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An efficient descriptor model for designing materials for solar cells

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An efficient descriptor model for fast screening of potential materials for solar cell applications is presented. It works for both excitonic and non-excitonic solar cells materials, and in addition to the energy gap it includes the absorption spectrum (a(E)) of the material. The charge transport properties of the explored materials are modelled using the characteristic diffusion length (L_d) determined for the respective family of compounds. The presented model surpasses the widely used Scharber model developed for bulk heterojunction solar cells. Using published experimental data, we show that the presented model is more accurate in predicting the achievable efficiencies. To model both excitonic and non-excitonic systems, two different sets of parameters are used to account for the different modes of operation. The analysis of the presented descriptor model clearly shows the benefit of including a(E) and a(E) in view of improved screening results.

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INTRODUCTION

There has been a remarkable thrust towards developing costeffective photovoltaics in the past two decades. ^{1–5} Different materials and device concepts have been deployed and the highest achieved conversion efficiency so far is 44.7% by quadruple junction using III–V materials. ⁶ As for the market, it is dominated by the conventional Si solar cells. Nonetheless, dye-sensitised solar cells, organic photovoltaics (OPV) and the recently emerged hybrid perovskite solar cells could become more cost effective and competitive if produced at large scale. ⁷

In principle, an efficient single-junction solar cell can be made of any semiconducting material with an energy gap (E_g) ranging between 1.0 and 1.7 eV and with reasonable transport to allow the photogenerated carrier to be collected. Hence, many organic and inorganic semiconductors have been used to make solar cells. 4,11 The selection was mostly based on known materials as, till recently, experimental data were the main source for screening materials for solar cells. Despite the rich data, this certainly limits the screening space. However, the sophisticated computational capabilities have provided an alternative route to explore new materials for solar cells much beyond the rich experimental data. There are many initiatives in this regard. Among the most noticeable ones is the Clean Energy Project at Harvard University.^{12–14} It is a high-throughput discovery and design program for the next generation of OPV materials. By 2013, 2.3 million of organic molecules and polymers were analysed using > 150 million density functional theory calculations to assess their applicability for solar cells.14

The Clean Energy Project, like other initiatives, $^{15-17}$ is based on atomistic calculations, which are then fed into empirical descriptor models to assess the potential of the studied material for photovoltaics. The commonly used descriptor model, at least within the OPV community, is the one proposed by Scharber, 18 a one-parameter model based on the computed E_{q} , in which the

open-circuit voltage (V_{oc}) is assumed to be a fixed reduction of E_{q} defined (by the Scharber model) as the difference between the highest occupied molecular orbital of the donor and the lowest unoccupied molecular orbital of the acceptor. The short-circuit current (J_{sc}) is estimated as a fraction of the current resulting from absorbing all incident photons above E_{qr} , whereas the fill factor (FF) is set to a fixed value. Usually, the FF and the scaling parameter for J_{sc} are both set to a value of 0.65. Although these approximations for V_{oc} and FF appear reasonable, the assumption that all the photons above E_{α} are absorbed and a fraction of them is extracted as current is an extreme oversimplification. These assumptions ignore the inhomogeneity of the absorption spectrum. Furthermore, it assumes that the transport is highly efficient and that the diffusion length is much larger than the absorption length so that the detailed balance fraction of the photogenerated carriers can be collected. Practically, it is important to consider in more detail the absorption spectrum and the transport limitations.

In this paper, we propose a descriptor model where the absorption spectrum (a(E)) is obtained from the same electronic structure calculations used to determine $E_{\rm g}$. E is the photon energy in eV, which is used as the unit for energy throughout in this paper. These are the only atomistic calculations needed here. In addition, the transport is characterised by the diffusion length ($L_{\rm d}$), which is a measure for the mean distance that an excited carrier can cross through random diffusion before recombining. Calculating $L_{\rm d}$ needs lengthy calculations, which would make combinatorial screening prohibitively expensive. To avoid this, each material is given a value for $L_{\rm d}$, which is characteristic for the family of compounds it belongs to.

The focus in this paper is on OPV as in the Scharber model. Nonetheless, the same model is applicable to other photovoltaics technologies. Yet, due to the slightly different modes of operation between excitonic (such as OPV) and non-excitonic (e.g., inorganic

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semiconductor cells) solar cells, two distinct sets of parameters should be used. For non-excitonic solar cells, the binding energy of excitons is small and hence the exciton can be dissociated thermally or by potential gradient. On the other hand, in excitonic cells, where the binding energy is large, the heterojunction band offset is needed to dissociate excitons. Thus, a considerable additional loss in the voltage is unavoidable. Therefore, it is essential to make distinction between these two classes of cells.

We intend to apply our model for large-scale virtual screening of organic compounds, where the absorption spectra fluctuate considerably. Hence, we expect that by taking into account the details of their absorption spectrum, we will be able to better discriminate between candidate compounds. The initial validation analysis clearly shows the merit of including $\alpha(E)$ and $L_{\rm d}$ in the descriptor model. Just as an example, the Scharber model suggests that copper phthalocyanine (CuPc) is better than the parent (2,4-bis[4-(N,N-diisobutylamino)-2,6-dihydroxyphenyl] squaraine) (SQ) donor. However, by including $\alpha(E)$, the improved model shows that SQ should be more efficient than CuPc if the film thickness is < 100 nm, which is within the normal range of OPV donor thickness. 19,20

THE PROPOSED DESCRIPTOR MODEL

As known, photovoltaics efficiency (η) is commonly expressed as

$$\eta = \frac{V_{\text{oc}}J_{\text{sc}}FF}{P_{\text{in}}},\tag{1}$$

where $P_{\rm in}$ is the input power density. Certainly, many factors contribute to $V_{\rm oc}$, $J_{\rm sc}$ and FF. The main factors are materials related. Yet, the device design, fabrication quality and operational conditions have major roles as well. For materials screening, it is reasonable to assume that the device design and quality are optimised. So, the merit of the material's potential for photovoltaic depends mainly on its optoelectronic properties. In this section, relations are proposed to link the materials properties to practical estimations for the maximum obtainable values for $V_{\rm oc}$, $J_{\rm sc}$ and FF and hence the efficiency.

For OPV technology, the most efficient cells are bulk heterojunction (BHJ) devices. Conceptually, for materials screening, BHJ device requires multi-purpose multi-dimensional screening; i.e., a matrix of possible devices need to be screened based on a set of acceptors and a set of donors that fulfil the requirements to make a working solar cell. If the sets are small, then, the two-dimensional screening is possible. Otherwise, it can become intractable. So, most of the related large-scale screening is performed for single-layer OPV. 12,13,18 However, as BHJ devices allow for greater thickness than single-layer ones, the assumed thickness should be larger than the actual 'exciton' diffusion length ($L_{\rm Xd}$), which is usually $\ll 100 \, {\rm nm}.^{19-21}$ In this work, we follow the same track of materials screening for single-layer OPV, but assume that the thickness is equal to the nominal average of BHJ devices, i.e., around 100 nm. 19,20 For practical reasons, the focus is on finding a small set of promising donor materials, for which it will be later possible to find matching acceptors.

The proposed descriptor model parameters will be based on the best experimentally reported efficiencies for different organic, inorganic and organometallic materials. These data are tabulated in Tables 1–3. There are some better reported efficiencies; unfortunately, there are no details about the performance parameters of these cells. So, we limit the analysis to the best reported cells with full details. The used reference materials are:

Excitonic:SQ, DTS (5,5-bis(4-(7-hexylthiophen-2-yl)thiophen-2-yl)-[1,2,5]thiadiazolo[3,4-c]pyridine-3,3-di-2-ethylhexylsilylene-2,2'-bithiophene), CuPc, ZnPc (zinc phthalocyanine), DBP ((dibenzo([f,f]-4,4',7,7'-tetraphenyl)diindeno[1,2,3-cd:1',2',3'-lm] perylene), P3HT (poly(3-hexylthiophene-2,5-diyl), PTB7 (poly[[4,8-

Table 1. The efficiencies and cell performances for the most-efficient reported inorganic homojunction solar cells with full data

	E_g (eV)	L (μm)	V _{oc} (V)	J_{sc} (mA/cm ²)	FF	η	Reference
Si	1.12	200	0.74	41.8	82.7	25.6	63
GaAs	1.43	1	1.122	29.68	86.5	28.8	64
InP	1.35	3	0.878	29.5	85.4	22.1	65

Abbreviation: FF, fill factor.

Table 2. The efficiencies and cell performances for the most-efficient reported inorganic and hybrid heterojunction junction solar cells with full data

	E_g (eV)	L (μm)	V_{oc} (V)	J_{sc} (mA/cm ²)	FF	η	Reference
GalnP	1.81	1	1.455	16.04	89.3	20.8	66
CdTe	1.45	3	0.872	29.47	79.5	20.4	67
CIGS	1.21	2	0.752	35.3	77.2	20.5	68
MAPbl ₃	1.42	0.3	1.07	21.5	67.0	15.4	69

Abbreviations: CIGS, Culn_xGa_(1-x)Se₂; FF, fill factor; MAPbI₃, (CH₃NH₃)PbI₃.

Table 3. The efficiencies and cell performances for some of the most-efficient reported organic solar cells with full data

	E_g (eV)	V _{oc} (V)	J_{sc} (mA/cm ²)	FF	η	Reference
SQ	1.47	0.86	13.6	52	6.1	70
DTS	1.40	0.78	14.4	59.3	6.7	71
CuPc	1.46	0.54	15	61	5.4	72
ZnPc	1.39	0.66	12	64	5.0	73
DBP	1.63	1.93	13.2	66	8.1	74
P3HT	1.77	0.87	11.35	75	7.4	75
PTB7	1.51	0.75	17.46	70	9.2	57

Abbreviations: CuPc, copper phthalocyanine; DTS, (5,5-bis(4-(7-hexylthio-phen-2-yl)thiophen-2-yl)-[1,2,5]thiadiazolo[3,4-c]pyridine-3,3-di-2-ethylhexylsilylene-2,2'-bithiophene); FF, fill factor; PTB7, (poly[[4,8-bis[(2-ethylhexyl)oxy]benzo[1,2-b:4,5-b0]dithiophene-2,6-diyl][3-fluoro-2-[(2-ethylhexyl)carbonyl]thieno[3,4-b]thiophenediyl]]); P3HT, (poly(3-hexylthiophene-2,5-diyl); SQ, (2,4-bis[4-(N,N-diisobutylamino)-2,6-dihydroxyphenyl]squaraine); ZnPc, zinc phthalocyanine.

bis[(2-ethylhexyl)oxy]benzo[1,2-b:4,5-b0]dithiophene-2,6-diyl][3-fluoro-2-[(2-ethylhexyl)carbonyl]thieno[3,4-b]thiophenediyl]]), Non-excitonics:Si, GaAs, InP, GaInP, CdTe, CuIn $_x$ Ga $_{(1-x)}$ Se $_2$ (CIGS) and (CH $_3$ NH $_3$)PbI $_3$ (MAPbI $_3$).

Before presenting the descriptor model, it is useful to discuss the solar photon flux density $(\phi_{\rm ph})$ and to introduce simple approximations for the maximum obtainable current density $(J_{\rm ph})$. The reference density is tabulated by the American Society for Testing and Materials standard (ASTM G173-03) for AM0, AM1.5g and AM1.5d. For flat panels, AM1.5g is more appropriate and it will be used in this paper. If all the photons above a given E_g are absorbed (i.e., the reflection is neglected and the thickness of the absorbing material is large enough) and each photon was to generate one exciton, the maximal photogenerated current $J_{\rm ph}$ is

$$J_{\rm ph} = q \int_{Eq}^{\infty} \phi_{\rm ph}(E) \, \mathrm{d}E, \tag{2}$$

where q is the electron charge. $J_{\rm ph}$ for the different solar spectra is shown in Figure 1. In the Scharber model, $J_{\rm sc}$ is assumed to be a fraction of $J_{\rm ph}$ associated with AM1.5g spectrum.

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As J_{ph} is used routinely in solar cells calculations, it would be useful to approximate $J_{\rm ph}$ as a function of $E_{\rm g}$ in the target range between 1 and 2 eV. This will be used later to develop the improved model. Using the data shown in Figure 1, three possible expressions for approximating $J_{\rm ph}$ as a function of $E_{\rm q}$ can be suggested:

$$\tilde{J}_{\mathsf{ph},1} = a_1 \exp(-b_1 E_{\mathsf{q}}),\tag{3}$$

$$\tilde{J}_{\text{ph},2} = A - \delta J E_{\text{q}} + a_2 \exp(-b_2 E_{\text{q}}) \tag{4}$$

$$\tilde{J}_{\text{ph,3}} = a_3 \exp\left(-b_3 E_{\text{g}}^{c_3}\right). \tag{5}$$

The parameters resulting in the best fit (Figure 2) are:

- for $\tilde{J}_{ph,1}$, $a_1 = 123.62$ and $b_1 = 1.0219$,
- for $\widetilde{J}_{ph,2}$, $a_2 = 0.09097$, $b_2 = -2.14$, A = 85.02 and $\delta J = 38.69$,
- for $\tilde{J}_{ph,3}$, $a_3 = 73.531$, $b_3 = 0.440$ and $c_3 = 1.8617$.

For its simplicity and good accuracy, the expression for $\tilde{J}_{ph,3}$ will be used in this work. It will be referred to as $J_{\rm ph}$, and, correspondingly, the numerical index will be dropped also for the fitting parameters a, b and c.

Parameters $V_{\rm oc}$, $J_{\rm sc}$ and FF are tightly coupled. Thus, to have estimations using only E_{q} , $\alpha(E)$, and L_{d} , many approximations are

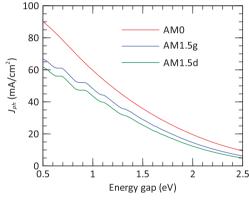


Figure 1. J_{ph} versus E_{q} corresponding to AM0, AM1.5g and AM1.5d spectra.

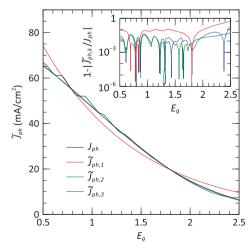


Figure 2. The approximated J_{ph} versus E_q . In the inset, the errors are plotted versus E_q in logarithmic scale.

needed. In this work, we will start by estimating V_{oc} as a function of E_{q} , where the extracted current is assumed as a fraction of J_{ph} . Then, E_{q} , $\alpha(E)$, and L_{d} will be used to estimate J_{sc} . Finally, FF is estimated based on $V_{\rm oc}$

The open-circuit voltage (V_{oc})

Theoretically, V_{oc} is the maximum voltage that a solar cell can apply to an external load. It is essentially the difference between electron and hole quasi-Fermi levels resulted from photoexcitation. Typically, it is assumed to be upper bounded by E_q/q , which is standardly defined—unlike the Scharber model—as the difference between highest occupied molecular orbital and lowest unoccupied molecular orbital of a single absorbing material. In the highly unlikely case of extreme charge accumulation, it can exceed the gap. Many relations between $V_{\rm oc}$ and $E_{\rm g}$ were suggested. Almost all of them are based on the Shockley diode equation (assumed ideal with the identity number set to unity) when the net current vanish. This leads to

$$V_{\rm oc} = \frac{k_{\rm B}T}{q} \ln \left(\frac{J_{\rm sc}}{J_0} + 1 \right),\tag{6}$$

where k_B is the Boltzmann constant, T is the cell temperature and J_0 is the reverse saturation current density. The differences between the suggested models are due to the different assumptions for J_{sc} and J_0 . For J_{sc} , in this subsection, it is assumed to be a fraction of $J_{\rm ph}$. This is acceptable as the scaling constant will be considered by the fitting parameters. As for J_0 , many models and empirical equations were suggested. ^{26–29} Among the best approximations is the Wanlass equation, ²⁸ where the values of J_0 of many of the commonly used semiconductors are fitted to very high accuracy. According to his model,

$$J_0 = \beta(E_g)T^3 \exp\left(-\frac{E_g}{k_B T}\right),\tag{7}$$

$$\beta(E_{g}) = 0.3165 \exp(2.192 E_{g}). \tag{8}$$

in mA/cm² K³. Theoretically, β should be constant. However, E_{α} dependence is introduced empirically as a correction for

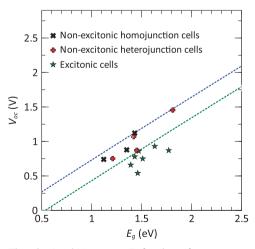


Figure 3. The obtained V_{oc} versus E_{q} for the reference materials. The black marks are for inorganic homojunction cells (non-excitonic), the red marks are for the inorganic and organometallic heterojunction junction solar cells (non-excitonic), and the green ones are for the organic cells (excitonic). The two dotted lines are for different values of V_L . The blue line is for $V_{L0} = 0.2 \text{ V}$, which fits non-excitonic cells, and the green line is for $V_{L0} = 0.5 \text{ V}$ for excitonic cells.

homojunction 'solar cells' operation. The same form was suggested also for OPVs, which are heterojunction devices, but with slightly smaller value for the prefactor. So, by applying a fraction of $\tilde{J}_{\rm ph}$ (Equation 5) and $J_{\rm o}$ in equation (6) and by considering the fact that $J_{\rm o}$ is very small quantity, we obtain

$$\tilde{V}_{oc} = E_{g} - \tilde{V}_{L}, \tag{9}$$

where at room temperature (at 300 K)

$$\tilde{V}_{L} = 0.0114E_{g}^{1.8617} + 0.057E_{g} + V_{L0}$$
 (10)

and V_{L0} is used as a fitting parameter (thus the differences in the prefactors of J_0 are accounted for).

In homojunction solar cells, the losses are mainly due to the materials and the excitation; i.e., the losses due to the device design are—in principle—avoidable. For heterojunction devices, the energy offsets between the layers add to the voltage loss. For non-excitonic solar cells, the binding energy of exciton is small and hence it can be dissociated thermally or by a potential gradient. As a result, the heterojunction offset can be made small. On the other hand, in excitonic cells, the binding energy is large and the band offset is used to dissociate excitons. Thus, a considerable additional loss in the voltage is unavoidable. Therefore and as aforementioned, it is essential to make distinction between the two classes of excitonic and non-excitonic cells. The original Scharber model considers the

reduction due to band offset. However, this is routinely ignored in materials screening as it adds extra constraint on the acceptor.

Figure 3 maps the obtained $V_{\rm oc}$ to $E_{\rm g}$ for the reference materials. Clearly for non-excitonic cells, the blue line ($V_{\rm L0}=0.2\,\rm V$) line provides a good estimation for the upper limit. On the other hand, the maximum experimentally measured $V_{\rm oc}$ values for excitonic cells are much lower. This is mainly due to the sizable, yet needed heterojunction band offset. Thus, larger $V_{\rm L0}$ is indispensable. Here this parameter is set to the lowest reported voltage loss in organic cells. As can be seen in Table 3, it is 0.61 V for SQ-based solar cell leading to $V_{\rm L0}{\approx}0.5\,\rm V$.

The short-circuit current (J_{sc})

As stated in the introduction, in the Scharber model, J_{sc} is assumed to amount to a constant fraction of J_{ph} . Usually, 0.65 is used as the scaling parameter. So,

$$\tilde{J}_{\text{sc.Sch}} = 0.65 J_{\text{ph}}.\tag{11}$$

The two most crucial deficiencies of the Scharber model, namely, the assumption of a homogeneous absorption spectrum (above the bandgap) and that the transport is very efficient such that $L_{\rm d}$ is much larger than the absorption length, can be addressed by explicitly considering the spectral inhomogeneity (using $\alpha(E)$) and by introducing a proper characterisation of $L_{\rm d}$. This shall result in improved predictions while not over-complicating the descriptor model.

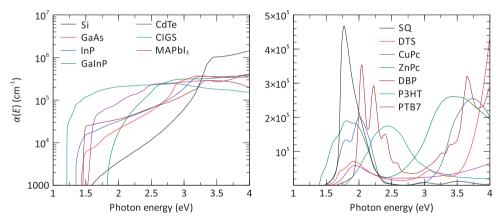


Figure 4. The absorption coefficients of the reference materials; left: non-excitonic cells, right: excitonic cells. The data are extracted from various sources. 49–56

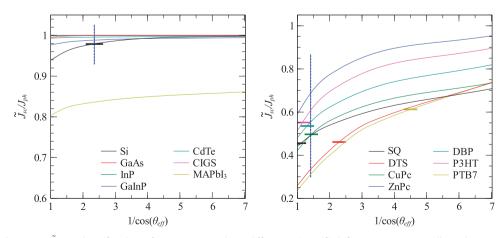


Figure 5. The ratio between \hat{J}_{sc} and J_{ph} for the reference materials at different 1/cos (θ); left: non-excitonic cells, right: excitonic cells. The small marks correspond to the maximum reported ratios. For the materials without shown marks, the ratios match the maximum possible values without scattering. This is mainly due to their strong absorptions and very efficient transports.

The absorption spectrum $\alpha(E)$ can be computed by means of electronic structure calculations, often based on semiclassical approaches. These calculations also provide numerical values for E_g . So, there is no additional atomistic calculation needed for $\alpha(E)$. However, the calculation of $\alpha(E)$ from these common inputs can be computationally expensive. This fact shall be considered during the design of high-throughput screening.

Commonly, a(E) is calculated by semiclassical approach where the electrons are treated quantum mechanically through the electronic structure and the field is treated classically. The details vary based on the used method for electronic structure calculations. From electronic structure calculations, the complex dielectric function $(\varepsilon(E) = \varepsilon_1(E) + i\varepsilon_2(E))$ can be calculated. $\varepsilon_2(E)$ is calculated by considering all the possible transitions from occupied to unoccupied states. For each transition, its contribution into $\varepsilon_2(E)$ is proportional to the square of the matrix element. Then, $\varepsilon_1(E)$ is calculated from $\varepsilon_2(E)$ using the Kramers–Kronig transformation. Finally, both the refractive index n(E) and a(E) are calculated from the relation $\sqrt{\varepsilon_1(E) + i\varepsilon_2(E)} = n(E) + i\alpha(E)\hbar c/qE$, where \hbar is the Planck constant and c is the speed of light.

As aforementioned, the transport is commonly characterised by $L_{\rm d}$. Calculating $L_{\rm d}$ requires very time-consuming computing, which will complicate the materials screening process. To avoid that, each material is given a value of $L_{\rm d}$, which is characteristic for the family of compounds it belongs to.

Many parameters govern $L_{\rm d}$. Some of them are related to the intrinsic properties of materials and many others are due to the fabrication quality. For non-excitonic cells, the minority carrier

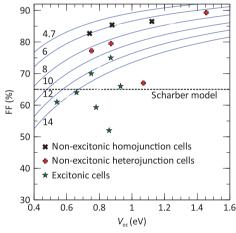


Figure 6. The obtained *FF* versus $V_{\rm oc}$ for the reference materials. The black marks are for inorganic homojunction cells (non-excitonic), the red marks are for the inorganic and hybrid heterojunction solar cells (non-excitonic) and the green ones are for the organic cells (excitonic). The solid lines are for six different values of a, whereas the dotted black line is the value suggested by Scharber model (Table 4).

diffusion is the main process and it is limited mainly by material growth quality. For defect-free indirect bandgap materials, lifetimes are in milliseconds and the mobilities are high, which give rise of few hundred microns to $L_{\rm d}$. 33,34 However, for direct gap materials, the lifetime is significantly reduced because of the band-to-band recombination. Thus, $L_{\rm d}$ is reduced to a range between few microns and few tens of microns. $^{35-37}$ As for organometallic materials, $L_{\rm d}$ is estimated to be $>1\,\mu\rm m$ for methylammonium lead iodide. 38

On the other hand, the main limiting factor in excitonic solar cells is the exciton diffusion length. 39,40 The exciton cannot dissociate at the same location at which it was generated. Rather, it has to travel by hopping to the nearest interface to dissociate. Thus, the transport is limited by exciton diffusion rather than the free carrier diffusion. Exciton diffusion length in organic solar cell materials is normally $< 0.1 \ \mu m.^{19-21}$ In this work, we assume the following values for $L_{\rm d}$ as characteristic for the following material families:

- for indirect-gap semiconductors, L_d≈200 μm,
- for direct-gap semiconductors, L_d≈10 μm,
- for organometallic semiconductors, $L_d \approx 0.6 \mu m$,
- for excitonic cells, $L_d \approx 0.1 \, \mu \text{m}$.

Conceptually, J_{sc} is the difference between photogenerated and recombination currents, i.e.,

$$J_{sc} = J_g - J_r. (12)$$

In an ideal situation, it is assumed that the thickness of the absorber layer is so large that all photons above $E_{\rm g}$ are absorbed. Practically, the carrier collection and hence the absorber layer thickness are limited by $L_{\rm d}$. Therefore, the maximum possible photogenerated current is $^{41-44}$

$$J_{g} = q \int_{Eg}^{\infty} \int_{-\pi/2}^{\pi/2} \phi_{ph}(E) P(\theta, \theta_{inc}, E) \left[1 - e^{-\alpha(E)L_{d}/\cos{(\theta)}} \right] d\theta dE, \tag{13}$$

where $P(\theta,\theta_{\text{inc}},E)$ is an angular distribution function that accounts for the scattering of the light at angle θ in the absorbing layer depending on the incidence angle θ_{inc} and photon energy. The scattering results in increasing—positively—the optical path of the light in the absorbing layer by a factor of 1/cos (θ). From a device-performance perspective, it is important to have $L_{\rm d}$ much larger than the absorption length ($L_{\rm a} \propto 1/a(E)$). If $L_{\rm d} \gg L_{\rm ar}$, the second term in the square bracket gets diminished and $J_{\rm g}$ increases. Otherwise, $J_{\rm q}$ is reduced considerably.

Obviously, $P(\theta,\theta_{inc},E)$ depends on many factors mainly related to the films morphology and microstructure and the structure of interfaces. For the modelling of the distribution function, many different distributions were suggested. ^{42,43,45–48} In this work, to keep the model simple, we can combine the scattering effects in a

Table 4. A summary of the original Scharber model and proposed model for both excitonic and non-excitonic solar cells. For the original Scharber model, ΔV is the band offset

	The original model	The proposed model for excitonic cells	The proposed model for non-excitonic cells
V _{oc}	$E_{\rm g} - 0.3 - \Delta V$	$E_{\rm g} - 0.5 - 0.0114 E_{\rm g}^{1.8617} - 0.057 E_{\rm g}$	$E_{g} - 0.2 - 0.0114E_{g}^{1.8617} - 0.057E_{g}$
$J_{\rm sc}$	$0.65J_{\rm ph}(E_{\rm g})$	$\widetilde{J}_{g}\left(E_{g},\alpha(E),L_{d},\pi/4\right)$	$\tilde{J}_{g}(E_{g}, \alpha(E), L_{d}, \pi/2.75)$
FF	0.65	$V_{\rm oc}/(V_{\rm oc}+12k_{\rm B}T_{\rm c})$	$V_{\rm oc}/(V_{\rm oc}+6k_{\rm B}T_{\rm c})$

single effective angle $\theta_{\rm eff}$. So, $J_{\rm q}$ becomes

$$\tilde{J}_{\rm g}(E,\alpha(E),L_{\rm d},\theta_{\rm eff}) = q \int_{E_{\rm g}}^{\infty} \phi_{\rm ph}(E) \left[1 - e^{-\alpha(E)L_{\rm d}/\cos{(\theta_{\rm eff})}}\right] {\rm d}E \eqno(14)$$

The way $\theta_{\rm eff}$ is determined will be shown at the end of this subsection.

As for the recombination, there are many mechanisms contributing to it. This is accounted for empirically by $L_{\rm d}$ and it can be adjusted further by a proper fitting of $\theta_{\rm eff}$. So, $J_{\rm sc}$ can be approximated by a similar form of equation (14), but with a slightly different $\theta_{\rm eff}$, that will be determined based on the actual performances and absorption spectra of the reference materials.

Figure 4 shows the absorption spectra of the reference materials, which are extracted from various sources. $^{49-56}$ For the known non-excitonic cells, it is evident that due to the extended absorption spectrum above E_g , $\alpha(E)$ is smooth, whereas the organic materials show a strongly fluctuating bands. For example, the absorption of SQ is strong only between 1.5 and 2.3 eV. Thus, a large portion of solar radiation is not absorbed due to the fact that the device thickness is small.

To determine $\theta_{\rm eff}$, the ratios $\tilde{J}_{\rm sc}/\tilde{J}_{\rm ph}$ are calculated and plotted against $1/\cos(\theta_{\rm eff})$ (Figure 5). For non-excitonic cells, the effect of $\theta_{\rm eff}$ for most materials is negligible due to their strong absorption and due to the fact that the growth quality of the studied materials is high and hence the assumed $L_{\rm d}$ is large. The exceptions are for Si due to its weak absorption and for MAPbl₃ due to its relatively short $L_{\rm d}$. For Si, $\theta_{\rm eff}\approx\pi/2.75$ is needed to match the obtained $J_{\rm sc}$. So, this value will be used for non-excitonic cells. For excitonic cells, $\theta_{\rm eff}=\pi/4$ is a good approximation for most of the studied materials. The exception is for PTB7, where the difference between the reported $J_{\rm sc}$ and the calculated value from absorption spectrum is high. This can be due to an extremely efficient light trapping used to make the cell. Theorem However, to match most of the reported maximum values, $\theta_{\rm eff}=\pi/4$ is suitable and will be used for excitonic cells.

The fill factor

The third performance parameter is the FF. Practically, many physical mechanisms contribute to it and consequently many models have been suggested to estimate it. $^{58-61}$ Generally, the suggested models are based on the relationship between current and voltage; but with different assumptions on the causes and values of shunt and series resistances. FF is usually represented as a function of $V_{\rm oc}$, which depends as shown above on $E_{\rm q}$.

One of the simplest—yet reasonably accurate–forms suggested by Green⁶¹ for conventional inorganic semiconductors is

$$FF = \frac{V_{\text{oc}}}{V_{\text{oc}} + ak_{\text{B}}T} \tag{15}$$

Originally, he suggested a=4.7. However, this factor can be adjusted for other solar cell technologies. On the basis of the best reported cells, a=6 and a=12 fit better the upper limits of the measured FF for non-excitonic and excitonic solar cells, respectively, as shown in Figure 6, where T is the room temperature.

MODEL IMPLEMENTATION AND EVALUATION

The parameterized expressions used for the three performance factors (V_{oc} , J_{sc} and FF) in the original Scharber model and the presented descriptor are summarised in Table 4.

In the first analysis, we compare the predictions of the two models for excitonic materials with the available experimental data (Table 3). For the original Scharber model, three reasonable values 12,14,62 for ΔV are assumed in the analysis; namely, 0.2, 0.3 and 0.4 V. The results are shown in Figure 7. As can be observed,

the improved model outperforms considerably the original Scharber model in the estimations of J_{scr} except for PTB7. For V_{ocr} the presented model provides good estimation for most of the studied materials. As for the original Scharber model, this depends obviously on ΔV . For η , the presented model outperforms in most cases the original one. The original model performs

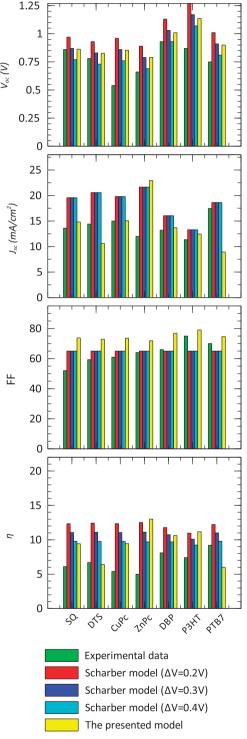


Figure 7. Comparison for organic (excitonic) solar cell performances of the relevant reference materials as estimated by the presented and the Scharber (for three different values for ΔV) models, and as experimentally published for the best reported cells.

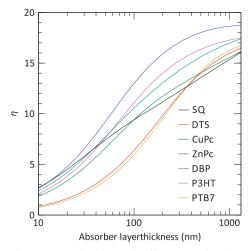


Figure 8. The estimated solar cell efficiencies for the reference organic (excitonic) materials as a function of the absorbing layer thickness.

generally better only in the estimation of FF. However, FF depends extremely on the device design and optimisation, unlike other parameters that are mostly materials dependent. The improved model suggests that the obtained FF values are smaller than the predictions. Thus, there is a reasonable room for improvement through device optimisation.

To illustrate the importance of considering $L_{\rm d}$, the presented method is used to estimate conversion efficiencies of the array of organic materials studied as a function of thicknesss as shown in Figure 8. Clearly, material potential ranking varies with the thickness. For example, for very thin films ($L < 50 \, \rm nm$), SQ is predicted to show better efficiency when compared with all other materials, except ZnPc. Also, PTB7- and DTS-based solar cells would result in better efficiencies when compared with CuPc and SQ only for relatively thicker films.

In the next analysis, the improved model is applied to the reference non-excitonic materials. As aforementioned, the original Scharber model was designed for OPVs. It can be adjusted to also work for inorganic cells in a similar way as our proposed model, i.e., by working with two sets of parameters. Figure 9 shows a comparison between the reported experimental efficiencies and the estimated ones by the proposed model for non-excitonic cells. Again, the model provides very good estimations. For the well-optimised devices such as Si and GaAs, the presented model suggests that the room of improvement is limited. However, it indicates that there is a possibility to considerably improve the performance of MAPbl₃, CIGS, CdTe and InP.

The last analysis is for the effect the absorber layer thickness on the expected efficiencies for the non-excitonic solar cell materials. The results are shown in Figure 10. The expected efficiencies for all the studied materials saturate after few micrometre except for Si solar cells. It takes very thick layer to reach a reasonable efficiency. As known, this is due to its weak absorption. 4.5.47,63

CONCLUSION

A descriptor model for solar cell efficiencies estimation is developed. Relative to the original Scharber model, the developed model presented here revisits the three main performance factors $(V_{\rm oc}, J_{\rm sc})$ and FF; Equation 1). For the short-circuit current $(J_{\rm sc})$, the model takes in full account the details of the absorption spectrum a(E) to evaluate the photogenerated current $(J_{\rm g})$, and uses new and more elaborate parametrization for the other components contributing to this quantity, i.e., the scattering distribution and

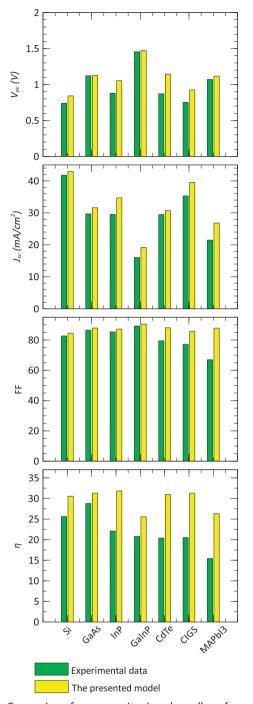


Figure 9. Comparison for non-excitonic solar cell performances of the relevant reference materials as estimated by the presented and as experimental published for the best reported cells.

the diffusion length, which characterize the transport and the recombination. The open-current voltage $V_{\rm oc}$ is expressed in terms of a power series of the energy gap fitted against available experimental data. The FF is estimated using adjusted empirical model originally suggested by M. Green. Using two different sets of parameters, the model can be used for both excitonic and non-excitonic materials.

The analysis of the new model shows that its much better performance arises from the improved predictions for the open-circuit voltage and the short-circuit current ($V_{\rm oc}$ and $J_{\rm sc}$). On the other hand, the estimation of the original Scharber model for the

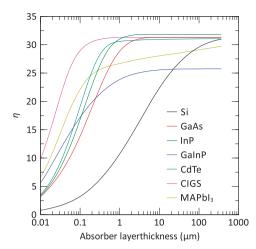


Figure 10. The estimated non-excitonic solar cell efficiencies for the relevant reference materials as a function of the absorbing layer thickness

FF is slightly better than our model when compared with the experimentally reported values. However, as FF depends extremely on the device design and optimisation, the larger values estimated by the proposed model indicate that the performance of the reference cells can be improved by proper device optimisation.

We expect the proposed descriptor model to allow for more accurate assessments of the performance of light harvesting materials. Even though the results of material screening efforts based on this model are still missing, the model was already shown to be useful to study the change of performance of a given material with the variation of some device parameter such as the layer thickness.

COMPETING INTERESTS

The authors declare no conflict of interest.

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