



# Maximum Power Point Tracking of Thermoelectric Generation Systems Under Nonuniform Temperature Distribution: A State-of-the-Art Evaluation

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# INTRODUCTION

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Shao R, Yang B, Chen N and Han Y (2022) Maximum Power Point Tracking of Thermoelectric Generation Systems Under Nonuniform Temperature Distribution: A State-of-the-Art Evaluation. Front. Energy Res. 10:857261. doi: 10.3389/fenrg.2022.857261 Over the past few years, due to the increasing demand for energy and the decreasing reserves of fossil energy, renewable energy has attracted more attention and gradually replaced most of the fossil fuels, among which solar energy is one of the most promising one (Zhang et al., 2015; Zhang et al., 2016; Yao et al., 2019). Recently, thermoelectric generation (TEG) is an important application technology of solar power generation fields (Iqbal et al., 2021; Zhao et al., 2021), which usually serves as a thermoelectric waste heat energy recovery system in hybrid power generation system (Chen et al., 2021). However, due to the low conversion efficiency, expensive material cost, temperature mismatch, and variation of internal resistance of TEG system, improving technologies and more efficient TEG material are exploited to accelerate the industrialization of TEG system (Liu et al., 2016). In terms of the above technologies, maximum power point tracking (MPPT) is a necessary and crucial technique to extract the maximum power during the operating of the TEG system. However, MPPT for the TEG system will face a lot of challenges. For the TEG system, nonuniform temperature distribution (NUTD) condition limits the available power. Under this nonuniform circumstance, the output power-voltage (P-V) characteristics will exhibit several peaks, which makes MPPT more difficult (Yang et al., 2020a). In this context, many kinds of MPPT algorithms emerged in recent years. This paper gives some viewpoints of the TEG systems and existing MPPT algorithms for the TEG systems, as well as some suggestions for future research.

# MODEL OF THE THERMOELECTRIC GENERATION SYSTEM

The basic structure of the TEG system is illustrated in **Figure 1**. In a closed circuit of two different conducting materials, when the two contacts are at different temperatures, the potential generated in the circuit converts heat energy into electricity, and this phenomenon is called Seebeck effect (Zhu et al., 2021). In the TEG system, p-type and n-type semiconductors are connected with cold side conductor material and hot side conductor material to increase system voltage level. The main factors influencing conversion efficiency of the TEG system are Seebeck coefficient  $\alpha$ , electrical conductivity  $\sigma$ , and thermal conductivity k. The figure of merit Z is an evaluation criteria of efficiency of the TEG material, which is shown as follows:

1



$$Z = \frac{\alpha^2 \sigma}{k} \tag{1}$$

It can be concluded that a thermoelectric material with higher electricity conductivity and higher Seebeck coefficient are key factors in choosing high-performance TEG materials, and materials with high thermal conductivity can be used as a cooling device in the TEG system. The optimization of a cooling device in TEG is the main market of current commercial TEG (Manikandan and Kaushik, 2015). A study (Sato and Yamada, 2019) explored the different photovoltaic module cooling methods, which can provide a reference for cooling devices of the TEG system. Besides, utilization of waste heat can be improved by increasing heat flux through TEG; one effective way is to install heat pipes in TEG modules (Wen et al., 2021). Selecting a proper number of thermocouples and designing a reasonable structure of DC-DC converters are also crucial to make maximum use of the generated power by the TEG system. Apart from methods aforementioned, an optimized system design is another useful method to enhance the efficiency of the TEG system. The interconnection of the TEG modules in large-scale systems is limited by actual installation conditions, resulting in parameter mismatch of the TEG modules and mismatch loss. So it is necessary to further study the topology of large-scale gridconnected TEG systems. A study (Al-Habahbeh et al., 2016) explored the geometric design of a large TEG system and optimization of the key parameters of the system, which deserves further studying. Therefore, there is a need to create standard mathematical models for researchers to conduct effective research. It is more reasonable to consider factors that influence temperature in a practical scenario, which will affect the accuracy of mathematical models (Dasu et al., 2021; Sakthivel and Sathya, 2021).

# MAXIMUM POWER POINT TRACKING FOR THERMOELECTRIC GENERATION SYSTEM

# Non-Uniform Temperature Distribution

Mismatch of the TEG system are usually caused by NUTD, aging, and faults on TEG modules, which influences the efficiency and

service life of the TEG system. In practice, TEGs usually operate under dynamical environments with time-varying temperature differences called NUTD. Under this circumstance, there will emerge multiple MPPs, which hinder the tracking of GMPP. Literature about MPPT for the TEG system usually use step change in temperature and random temperature as NUTD condition in case studies (Yang et al., 2019a; Yang et al., 2020b; Majad et al., 2021; Yang et al., 2021). These can be summed up as the evaluation criteria of case studies in the MPPT for the TEG system. A study (A. et al., 2021) collected field temperature and irradiance data between 10:00 a.m. and 1:00 p.m. to evaluate the effects of real environment parameters, such as angle of installation or irradiation on temperature of the TEG system, providing the latest reference data available for researchers. Temperature level, duration, heat loss during heat conduction, and other rapid variations in NUTD should be considered in practical engineering.

Therefore, by choosing the proper models of time-varying NUTD, applicable topology of the TEG system, MPPT algorithms, and other advanced mismatch mitigating techniques can relieve the adverse impact of NUTD.

## Maximum Power Point Tracking of Thermoelectric Generation System

MPPT techniques of the TEG system can be classified into classical ones and intelligent ones. Traditional MPPT algorithms are perturb and observe (P&O) algorithm, hill climbing (HC) technique, and incremental conductance (INC) technique (Eakburanawat and Boonyaroonate, 2006; Rae-Young Kim et al., 2009; Shang et al., 2020). Almost all MPPT algorithms can extract the global maximum power point (GMPP) under uniform temperature condition (Yang et al., 2019b), but the above classic techniques are easily trapped into the local maximum power point (LMPP) and might have steady-state oscillations. There are also some improved algorithms of traditional methods, which adopted variable step size instead of fixed steps, so as to enhance tracking precision and balance between steady-state oscillations and response speed to some certain extent, but there are still some issues of low tracking speed and getting easily trapped in local optimum (Shiriaev et al., 2019). A study (Kanagaraj et al., 2020) proposed a variable fractional order fuzzy logic control MPPT algorithm, which adjusted fractional factor  $\alpha$  to shorten the tracking time. Another study (Liu et al., 2016) combined the P&O method and open circuit voltage (OCV) method to realize a faster and simpler tracking, but the aforementioned methods are based on trial-and-error principle, in which the operating point usually oscillates around MPP in a steady state. A study (Bijukumar et al., 2018) used two measurable operating points to calculate optimal duty ratio under MPP, which has high precision and have no steady-state oscillation around MPP. Recently, there are many advanced MPPT algorithms that emerged, such as metaheuristic algorithms or mathematics-based algorithms. Metaheuristic algorithms are increasingly used in recent studies due to their high efficiency, simple mechanism, and not being easily trapped in LMPP. Among the above techniques, swarm intelligence (SI)-

based MPPT techniques outperform other methods due to it not requiring an exact mathematical model and not easily converging to local optimum. Up to now, adaptive compass search (ACS) (Yang et al., 2019a), equilibrium optimization (EQO) (Majad et al., 2021), fast atom search optimization (FASO) (Yang et al., 2020b), interacted collective intelligence (ICI) (Yang et al., 2021), sine cosine algorithm (SCA) (Rezk et al., 2021), and many other intelligent algorithms have been studied. Basically, they carried out four case studies, which are startup test, step change in temperature, random temperature variation, and sensitivity analysis, respectively. These can be a standard for case studies in relevant fields. A study (Rezk et al., 2021) compared the best, the worst, the average, median, variance, and standard deviation of MPPT results to evaluate the performance of the particle swarm algorithm (PSO), whale optimization algorithm (WOA), and SCA, which can be used as references in testing new MPPT algorithms for researchers. Moreover, metaheuristic algorithm-based MPPT techniques are usually of high randomness, and the execution time increases as the scale of TEG increases. So, there is a need to explore more stable metaheuristic algorithms with general applicability, and there should be more hardware experimental setup to verify the validity and accuracy of the proposed methods.

Up to now, literature regarding the assessment of MPPT for a large TEG plant is limited to a few cases. A study (Molina et al., 2010) discussed two hardware topologies of MPPT, which are, respectively, one-stage topology and two-stage topology, then proposed a two-stage configuration for the distributed TEG system. This flexibility in the design of the MPPT topology is worth advocating. In addition, it is worth considering how many MPP trackers and converters should be used in MPPT studies, which is a practical issue for system design. Anyway, the design of the MPPT system should be combined with actual installation condition in engineering projects. At present, the topology of the TEG system in MPPT studies does not have a uniform standard, which needs to be further established. For a large-scale TEG system, the system designer should decide to use how many MPP trackers or converters under different installation conditions. Furthermore, the ambient irradiance, number of thermocouples, and other environmental inputs in simulation should use all-purpose nominal specifications to get the exact result. How to set these parameters properly is a problem that researchers need to consider (Chen et al., 2018; Zhou et al., 2020; Huang et al., 2021; Xiong et al., 2021).

# HYBRID PV-THERMOELECTRIC GENERATION SYSTEM

In PV systems, the waste heat and rise in temperature result from solar irradiation greatly reducing the energy conversion efficiency or even damaging the PV panel. The PV–TEG system with heat sinks can recycle the waste heat from a PV panel, which is a promising and worth investigating improved technique. So far, there has been little research on MPPT for the PV–TEG systems. A study (Adeel et al., 2020) proposed the arithmetic optimization algorithm (AOA) for MPPT, which applied nonuniform irradiance and nonuniform temperature distribution as a study case to evaluate the proposed method. A study (Kanagaraj, 2021) used step change in solar irradiation and a constant temperature difference to evaluate FOFLC, P&O, and FLC MPPT techniques of the PV-TEG system. These are open to question because temperatures of TEG modules mostly depend on temperatures of PV modules. In other words, it is unrealistic to design irradiation and temperature difference separately. It is more appropriate to combine both of the aforementioned to meet the demands of the study. Literature (Sark, 2011) determined the temperature of TEG modules according to ambient temperature and irradiation, which is given by Eq. 2. Studies (Verma et al., 2016; Babu and Ponnambalam, 2018) considered the influence of wind speed on temperature, which is computed as Eqs. 3 and 4:

$$T_{\text{TEG1}} = \frac{1}{2} \left( T_{\text{M}} + T_{\text{A}} \right) = T_{\text{A}} + \frac{1}{2} cG$$
 (2)

 $T_{\text{TEG2}} = 0.943T_A + 0.028G \cdot 1000 - 1.521w_s + 4.3 \tag{3}$ 

 $T_{\text{TEG3}} = 0.943T_A + 0.0195G \cdot 1000 - 1.528w_s + 0.3529$  (4)

where  $T_{\text{TEG1}}$ ,  $T_{\text{TEG2}}$ , and  $T_{\text{TEG3}}$  are the average temperatures of the TEG module in the above literature, respectively;  $T_{\text{M}}$  is the temperature of the PV module;  $T_{\text{A}}$  is the ambient temperature; *c* is a coefficient determined by installation conditions; and *G* is the irradiance.

In addition, it is worth investigating for researchers to study more efficient and systematic metaheuristic algorithms, thus, realizing efficient MPPT for the PV-TEG system (Liu et al., 2020; Wang et al., 2021; Zhang et al., 2021).

### **DISCUSSION AND CONCLUSION**

MPPT algorithms are the most frequently used techniques to obtain the maximum power of the TEG systems, but there is still room for improvement. Researchers can promote research priorities for MPPT of the TEG system to fill up the gaps in the previous studies. Recommendations and limitations of this technique are as follows:

- (a) NUTD in a real scenario can be further simulated, such as the variation in temperature of the TEG system from sunrise to sunset in 1 day. In addition, standard study cases of NUTD for researchers to simulate in MPPT studies can be further established.
- (b) For the TEG system, researchers should give more consideration to the mathematical model of system, in which wind speed, installation condition, and other practical factors can be considered.
- (c) Existing MPPT algorithms are only available for small-scale systems. Most of the literature only conducts simulation under uneven distribution of temperature. Hence, there is a need to consider other factors leading to mismatch and study how many converters or MPP trackers should be used in large-scale system.

(d) MPPT techniques for the hybrid PV-TEG system have a large potential. Researchers can further study the MPPT techniques of the hybrid system, which are underexploited in the related fields.

Future studies will further explore the following aspects:

(i) MPPT techniques for actual large-scale TEG system will be further explored to meet the demand of practical engineering.

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(ii) Efficient and more stable metaheuristic algorithm-based MPPT method for the TEG system will be designed to fill the gap of related fields.

### AUTHOR CONTRIBUTIONS

RS: writing the original draft and editing. BY: conceptualization. NC: visualization and contributed to the discussion of the topic. YH: visualization and contributed to the discussion of the topic.

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