

ARTICLE



1

https://doi.org/10.1038/s41467-021-24208-3

OPFN

High thermoelectric figure of merit of porous Si nanowires from 300 to 700 K

Lin Yang ^{1,7}, Daihong Huh^{2,3,7}, Rui Ning^{2,7}, Vi Rapp¹, Yuqiang Zeng ¹, Yunzhi Liu², Sucheol Ju³, Yi Tao⁴, Yue Jiang ⁵, Jihyun Beak ⁵, Juyoung Leem ⁵, Sumanjeet Kaur¹, Heon Lee ³, Xiaolin Zheng ^{5⊠} & Rayi S. Prasher ^{1,6™}

Thermoelectrics operating at high temperature can cost-effectively convert waste heat and compete with other zero-carbon technologies. Among different high-temperature thermoelectrics materials, silicon nanowires possess the combined attributes of cost effectiveness and mature manufacturing infrastructures. Despite significant breakthroughs in silicon nanowires based thermoelectrics for waste heat conversion, the figure of merit (ZT) or operating temperature has remained low. Here, we report the synthesis of large-area, wafer-scale arrays of porous silicon nanowires with ultra-thin Si crystallite size of ~4 nm. Concurrent measurements of thermal conductivity (κ), electrical conductivity (σ), and Seebeck coefficient (S) on the same nanowire show a ZT of 0.71 at 700 K, which is more than ~18 times higher than bulk Si. This ZT value is more than two times higher than any nanostructured Si-based thermoelectrics reported in the literature at 700 K. Experimental data and theoretical modeling demonstrate that this work has the potential to achieve a ZT of ~1 at 1000 K.

¹ Energy Technology Area, Lawrence Berkeley National Laboratory, Berkeley, CA, USA. ² Department of Materials Science and Engineering, Stanford University, Stanford, CA, USA. ³ Department of Material Science and Engineering, Korea University, Seoul, Republic of Korea. ⁴ Department of Mechanical Engineering, Vanderbilt University, Nashville, TN, USA. ⁵ Department of Mechanical Engineering, Stanford University, Stanford, CA, USA. ⁶ Department of Mechanical Engineering, University of California, Berkeley, CA, USA. ⁷ These authors contributed equally: Lin Yang, Daihong Huh, Rui Ning. Emenail: xlzheng@stanford.edu; rsprasher@lbl.gov

oughly 50% of primary energy worldwide is rejected as waste heat over a wide range of temperatures. Waste heat above 573 K has the highest Carnot potential (>50%) to be converted to electricity due to higher Carnot efficiency¹. Technoeconomic analysis² shows that thermoelectrics (TE) operating above 573 K can cost-effectively convert waste heat and compete with other zero carbon and waste heat conversion technologies. However, commercial deployment of high-temperature TE is still eluding due to many challenges such as manufacturing scalability, reliability, chemical stability, and toxicity³. Among different high-temperature TE materials proposed⁴⁻⁷, silicon nanowires (SiNWs)^{8,9} possess the attributes to solve these challenges.

Historically, silicon (Si) has not been considered for TE applications due to its very low $ZT = S^2 \sigma T / \kappa (\approx 0.01 \text{ at } 300 \text{ K})$ caused by the high κ (145 W/m-K). This changed in 2008 when researchers reported that SiNW with rough surfaces or thin SiNW arrays could achieve a low κ of ~1 W/m-K, which translated into a ZT value ~0.68 and ~0.249 at 300 K, respectively. To increase the energy conversion efficiency (η) of a TE module, it is important to increase both the hot side temperature ($T_{\rm H}$) and ZT as $\eta = \left(1 - \frac{T_{\rm C}}{T_{\rm H}}\right) \times \frac{\sqrt{1+ZT}-1}{\sqrt{1+ZT}+T_{\rm C}/T_{\rm H}}$ ($T_{\rm C}$ is cold-side temperature). TE material costs also become competitive with other zero-carbon energy technologies when operating temperatures exceed 550 K². $T_{\rm H}$ in many industrial waste heat sources is higher than 550 K¹. Increasing $T_{\rm H}$ also has a significant impact on reducing the cost of heat exchangers $T_{\rm H}$

To date, single SiNW measurement⁸ for high ZT have been performed for $T_{\rm H} \leq 300 {\rm K}$ due to many challenges related to high temperatures^{11,12}. Some of these challenges are: (1) measurement errors in high temperature due to enhanced radiation heat loss to the local ambient and coupling between the heating and sensing membranes; (2) non-stable platinum (Pt) heater/thermometer electrical resistance at high temperature; and (3) difficulty in simultaneously measuring κ , S, and σ on the same sample. In previous SiNW measurements, S and σ were measured on different samples with presumably similar dimensions and sample qualities^{8,13}. Previous measurements on SiNW were also performed on a single sample under given preparation conditions without a systematic study on the effects of various parameters such as doping level^{8,9,13}.

In this paper, we conducted systematic optimization of the synthesis and doping conditions to achieve high-performance SiNW thermoelectrics. We measured the average ZT of single porous SiNW (three different samples) reaching 0.31 at 300 K and 0.71 at 700 K with simultaneous measurements of κ , σ , and S on the same individual wire. Although porous SiNW has been proposed as a promising TE due to their exceptionally low κ^{14-16} , simultaneous measurements of temperature-dependent κ , σ , and S is lacking due to sample synthesis and measurement challenges. We overcome these measurement challenges by designing an advanced suspended microdevice platform to improve measurement accuracy and extend the measurement temperature range. This is achieved by using multiple radiation shields and high-temperature microdevice annealing steps (see Supplementary Note 1 and Supplementary Figs. 1 and 2). Moreover, we synthesized uniform porous SiNWs with ultra-thin Si crystallite size (3.8–4.7 nm) by combining nanoimprint lithography (NIL)¹⁷ with top-down metalassisted chemical etching (MACE)¹⁸ method. We also accurately determined the doping concentration of various SiNWs tested as opposed to previous work where the doping levels are unknown^{8,13}. In our process, we systematically vary doping concentration and porosity to optimize the ZT. The ZT value of 0.71 at 700 K for SiNWs is higher than any nanostructured Si-based TE reported in the literature at the same temperature (0.14-0.32)^{13,19-26}. Such enhancement in ZT is achieved by significantly lowering κ , moderately reducing σ , and

maintaining similar *S* to bulk Si, which demonstrates the potential of using nanostructured Si to convert high-temperature waste heat.

Results

Porous Si nanowire fabrication and thermoelectric measurement scheme. Figure 1a-c schematically illustrates the porous SiNW fabrication procedures, which involves first patterning metals with nanoimprint lithography, followed by MACE etching and post doping with spin-on dopants (see details in Supplementary Note 2 and Supplementary Figs. 3-5). The boron concentration (p) of SiNW was quantified by the secondary ion mass spectrometry (SIMS, see "Methods"). Figure 1d shows an SEM image of an as-fabricated SiNW with a diameter ~218 nm. The porosity (ϕ) of SiNW was varied from ~9% to 61% (Fig. 1e, f) by varying the doping concentration of starting Si wafer and MACE etching conditions, and the porosity was determined by the gravimetric measurement method (see Supplementary Note 3). The porous SiNW is single crystalline as evidenced by the selected area diffraction (SAD) pattern (Supplementary Fig. 6) and the average crstallite size is 3.8 to 4.7 nm from the photoluminescence measurement (see "Methods").

The TE properties of individual SiNW were measured using the custom-fabricated suspended microdevice method²⁷⁻²⁹, for which a SiNW is placed between two suspended SiNx membranes with integrated Pt heaters/resistance thermometers and electrodes (Fig. 1g). We implemented several strategies to accurately measure TE property at high temperature, including: (1) additional radiation shield was used to minimize the radiation heat loss to the surroundings for better temperature control^{30,31} (Supplementary Figs. 1a, b) and (2) high temperature (1000 K in Ar environment) microdevice annealing was conducted to increase the stability of Pt heater/thermometers¹² (see Supplementary Note 1 and Supplementary Fig. 1c), and (3) an empty device (without nanowire bridging the gap) was directly measured to calibrate background thermal conductance caused by radiation heat transfer³² (see Supplementary Note 1 and Supplementary Fig. 2). The contact thermal resistance between the nanowire and underlying electrodes has been confirmed to be negligible (details in Supplementary Note 4).

Measured room temperature thermoelectric properties. We varied the SiNW porosity and doping concentration by changing the initial p-type Si wafer doping concentration, H₂O₂ concentration in MACE, and post-doping conditions, to study their effects on the TE properties of SiNWs. Table 1 summarizes the physical properties and measured TE properties of all tested SiNWs. The porosity for SiNWs fabricated from P, P+, and P++ wafers with 0.22 M H₂O₂ is 9%, 46%, and 61%, respectively (see Table 1). Higher initial Si wafer doping concentration leads to SiNWs with a higher porosity because the dopant atom sites act as preferential locations for pore formation³³. Both κ and σ were extracted using the effective medium theory to account for the porosity¹⁹. Although high porosity reduces κ by one order of magnitude compared to bulk Si due to pore boundary scattering, it significantly reduces σ by orders of magnitude compared to the starting wafer because of the removal of dopant atoms. Moreover, when the porosity reaches the percolation threshold (~57%), electron hopping becomes the dominant mechanism for charge carrier transport³⁴, and the hopping mobility could be five orders of magnitudes lower than the charge mobility of bulk Si^{34,35}. This explains the observed ultralow σ of SiNW with high porosity. The results in Table 1 indicate that the optimization process of TE properties of SiNWs is a delicate tradeoff between porosity and doping concentration.

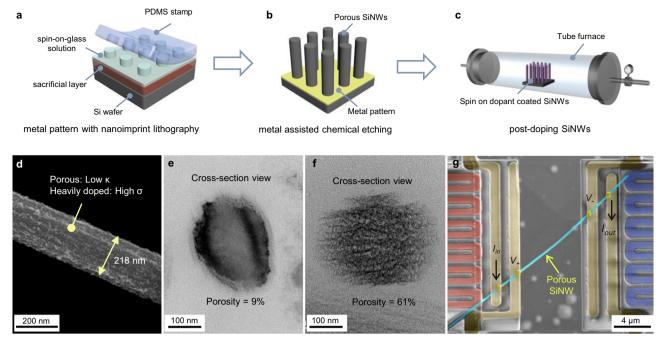


Fig. 1 SiNW fabrication, morphology, and thermoelectric measurement with suspended microdevice. Schematic drawing showing the sample fabrication process: a nanoimprint lithography (NIL) method to pattern metals, b metal-assisted chemical etching (MACE) to fabricate porous Si nanowire (SiNW) array, c post-doping (PD) SiNW arrays with a spin-on dopant (SOD) and high-temperature annealing (see details in Supplementary Note 2 and Supplementary Figs. 3-5). d SEM image of the as-fabricated porous SiNW. TEM images showing the cross-section view of two SiNWs with a porosity of e 9% and f 61%. g False-color SEM image showing the suspended microdevice with a porous SiNW placed to bridge the gap of two membranes for thermoelectric properties measurements. The Pt serpentine electrical leads marked with red and blue color indicate heating and sensing side thermometers, respectively. The electrical resistance of the individual nanowires is measured using the four-probe method, and the Seebeck coefficient is measured simultaneously with the thermal conductivity measurements.

Starting wafer (p, σ, κ) H_2O_2 (M)	P (-9 × 10 ¹⁴ cm ⁻³ , 10 S/m, 145 W/m-K) ^a		$P+ (-8 \times 10^{16} \text{ cm}^{-3}, -10^3 \text{ S/m}, 134 \text{ W/m-K})^a$						P++ (~1 × 10 ¹⁹ cm ⁻³ , 10 ⁵ S/m 113 W/m-K) ^a
	0.22		0.22				0.33	0.44	0.22
Porosity (%)	9		46				60	67	61
Post-doping	No	Yes	No	Yes	Yes	Yes	Yes	Yes	No
Final doping level (p , $\times 10^{18}$ cm ⁻³)	1.6E-5 ^c	2.1	3.9E-3 ^c	4.7	23	220	12.7	34	4.8
Si crystallite size (nm)	4.7	4.7	3.9	3.9	3.9	3.9	3.8	3.8	3.8
κ (W/m-K) ^b	9.32	9.13	5.43	4.41	4.08	4.85	3.19	2.18	2.56
σ (S/m) ^b	0.03	3258	1.05	2886	11,950	115,101	32.3	0.51	3.63
S (μV/K) ^b		445.1		430.9	381.7	206.2	419.3		
ZT (300 K)		0.021		0.037	0.13	0.31	0.00053		
ZT (700 K)		0.098		0.16	0.35	0.71	0.0076		

Temperature-dependent thermoelectric properties. Figure 2 shows the temperature-dependent $\kappa_{\rm eff}$, $\sigma_{\rm eff}$, and S of SiNWs of various porosity (below the percolation threshold), boron doping concentration (post-doping level), and diameter D. The values of $\kappa_{\rm eff} = \frac{{\rm GL}}{A}$ and $\sigma_{\rm eff} = \frac{L}{{\rm RA}}$ were extracted based on nanowire diameter $(A = \pi D^2/4)$ without porosity correction, and G, R, and L are measured thermal conductance, electrical resistance, and nanowire length, respectively (see Supplementary Note 5 for details). The effective thermal conductivity $\kappa_{\rm eff}$ (Fig. 2a) is mainly affected by porosity and less sensitive to the doping concentration and diameter for the SiNWs (Supplementary Fig. 9a) tested here. Higher porosity leads to smaller $\kappa_{\rm eff}$ due to pore boundary scattering. The effective electrical conductivity $\sigma_{\rm eff}$ is a strong function of both the porosity and doping concentration. Higher doping

concentration is needed to achieve la2rge $\sigma_{\rm eff}$. For similar doping concentrations, low porosity leads to large $\sigma_{\rm eff}$. As expected, the Seebeck coefficient S shows approximately the opposite dependence as compared to $\sigma_{\rm eff}$ on doping concentration.

Among all SiNWs tested, porous SiNWs with $p = 2.2 \times 10^{20}$ cm⁻³ and porosity of 46% (152, 171, and 184 nm) show the highest ZT (Fig. 2d). For each type of SiNW, we measured three samples and the results are consistent as shown in Fig. 2d. The average ZT reaches 0.71 at 700 K. Figure 2d also shows the ZT values of Si in various forms, such as single rough SiNW8,13, SiNW arrays9, holey Si¹⁹, polycrystalline Si nanotube mesh²⁰, nanobulk Si^{21–26}, and optimally doped bulk Si³⁶. It can be seen that the ZT of our SiNW at 300 K lies between the ZT value obtained previously on rough SiNWs⁸ and thin SiNW arrays⁹. At elevated temperature,

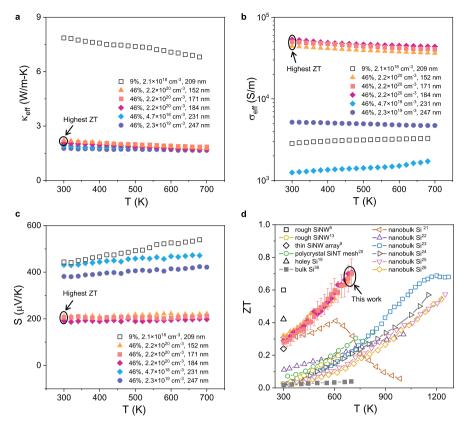


Fig. 2 Temperature-dependent thermoelectric properties. Measured **a** effective thermal conductivity, $\kappa_{\rm eff}$, **b** effective electrical conductivity, $\sigma_{\rm eff}$, and **c** Seebeck coefficient, *S*, of various porous SiNWs as a function of temperature. For the legend, the first number represents SiNW porosity, the middle one is boron doping concentration (p) measured using secondary ion mass spectrometry (SIMS, see Methods), and the last number is SiNW diameter. Note $\kappa_{\rm eff}$ and $\sigma_{\rm eff}$ are extracted based on nanowire diameter without normalizing with porosity. **d** Calculated thermoelectric figure of merit ZT for the three samples with $\phi = 46\%$ and $p = 2.2 \times 10^{20}$ cm⁻³ (152, 171, 184 nm) with the highest ZT in this work, where the previously measured ZT results of single rough SiNW8,13, thin SiNW array⁹, polycrystalline Si nanotube mesh²⁰, holey Si¹⁹, nanobulk Si²¹⁻²⁶ and bulk Si (8.1 × 10¹⁹ cm⁻³ boron-doped)³⁶ are plotted for comparison. The error bars represent ZT uncertainties calculated based on measurement errors in κ , σ , and *S* (see Supplementary Note 5).

the ZT of our SiNW is significantly higher than other forms of Si, and only Bux *et al.* showed a ZT of nanobulk Si reaching 0.70 at 1100 K²³. The main reason for the higher ZT of our SiNWs is due to the smaller crystallite size in our sample (3.8–4.7 nm) as compared to other forms of Si where the crystalline size is at least 10 nm or higher^{21–26}. This leads to about a two to five times lower κ for our SiNW.

Theoretical modeling to understand the high ZT. κ and σ of solid Si skeleton is extracted by applying the effective medium theory through dividing $\kappa_{\rm eff}$ and $\sigma_{\rm eff}$ data by $(2-2\phi)/(2+\phi)^{19}$ (Fig. 3). Figure 3a shows that while we obtained significant reduction in κ as compared to bulk Si, the power factor $(S^2\sigma)$ is comparable to bulk Si, leading to a significant increase in ZT. In previous work, TE properties of rough SiNW could not be explained theoretically 8,14. For our porous SiNW, κ is modeled using Callaway-Holland model³¹ and σ is modeled using the Boltzmann transport equation under the relaxation time approximation³⁷ by including the nanopore boundary scattering. Modeling of transport properties of random nanoporous material is very challenging. Therefore, most of the theoretical/numerical models are for periodic geometries^{38,39}. Herein, we analytically model κ and σ (see Supplementary Notes 6 and 7) where the biggest unknown is the scattering time due to boundary scattering from the pore. Recently, Yang et al.³¹ showed the κ of Si nanostructures is directly proportional to V/S where V is the solid volume and S is the surface area of the nanoscale geometry. The boundary scattering length given by 4 V/S matches their data very well (Supplementary Fig. 11). We assume that the boundary scattering length of our porous SiNW is also given by 4 V/S for both κ and σ . Since the crystallite size varies in a narrow range, V/S is mainly dependent on ϕ (Supplementary Note 6). Figure 3b, c show that the analytical model matches well for both κ and σ with different values of ϕ and p, and that κ is mainly affected by ϕ whereas σ is sensitive to both ϕ and p. Note that for the highest ZT sample ($\phi = 46\%$, $p = 2.2 \times 10^{20} \text{ cm}^{-3}$), charge carriers also make a non-negligible contribution to thermal transport. The electronic conductivity κ_e was estimated using the Wiedemann-Franz law and added to the modeled lattice κ in Fig. 3b. We also modeled S using the diffusion charge carrier model¹⁶. The modeled S matches the data at high temperatures much better than at lower temperatures, however, the reason for this behavior is unclear. Sadhu et al. 16 also observed higher S for nanoporous SiNW as compared to bulk Si at 300 K.

Discussion

Our experimental data and theoretical model show that κ , σ , and S are relatively independent of temperature for the best performing SiNW (Figs. 2 and 3), making Z independent of temperature (Supplementary Fig. 12). Our model also shows that Z is relatively independent of temperature at high temperatures. Assuming this holds for T > 700 K, a ZT of about 1 can be achieved at T = 1000 K; however, experimental validation will require new materials for the heaters and sensors in the measurement platform, as Pt/Cr become unstable at these temperatures 40 . To develop practical nanowire-based

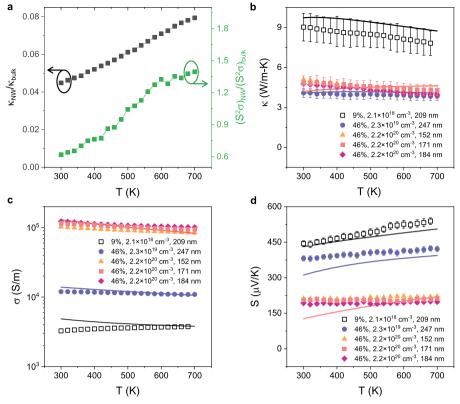


Fig. 3 Theoretical modeling on thermoelectric properties of porous SiNWs. a Black square represents the ratio of porous SiNW κ (ϕ = 46% and p = 2.2 × 10²⁰ cm⁻³, 171 nm) to that of optimally doped bulk Si (8.1 × 10¹⁹ cm⁻³ boron-doped)³⁶ as a function of temperature. Green squares show the ratio of power factor of porous SiNW (ϕ = 46% and p = 2.2 × 10²⁰ cm⁻³, 171 nm) to that of the optimally doped bulk Si (8.1 × 10¹⁹ cm⁻³ boron-doped)³⁶. **b-d** Comparison between the measured temperature-dependent (**b**) κ , (**c**) σ , and (**d**) S with modeled results considering the effects of pore boundary scattering. Note that in panel **b** for the ϕ = 46% and p = 2.2 × 10²⁰ cm⁻³ sample, charge carriers make a non-negligible contribution to thermal transport, and the modeled κ is the sum of the calculated lattice thermal conductivity and electronic thermal conductivity, κ _e, estimated using the Wiedemann-Franz law. The error bars in κ represent uncertainties calculated based on measurement errors in thermal conductance, porosity, nanowire length and cross-section. The error bars in σ represent uncertainties calculated based on measurement errors in electrical resistance, porosity, nanowire length and cross-section, and the magnitude of the error bars are smaller than the symbol size for σ . The error bars in S are determined as the standard deviation from linear least square fitting (see Supplementary Note 5).

thermoelectric devices, one challenge is to minimize the contact electrical resistance between the nanowire and metal electrodes for optimum current and power output. For the future technology development, strategies such as chemical mechanical polishing to reduce the nanowire array top surface roughness, and subsequent rapid thermal annealing to form strong metallic bonds will be adopted.

For TE waste heat conversion to become a viable and competitive technology with other zero-carbon and waste heat conversion technologies, the levelized cost of electricity (LCOE)⁴¹ must be competitive. Among other things LCOE depends on the capital cost (e.g., material), and lifetime the technology can survive. For example, Si-based PV has a lifetime of 25 years. Even though the efficiency of more sophisticated PV, such as fresh samples of multi-junction solar cells, is twice that of Si⁴², Si-based PV completely dominates the market due to low material cost, scalability, and high reliability. Although other nanostructured TE materials with higher ZT (~2 or higher)⁵⁻⁷ have been synthesized, however, analogous to Si-based PV, Si-based TE may offer significantly lower LCOE. Therefore, we believe our results provide concrete material design guidelines for creating potentially highly cost-effective SiNW-based TE energy converters. We note that LCOE also depends on other factors such as integration, processing and heat exchanger costs, however, achieving higher temperature and availability of stable and cheap TE material are very important to reduce LCOE41.

Methods

Thermoelectric measurements of individual SiNWs. For thermoelectric properties measurements, we first immersed the porous SiNW arrays in reagent alcohol to form a suspension. After sonicating for $\sim\!10\,\mathrm{s}$, a droplet of the suspension was drop-casted on a piece of polydimethylsiloxane (PDMS) substrate. We then used a house-built sharp microprobe to pick up individual nanowire and place it between the gap of two side-by-side suspended membranes. The microdevice was then loaded in a cryostat (Janis VPF-800) and the thermoelectric properties were measured under a high vacuum (<1 $\times\!10^{-6}\,\mathrm{mbar}$) condition 43,44 .

Several strategies are applied to solve the technical challenges for hightemperature thermal conductivity measurements (see details in Supplementary Note 1). We measured the electrical resistance of the nanowire using the fourprobe method to avoid the effects of contact electrical resistance (Fig. 1g). A DC voltage output from the data acquisition (DAQ) board (National Instruments PCI-6052e) is used as the voltage source, which was connected to a large resistor (1 M Ω) in series with the microdevice. During the measurements, a sweeping DC current was applied to the porous SiNW through varying the DC output voltage. We measured the voltage difference between the two inner electrodes of the nanowire sample using a voltage amplifier (Stanford Research Systems, SR560), and meanwhile, the DC current was measured by a current amplifier (Keithley 6487). We obtained the temperature-dependent electrical resistance (R(T)) by fitting the measured linear I-V curve. To ensure accurate measurements for samples with a large resistance (>1 M Ω), the measured voltage signal is passed through an instrumentation amplifier (Texas Instruments INA110) with a large input impedance (>10 GΩ) before fed into the voltage amplifier (SR560)45

To cancel out the effects of temperature fluctuation caused by temperature controller and increase the sensitivity for thermal conductivity measurements, a Wheatstone bridge circuit was adopted by introducing a blank device at the sensing side of measurement device⁴⁶. During the thermal measurements, the Seebeck coefficient for each sample was simultaneously measured by monitoring the temperature difference of the heating and sensing membranes and the induced voltage difference (SR560) across the two inner electrodes of the measurement device.

Fabrication of porous SiNWs. The fabrication steps of porous SiNWs were described in Supplementary Figs. 3–5. The metal pattern required for metal-assisted chemical etching (MACE) was formed using direct printing and lift-off methods, and conventional MACE was conducted using the metal catalyst patterned on a silicon wafer (details in Supplementary Note 2).

To achieve high electrical conductivity for the porous SiNWs, a post-doping process was conducted. This technique is based on solid-state dopant diffusion and is comprised of two stages: dopant pre-deposition and diffusion. First, SiNWs were dip-coated with the high concentration boron solution (SOD, 2–2.5 wt% Boron in SOG (spin-on-glass) solution) (Supplementary Fig. 4h), followed by annealing in a tube furnace (Ar 95 vol %/O₂ 5 vol%) at 850 °C for 30 min, and the coated dopant solution was then removed using 2 wt% HF solution for 10 min (Supplementary Fig. 4i). Post-doped samples with higher doping levels ($\phi = 46\%$, $p = 2.2 \times 10^{20}$ cm⁻³) were prepared by repeating the previous step using the same condition, and lightly post-doped sample ($\phi = 46\%$, $p = 4.7 \times 10^{18}$ cm⁻³) was annealed at 700 °C for 15 min under the same gas condition.

Gravimetric method for porosity measurement. For the porous SiNWs etched from the P++ type wafer, the porosity is large enough to be determined by the N_2 gas adsorption method. The porosity of P++ porous SiNW is determined to be 60.6% using the BJH method⁴⁷. For SiNWs with low to moderate porosity, some pores are not accessible by N_2 gas adsorption, so the porosity was estimated based on the gravimetric method (details in Supplementary Note 3).

Photoluminescence measurements. We used the Horiba Labram HR Evolution Raman System to measure the photoluminescence (PL) spectra of the SiNWs vertical arrays standing on their original substrate. A 532 nm laser source was used with 50% power and 600 grating/mm. The objective lens used was x100. Supplementary Fig. 5b shows the PL spectra taken as a function of light wavelength. It has been previously shown that different spectrum curves represent different average Si crystalline sizes, and the SiNWs crystalline sizes under different fabrication conditions were calculated using $E = E_0 + \frac{3.7348}{l^{1.55}}$, where E is the PL peak position, $E_0 = 1.12$ eV is the bandgap energy of Si, and t is the resulting crystalline size of the porous SiNWs.

Doping concentration characterization by SIMS. The SIMS used here was Cameca NanoSIMS 50 L. For sample preparation, SiNWs were scratched off from their original substrates using a razor blade and then dissolved in IPA. The SiNWs in IPA solution were drop cast on P-type silicon wafers for SIMS measurements. In SIMS analysis, a primary ion beam (Cs+) was used to pre-sputter and etch the SiNWs and for image analysis, the sputtered secondary silicon and boron ions from the sample were collected and counted. The operating current was 10 pA, the image frames were taken with 2 µm raster size, 64 × 64 pixels, and 1000 µs dwell time/pixel. From the image analysis, we selected the relevant area where the SiNWs were located using ImageJ, and calculated the average boron concentration within the nanowire depth based on the relative scaling factor (RSF) table for the boron ions in silicon matrix (https://pprco.tripod.com/SIMS/ Theory.htm). Then the boron concentration c_B was calculated following the equation as $c_{\rm B} = {\rm RSF} \bullet \frac{I_{\rm B}}{I_{\rm c}}$, where $I_{\rm Si}$ is silicon counts and $I_{\rm B}$ is the boron counts, both obtained from the SIMS measurements. Note that for each type of nanowire samples, we selected and mixed nanowires from different locations of the wafer and measured more than three bundled nanowires with SIMS, and the results are consistent.

Data availability

The data generated in this study have been deposited in Figshare under accession code [https://doi.org/10.6084/m9.figshare.14731974.v1].

Code availability

The code that has been used for this work is available from the corresponding author on request.

Received: 7 May 2021; Accepted: 7 June 2021; Published online: 24 June 2021

References

- Forman, C., Muritala, I. K., Pardemann, R. & Meyer, B. Estimating the global waste heat potential. Renew. Sustain. Energy Rev. 57, 1568–1579 (2016).
- LeBlanc, S., Yee, S. K., Scullin, M. L., Dames, C. & Goodson, K. E. Material and manufacturing cost considerations for thermoelectrics. *Renew. Sustain. Energy Rev.* 32, 313–327 (2014).
- Hamid Elsheikh, M. et al. A review on thermoelectric renewable energy: principle parameters that affect their performance. *Renew. Sustain. Energy Rev.* 30, 337–355 (2014).
- Poudel, B. et al. High-thermoelectric performance of nanostructured bismuth antimony telluride bulk alloys. Science 320, 634–638 (2008).

- Heremans, J. P. et al. Enhancement of thermoelectric efficiency in PbTe by distortion of the electronic density of states. *Science* 321, 554–557 (2008).
- Zhao, L.-D. et al. Ultralow thermal conductivity and high thermoelectric figure of merit in SnSe crystals. *Nature* 508, 373–377 (2014).
- Biswas, K. et al. High-performance bulk thermoelectrics with all-scale hierarchical architectures. *Nature* 489, 414–418 (2012).
- Hochbaum, A. I. et al. Enhanced thermoelectric performance of rough silicon nanowires. *Nature* 451, 163–167 (2008).
- Boukai, A. I. et al. Silicon nanowires as efficient thermoelectric materials. Nature 451, 168–171 (2008).
- Yee, S. K., Leblanc, S., Goodson, K. E. & Dames, C. \$ per W metrics for thermoelectric power generation: beyond ZT. Energy Environ. Sci. 6, 2561–2571 (2013).
- Lee, J. et al. Thermal transport in silicon nanowires at high temperature up to 700 K. Nano Lett. 16, 4133–4140 (2016).
- Wang, X. et al. Measuring nanowire thermal conductivity at high temperatures. Meas. Sci. Technol. 29, 7 (2018).
- Gadea Díez, G. et al. Enhanced thermoelectric figure of merit of individual Si nanowires with ultralow contact resistances. Nano Energy 67, 104191 (2020).
- Chen, R., Lee, J., Lee, W. & Li, D. Thermoelectrics of nanowires. *Chem. Rev.* 119, 9260–9302 (2019).
- Zhao, Y. et al. Ultralow thermal conductivity of single-crystalline porous silicon nanowires. Adv. Funct. Mater. 27, 1702824 (2017).
- Sadhu, J. et al. Quenched phonon drag in silicon nanowires reveals significant effect in the bulk at room temperature. Nano Lett. 15, 3159–3165 (2015).
- Guo, L. J. Nanoimprint lithography: methods and material requirements. Adv. Mater. 19, 495–513 (2007).
- Kim, J. et al. Au/Ag bilayered metal mesh as a Si etching catalyst for controlled fabrication of Si nanowires. ACS Nano 5, 3222–3229 (2011).
- Tang, J. et al. Holey silicon as an efficient thermoelectric material. Nano Lett. 10, 4279–4283 (2010).
- Morata, A. et al. Large-area and adaptable electrospun silicon-based thermoelectric nanomaterials with high energy conversion efficiencies. *Nat. Commun.* 9, 1–8 (2018).
- Kashiwagi, M. et al. Scalable multi-nanostructured silicon for roomtemperature thermoelectrics. ACS Appl. Energy Mater. 2, 7083–7091 (2019).
- Kessler, V. et al. Thermoelectric properties of nanocrystalline silicon from a scaled-up synthesis plant. Adv. Eng. Mater. 15, 379–385 (2013).
- Bux, S. K. et al. Nanostructured bulk silicon as an effective thermoelectric material. Adv. Funct. Mater. 19, 2445–2452 (2009).
- Zhu, T. et al. The role of electron–phonon interaction in heavily doped finegrained bulk silicons as thermoelectric materials. Adv. Electron. Mater. 2, 1–6 (2016)
- Claudio, T. et al. Nanocrystalline silicon: Lattice dynamics and enhanced thermoelectric properties. Phys. Chem. Chem. Phys. 16, 25701–25709 (2014).
- Schierning, G. et al. Role of oxygen on microstructure and thermoelectric properties of silicon nanocomposites. J. Appl. Phys. 110, 113515 (2011).
- Shi, L. et al. Measuring thermal and thermoelectric properties of onedimensional nanostructures using a microfabricated device. *J. Heat. Transf.* 125, 881–888 (2003).
- Yang, L. et al. Ballistic phonon penetration depth in amorphous silicon dioxide. Nano Lett. 17, 7218–7225 (2017).
- Yang, L., Zhao, Y., Zhang, Q., Yang, J. & Li, D. Thermal transport through fishbone silicon nanoribbons: unraveling the role of Sharvin resistance. *Nanoscale* 11, 8196–8203 (2019).
- Moore, A. L. & Shi, L. On errors in thermal conductivity measurements of suspended and supported nanowires using micro-thermometer devices from low to high temperatures. *Meas. Sci. Technol.* 22, 015103 (2010).
- Yang, L. et al. Thermal conductivity of individual silicon nanoribbons. Nanoscale 8, 17895–17901 (2016).
- Thompson, D. et al. Hundred-fold enhancement in far-field radiative heat transfer over the blackbody limit. Nature 561, 216–221 (2018).
- Weisse, J. M. et al. Thermal conductivity in porous silicon nanowire arrays. Nanoscale Res. Lett. 7, 1–5 (2012).
- Aroutiounian, V. M. & Ghulinyan, M. Z. Electrical conductivity mechanisms in porous silicon. *Phys. Status Solidi Appl. Res.* 197, 462–466 (2003).
- Weisse, J. M. Fabrication and Characterization of Vertical Silicon Nanowire Arrays: A Promising Building Block for Thermoelectric Devices. Ph.D. Thesis, Stanford Univ. (2013).
- Stranz, A., Kähler, J., Waag, A. & Peiner, E. Thermoelectric properties of high-doped silicon from room temperature to 900 K. J. Electron. Mater. 42, 2381–2387 (2013).
- 37. Lundstrom, M. Fundamentals of Carrier Transport. (Cambridge University Press, 2009).
- Prasher, R. Transverse thermal conductivity of porous materials made from aligned nano- and microcylindrical pores. J. Appl. Phys. 100, 064302 (2006).

- Yang, R. & Chen, G. Thermal conductivity modeling of periodic twodimensional nanocomposites. *Phys. Rev. B-Condens. Matter Mater. Phys.* 69, 1–10 (2004).
- Feser, J. P. Scalable Routes to Efficient Thermoelectric Materials. Ph.D. Thesis, Univ. California, Berkeley (2010).
- Branker, K., Pathak, M. J. M. & Pearce, J. M. A review of solar photovoltaic levelized cost of electricity. Renew. Sustain. Energy Rev. 15, 4470–4482 (2011).
- Dimroth, F. et al. Four-junction wafer-bonded concentrator solar cells. *IEEE J. Photovolt.* 6, 343–349 (2016).
- Yang, L. et al. Observation of superdiffusive phonon transport in aligned atomic chains. Nat. Nanotechnol. 1–5 https://doi.org/10.1038/s41565-021-00884-6 (2021).
- Yang, L. et al. Decoupling electron and phonon transport in single-nanowire hybrid materials for high-performance thermoelectrics. Sci. Adv. 7, eabe6000 (2021)
- Zhang, Q. Thermal Transport in Individual Nanowires of Fine Structures. Ph. D. Thesis, Vanderbilt Univ. (2017).
- Wingert, M. C., Chen, Z. C. Y., Kwon, S., Xiang, J. & Chen, R. Ultra-sensitive thermal conductance measurement of one-dimensional nanostructures enhanced by differential bridge. *Rev. Sci. Instrum.* 83, 024901 (2012).
- 47. Quantachrome Instruments. Gas Sorption System Operating Manual. (Quantachrome Instruments, 2015).
- Ledoux, G., Gong, J., Huisken, F., Guillois, O. & Reynaud, C. Photoluminescence of size-separated silicon nanocrystals: Confirmation of quantum confinement. Appl. Phys. Lett. 80, 4834–4836 (2002).

Acknowledgements

The authors acknowledge the support of from California Energy Commission EPC-16-042. This work was partially performed at the Molecular Foundry, Lawrence Berkeley National Laboratory, and was supported by the Department of Energy, Office of Science, Office of Basic Energy Sciences, Scientific User Facilities Division of the U.S. Department of Energy under Contract No. DE-AC02-05CH11231. Part of this work was performed at the Stanford Nano Shared Facilities (SNSF), supported by the National Science Foundation under award ECCS-1542152. R.S.P. also acknowledges the tremendous support of Alecia Ward, Jerri Carmo and Ted Giraldin of LBNL in navigating the financial aspects of this project under challenging circumstances.

Author contributions

L.Y. performed microdevice fabrication and thermoelectric transport property measurements. D.H. and R.N. fabricated porous SiNWs and conducted the SEM char-

acterization. R.N., Y.J., and J.L. conducted PL characterization. R.N. conducted the SIMS characterization. J.B. helped the fabrication of porous SiNWs. Y.L. and S.J. conducted TEM characterization. L.Y. and Y.T. performed theoretical simulation. V.R., Y.Z., S.K., and H.L. discussed the results. L.Y., D.H., R.N., X.Z., and R.S.P. compiled and analyzed results. X.Z. and R.S.P. conceived and directed the project.

Competing interests

The authors declare no competing interests.

Additional information

Supplementary information The online version contains supplementary material available at https://doi.org/10.1038/s41467-021-24208-3.

Correspondence and requests for materials should be addressed to X.Z. or R.S.P.

Peer review information *Nature Communications* thanks the anonymous reviewer(s) for their contribution to the peer review of this work.

Reprints and permission information is available at http://www.nature.com/reprints

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing,

adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit https://creativecommons.org/licenses/by/4.0/.

This is a U.S. government work and not under copyright protection in the U.S.; foreign copyright protection may apply 2021