calculations reported in this work were performed using Python 3.7.10 with the open-source libraries NumPy, SciPy, and Matplotlib. The 3D atomistic simulations were done using the large-scale Slater-Koster tight-binding solver NEMO3D. A spin-resolved 20 band sp3d5s* nearest neighbour model was used. Strain optimization was done using a valence force field Keating model.

Data availability

All data included in this work are available from the 4TU. Research Data international data repository at <https://doi.org/10.4121/16592522>.

References

- Vandersypen, L. M. K. & Eriksson, M. A. Quantum computing with semiconductor spins. *Phys. Today* **72**, 38–45 (2019).
- Zwerver, A. M. J. et al. Qubits made by advanced semiconductor manufacturing. *Nat. Electron.* **5**, 184–190 (2022).
- Loss, D. & DiVincenzo, D. P. Quantum computation with quantum dots. *Phys. Rev. A* **57**, 120–126 (1998).
- Maune, B. M. et al. Coherent singlet-triplet oscillations in a silicon-based double quantum dot. *Nature* **481**, 344–347 (2012).
- Vandersypen, L. M. K. et al. Interfacing spin qubits in quantum dots and donors-hot, dense, and coherent. *npj Quant. Inf.* **3**, 34 (2017).
- Li, R. et al. A crossbar network for silicon quantum dot qubits. *Sci. Adv.* **4**, 3960 (2018).
- Zajac, D. M. et al. Scalable gate architecture for a one-dimensional array of semiconductor spin qubits. *Phys. Rev. Appl.* **6**, 054013 (2016).
- Watson, T. F. et al. A programmable two-qubit quantum processor in silicon. *Nature* **555**, 633–637 (2018).
- Takeda, K. et al. Quantum tomography of an entangled three-qubit state in silicon. *Nat. Nanotechnol.* **16**, 965–969 (2021).
- Xue, X. et al. Quantum logic with spin qubits crossing the surface code threshold. *Nature* **601**, 343–347 (2022).
- Noiri, A. et al. Fast universal quantum gate above the fault-tolerance threshold in silicon. *Nature* **601**, 338–342 (2022).
- Zwanenburg, F. A. et al. Silicon quantum electronics. *Rev. Mod. Phys.* **85**, 961–1019 (2013).
- Russ, M., Péterfalvi, C. G. & Burkard, G. Theory of valley-resolved spectroscopy of a Si triple quantum dot coupled to a microwave resonator. *J. Phys.: Condens. Matter* **32**, 165301 (2020).
- Zajac, D. M., Hazard, T. M., Mi, X., Wang, K. & Petta, J. R. A reconfigurable gate architecture for Si/SiGe quantum dots. *Appl. Phys. Lett.* **106**, 223507 (2015).
- Shi, Z. et al. Tunable singlet-triplet splitting in a few-electron si/sige quantum dot. *Appl. Phys. Lett.* **99**, 233108 (2011).
- Scarlino, P. et al. Dressed photon-orbital states in a quantum dot: Intervalley spin resonance. *Phys. Rev. B* **95**, 165429 (2017).
- Ferdous, R. et al. Valley dependent anisotropic spin splitting in silicon quantum dots. *npj Quant. Inf.* **4**, 26 (2018).
- Mi, X., Péterfalvi, C. G., Burkard, G. & Petta, J. R. High-resolution valley spectroscopy of Si quantum dots. *Phys. Rev. Lett.* **119**, 176803 (2017).
- Borjans, F., Zajac, D. M., Hazard, T. M. & Petta, J. R. Single-spin relaxation in a synthetic spin-orbit field. *Phys. Rev. Appl.* **11**, 044063 (2019).
- Mi, X., Kohler, S. & Petta, J. R. Landau-Zener interferometry of valley-orbit states in Si/SiGe double quantum dots. *Phys. Rev. B* **98**, 161404 (2018).
- Borselli, M. G. et al. Measurement of valley splitting in high-symmetry Si/SiGe quantum dots. *Appl. Phys. Lett.* **98**, 123118 (2011).
- Hollmann, A. et al. Large, tunable valley splitting and single-spin relaxation mechanisms in a Si/Si_xGe_{1-x} quantum dot. *Phys. Rev. Appl.* **13**, 034068 (2020).
- Chen, E. H. et al. Detuning axis pulsed spectroscopy of valley-orbital states in SiGe quantum dots. *Phys. Rev. Appl.* **15**, 044033 (2021).
- Kawakami, E. et al. Electrical control of a long-lived spin qubit in a Si/SiGe quantum dot. *Nat. Nanotechnol.* **9**, 666–670 (2014).
- Tagliaferri, M. L. V. et al. Impact of valley phase and splitting on readout of silicon spin qubits. *Phys. Rev. B* **97**, 245412 (2018).
- Friesen, M., Chutia, S., Tahan, C. & Coppersmith, S. N. Valley splitting theory of SiGe/Si/SiGe quantum wells. *Phys. Rev. B* **75**, 115318 (2007).
- Friesen, M. & Coppersmith, S. N. Theory of valley-orbit coupling in a Si/SiGe quantum dot. *Phys. Rev. B* **81**, 115324 (2010).
- Friesen, M., Eriksson, M. A. & Coppersmith, S. N. Magnetic field dependence of valley splitting in realistic Si/SiGe quantum wells. *Appl. Phys. Lett.* **89**, 202106 (2006).
- Kharche, N., Prada, M., Boykin, T. B. & Klimeck, G. Valley splitting in strained silicon quantum wells modeled with 2° miscuts, step disorder, and alloy disorder. *Appl. Phys. Lett.* **90**, 092109 (2007).
- Gamble, J. K., Eriksson, M. A., Coppersmith, S. N. & Friesen, M. Disorder-induced valley-orbit hybrid states in Si quantum dots. *Phys. Rev. B* **88**, 035310 (2013).
- Tariq, B. & Hu, X. Effects of interface steps on the valley-orbit coupling in a Si/SiGe quantum dot. *Phys. Rev. B* **100**, 125309 (2019).
- Dodson, J. P. et al. How valley-orbit states in silicon quantum dots probe quantum well interfaces. *Phys. Rev. Lett.* **128**, 146802 (2022).
- Bennett, S. E. et al. Atom probe tomography characterisation of a laser diode structure grown by molecular beam epitaxy. *J. Appl. Phys.* **111**, 053508 (2012).
- Bas, P., Bostel, A., Deconihout, B. & Blavette, D. A general protocol for the reconstruction of 3D atom probe data. *Appl. Surf. Sci.* **87–88**, 298–304 (1995).

35. Rolland, N. et al. New atom probe tomography reconstruction algorithm for multilayered samples: beyond the hemispherical constraint. *Microscopy Microanal.* **23**, 247–254 (2017).
36. Koelling, S. et al. High depth resolution analysis of Si/SiGe multilayers with the atom probe. *Appl. Phys. Lett.* **95**, 144106 (2009).
37. Melkonyan, D. et al. Atom probe tomography analysis of SiGe fins embedded in SiO₂: facts and artefacts. *Ultramicroscopy* **179**, 100–107 (2017).
38. Dyck, O. et al. Accurate quantification of Si/SiGe interface profiles via atom probe tomography. *Adv. Mater. Interfaces* **4**, 1700622 (2017).
39. Xue, X. et al. CMOS-based cryogenic control of silicon quantum circuits. *Nature* **593**, 205–210 (2021).
40. Ercan, H. E., Coppersmith, S. N. & Friesen, M. Strong electron-electron interactions in Si/SiGe quantum dots. *Phys. Rev. B* **104**, 235302 (2021).
41. Voronoi, G. Nouvelles applications des paramètres continus à la théorie des formes quadratiques. premier mémoire. sur quelques propriétés des formes quadratiques positives parfaites. *Journal für die reine und angewandte Mathematik (Crelles Journal)* **1908**, 97–102 (1908).
42. Voronoi, G. Nouvelles applications des paramètres continus à la théorie des formes quadratiques. deuxième mémoire. recherches sur les paralléloèdres primitifs. *Journal für die reine und angewandte Mathematik (Crelles Journal)* **1908**, 198–287 (1908).
43. Boykin, T. B. et al. Valley splitting in low-density quantum-confined heterostructures studied using tight-binding models. *Phys. Rev. B* **70**, 165325 (2004).
44. Klimeck, G. et al. Atomistic Simulation of Realistically Sized Nano-devices Using NEMO 3-D-Part I: Models and Benchmarks. *IEEE Transactions on Electron Devices* **54**, 2079–2089 (2007).
45. McJunkin, T. et al. SiGe quantum wells with oscillating Ge concentrations for quantum dot qubits. Preprint at <http://arxiv.org/abs/2112.09765> (2021).
46. Monroe, D., Xie, Y. H., Fitzgerald, E. A., Silverman, P. J. & Watson, G. P. Comparison of mobility-limiting mechanisms in high-mobility Si_{1-x}Ge_x heterostructures. *J. Vacuum Sci. Technol. B* **11**, 1731 (1993).
47. Sabbagh, D. et al. Quantum transport properties of industrial ²⁸Si/²⁸SiO₂. *Phys. Rev. Applied* **12**, 014013 (2019).
48. Koelling, S. et al. (Invited) Probing semiconductor heterostructures from the atomic to the micrometer scale. *ECS Trans.* **98**, 447–455 (2020).
49. Lawrie, W. et al. Quantum dot arrays in silicon and germanium. *Appl. Phys. Lett.* **116**, 080501 (2020).
50. Paquelet Wuetz, B. et al. Multiplexed quantum transport using commercial off-the-shelf CMOS at sub-kelvin temperatures. *npj Quant. Inf.* **6**, 43 (2020).
51. Aja-Fernández, S. & Vegas-Sánchez-Ferrero, G. Statistical Analysis of Noise in MRI: Modeling, Filtering and Estimation. Springer (2016).

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Author contributions

A.S. grew and designed the Si/SiGe heterostructures with B.P.W. and G.S. M.P.L., R.R., S.N.C., and M.F. developed the theory. S.K. performed atom probe tomography and analyzed the data with B.P.W., and L.A.E.S. M.L. fabricated heterostructure field effect transistors measured by B.P.W. S.A. and N.S. fabricated quantum dot devices measured by B.P.W., A.J.Z., S.G.J.P., M.T.M., X.X., G.Z., and N.S. S.N.C., O.M., M.F., and G.S. supervised the project. G.S. conceived the project. B.P.W., M.P.L., S.K., and G.S. wrote the manuscript with input from all authors.

Competing interests

M.P.L., S.N.C., and M.F. declare a related patent application that proposes to intentionally introduce Ge into the quantum well, to increase the average valley splitting: US Patent Application No. 63/214957 (currently under review). The remaining authors declare no competing interests.

Additional information

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