Propagation Distance Estimation for Radio over Fiber with Cascaded Structure

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Abstract—Recent developments in polymer microwave fiber (PMF) have opened great opportunities for robust, low-cost, and high-speed sub-terahertz (THz) communications. Noticing this great potential, this paper addresses the problem of estimation of the propagation distance of a sub-Thz signal along a radio over fiber structure. Particularly, this paper considers a novel cascaded structure that interconnects multiple radio units (RUs) via fiber for applications in indoor scenarios. Herein, we consider the cascaded effects of distortions introduced by non-linear power amplifiers at the RUs, and the propagation channel over the fiber is based on measurements obtained from transmissions of sub-THz signals on high-density polyethylene fibers. For the estimation of the propagation distance, nonlinear least-squares algorithms are proposed, and our simulation results demonstrate that the proposed estimators present a good performance on the propagation distance estimation even in the presence of the cascaded effect of non-linear PAs.

Index Terms—Non-linear power amplifiers, propagation distance estimation, radio over fiber

I. INTRODUCTION

The ever-increasing demand for wireless connectivity raises the necessity of pursuing the unexploited spectrum at very high frequencies. The opportunities to use the abundance of spectrum at the sub-terahertz (THz) frequency band have attracted attention for the sixth generation (6G) wireless communication systems [\[1\]](#page-4-0), [\[2\]](#page-4-1). Although there has been abundant research on the performance of sub-THz wireless communication systems [\[3\]](#page-4-2), [\[4\]](#page-4-3), the implementation of sub-THz wireless communication systems is still an open challenge [\[5\]](#page-4-4). Considering the cost of sub-THz radio hardware and the limited coverage [\[6\]](#page-4-5), a low-cost and dense deployment solution is desirable.

Recent developments in polymer microwave fiber (PMF) have motivated the development of radio-over-fiber (ROF) communications, which offer great opportunities for lowcost implementations of sub-THz wireless systems [\[7\]](#page-4-6)–[\[9\]](#page-4-7). Herein, we consider a ROF system with a cascaded structure, operating at the sub-THz band, in which multiple components are interconnected via low-cost PMFs and finally connected to a central unit (CU). Fig. [1](#page-0-0) illustrates the cascade ROF system under consideration (the different variables will be defined later). In this system, each user equipment (UE)

Fig. 1: Signal model for the cascade ROF system

transmits sub-THz signals over the air. And the signals are captured by densely deployed radio units (RUs) which are equipped with an antenna, a power amplifier (PA), and other components. Then, the signals propagate over the ROF in a cascaded structure. Each RU in between the entry RU and the CU acts as a repeater which amplifies the signals and forwards them to the subsequent component, in a sequential process, until reaching the CU. All signal processing is then performed at the CU.

For energy efficiency (EE) purposes, the PA is allowed to operate in the non-linear regime [\[10\]](#page-4-8). Therefore, in each stage of the ROF system, the signals are distorted by the PA and by a segment of dispersive PMF. The fiber itself is a linear timeinvariant system, whereas the amplifiers are non-linear. This characteristic enables us to estimate the propagation distance over the ROF by analyzing the way the signals are distorted when they propagate over the ROF. Our proposed propagation distance estimator could be a building block in a system for positioning the UE, for example, to help find the closest RU to the UE in the uplink (UL).

Contributions: The specific contributions of this paper are (i) an analysis of the cascaded structure with non-linear PAs and dispersive PMFs, and the formulation of a corresponding UL signal model; (ii) a non-linear least-squares (NLS) optimization framework for propagation distance estimation, and (iii) numerical results (using measured PMF dispersion characteristics and different values of non-linear factors) demonstrate that the proposed estimators present a good performance on the propagation distance estimation even in the presence of the cascaded effect of non-linear PAs. To the best of our knowledge, signal propagation over a ROF with segments of dispersive PMFs and non-linear amplifiers connected in cascade has not been studied before.

Fig. 2: The deployment of ROF systems in an indoor scenario

Fig. 3: System model for UL communication between the UE1 and the ROF1

II. SYSTEM MODEL AND PROBLEM FORMULATION

A. System Model of a ROF System

Consider an indoor scenario as illustrated in Fig. [2,](#page-1-0) where two UEs are served by two ROF systems, each with M components interconnected by PMFs. The UE1 transmits data to ROF1 through the UL communication, where all RUs are active. The UE2 receives data from ROF2 through the DL communication, where the CU configures the RUs via the fiber according to the estimate of the UE2 position. Since the propagation range of the sub-THz wireless connection is extremely limited, we consider UE is only served by the nearest RU of the nearest ROF.

It is considered that there is a clock offset and phase offset between the UEs and the ROF systems. Particularly, Fig. [3](#page-1-1) illustrates the UL communication between UE1 and ROF1, where UE1 gets access through the unknown rth RU. The objective is to locate the nearest RU to the UE, i.e. estimating r, which leads to a good approximation of the UE location. In the following, we detail the two setups for the RUs.

B. RUs with PAs Operating in the Linear Regime

Under this scenario, the RUs are equipped with PAs amplifying the input signals without any non-linearity. The signal model considers the channel over the fiber and the wireless channel from the UE to the RU. For a unit-length fiber segment, we model its impulse response via L taps with amplitudes $([\beta_0, \beta_1, \cdots, \beta_{L-1}]^{\mathrm{T}})$:

$$
h_n = \sum_{l=0}^{L-1} \beta_l \delta(n-l),\tag{1}
$$

where *n* is the time index and $\delta(\cdot)$ is the delta function. Let D be the unknown propagation distance which is associated with an integer number r indicating the number of unit lengths of the fiber that the signal has passed through, and can be expressed as $D = rd_f$, where d_f denotes the unit length of the fiber. Then, the impulse response can be expressed as

$$
\tilde{h}_n = \underbrace{h_n * h_n * \cdots * h_n}_{r \text{ convolutions}},
$$
\n(2)

where all factors in [\(2\)](#page-1-2) are modeled as in [\(1\)](#page-1-3). In the frequency domain, we consider the frequency response for a set of K discrete frequencies, $\mathbf{f} = [f_0, \cdots, f_{K-1}]^{\mathrm{T}}$. The corresponding relation of [\(2\)](#page-1-2) in the frequency domain is in the form of multiplication of frequency responses. Let $\boldsymbol{H} = [H_0, \cdots, H_{K-1}]^{\mathrm{T}}$ represent the frequency response of a unit-length fiber. The frequency response of a unit-length fiber at the kth frequency H_k is the Fourier transform of its impulse

$$
H_k = \sum_{n=0}^{N-1} h_n e^{-j2\pi f_k n T_s},
$$
\n(3)

where T_s is the sampling time interval. Hence, the frequency response of an r-units-long fiber, at the kth frequency, can be expressed as

$$
\tilde{H}_k = \underbrace{H_k H_k \cdots H_k}_{r \text{ multiplications}} = H_k^r. \tag{4}
$$

Considering [\(2\)](#page-1-2) and [\(4\)](#page-1-4), we aim at estimating r of the propagation of a signal within the ROF. For that purpose, it is considered that the UE transmits a known sequence of samples $\mathbf{s} = [s_0, \dots, s_{K-1}]^T \in \mathbb{C}^{K \times 1}$ over K discrete frequencies. Initially, the signals undergo the wireless channel between the UE and the RU, which is unknown to the CU. Due to the sparse nature of the sub-THz wireless channel, only the line-of-sight components are considered in the signal model. The input signal for the kth frequency at the ROF, $x_k^{(0)}$ k with $\bm{x}^{(0)} = [x_0^{(0)}, \cdots, x_{K}^{(0)}]$ $\binom{0}{K-1}$ ^T (see Fig. [1\)](#page-0-0), can be written as

$$
x_k^{(0)} = A e^{-j2\pi f_k \tau} s_k,
$$
 (5)

where

• \overline{A} is a complex value absorbing the unknown wireless channel path gain, antenna gain, and the phase offset between the UE and the ROF.

• τ is the unknown propagation delay including the effects of one-way wireless signal propagation and the clock offset, which can be expressed as

$$
\tau = \frac{d}{c} + \delta_t \tag{6}
$$

with d being the distance over the wireless channel, c is the speed of light, and δ_t is the clock offset between the UE and the $ROF¹$ $ROF¹$ $ROF¹$.

The output signal at the k th frequency of the rth RU as $x_k^{(1)}$ $\binom{1}{k}$ is given as

$$
x_k^{(1)} = Gx_k^{(0)} + w_k^{(0)}.
$$
 (7)

In the rest of this paper, G is the amplitude amplification of a PA, and $w_k^{(m)} \in \mathcal{CN}(0, \sigma^2)$ is the kth AWGN noise component at the $(r - m)$ th RU.

After propagating through r RUs along the ROF system, the received signal with $\mathbf{x}^{(r)} = [x_0^{(r)}, \cdots, x_{K}^{(r)}]$ $_{K-1}^{(r)}$]^T at the CU can be written as

$$
x_k^{(r)} = G^{r+1} H_k^r A e^{-j2\pi f_k \tau} s_k + w_k^{(r-1)}.
$$
 (8)

The unknown parameters to be estimated in this problem are A, r , and τ , of which the parameters r and τ lead to a non-linear problem. We employ a non-linear least-squares (NLS) algorithm to tackle this estimation problem. First, we define the vector $g \in \mathbb{C}^{K \times 1}$ as

$$
\mathbf{g} = G^{r+1} [e^{-j2\pi f_0 \tau} H_0^r s_0, \cdots, e^{-j2\pi f_{K-1} \tau} H_{K-1}^r s_{K-1}]^{\mathrm{T}}.
$$
\n(9)

The estimation objective can be written as:

$$
\begin{bmatrix} \hat{r} \\ \hat{\tau} \\ \hat{A} \end{bmatrix} = \min_{r,\tau,A} ||\mathbf{x}^{(r)} - A\mathbf{g}||^2, \tag{10}
$$

where $\Vert . \Vert$ denotes the L^2 norm. Dropping irrelevant constants, the estimation of the nuisance parameter A is a linear estimation problem that the estimate is obtained as

$$
\hat{A} = \frac{\boldsymbol{g}^{\mathrm{H}} \boldsymbol{x}^{(r)}}{||\boldsymbol{g}||^2},\tag{11}
$$

where $(\cdot)^H$ means the Hermitian transpose. After dropping the dependency on A by considering \hat{A} , we can rewrite the objective as

$$
\begin{bmatrix} \hat{r} \\ \hat{\tau} \end{bmatrix} = \min_{r,\tau} \left| \left| \boldsymbol{x}^{(r)} - \boldsymbol{g}(\boldsymbol{g}^{\mathrm{H}}\boldsymbol{g})^{-1}\boldsymbol{g}^{\mathrm{H}}\boldsymbol{x}^{(r)} \right| \right|^2. \tag{12}
$$

Therefore, after a two-dimensional grid search, the estimate \hat{r} as well as the nuisance parameter, $\hat{\tau}$, can be obtained.

C. RUs with PAs Operating in the Non-linear Regime

In this section, we jointly consider the effects of non-linear PAs and fiber dispersion. The effects of non-linear amplifiers are characterized as a third-order polynomial by a factor λ [\[11\]](#page-4-9), [\[12\]](#page-4-10). Again, the UE transmits a known sequence of samples $\boldsymbol{s} = [s_0, \dots, s_{K-1}]^T$ over K discrete frequencies to the ROF system. We model the input signal in the time domain as

$$
x_n^{(0)} = \frac{1}{K} \sum_{k=0}^{K-1} e^{j2\pi \frac{n}{N}k} A e^{-j2\pi f_k \tau} s_k,
$$
 (13)

with $x_n^{(0)} \in [x_0^{(0)}, \cdots, x_{K}^{(0)}]$ $_{K-1}^{(0)}$]T. The output of the entry RU can be written as

$$
x_n^{(1)} = G\left(x_n^{(0)} + \frac{\lambda x_n^{(0)}}{\lambda x_n^{(0)}} \middle| x_n^{(0)} \right)^2 + w_n^{(0)},
$$
 (14)

where $w_n^{(0)} \in \mathcal{CN}(0, \sigma^2)$ is the *n*th AWGN noise component at the rth RU. To express the output at the following RUs, we define the function $f(.)$ that combines the effects of the channel dispersion and the non-linearity and can be written as

$$
f(x_n^{(1)}) = G\left(\sum_{l=0}^{L-1} \beta_l x_{n-l}^{(1)} + \lambda \sum_{l=1}^{L-1} \beta_l x_{n-l}^{(1)} \left| \sum_{l=1}^{L-1} \beta_l x_{n-l}^{(1)} \right|^2 \right).
$$
\n(15)

If $f(\cdot)$ takes a vector as input, it performs [\(15\)](#page-2-1) element-wise.

The signal $x^{(1)}$ would undergo $(r - 1)$ RUs to reach the CU. Consequently, the signal $x^{(1)}$ would undergo the recursive process r times. Let $f^r(x^{(1)})$ be the overall function, which can be expressed as $f^r(\boldsymbol{x}^{(1)}) = f(f(f(...(\boldsymbol{x}^{(1)}))))$.

Therefore, the received signal at the CU can be expressed as $x^{(r)} = f^r(x^{(1)}) + w^{(r-1)}$. Following the LS framework, the objective function w.r.t. the unknown parameter A, r , and τ is given by

$$
\begin{bmatrix} \hat{A} \\ \hat{\tau} \\ \hat{r} \end{bmatrix} = \min_{A,\tau,r} \left| \left| \boldsymbol{x}^{(r)} - f^r \left(G \left(x_n^{(0)} + \lambda x_n^{(0)} \left| x_n^{(0)} \right|^2 \right) \right) \right| \right|^2.
$$
\n(16)

To reduce the complexity of the three-dimensional grid search, we propose Algorithm [1,](#page-4-11) which is a coordinate descent algorithm, to solve this problem.

III. SIMULATIONS AND RESULTS

In this section, we illustrate the performance obtained by the proposed estimators. We use the measurements presented in [\[13\]](#page-4-12), for a 1-meter PMF made out of highdensity polyethylene with a solid rectangular cross-section in the D-band (110 GHz to 170 GHz). The measured data

¹Distinguish the effects of d and δ_t is impossible because they have the same influence on the signals, i.e. phase shift and delay. However, one can rely on the effects of cascaded fibers and PAs to estimate r and τ separately.

Fig. 5: Magnitude

consists of channel characteristics at K discrete frequencies, encompassing both magnitudes $(\boldsymbol{\alpha} = [H_0 |, \cdots, H_{K-1}|]^{\text{T}})$ and group delay. These measurements inherently include several imperfections, such as noise, interference, and measurement errors. Therefore, the Matlab built-in *smoothdata* function was employed to average out these impairments as shown in Figs. [4](#page-3-0) and [5.](#page-3-1) Subsequently, the phase response $\boldsymbol{\phi} = [\phi_0, \cdots, \phi_{K-1}]^T$ was obtained by integrating the group delay on the discrete frequencies. Then, the transfer function can be expressed as

$$
H = \alpha \circ \exp(j\phi), \tag{17}
$$

where ∘ represents the Hadamard product. This channel corresponds to a spectrum with 1 GHz bandwidth centered around 140 GHz, as illustrated in Fig. [6.](#page-3-2)

With PAs operating in both linear and non-linear regimes, we simulate a ROF system comprising five RUs and one CU. Between every two components, a PMF with the frequency response as expressed in [\(17\)](#page-3-3) serves as the connection. The UE transmits a known sequence of samples using a quadrature phase shift keying (QPSK) waveform. The UE

Fig. 6: Channel transfer function

Fig. 7: Error rate of $\hat{r} \neq r$ in a ROF system

accesses the ROF system through the third RU. Monte Carlo simulations were performed to demonstrate the performance of the estimators in [\(12\)](#page-2-2) and [\(16\)](#page-2-3). In this paper, the noise at each stage is white over the whole bandwidth with variance σ^2 is 0 dB.

From Fig. [6,](#page-3-2) the maximum magnitude attenuation in a onemeter fiber is approximately 2.4 dB. Therefore, the amplification factor G is set to 2.4 dB. Monte Carlo simulations were also performed with the distortion incurred by PAs operating with two non-linear factors, i.e. $\lambda_1 = -\frac{4}{27}e^{j0.2}$, and $\lambda_2 = -\frac{8}{27}e^{j0.2}$. The proposed grid search algorithm was implemented in Matlab and the results are shown in Fig. [7.](#page-3-4) The configurations of the antenna gain and the path loss in the wireless channel were set to ensure the input amplitude is in the certain regime (linear or non-linear) of the PAs. It is observed that the error rate decreases with increased input amplitude, which indicates that the proposed algorithm is able to accurately estimate the propagation distance even when PAs work in the non-linear regime. Through comparison between the estimation accuracy with two non-linear factors, one can observe an accuracy loss with a higher non-linear factor.

IV. CONCLUSION

We considered a novel, low-cost, and easily deployable sub-THz communication system implementation that combines PMFs and PAs in a cascaded structure. An UL signal model of this system was developed, both with and without PA non-linearities. Based on this model, a NLS framework was developed for the estimation of propagation distance along the ROF of signals transmitted from a UE. The NLS objective was minimized by using a combination of coordinate descent and a grid search. Monte-Carlo simulations were performed to assess the performance of the proposed estimator. Results show that a good performance of the propagation distance estimation can be attained under the effects of cascaded dispersive fibers and non-linear PAs. Our proposed algorithms show the feasibility of localizing UEs in the proposed system and provide a starting point for the development of high-resolution positioning schemes.

Future work can be conducted by considering the presence of automatic gain control loop, which makes the gain of PAs adaptive.

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Algorithm 1: Grid search

Data: $s, f(x), x^{(r)}, T$ **Result:** \hat{r} , $\hat{\tau}$, \hat{A} 1 initialization: $|A| \in (0, 1]$, $\angle A \in [-\pi, \pi]$, $\tau \in 1:1:10$ ns, $r \in [1, 2, 3, 4, 5]$, $cost = c$ $\omega = \Big|$ 2 while $cost \leq T$ do $\left|\boldsymbol{x}^{(r)}-f^r\left(\boldsymbol{x}^{(1)}\right)\right|$ $\begin{array}{c} \begin{array}{c} \begin{array}{c} \end{array} \\ \begin{array}{c} \end{array} \end{array} \end{array}$ 2 ; 3 **for** $\tau \leftarrow 1$ to 10 ns do $4 \mid$ [\(16\)](#page-2-3); $5 \mid (14);$ $5 \mid (14);$ $5 \mid (14);$ 6 $\Big|$ $cost_1(\tau) = \omega$; end $\tau = \min_{\tau} cost_1;$ 8 for $|A| \leftarrow 0.1$ to 1 do $9 \mid (13);$ $9 \mid (13);$ $9 \mid (13);$ 10 [\(14\)](#page-2-4); 11 $\qquad \qquad \cos t_2(|A|) = \omega;$ 12 end 13 | $|A| = \min_{|A|} cost_2;$ 14 for $\angle A \leftarrow -\pi$ to π do 15 [\(13\)](#page-2-5); 16 (14) ; 17 $\big|$ $cost_3(\angle(A)) = \omega;$ ¹⁸ end 19 $\angle A = \min_{\angle A} cost_3;$ 20 for $r \leftarrow 1$ to 5 do 21 [\(13\)](#page-2-5); 22 (14) ; 23 $\cos t_4(r) = \omega;$ 24 end 25 $r = \min_r cost_4;$ $26 \quad (13);$ $26 \quad (13);$ $26 \quad (13);$ 27 (14) ; 28 $cost = \omega$; ²⁹ end

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