#### MATERIALS SCIENCE

## Physics-guided co-designing flexible thermoelectrics with techno-economic sustainability for low-grade heat harvesting

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Flexible thermoelectric harvesting of omnipresent spatial thermodynamic energy, though promising in lowgrade waste heat recovery (<100°C), is still far from industrialization because of its unequivocal cost-ineffectiveness caused by low thermoelectric efficiency and power-cost coupled device topology. Here, we demonstrate unconventional upcycling of low-grade heat via physics-guided rationalized flexible thermoelectrics, without increasing total heat input or tailoring material properties, into electricity with a power-cost ratio (W/US\$) enhancement of 25.3% compared to conventional counterparts. The reduced material usage (44%) contributes to device power-cost "decoupling," leading to geometry-dependent optimal electrical matching for output maximization. This offers an energy consumption reduction (19.3%), electricity savings (0.24 kWh  $W^{-1}$ ), and  $CO_2$ emission reduction (0.17 kg  $W^{-1}$ ) for large-scale industrial production, fundamentally reshaping the R&D route of flexible thermoelectrics for techno-economic sustainable heat harvesting. Our findings highlight a facile yet cost-effective strategy not only for low-grade heat harvesting but also for electronic co-design in heat management/recovery frontiers.

#### INTRODUCTION

Converting low-grade heat (<100°C) from the surroundings into electricity plays a crucial role in alleviating the energy crisis and global warming, especially for the postpandemic sustainable development as the economic activity gradually recovers with ever-increasing energy demand (expected to increase by 4%) (1-3). In this context, scavenging all-present low-grade waste heat [accounting for >30% of worldwide primary energy consumption (1, 4)] toward energy sustainability is of great interest. Thermoelectrics (TEs) directly convert spatial heat into electricity via the Seebeck effect, offering a promising solution for environmental waste heat harvesting. Typically, the power conversion efficiency (PCE) of TEs is determined by the dimensionless figure-of-merit (ZT), which is defined as  $ZT = S^2 \sigma T / \kappa$ , where S,  $\sigma$ ,  $\kappa$ , and T denote the Seebeck coefficient, electrical conductivity, thermal conductivity, and operational temperature, respectively. However, these properties (S,  $\sigma$ , and  $\kappa$ ) are intercoupled to both the carrier concentration (*n*) and electronic structure (e.g.,  $S \propto n^{-2/3}$ ,  $\sigma \propto n$ ;  $S \propto m^*$ ,  $\sigma \propto 1/m^*$ , where  $m^*$  is the effective mass), making the achievement of desirable ZT values or power factors (PF =  $S^2\sigma$ ) challenging. During the past two decades, tremendous efforts have been made to attain a high ZT

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value (up to 3.1) in high-temperature TE materials [e.g., element doping (5–8), band structure manipulation (9, 10), and nanostructures (11, 12)], and the number of yearly publications exceeds 1000 (fig. S1A). Unfortunately, the average ZT of room temperature TEs (e.g., Bi<sub>2</sub>Te<sub>3</sub>, Mg<sub>3</sub>Sb<sub>2</sub>, and conductive polymers) is still less than 1.0 (13–15), and PCE across a wide temperature range is below 5% (16, 17), especially for <100°C waste heat recovery.

In terms of body heat harvesting or environmental waste heat scavenging, there is only a 5°C attainable temperature gradient  $(\Delta T)$  due to inevitable heat dissipation or convection, and thus, a PCE of barely 0.25% can be achieved (18–20). This means that a well-matched thermal interface (negligible thermal contact resistance) between the nonplanar heat source/sink and TE module is critical for maximizing the out-of-plane  $\Delta T$  and power output. Accordingly, flexible TEs (f-TEs) have been sought by chemical doping (21-23), physical vapor deposition (24), free-standing substrates (25, 26), and organic/inorganic hybridization (27-29). However, the issue of relatively low PCEs at room temperature still prevails, suggesting that much of the current research focused on the strategy of continuously increasing the peak ZT is not costeffective for ubiquitous, unusable, low-grade waste heat harvesting toward affordable and clean energy supply (18, 30-32). In other words, the concerns related to the output power enhancement, material cost reduction, and power-cost ratio (PCR) increase of f-TE devices for industry-oriented deployment via topology co-design could be equally important as those of ZT and PCE; however, they have been largely overlooked until now (fig. S1) (33-37). Meanwhile, the geometry of TE legs, correlated thermal conductance, and electrical resistance  $(R_{te})$  are acknowledged to substantially affect the output power and cost-effectiveness (fig. S2A). Consequently, there remain some outstanding challenges regarding f-TE devices for sustainable low-grade heat harvesting: (i) superior flexibility in high-performance room temperature TEs; (ii) economic materials or devices as the power density increases; and (iii)

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device-level durability, stability, and sustainability for potential industrial implementation.

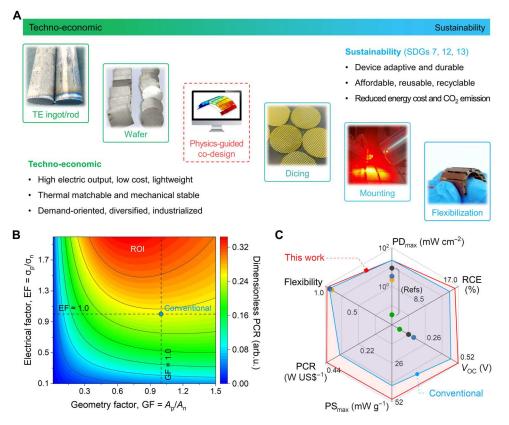
In this work, we report cost-effective and enhanced-PCR f-TEs via rational co-designed device geometry by deploying theoretical, modeling, and experimental approaches to overcome the abovementioned impediments for industrial low-grade heat harvesting. Our proposition deviates from the conventional uniform geometry factor (GF = 1.0; fig. S2B) or traditional fill factor increases (dense TE legs for output power multiplication) (table S1) (9, 35, 38–48). The narrowed p-type leg and small GF value (GF < 1.0) of the proposed f-TE device not only leads to reduced material usage and electricity savings for fabrication but also rationalizes the heat flowing across the device and electrical matching to maximize the PCR and achieve sustainable techno-economics. Without consuming additional thermal energy, increasing the device fill factor, or tailoring the material properties, the developed f-TE device converts the otherwise unavailable heat (<100°C) into electricity with a relative Carnot efficiency (RCE) of 16.1% and energy savings of 0.24 kWh  $W^{-1}$  and remains exceedingly stable after 1000 bending cycles and durability tests. Apart from being facile, the proposed approach is a universal paradigm for realizing cost-effective f-TEs for industryorientated low-grade heat harvesting. Furthermore, it also provides avenues for the device co-design and integration of other semiconductors/electronics beyond the TE community, e.g., solid-state semiconductor cooling, asymmetric electronics, and thermocells.

#### RESULTS

The typical TE device fabrication and industrial implementation from ingots/rods to demand-oriented applications are illustrated in Fig. 1. Conventionally, large-scale device fabrication follows an industrialized production process, where an ingot/rod synthesized from raw materials is cut into wafers and further diced into uniform TE legs for mounting and assembly. The consistent dimension of the p- and n-type legs without device geometry design provides a GF value of 1.0. In contrast, our introduced physics-guided codesign aims to rationalize the geometric dimension of TE legs before dicing to achieve cost-effective and sustainable heat harvesting (Fig. 1A). Noticeably, the developed f-TE device with thinner ptype legs (fig. S2B; GF < 1.0) presented high power output, low cost, low weight, well-matched heat transfer, and mechanical stability. The f-TE device was suitable for sustainable industrialization with energy consumption and carbon emission reductions [i.e., to meet the sustainable development goals (SDGs)]. Moreover, according to the TE constitutive equation (fig. S2A; see Materials and Methods for details), the correlation of PCR versus GF and electrical factor (EF) values was revealed and mathematically plotted in Fig. 1B without using any material parameters. Notably, the region of interest (ROI) to achieve a maximized PCR varies with GF values and peaks at 0.6 to 0.9 for known TE materials (EF is unchangeable). These results differ substantially from the conventional design (GF = 1.0, circle dot), suggesting that the co-designed p-type legs(GF < 1.0) enable a power output increase while lowering the material usage for cost-effectiveness enhancement. Furthermore, the state-of-the-art comparison (Fig. 1C and Table 1) of conventional designs and our work evidenced an unprecedented improvement in both the device performance and cost-effectiveness [enhancement of 9.2% in RCE, 12.2% in open-circuit voltage (V<sub>OC</sub>), 22.4% in maximum specific power (PS<sub>max</sub>), and 25.3% in the PCR value].

#### Physical modeling and experimental verification

To elucidate how the GF value affects the electrical output and costeffectiveness of the f-TE device for waste heat harvesting, as well as the underlying TE characteristics, we performed finite element modeling using the COMSOL Multiphysics software (fig. S3; see Materials and Methods for details). Room temperature commercial bismuth telluride materials (Bi<sub>0.4</sub>Sb<sub>1.6</sub>Te<sub>3</sub> and Bi<sub>2</sub>Te<sub>2.85</sub>Se<sub>0.15</sub>) with high TE performance were used (fig. S4). The contours of maximum power density (PD<sub>max</sub>) and PCE<sub>max</sub> illustrated that the height and GF optimization in the desired power and efficiency were different (Fig. 2, A and B). For instance, a considerable height of the TE leg offered a high PCE, whereas PD<sub>max</sub> required small height since the impedance ratio of  $PD_{max}$  ( $\lambda_{P_max} = 1$ ) was less than that of PCE<sub>max</sub> ( $\lambda_{PCE\_max} = \sqrt{1 + ZT_{ave}} > 1$ ). In other words, the total resistance of a device at PCE<sub>max</sub> is greater than that at  $P_{\text{max}}$ , so the dimension-dependent internal resistance of the device at  $PCE_{max}$  ( $R_{PCE_max}$ ) and  $P_{max}$  ( $R_{P_max}$ ) follows  $R_{PCE_{max}} > R_{P_{max}}$ , i.e., height-dependent electrical output, for a known invariable R<sub>L</sub> (Eqs. 3 and 7; see Materials and Methods for details). However, with a recommended height of 1.78 mm for pand n-type legs from commercial TE modules, the GF for PD<sub>max</sub> and PCE<sub>max</sub> peaked at 0.5 to 0.9 with an overlapped ROI. Specifically, from the viewpoint of GF-dependent output, the resistance of a TE leg is linear to the reciprocal value of the cross-sectional area  $(A_{\rm p} \text{ or } A_{\rm n})$  at a given height (Eq. 8; see Materials and Methods for details). In this context,  $GF = 1.0 (A_p = A_n)$  offers a low internal resistance and benefits to achieve a high output power ( $P_{O}$ ; Fig. 2, C and D), whereas GF = 0.56 ( $A_p < A_n$ ) contributes to obtaining a high PCE and  $V_{OC}$ . Thereby, the GF of ~0.56 is a rationalized design for an optimized device with a high PCE and  $V_{\rm OC}$  while maintaining a modest output power. Moreover, we fabricated f-TE devices with three GF values (1.0, 0.56, and 0.25) by solely varying  $A_{\rm p}$ and measured the electric and thermal output at different  $\Delta T$ values to verify the GF-dependent output characteristics (Fig. 2, C to F, and fig. S5). The trends of  $P_{\rm O}$ , PCE,  $V_{\rm OC}$ , and  $R_{\rm te}$  for various GF values agreed with the modeling results (Fig. 2, C and D). Generally, PCE is determined by the  $P_{\rm O}$  and input thermal power (i.e.,  $Q_{\rm C} + P_{\rm O}$ ) where  $Q_{\rm C}$  is the output thermal power) (Eq. 4; see Materials and Methods for details). The measured  $Q_{\rm C}$  goes up with increased GF values (GF  $\leq$  1.0; fig. S5J), indicating similarity to the GF-dependent  $P_{\rm O}$  variations (Fig. 2C). The ratio of  $P_{\rm O}/Q_{\rm C}$  tends to peak at GF = 0.56 (fig. S5K), which is consistent with the GF-dependent PCE (Fig. 2C), owing to the quasi-linear characteristics between  $P_{\rm O}/$ Q<sub>C</sub> and PCE, as experimentally and theoretically verified in fig. S5L. These findings reveal that our device topology co-design approach plays a vital role in synergistic manipulations of Po and Qc toward maximized PCE. Here, the deviations between the simulation and measured data (Fig. 2, C and D) were mainly ascribed to the absence of electrical and thermal contact resistances (18, 38). We also measured the electrical contact resistance  $(R_{\rm C})$  between TE legs and the electrode by using transmission line method (fig. S6; see Materials and Methods for details). In contrast to conventional device (GF = 1.0), where the contact resistance (resistivity) is 1.91 milliohms (113.3 microhm·cm<sup>2</sup>) and 1.65 milliohms (77.7 microhm·cm<sup>2</sup>) for p-type ( $A_p = 2.0 \text{ mm} \times 2.0 \text{ mm}$ ) and n-type leg ( $A_n = 2.0 \text{ mm} \times 2.0 \text{ mm}$ ) to the electrode, separately. The proposed device (GF = 0.56) with a lower contact resistance (resistivity) of 1.13 milliohms (43.2 microhm·cm<sup>2</sup>) by using co-designed p-type



**Fig. 1. Physics-guided f-TEs and comparison with conventional designs.** (**A**) Illustration of techno-economic sustainability for physics-guided industry-orientated fabrication of f-TEs. Here, the industrial synthesis process from raw materials to TE ingots/rods is not included. SDGs refer to the sustainable development goals (SDG7, Affordable and Clean Energy; SDG12, Responsible Consumption and Production; SDG13, Climate Change) adopted by the United Nations. (**B**) Dimensionless power-cost ratio (PCR) versus geometry and electrical factors. (**C**) Radar plot of key parameters for state-of-the-art comparison of this work (GF < 1.0) and conventional designs (GF = 1.0), where  $PD_{max}$ ,  $PS_{max}$ , and  $V_{OC}$  denote the maximum power density, maximum specific power, and open-circuit voltage, respectively. Photo credit: (A) Xixi Liu, Shenzhen Thermo-Electric New Energy Co. Ltd.

leg ( $A_p = 1.5 \text{ mm} \times 1.5 \text{ mm}$ ) enables to minimize  $R_{te}$  (i.e., ratio of  $R_{\rm C}/R_{\rm te}$ ) toward a large  $P_{\rm O}$  and PCE (Eqs. 3 and 16 and Fig. 2, C and D). The slight drop of experimental  $V_{\rm OC}$  (Fig. 2D) is attributed to the measurement variation, which agrees with the simulation. In addition, a high  $R_{te}$  (low GF value) deteriorates  $P_O$  and  $Q_C$ (Fig. 2, C and D, and fig. S5), so the GF of ~0.56 is a delicate balance to comprehensively optimize  $V_{OC}$ ,  $P_{max}$ , and  $PCE_{max}$  (fig. S7). Notably,  $PD_{max}$  for co-designed f-TE device (GF = 0.56) is around 22.31 mW cm<sup>-2</sup> under  $\Delta T$  of 73°C, which is around 10fold greater than that of other bulk material-based devices (Table 1; <100°C low-grade heat harvesting at  $T_{\rm C}$  = 27°C). We then analyzed the electrical output of an f-TE device at GF = 0.56(Fig. 2, E and F, and figs. S7 and S8). PD<sub>max</sub> and PCE<sub>max</sub> increased with a rising  $\Delta T$  across the device (consistent with Eqs. 2 and 6; see Materials and Methods for details), while the corresponding currents for the two electrical outputs were dissimilar (i.e., I<sub>PCE max</sub> <  $I_{P_{max}}$ ) at a specific  $\Delta T$ . This means that the internal resistance for determining  $PD_{max}$  and  $PCE_{max}$  was not identical for an invariable load resistance, as revealed by the extracted impedance ratio (fig. S8). From the viewpoint of electrostatics, the GF-dependent output is equivalent to the impedance ratio, and the experimentally obtained  $\lambda_{P max} = 1$  and  $\lambda_{PCE max} > 1$  was consistent with the modeling and industrial measurements (49). Furthermore, our co-designed f-TE device (GF = 0.56) is enabled to generate an

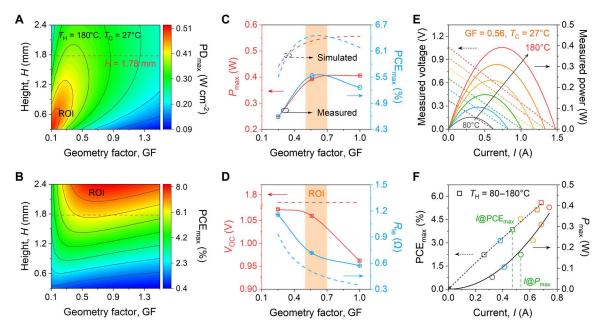
estimated power of 0.475 mW at a 5°C attainable temperature difference between body skin and ambient (fig. S7C). This value is sufficient to power a kind of low-power wearable electronics (26, 43, 50), such as temperature or relative humidity sensors and smartwatches.

In addition, our developed strategy can be generalized to other TE materials/devices apart from bismuth telluride. The GF-dependent modeling of PD<sub>max</sub> and PCE<sub>max</sub> using representative inorganic materials [e.g., PbTe (12), Mg<sub>3</sub>Sb<sub>2</sub> (6, 7), and SnSe (8)] and organic materials {poly[ $A_x$ (M-ett)] (15)} is shown in fig. S9. The GF values for PD<sub>max</sub> and PCE<sub>max</sub> are less than 1.0 and vary with different materials. Specifically, the ROI for PbTe, Mg<sub>3</sub>Sb<sub>2</sub>, SnSe, and poly[Cu<sub>x-</sub>  $(Cu-ett)]/poly[Na_x(Ni-ett)]$  is dissimilar, i.e., GF = 0.25, 0.4, 0.55, and 0.65, respectively. These results suggest that the fundamentals of GF-dependent TEs (Fig. 1B, fig. S2B, and Eq. 12; see Materials and Methods for details) are applicable to all p-n paired materials/devices. The conclusion remains consistent to that of Bi2Te3 materials, i.e., a rationalized thin p-type leg benefits to reduce material usage while boosting the electricity generation toward sustainable heat harvesting. Besides, in terms of low-grade heat recovery, Bi<sub>2</sub>Te<sub>3</sub> is a priority candidate owing to its high TE performance and cost-effectiveness compared with other materials (figs. S4 and S9). On the other side, the TE device fabrication procedure normally follows the "material-to-device" route with known material

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GF	PD <sub>max</sub> (mW cm <sup>-2</sup> )	PS <sub>max</sub> (mW g <sup>-1</sup> )	PCR (W US\$ <sup>-1</sup> )	RCE (%)	V <sub>oc</sub> (V)	Flexibility (ΔR/R <sub>0</sub> )	Reference	Notes*
1.0	0.03	-	-	-	0.06	-	(64)	Estimated
1.0	2.10	-	-	-	0.17	0.90	(65)	Estimated
1.0	3.18	-	-	-	-	0.94	(26)	Estimated
1.0	3.30	-	-	-	0.17	0.93	(66)	Estimated
1.0	8.65	-	-	-	0.13	0.93	(42)	Estimated
1.0	22.31	41.06	0.34	14.71	0.46	0.94	This work	Measured
0.56	22.31	50.27	0.43	16.06	0.52	0.97	This work	Measured

Table 1. State-of-the-art comparison of output performance and cost-effectiveness for conventional and proposed f-TE devices ( $T_{H}$ = 100°C,  $T_{C}$ = 27°C).

\*"Estimated" means that PD<sub>max</sub> of the f-TE device was estimated from a quadratic relationship at a temperature gradient of 73°C (Eq. 3; see Materials and Methods for details), whereas V<sub>OC</sub> was estimated from a linear fitting at open-circuit state (where the current is zero; Eq. 1).



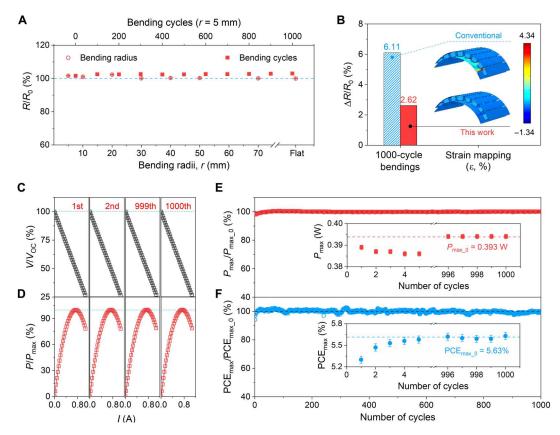
**Fig. 2. Physical modeling and experimental verification.** GF-dependent (**A**)  $PD_{max}$  and (**B**) maximum PCE from simulations. The height (H = 1.78 mm) was recommended from typical commercial TE modules.  $PD_{max}$  and PCE (**C**), as well as (**D**)  $V_{OC}$  and internal resistance at different GF values. Dashed lines, simulated result; solid lines, measured data. ROI refers to the region of interest used for optimum device design. (**E**) Measured voltage and power versus output current at different temperature gradients. (**F**) Maximum PCE and maximized power variations with output current for various temperature differences, where  $I_{PCE\_max} < I_{P\_max}$ .

properties, so the EF is unchangeable for specific materials, although it affects the PCR (Fig. 1B). This signifies that our proposed strategy could offer an unconventional way, i.e., "device-to-material" to optimize the EF value, thus guiding material synthesis and property manipulation under given GF and PCR values.

#### Flexibility, stability, and durability characterizations

Aside from the leveraged output power via physics-guided device topology rationalization, the flexibility, stability, and durability also play crucial roles in practical applications. First, the flexibility of the proposed f-TE device with an optimum geometry (GF = 0.56) was quantified at various bending radii and cycles (Fig. 3A; see Materials and Methods for details). The modest variation of the internal resistance during bending tests indicated that the end-to-end

electrical interconnection between the inorganic TE legs and flexible electrodes is adequately stable and suitable for the thermal energy harvesting of curved heat sources. Because of the reduced size of p-type legs, the fill factor decreased as well (fig. S2B). The enlarged air gap between adjacent TE legs could benefit the device bending under an external stimulus. Consequently, we investigated the resistance change ( $R/R_0$ ) of an f-TE device with (GF = 0.56) and without (conventional, GF = 1.0) physics-guided co-design after 1000-cycle bending tests (r = 5 mm).  $R/R_0$  of the optimized f-TE device (2.62%) was less than that of the conventional device, which was identified by the strain modeling as well (Fig. 3B). Specifically, under a constant external pressure (fig. S10; see Materials and Methods for details), the volumetric strain of a conventional device is greater than that of the developed f-TE device.



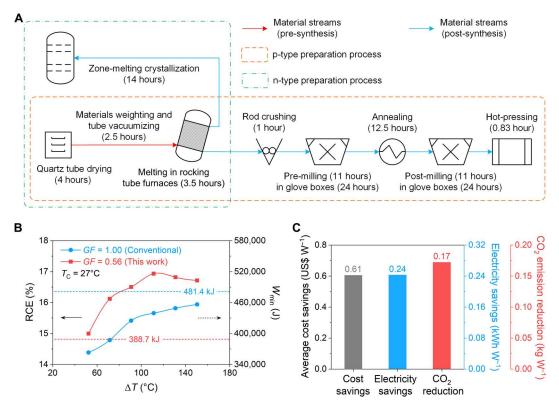
**Fig. 3. Flexibility, stability, and durability characterizations of f-TE devices at GF** = **0.56.** (**A**) Resistance variations for various bending radii and cycles (r = 5 mm). (**B**) Relative resistance changes after 1000-cycle bending (left) and strain mapping ( $\epsilon$ , right) for the conventional (GF = 1.0) and proposed (GF = 0.56) devices. Ratio of output voltage and  $V_{OC}$  (**C**), as well as (**D**) power/ $P_{max}$  versus current for the first and last two measurements of 1000-cycle stability evaluation. Maximum power (**E**) and (**F**) maximum PCE variations for 1000-cycle durability test. Inset, the first and last five measured data.

These results elucidate that our approach with a rationalized geometry co-design not only offered a high electrical output but also contributed to strain propagation across the device for superior flexibility. This unprecedented finding could pave a feasible route for co-designing high-performance f-TEs in the absence of material tailoring (i.e., complex manipulation of carrier concentration and electronic structure). Moreover, to verify the device stability and durability for <100°C waste heat harvesting, the acceleration testing of an f-TE device (GF = 0.56) was evaluated over 1000 thermal cycles at a large  $\Delta T$  of 153°C (fig. S11A). The voltage-current and powercurrent plots of the first and last two measurements showed a cycle-independent steady output (Fig. 3, C and D) and negligible  $P_{\text{max}}$ , PCE<sub>max</sub>,  $V_{\text{OC}}$ , and  $R_{\text{te}}$  variations (Fig. 3, E and F, and fig. S11). The slight fluctuation of  $P_{\text{max}}$ , PCE<sub>max</sub>,  $V_{\text{OC}}$ , and  $R_{\text{te}}$  for the first five tests (insets of Fig. 3, E and F, and fig. S11) is mainly ascribed to the heat flow variation across the device at initial states, which tends to be stable under continuous measurements.

#### Techno-economic sustainability estimation

Furthermore, in practice, to promote the attained high-performance f-TEs in industrial implementation for waste heat harvesting, the cost-effectiveness and sustainable production are prior considerations toward affordable energy supply and carbon emission reduction. Therefore, we focus on how the physics-guided codesign contributes to the techno-economic sustainable industrialization of f-TE devices. Specifically, a typical large-scale industrial production flow of TE materials was introduced, and the synthesis procedures, as well as corresponding electricity consumption, were analyzed (Fig. 4A; see Materials and Methods for details). In terms of commercial bismuth telluride alloys, the ptype material (orange block) is usually prepared via the hot-press method, and the n-type material (green block) is synthesized by the zone-melting technique. These different synthesis approaches and processes lead to distinct TE properties (fig. S4) and electricity consumption demand (table S2). Compared to conventional designs, the reduced material usage of the p-type legs (by 44%) in our f-TE device offers higher RCEs (Fig. 4B) over a wide temperature range ( $\Delta T$  up to 153°C for  $T_{\rm C}$  = 27°C). This suggested that the developed device (GF = 0.56) is capable of highly efficient heat-toelectricity conversion at a given temperature gradient and consistent material properties (16). The minimal energy consumption  $(W_{\min})$  for large-scale p-type ingot/rod production from raw materials would be reduced by 19.3% if our solution were deployed (see Materials and Methods for details). In addition, we estimated the cost savings, electricity savings, and equivalent CO2 emission reduction per output power of the developed f-TE device with  $\Delta T$  of 73°C for low-grade heat harvesting ( $T_{\rm H}$  < 100°C). The results showed that 0.61 US\$ W<sup>-1</sup> of cost savings, 0.24 kWh W<sup>-1</sup> of electricity savings, and 0.17 kg W<sup>-1</sup> carbon emission reduction could be achieved for an f-TE device by solely introducing a physics-guided co-design

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**Fig. 4. Techno-economics estimation for industry-orientated sustainable heat harvesting.** (**A**) Typical large-scale industrial production flows of p- and n-type TE ingots from raw materials. (**B**) RCE (left) and estimated minimal energy consumption (right) of conventional and proposed devices at different temperature gradients. The RCE can be calculated from the ratio between PCE<sub>max</sub> and the Carnot efficiency (Eq. 7). (**C**) Estimated average cost savings, electricity savings, and CO<sub>2</sub> emission reduction per watt by deploying the proposed f-TE device (GF = 0.56). Details can be found in Table 2 and table S2.

(Fig. 4C and Table 2). Our delivered strategy, which realized costeffective, high-output, f-TEs, is facile, universal, and fundamentally different from traditional approaches. In recent years, although the material cost of TE devices has been reduced by using abundant elements (e.g.,  $Mg_3Sb_2$ , SnS, SnSe, half-Heusler compounds, silicide, and polymers) (5, 9, 14, 51–55), the industrialization remains challenging. Since no headway has been made so far in their corresponding large-scale production process, and their demands/ markets are unclear (33, 56), academia and industry are urged to diversify their research focus past the one-and-only commercialized room temperature  $Bi_2Te_3$  materials.

#### DISCUSSION

In summary, we investigated a nonunity, co-designed geometry of unconventional f-TEs to address the long-standing challenges in cost-effective, sustainable, and low-grade heat harvesting. The physics-guided device rationalization reduces the usage of TE materials by 44% (p-type) while barely deteriorating the electrical output, in contrast to conventional approaches. This "decoupled" power output and cost account for an unprecedented PCR enhancement of 25.3%, minimal energy consumption reduction of 19.3%, electricity savings of 0.24 kWh W<sup>-1</sup>, and carbon emission reduction of 0.17 kg W<sup>-1</sup> for large-scale industrial production. Further

f- TE devices	Mass, p-type legs (g)	Mass, n-type legs (g)	PCR (W US\$ <sup>-1</sup> )	Cost per watt (US\$ W <sup>-1</sup> )	Electricity usage per watt (kWh W <sup>-1</sup> )	CO <sub>2</sub> emission per wat (kg W <sup>-1</sup> )
GF = 1.0	1.048	1.259	0.332	3.009	1.262	0.894
GF = 0.56	0.583	1.259	0.416	2.403	1.019	0.722
Savings*	0.465 (-44.3%)	0	0.084 (+25.3%)	0.606 (-20.1%)	0.24 (–19.3%)	0.17(-19.3%)

\*The symbol in savings indicates the corresponding proportion of increase ("+") or decrease ("-"). The output power at  $T_{\rm H} = 100^{\circ}$ C and  $T_{\rm C} = 27^{\circ}$ C was used for estimation. The commercial electricity and raw materials (bismuth telluride) prices are 0.23 \$ kWh<sup>-1</sup> and 125 \$ kg<sup>-1</sup> (*33*), respectively. The cost of substrates, electrodes, and solder was not included in the estimation. In contrast to the conventional design (GF = 1.0), the proposed device (GF = 0.56) contributed to p-type materials usage reduction, while the dimension of n-type legs remained consistent, so the overall electricity consumption reduction (i.e., equivalent carbon emission minimization and energy savings) and cost savings were dominated by p-type materials.

development of flexible electrical interconnected electrodes and polymer substrates, as well as demand-oriented device diversification, is a promising approach to advance the industrial sustainable low-grade heat-to-electricity conversion. This upcycling of lowgrade waste heat through physics-guided rationalization of the device topology also creates a previously unidentified paradigm for other energy harvesting and management frontiers, e.g., device-guided material synthesis, TE cooling, transverse TEs, thermocells, semiconductors, and electronics heat management.

#### MATERIALS AND METHODS

#### **Fundamentals of GF-dependent PCR analysis**

On the basis of the Seebeck effect for spatial heat harvesting, the electric potential of a TE uni-couple is governed by  $S_{pn}\Delta T$ , where  $S_{pn}$  is the sum of the Seebeck coefficients of p- and n-type TE legs, and  $\Delta T$  denotes the spatial temperature gradient across the hot  $(T_{\rm H})$  and cold  $(T_{\rm C})$  sides of TE legs. The output voltage  $(V_{\rm o})$  of a uni-couple is given by

$$V_{\rm o} = S_{\rm pn} \Delta T - I R_{\rm te} \tag{1}$$

where  $V_{\rm o}$  is proportional to the current flowing across the TE unicouple under a known internal resistance  $R_{\rm te}$ . In addition, the  $P_{\rm o}$  can be derived from the voltage-current relationship and is expressed as

$$P_{\rm o} = I^2 R_{\rm L} = S_{\rm pn} \Delta T \cdot I - I^2 R_{\rm te} \tag{2}$$

Then, the maximum output power ( $P_{\text{max}}$ ) is determined from Eq. 2, as long as the external load impedance ( $R_{\text{L}}$ ) equals  $R_{\text{te}}$  (i.e., the impedance ratio  $\lambda = R_{\text{L}}/R_{\text{te}}$  and  $\lambda_{P_{\text{max}}} = 1$ )

$$P_{\rm max} = \frac{S_{\rm pn}^2 \Delta T^2}{4R_{\rm te}} \tag{3}$$

Furthermore, PCE of a TE device can be estimated by

PCE (%) = 
$$\frac{P_{o}}{Q_{H}} = \frac{P_{o}}{Q_{C} + P_{o}}$$
 (4)

 $Q_{\rm H}$  and  $Q_{\rm C}$  are the hot-side and cold-side thermal powers, respectively, and can be derived from the Seebeck effect, Peltier effect, and Joule heating, as follows

$$\begin{cases} Q_{\rm H} = S_{\rm pn} T_{\rm H} I - \frac{1}{2} I^2 R_{\rm te} + K(T_{\rm H} - T_{\rm C}) \\ Q_{\rm C} = S_{\rm pn} T_{\rm C} I + \frac{1}{2} I^2 R_{\rm te} + K(T_{\rm H} - T_{\rm C}) \end{cases}$$
(5a) and (5b)

Consequently, by substituting Eqs. 2, 5a, and 5b into Eq. 4, PCE can be rewritten as

$$PCE = \frac{T_{\rm H} - T_{\rm C}}{T_{\rm H}} \left\{ \frac{R_{\rm L}}{R_{\rm te}} \left[ \left( 1 + \frac{R_{\rm L}}{R_{\rm te}} \right) - \frac{T_{\rm H} - T_{\rm C}}{2T_{\rm H}} + \frac{\left( 1 + R_{\rm L}/R_{\rm te} \right)^2}{ZT_{\rm H}} \right]^{-1} \right\}$$
(6)

This formula can be simplified by applying  $\lambda = R_L/R_{te}$ , and the maximized PCE is obtained in the condition of  $\partial$ (PCE)/ $\partial\lambda = 0$ 

$$PCE_{max} = \frac{T_{h} - T_{c}}{T_{h}} \frac{\lambda_{PCE\_max} - 1}{\lambda_{PCE\_max} + T_{c}/T_{h}}$$
$$= \eta_{Carnot} \frac{\lambda_{PCE\_max} - 1}{\lambda_{PCE\_max} + T_{c}/T_{h}}$$
(7)

where  $\eta_{Carnot}$  is the Carnot efficiency, and the irreversibility

of TE generators (heat engines) is reported as the RCE that is given by the ratio between PCE and  $\eta_{\text{Carnot}}$  (16, 32, 57), i.e., RCE = PCE/ $\eta_{\text{Carnot}}$ .  $\lambda_{\text{PCE}_{max}} = \sqrt{1 + ZT_{ave}} > 1 = \lambda_{\text{P}_{max}}$ , where  $ZT_{ave} = \frac{1}{T_h - T_c} \int_{T_c}^{T_h} ZT dT$ . From the viewpoint of the pure resistive circuit and Kirchhoff's laws, these mathematical derivations suggest that the internal resistances for the maximum output power ( $P_{max}$ ) and PCE<sub>max</sub> are different, i.e.,  $R_{\text{PCE}_{max}} > R_{\text{P}_{max}}$  for a given  $R_L$ . In terms of the GF-dependent characteristics of the resistance (fig. S2), the distinct internal resistances of  $P_{max}$  and  $PCE_{max}$  eventually reveal that the device geometry demands for the two goals are entirely dissimilar. For instance, the cross-sectional area ratio between the p-type ( $A_p$ ) and n-type ( $A_n$ ) legs, i.e., (GF =  $A_p/A_p$ ), substantially varies the total resistance and output of the TE device for known materials (invariable, EF =  $\sigma_p/\sigma_n$ )

$$R_{\text{te}} = \frac{H}{\sigma_{\text{p}}A_{\text{p}}} + \frac{H}{\sigma_{\text{n}}A_{\text{n}}} = \frac{H}{A_{\text{n}}} \left(\frac{1}{\sigma_{\text{p}}\text{GF}} + \frac{1}{\sigma_{\text{n}}}\right)$$
$$= \frac{H}{A_{\text{n}}\sigma_{\text{n}}} \left(\frac{1}{\text{EF} \cdot \text{GF}} + 1\right)$$
(8)

Furthermore, to quantify how the GF variation affects the PCR, the GF-dependent PCR of a TE device is estimated. First, the cost [C (\$)] of a typical TE device is given in consideration of the volumetric cost (C''') and area cost (C'') (46). The volumetric cost consists of the cost of TE materials, manufacturing costs (e.g., hot pressing and zone melting), and other costs that scale with the amount of TE materials. By contrast, the areal cost includes areal manufacturing costs (e.g., dicing, cutting, and mounting), metallization, flexibilization, and other scales with the device area. The overall cost can be shown as follows

$$C[\$] = (C'''H + C'')(A_p + A_n) = (C'''H + C'')(1 + GF)A_n$$
(9)

where *H* refers to the height of the TE legs. The PCR (W  $^{-1}$ ) is given by the combination of Eqs. 3 and 9

$$PCR[W \$^{-1}] = \frac{P_{\max}}{C} = \frac{S_{pn}^2 \Delta T^2}{(C''H + C'')(1 + GF)A_n(4R_{te})}$$
(10)

By substituting Eq. 8 into Eq. 10, the PCR can be rewritten as

$$PCR[W \ \$^{-1}] = \frac{S_{pn}^2 \Delta T^2 \sigma_n}{4H(C'''H + C'')} \left[ (1 + GF) \left( 1 + \frac{1}{EF \cdot GF} \right) \right]^{-1}$$
(11)

For a unit cost,  $PCR_0 = (S_{pn}^2 \Delta T^2 \sigma_n) / [4H(C^{'''}H + C^{''})]$ , the dimensionless PCR is given by

$$\frac{PCR}{PCR_0} = \left[ (1+GF) \left( 1 + \frac{1}{EF \cdot GF} \right) \right]^{-1}$$
(12)

Thus, the dimensionless PCR is GF dependent for specific TE materials (EF is unchangeable), and the geometry co-design is crucial and universal for desirable cost-effectiveness and power output.

#### Physics-guided finite element modeling

The finite element modeling of geometry-dependent TE output was performed by using COMSOL Multiphysics software with Heat Transfer in Solids, Electric Currents, and Electrical Circuit (58). Specifically, the Heat Transfer in Solids was used to model the heat transfer in solid domains concerning the heat conduction, convection, and radiation. The governing equation of heat transfer with external heat source ( $Q_e$ ) can be given from the differential form of Fourier's law

$$\begin{cases} \rho C_{\rm p} u \cdot \nabla T + \nabla \cdot q = Q_{\rm e} \\ q = -\kappa \nabla T \end{cases}$$
(13)

in which  $\rho$ ,  $C_p$ , and u are density, specific heat, and thermal diffusivity, respectively;  $\kappa$  is the thermal conductivity; and T is the absolute temperature. The second module of Electric Currents was used to solve the current conservation equation in accordance with Ohm's law, and the governing equation is given as

$$\begin{cases} \nabla J = Q_{j} \\ J = \sigma E + J_{e} \\ E = -\nabla V \end{cases}$$
(14)

where J,  $J_e$ , and  $Q_j$  are induced electric current, external current source, and current source, respectively, and  $\sigma$ , E, and V are electrical conductivity, electric field, and electric potential, respectively. The last module of Electrical Circuit was used to model a load resistor for recording the voltage and current output under electrical matching conditions. Considering the thermodynamic relation of Seebeck effect, Peltier effect, and Thomson effect, the governing equations for TE modeling can be written as

$$\begin{cases} q = PJ \\ P = ST \\ J_e = -\sigma S \nabla T \end{cases}$$
(15)

where P, S, and T are Peltier coefficient, Seebeck coefficient, and absolute temperature, respectively. Thus, the target for device topology co-design of TEs was simplified to solve the geometry-dependent current density and heat flux across the device with variable dimensions of TE legs by using finite element modeling under stationary heat transfer, as illustrated in the flowchart (fig. S3). For materials selection, the measured TE properties of bismuth telluride (fig. S4) and other parameters from the COMSOL material library were used in the simulation. Moreover, to determine how the optimized geometry affected the bendability of the f-TE device, the strain mapping of conventional and optimized devices under an external bending/contact pressure (2 kPa) (59) was analyzed using the Heat Transfer and Solid Mechanics modules. The hot- and cold-side temperatures of f-TE device remained constant ( $T_{\rm H} = T_{\rm C} = 27^{\circ}$ C, consistent with the room temperature) to minimize the thermal expansion. There were two stress boundaries introduced (fig. S10), i.e., pressure load layers and constraint layers, for strain modeling.

#### f-TE device fabrication and characterization

Commercial Bi<sub>0.4</sub>Sb<sub>1.6</sub>Te<sub>3</sub> and Bi<sub>2</sub>Te<sub>2.85</sub>Se<sub>0.15</sub> materials (provided by Shenzhen Thermo-Electric New Energy Co. Ltd.) were used for pand n-type TE leg fabrications, respectively. For materials characterization, the Seebeck coefficient and the electrical conductivity were measured simultaneously using a four-probe static direct current method (commercial instrument, ZEM3, ULVAC-RIKO) with a sample size of 2 mm × 2 mm × 10 mm, in which the corresponding uncertainty was 3 and 5%, respectively. The thermal conductivity was indirectly determined using the following equation:  $\kappa = D \cdot \rho \cdot C_p$ , where the thermal diffusivity (*D*) was obtained via the laser flash method (commercial instrument, LFA457, NETZSCH) with a sample size of 6 mm  $\times$  6 mm  $\times$  1.5 mm and an uncertainty of 5%. The density ( $\rho$ ) was measured by the Archimedes method, and the specific heat  $(C_p)$  was obtained from previous work (60). The uncertainty of measured temperatures is 1%. The sample orientation used for thermal and electrical measurements was illustrated in the insets of fig. S4. The device ZT and efficiency were estimated by using the ZT calculator (61). Therefore, according to the law of propagation of uncertainty (62), the combined uncertainty of PF and ZT were estimated at 11 and 16%, respectively. For device fabrication, the dimensions of the n-type TE leg (2.0  $mm \times 2.0 mm \times 1.78 mm$ ) were fixed, and we solely varied the dimensions of the p-type legs from 2.0 mm  $\times$  2.0 mm  $\times$  1.78 mm (GF = 1.0) to 1.5 mm × 1.5 mm × 1.78 mm (GF = 0.56) and 1.0  $mm \times 1.0 mm \times 1.78 mm$  (GF = 0.25). The fabrication procedure of the f-TE devices can be found in our previous work (37). The electrical outputs of the TE modules (25 mm  $\times$  19 mm  $\times$  1.9 mm) were evaluated by using a commercial instrument (PEM2, ULVAC-RIKO) in a vacuum atmosphere with an uncertainty of 10%. The output heat flux of the TE device was acquired using a typical technique, i.e., the steady-state plate method and one-dimensional heat conduction. Specifically, the TE device was sandwiched in a heater and a cooler (copper block with controlled water cooling). There are three thermocouples vertically positioned inside the copper block with an interval of 5 mm, and the temperature was obtained under a steady state. The output heat flux  $(q_{\rm C})$ can be given on the basis of Fourier's law of heat conduction, i.e.,  $q_{\rm C}$ =  $\kappa_{Cu}\Delta T/d$ , where  $\kappa_{Cu}$  is the thermal conductivity of copper block and d is the spatial difference between adjacent thermocouples. The temperature, output voltage, and internal resistance were concurrently recorded by varying the current with a step of 0.03 A. Then, PCE was calculated on the basis of Eq. 4. In terms of low-grade heat harvesting and one-dimensional steady-state heat transfer, the heat loss (thermal radiation and convection) is negligible and not considered in the measurement. Moreover, we examined the contact behavior of fabricated f-TE devices by using transmission line method. As illustrated in fig. S6, considering neighboring TE legs located on an electrode, the measured total resistance  $(R_{\text{total}})$  across neighboring TE legs can be given as in (63),

$$R_{\text{total}} = 2R_{\text{leg}} + 2R_{\text{C}} + R_{\text{ele}} \tag{16}$$

in which  $R_{\text{leg}}$  is the resistance of TE leg due to contact,  $R_{\text{C}}$  is the contact resistance associated with the metal/semiconductor interface, and  $R_{\text{ele}}$  is the usual electrode resistance. Normally,  $R_{\text{leg}}$  is known according to the  $\sigma$  of TE materials (fig. S4B), and  $R_{\text{ele}} = R_{\text{E}}L/W$  for a given electrode with limited lengths (*L*) and widths (*W*). Thereby, Eq. 16 can be simplified as

$$R_{\rm T} = L \frac{R_{\rm E}}{W} + 2R_{\rm C} \tag{17}$$

where  $R_{\rm T} = R_{\rm total} - 2R_{\rm leg}$  and is proportional to *L*,  $R_{\rm C}$  and transfer length ( $L_{\rm T}$ ) can be extracted separately from the intercept at vertical and horizontal axes of the linear curve, and the slope is the sheet resistance of the electrode. Then, the contact resistivity ( $\rho_{\rm C}$ ) can be calculated, i.e.,  $\rho_{\rm C} = R_{\rm C}L_{\rm T}W$  (63). In our experiments, five TE legs (p-type,  $A_{\rm p} = 1.5$  mm × 1.5 mm, corresponding GF = 0.56) were soldered on a Cu strip with spacings of 2.5, 5.0, 10.0, and 20.0 mm to form metal-semiconductor contacts.  $R_{\rm T}$  of p-type legs to the electrode across different spacings was measured by using an inductance-capacitance-resistance (LCR) meter (U2830, EUCOL) and plotted in fig. S6B. The measurement of  $R_{\rm C}$  and  $L_{\rm T}$  for other p-type leg ( $A_{\rm p} = 2.0 \text{ mm} \times 2.0 \text{ mm}$ , corresponding GF =1.0) and n-type leg ( $A_{\rm n} = 2.0 \text{ mm} \times 2.0 \text{ mm}$ ) to the electrode was performed by a consistent manner.

#### Flexibility, stability, and durability verifications

The flexibility characterization of the f-TE devices was conducted in a homemade system, where a fatigue analyzer (PA2021-0004, Prime-Ace Tech) with adjustable bending radii and speeds, as well as an LCR meter (U2830, EUCOL), was used for resistance measurements. The flexibility used for state-of-the-art comparison was calculated from  $R/R_0$  of f-TE devices after 1000 bending cycles with a bending radius of 5 mm (20). Moreover, the stability and durability of devices were characterized by using a PEM2 data logger (ULVAC-RIKO) in a vacuum atmosphere. The  $T_{\rm H}$  and  $T_{\rm C}$  values of the device were maintained at 180° and 27°C, respectively, for the acceleration test of the low-grade waste heat harvesting. The electrical measurements were performed for over 1000 cycles using the LabView software.

# Estimation of cost savings, electricity savings, and $\rm CO_2$ emission reduction

The reduced material usage of the p-type TE legs from the physicsguided optimal GF (i.e., GF = 0.56) contributed to practical cost savings, electricity savings, and CO<sub>2</sub> emission reduction. On the basis of the typical industrial production flow (Shenzhen Thermo-Electric New Energy Co. Ltd.), the cost savings (raw TE materials and device components), electricity savings (electricity consumption of TE ingot fabrication), and equivalent CO<sub>2</sub> emission (1 kWh electricity = 0.709 kg CO<sub>2</sub>; https://epa.gov/energy/ greenhouse-gas-equivalencies-calculator) per power output of an optimized f-TE device were estimated. Details can be found in table S2. The minimal energy consumption ( $W_{min}$ ) of large-scale industrial production for conventional and developed f-TE devices is estimated as

$$W_{\min} = \frac{m_p}{M_p} \sum_{i=1}^{i=10} P_p^i t_p^i + \frac{m_n}{M_n} \sum_{j=1}^{j=4} P_n^j t_n^j$$
(18)

where the first and second terms refer to the electricity usage of pand n-type TE legs per device, respectively. In this work, the dimensions of p-type legs were varied, whereas those of the n-type legs remained constant.  $m_p$  is the mass of the p-type TE legs;  $M_p$  is the total mass of the p-type ingots/rods using large-scale industrial production (orange block; Fig. 4A);  $P_p^i$  and  $t_p^i$  are the electric power and the corresponding operational duration of the specific equipment, respectively; and *i* is the index number of the equipment. Similarly,  $m_n$  is the mass of the n-type TE legs;  $M_n$  is the total mass of the ntype ingots/rods in large-scale industrial production (green block; Fig. 4A);  $P_n^j$  and  $t_n^j$  are the electric power and the corresponding operational duration of the specific equipment, respectively; and *j* is the index number of the equipment. Consequently,  $W_{min}$  is mainly dependent on  $m_p$  of the f-TE devices.

#### **Supplementary Materials**

This PDF file includes: Figs. S1 to S11 Tables S1 and S2

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