Embedded Pilot-Aided Channel Estimation for OTFS in Delay-Doppler Channels

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Abstract—Orthogonal time frequency space (OTFS) modulation was shown to provide significant error performance advantages over orthogonal frequency division multiplexing (OFDM) in delay–Doppler channels. In order to detect OTFS modulated data, the channel impulse response needs to be known at the receiver. In this paper, we propose embedded pilot-aided channel estimation schemes for OTFS. In each OTFS frame, we arrange pilot, guard, and data symbols in the delay–Doppler plane to suitably avoid interference between pilot and data symbols at the receiver. We develop such symbol arrangements for OTFS over multipath channels with integer and fractional Doppler shifts, respectively. At the receiver, channel estimation is performed based on a threshold method and the estimated channel information is used for data detection via a message passing (MP) algorithm. Thanks to our specific embedded symbol arrangements, both channel estimation and data detection are performed within the same OTFS frame with a minimum overhead. We compare by simulations the error performance of OTFS using the proposed channel estimation and OTFS with ideally known channel information and observe only a marginal performance loss. We also demonstrate that the proposed channel estimation in OTFS significantly outperforms OFDM with known channel information. Finally, we present extensions of the proposed schemes to MIMO and multi-user uplink/downlink.

Index Terms—OTFS, delay–Doppler channel, Channel estimation, pilot arrangement.

I. INTRODUCTION

Orthogonal frequency division multiplexing (OFDM) is a popular modulation scheme that are currently deployed in 4G long term evolution (LTE) mobile systems. OFDM is known to achieve good robustness and high spectral efficiency for time-invariant frequency selective channels. However, for high-mobility environments such as high-speed railway mobile communications, the channels can be typically time-varying with high Doppler spreads. Under such high Doppler conditions, OFDM is no longer robust and suffers heavy performance degradations. Hence, new modulation schemes that are robust to channel time-variations are being extensively explored.

Recently, orthogonal time frequency space (OTFS) modulation was proposed in [1, 2]. OTFS exhibits significant advantages over OFDM in multipath delay–Doppler channels where each path exhibits a different delay and Doppler shift. In particular, the idea of transmission in the delay-Doppler domain was introduced in [1, 2]. The delay–Doppler domain provides as an alternative representation of a time-varying channel geometry due to moving objects (e.g. transmitters, receivers, or reflectors) in the scene. Leveraging on this representation, OTFS multiplexes each information symbol over a two dimensional (2D) orthogonal basis functions, specifically designed to combat the dynamics of time-varying multipath channels. Then the information symbols placed in the delay-Doppler coordinate system can be converted to the standard time-frequency domain used by traditional modulation schemes such as OFDM. More recently, in [12], a simplified OTFS structure was proposed by including OFDM for time-frequency signal modulation. Its extension to the multiple-input multiple-output (MIMO) case was presented in [13].

In general, OTFS uses the delay-Doppler channel response to parameterize the effects of a time-varying channel on any transmitted waveform. In the delay-Doppler domain, the response captures the dominant scatterers in the channel, with their specific delay and Doppler parameters. In the time-frequency domain, this corresponds to a standard time-varying impulse response.

Estimating delay-Doppler channel response at the receiver is necessary to perform OTFS detection [4–11]. Hence, in [10], [11], [14], [15], pilot-aided channel estimation techniques were investigated.

In [11], an entire OTFS frame was used for pilot transmission and the estimated channel information was used for data detection in next frame. This method may not be effective if the channel estimation becomes outdated in the following frame. In [10], [15], OTFS channel estimation was conducted in the time–frequency domain, resulting in higher implementation complexity than that of [11], [14], where the channel estimation was conducted in delay–Doppler domain. In [14], channel estimation was considered for OTFS with ideal pulse-shaping waveform over channels with integer Doppler shifts only, i.e., when the channel Doppler taps are aligned to integer delay–Doppler grid.

Motivated by [13], in this paper, we consider multipath channels with integer and fractional Doppler shifts, respectively. Under such setting, we propose an embedded OTFS channel estimation scheme for point-to-point single-input single-output (SISO) system with ideal and rectangular pulse-shaping waveforms, respectively. Specifically, for each OTFS frame, we arrange a single pilot symbol, guard symbols, and data symbols in the delay–Doppler grid to suitably avoid the interference between pilot and data symbols. At the receiver, channel estimation is performed based on a threshold method and the estimated channel information is used...
A. Basic OTFS concepts/notations

The time–frequency signal plane is discretized to a $M \times N$ grid (for some integers $N, M > 0$) by sampling time and frequency axes at intervals $T$ (seconds) and $\Delta f$ (Hz), respectively, i.e.,

$$\Lambda = \{(nT, m\Delta f), \; n = 0, \ldots, N - 1, m = 0, \ldots, M - 1\}$$

The modulated time–frequency samples $X[n,m], n = 0, \ldots, N - 1, m = 0, \ldots, M - 1,$ are transmitted over an OTFS frame with duration $T_f = NT$ and bandwidth $B = M\Delta f$. The delay–Doppler plane is discretized to a $M \times N$ information grid

$$\Gamma = \left\{ \left( \frac{k}{NT}, \frac{l}{M\Delta f} \right), \; k = 0, \ldots, N - 1, l = 0, \ldots, M - 1 \right\},$$

where $1/M\Delta f$ and $1/NT$ represent the quantization steps of the delay and Doppler frequency axes, respectively.

B. OTFS mod/demod

The modulator first maps a set of $NM$ information symbols \{x[k, l], k = 0, \ldots, N - 1, l = 0, \ldots, M - 1\} from a modulation alphabet $\mathcal{A} = \{a_1, \ldots, a_Q\}$ (e.g. QAM symbols) of size $Q$, arranged on the delay–Doppler information grid $\Gamma$, to $X[n,m]$ in the time–frequency domain grid using the inverse symplectic finite Fourier transform (ISFFT). Next, the Heisenberg transform is applied to $X[n,m]$ using transmit pulse $g_{tx}(t)$ to create the time-domain signal $s(t)$.

The signal $s(t)$ is then transmitted over the wireless channel with complex baseband channel impulse response $h(\tau, \nu)$, which characterizes the channel response to an impulse with delay $\tau$ and Doppler $\nu$. The received signal $r(t)$ is processed with the Wigner transform (implementing a receiver filter with an impulse response $g_{rx}(t)$) followed by a sampler, yielding $Y[n,m]$ in the time–frequency domain. We then apply SFFT on $Y[n,m]$ to obtain received symbols $y[k, l]$ in the delay–Doppler domain for symbol detection.

C. OTFS input–output analysis

We now look at the relations between received symbols $y[k, l]$ and transmitted symbols $x[k, l]$.

We assume that $h(\tau, \nu)$ has finite support bounded by $[0, \tau_{\text{max}}]$ on the delay axis and $[-\nu_{\text{max}}, \nu_{\text{max}}]$ on the Doppler axis, where $\tau_{\text{max}}$ and $\nu_{\text{max}}$ are the maximum delay and maximum Doppler shift among all channel paths. Since typically there are only a small number of reflectors in the channel with associated delays and Dopplers, very few parameters are needed to model the channel in the delay–Doppler domain. The sparse representation of the channel is

$$h(\tau, \nu) = \sum_{i=1}^{P} h_i \delta(\tau - \tau_i) \delta(\nu - \nu_i)$$

where $P$ is the number of propagation paths, $h_i$, $\tau_i$, and $\nu_i$ represent the complex gain, delay, and Doppler shift associated with the $i$-th path, and $\delta(\cdot)$ denotes the Dirac delta function. We denote by $l_{\tau i}, k_{\nu i}$ the delay and Doppler taps for the $i$-th path (relatively to the delay–Doppler grid $\Gamma$) defined as

$$\tau_i = \frac{l_{\tau i}}{M\Delta f}, \quad \nu_i = \frac{k_{\nu i} + \kappa_{\nu i}}{NT}$$

where $-\frac{1}{2} < \kappa_{\nu i} \leq \frac{1}{2}$ represents the fractional Doppler, i.e., the fractional shift from the nearest Doppler tap $k_{\nu i}$. We do not need to consider fractional delays, since the resolution $1/M\Delta f$ of the time axis is sufficient to approximate the path delays to the nearest sampling points in typical wide-band systems.

We also assume that the pulses $g_{tx}(t)$ and $g_{rx}(t)$ are ideal, meaning that they satisfy the bi-orthogonal property condition, i.e., the cross-ambiguity function $A_{g_{tx}, g_{rx}}(t, f) = 0$ for $t \in (nT - \tau_{\text{max}}, nT + \tau_{\text{max}})$, $f \in (m\Delta f - \nu_{\text{max}}, m\Delta f + \nu_{\text{max}})$, $\forall n, m$, except for $n = 0, m = 0$, where $A_{g_{tx}, g_{rx}}(t, f) = 1$ with $t \in (-\tau_{\text{max}}, \tau_{\text{max}})$ and $f \in (-\nu_{\text{max}}, \nu_{\text{max}})$. The case of non-ideal yet practical rectangular pulses is discussed in Section III.

1) Integer Doppler shifts: The relation between $y[k, l]$ and $x[k, l]$ was derived in [4] as

$$y[k, l] = \sum_{k' = -k_{\nu}}^{k_{\nu}} \sum_{l' = 0}^{l_{\tau}} b[k', l'] \hat{h}[k', l'] x[(k - k')N, (l - l')M]$$

$$+ v[k, l]$$

where $\hat{h}[k', l'] = h[k', l'] e^{-j2\pi \frac{k'N}{NT} - j2\pi \frac{l'M}{M\Delta f}}$, $b[k', l'] \in \{0, 1\}$ is the path indicator, i.e., $b[k', l'] = 1$ indicates that there is a path with Doppler tap $k'$ and delay tap $l'$ with corresponding path magnitude $\hat{h}[k', l']$, otherwise, there is no such path, i.e., $b[k', l'] = 0$ and $\hat{h}[k', l'] = 0$. Finally, the term $v[k, l] \sim \mathcal{CN}(0, \sigma^2)$ is an additive white noise with variance $\sigma^2$, and
\[ \sum_{k=-k_p}^{k_p} \sum_{l=0}^{l_p} b[k', l'] = P. \]

Each path circularly shifts the transmitted symbols by the delay and Doppler taps.

2) Fractional Doppler shifts: Similarly, the following result was derived in [4] for the fractional Doppler case

\[ y[k, l] = \sum_{k=-k_p}^{k_p} \sum_{l=0}^{l_p} b[k', l'] \sum_{q=0}^{N-1} \tilde{h}[k', l', k', q] x[(k - k') + qN, (l - l')N] + v[k, l] \]

where \( k' \) denotes the fractional Doppler associated with the \((k', l')\) path, with the path gain

\[ \tilde{h}[k', l', k', q] = \frac{e^{j2\pi(-q-k')}}{N e^{j2\pi(-q-k')}} h[k', l', k', q] e^{-j2\pi(k' + Mk, l' + Ml)}/1. \]

It can be seen that with fractional Doppler shifts, each received symbol is affected by more transmitted symbols than in the case of integer Doppler in (2). We can see from (3) that when \( k' = 0 \), (3) simplifies to (2) as expected.

D. OTFS data detection via message passing (MP)

From the received symbols \( y[k, l] \), if the channel parameters are known, we can employ the message passing (MP) algorithm in [4] to detect the data symbols \( x[k, l] \) using the set of \( MN \) linear equations (2) or (3).

III. EMBEDDED CHANNEL ESTIMATION FOR POINT-TO-POINT SISO CASE

We first assume that OTFS with ideal waveforms for multipath channel with integer and fractional Doppler cases. Then we consider the extension to OTFS with practical rectangular waveforms.

A. Integer Doppler Case

Let \( x_p \) denote the pilot symbol with pilot SNR of \( \text{SNR}_p \), \( x_d[k, l] \) denote the data symbols with data SNR of \( \text{SNR}_d \) located at location \([k, l]\) in the delay–Doppler information grid, and \( 0 \) denotes the guard symbol.

Motivated by [14], we place one pilot symbol \( x_p, N_\text{g} \) of the guard symbols, and \( MN - N_\text{g} - 1 \) information symbols in the delay–Doppler grid \( \Gamma \) for each OTFS frame transmission. The symbols are located in such a way so that at the receiver, we can separate two distinct groups of received symbols: the first group that involves pilot and guard symbols is used for channel estimation, and the second group for data detection. Moreover, the guard symbols guarantee that the received symbols for channel estimation and data detection are not interfered with each other. This helps to provide a more accurate channel estimation to be used for data detection within the same frame.

For a pilot, we first choose arbitrary grid location \([k_p, l_p]\) such that \( 0 \leq k_p \leq N-1, 0 \leq l_p \leq M-1 \). For ease of representation, we choose \( 0 \leq l_p - l \leq l_p \leq l_p + l \leq M - 1 \), and \( 0 \leq k_p - 2k_v \leq k_p \leq k_p + 2k_v \leq N-1 \). Recall that \( l_p \) and \( k_v \) denote the taps corresponding to the maximum delay and Doppler values.

We arrange the pilot, guard, and data symbols in the delay–Doppler grid for an OTFS frame transmission as in Fig. 1a

\[ x[k, l] = \begin{cases} x_p & k = k_p, l = l_p, \\ 0 & k_p - 2k_v \leq k \leq k_p + 2k_v, \\ l_p - l \leq l_p + l & l_p - l \leq l_p + l, \\ x_d[k, l] & \text{otherwise}. \end{cases} \]

In this case, we have \( N_\text{g} = (2l_p + 1)(4k_v + 1) - 1 \) guard symbols. For example, in Long-Term Evolution (LTE) channels, the overhead for pilot and guard symbols is less than 1% of the data frame [16].

At the receiver, we use the received symbols \( y[k, l] \), \( k_p - k_v \leq k \leq k_p + k_v, l_p \leq l \leq l_p + l \) for channel estimation. Then the remaining received symbols \( y[k, l] \) on the grid are used for data detection, as shown in Fig. 1b.

Due to the transmit symbol arrangement in (4), using (2), we can express the received symbols for channel estimation as

\[ y[k, l] = b[k - k_p, l - l_p] \tilde{h}[k - k_p, l - l_p] x_p + v[k, l]. \]
for \( k \in [k_p - k_v, k_p + k_v], l \in [l_p, l_p + l_r] \). We can see that if there is a path with Doppler tap \( k - k_p \) and delay tap \( l - l_p \), i.e., \( b[|k - k_p|, l - l_p] = 1 \), we have \( y[k, l] = \hat{h}[|k - k_p|, l - l_p]x_p + v[k, l] \). Otherwise, \( y[k, l] = v[k, l] \).

Similarly, we can express the received symbols for data detection as in (2), demonstrating no interference between the received symbols for channel estimation and data detection.

We propose a simple channel estimation algorithm as follows. For \( k \in [k_p - k_v, k_p + k_v], l \in [l_p, l_p + l_r] \), if the magnitude \( |y[k, l]| \geq T \), where \( T \) is some positive detection threshold, then we estimate \( b[|k - k_p|, l - l_p] = 1 \) and \( \hat{h}[|k - k_p|, l - l_p] = y[k, l]/x_p \). Otherwise, we set \( b[|k - k_p|, l - l_p] = \hat{h}[|k - k_p|, l - l_p] = 0 \). The proposed threshold-based scheme relies on the fact that if a path exists, the received symbol is the scaled pilot signal with additive white Gaussian noise (see (5)). Otherwise, it is only noise.

By varying the threshold \( T \), we can alter the miss detection or false alarm probabilities on path detection. As a result, the error performance of data detection is affected by \( T \), as will be shown in Section 4.

We then use the estimated information for data detection, i.e., the received symbols \( y[k, l] \) for data detection are

\[
y[k, l] = \sum_{k'=-k_v}^{k_v} \sum_{l'=0}^{l_r} b[k', l']\hat{h}[k', l']x_d[[k - k']_N, [l - l']_M] + v[k, l] \tag{6}
\]

for \( k \not\in [k_p - k_v, k_p + k_v] \) or \( l \not\in [l_p, l_p + l_r] \). Note that we have a total of \( MN - (2k_v + 1)(l_r + 1) \) received symbols to detect a smaller number of \( MN - (2l_r + 1)(4k_v + 1) \) data symbols via the MP algorithm in [4].

B. The fractional Doppler case

We consider two cases using full guard symbols and reduced guard symbols, respectively. The former case offers better channel estimation at the expense of the lower spectral efficiency by using more guard symbols and less data symbols, in contrast to the latter case.

1) The case with full guard symbols: We arrange the pilot, guard, and data symbols in the delay–Doppler grid, as depicted in Fig. 2a:

\[
x[k, l] = \begin{cases} x_p, & k = k_p, l = l_p \\ 0, & 0 \leq k \leq N - 1, l_p - l_r \leq l \leq l_p + l_r \\ x_d[k, l], & \text{otherwise.} \end{cases} \tag{7}
\]

For simplicity of notation, we choose \( 0 \leq l_p - l_r \leq l_p + l_r \leq M - 1 \). We have the number of guard symbols \( N_g = (2l_r + 1)N - 1 \), and the overhead for pilot and guard symbols is about 8\% in LTE channels [16]. At the receiver, we use the received symbols \( y[k, l], 0 \leq k \leq N - 1, l_p - l_r \leq l \leq l_p + l_r \) for channel estimation, and the remaining received symbols \( y[k, l] \) for data detection (see Fig. 2b).

Using (3), the received symbols \( y[k, l] \) for channel estimation are

\[
y[k, l] = \sum_{k'=k_p}^{k_p+k_v} \sum_{l'=0}^{l_r} b[k', l'-l_p]\hat{h}[k', l'-l_p, k', [k_p+k'-k]_N] x_p + v[k, l]
\]

for \( k \in [0, N - 1], l \in [l_p, l_p + l_r] \). We can rewrite \( y[k, l] \) as

\[
y[k, l] = \hat{b}[l - l_p]\hat{h}[[k - k_p]_N, l - l_p]x_p + v[k, l] \tag{8}
\]

where

\[
\hat{b}[l - l_p] = \begin{cases} 1, & \sum_{k'=-k_v}^{k_v} b[k', l'-l_p] \geq 1 \\ 0, & \text{otherwise.} \end{cases}
\]

is the path indicator, and

\[
\hat{h}[[k - k_p]_N, l - l_p] = \sum_{k'=k_p}^{k_p+k_v} b[k', l'-l_p]\hat{h}[k', l'-l_p, k', [k_p+k'-k]_N]
\]

is the effective path gain from the pilot symbol \( x_p \) at location \([k_p, l_p]\) to the received symbol \( y[k, l] \). Then \( \hat{b}[l - l_p] = 1 \) indicates that there is at least one path with delay tap \( l - l_p \), otherwise, \( \hat{b}[l - l_p] = 0 \).

Based on (8), we propose the following threshold-based channel estimation algorithm.

For \( k \in [0, N - 1], l \in [l_p, l_p + l_r] \), if \( |y[k, l]| \geq T \), then we have \( \hat{b}[l - l_p] = 1 \), and \( \hat{h}[[k - k_p]_N, l - l_p] = y[k, l]/x_p \). Otherwise, we set \( \hat{b}[l - l_p] = \hat{h}[[k - k_p]_N, l - l_p] = 0 \). Unlike the integer Doppler case, where we estimate whether an individual
path with given delay and Doppler taps exists, in this case, we estimate whether there exists at least one path with a given delay tap.

For data detection, similar to (8), we rewrite (3) as

$$y[k, l] = \sum_{l_0} b[l_0] \sum_{k_0} 5\hat{h}[k_0', l_0'] x_{d}[\hat{k} - k_0'] \cdot N_{l - l_0'} \cdot \hat{h}[\hat{k}]$$

+ v[k, l]  \tag{9}$$

for $k \in [0, N - 1]$ and $l \notin [l_0, l_0 + l_0']$. Now we can adapt the MP algorithm in [4] for data detection in (9).

Note that, to guarantee no interference between the received symbols for channel estimation and data detection, the guard symbols need to expand over a wider range over the Doppler axis, when compared to the integer Doppler case.

2) The case of reduced guard symbols: Employing full guard symbols to avoid interferences provide more accurate channel estimation but with reduced spectral efficiency. To improve the spectral efficiency, we can reduce the number of guard symbols and thus increase the number of data symbols, as discussed below.

We arrange the symbols as in Fig. 3a

$$x[k, l] = \begin{cases} x_{p}, & k = k_{p}, l = l_{p}, \\ 0, & k_{p} - 2k_{v} - \hat{k} \leq k \leq k_{p} + 2k_{v} + \hat{k}, \\ l_{p} - l_{p'} \leq l \leq l_{p} + l_{p'}, \\ x_{d}[k, l], & \text{otherwise} \end{cases}$$

for some integer $\hat{k}$. For smaller $\hat{k}$, less guard and more data symbols are used, resulting in an increased spectral efficiency.

The received symbols $y[k, l]$, $k_{p} - k_{v} - \hat{k} \leq k \leq k_{p} + k_{v} + \hat{k}$, $l_{p} \leq l \leq l_{p} + l_{p'}$ are used for channel estimation, while the remaining $y[k, l]$ are used for data detection (see Fig. 3b).

From (3), for channel estimation, we have

$$y[k, l] = \sum_{k_{0} = -k_{v}} b_{[k_{0}, l_{0}]} \cdot N_{l - l_{0}} \cdot x_{d}[k_{0}, l_{0}'] \cdot I[k, l] + v[k, l]$$

for $k_{p} - k_{v} - \hat{k} \leq k \leq k_{p} + k_{v} + \hat{k}$, $l_{p} \leq l \leq l_{p} + l_{p'}$. The second term $I[k, l]$ is the interferences from all neighboring data symbols $x_{d}[k, l]$, i.e.,

$$I[k, l] = \sum_{k_{0} = -k_{v}} b_{[k_{0}, l_{0}']} \sum_{q_{0} = [k_{0} - 2k_{v} - \hat{k}]} x_{d}[\hat{k} - q_{0} \cdot k_{p}, l_{0}'] \cdot N_{l - l_{0}'}$$

$$\hat{h}[\hat{k} - q_{0} \cdot k_{p}, l_{0}'] \cdot N_{l - l_{0}'} = \sum_{\hat{k}} \hat{h}[k_{0}, l_{0}']$$

We observe that the interference $I[k, l]$ gets larger for smaller $\hat{k}$, and similarly for the interference from pilot symbols to the received symbols for data detection.

Similar to the case of full guard symbols, we develop a threshold-based algorithm to estimate $\hat{b}[l - l_{p}]$ and $\hat{h}[k - k_{p}, l_{0}, l_{p} - l_{p}]$ based on (10) by treating $I[k, l]$ as additive noise. Based on the simulation results (see next section), we demonstrate that the performance gap of the full guard symbols case (8% overhead) and reduced guard symbols case (2% overhead) is indeed marginal.

C. OTFS with rectangular waveforms

So far, we have assumed ideal transmit $g_{tx}(t)$ and receive $g_{rx}(t)$ pulses. Since the ideal pulses cannot be realized in practice, we now investigate OTFS with the more practical rectangular pulses at both transmitter and receiver. Although these pulses do not satisfy the bi-orthogonality conditions [5], we show that the proposed embedded channel estimation schemes can also be employed for this case.

Consider the integer Doppler case for simplicity. With rectangular pulses, the input-output symbol relationship in (5) can be rewritten as

$$y[k, l] = \sum_{k_{0} = -k_{v}} b_{[k_{0}, l_{0}]} \cdot N_{l - l_{0}} \cdot x_{d}[k_{0}, l_{0}'] \cdot I[k, l] + v[k, l]$$

where

$$\alpha[k, l] = \begin{cases} e^{j2\pi(\frac{l_{p}^\prime}{l_{p} + l_{p}^\prime})}, & l_{p}^\prime \leq l \leq M \setminus l_{p}^\prime, \\ e^{-j2\pi(\frac{l_{p}^\prime}{l_{p} + l_{p}^\prime})}, & 0 \leq l < l_{p}^\prime. \end{cases}$$

Hence, the threshold-based channel estimation technique can be straightforwardly employed by introducing a known phase $\alpha[k, l]$ in the detection process. The thresholds for the rectangular waveforms remains the same as the ideal waveforms, since the channel differs only by a phase.

IV. NUMERICAL RESULTS

We illustrate the performance in term of bit-error-rate (BER) of the uncoded OTFS using the proposed channel estimation schemes for integer and fractional Doppler cases. We adopt the
over \( \theta \) determined by the UE speed and single Doppler shift generated by using Jakes’ formula, i.e., the Vehicular A model [18] is used, and each delay tap has a signaling. For both OTFS and OFDM systems, Extended Fig. 6. BER versus channel estimation thresholds: Integer Doppler case.

\[ \nu_{\text{max}} \cos(\theta_i) \] determines the maximum Doppler shift determined by the UE speed and \( \theta_i \) is uniformly distributed over \([−\pi, \pi]\).

following system parameters: Carrier frequency of 4 GHz, sub-carrier spacing of 15 KHz, \( M = 512 \), \( N = 128 \), and 4-QAM signaling. For both OTFS and OFDM systems, Extended Vehicular A model [18] is used, and each delay tap has a single Doppler shift generated by using Jakes’ formula, i.e., \( \nu_i = \nu_{\text{max}} \cos(\theta_i) \), where \( \nu_{\text{max}} \) is the maximum Doppler shift determined by the UE speed and \( \theta_i \) is uniformly distributed over \([−\pi, \pi]\).

Fig. 5. BER versus SNR\(_d\) for different Dopplers

\[ N = 128, M = 512, f = 20, \nu = 4, \] SNR = 40 dB, 4-QAM

A. The integer Doppler case

Fig. 4 compares BER versus data SNRs (SNR\(_d\)) for OTFS with known channel information (ideal case) and OTFS using the proposed channel estimation for the integer Doppler case with SNR\(_p\) = 30, 35, and 40 dB and \( \mathcal{T} = 3\nu \). We assume a delay–Doppler channel with maximum delay tap \( l_{\nu} = 20 \) and Doppler tap \( k_{\nu} = 4 \), which corresponds to maximum Doppler speed of 120 Kmph. The overhead for pilot and guard symbols is approximately 1% of an OTFS frame. We observe that the BER reduces as SNR\(_p\) increases, providing more accurate channel estimation and better data detection. Moreover, the performance of OTFS with channel estimation is very close to the ideal case, when SNR\(_p\) = 40 dB (at least 20dB higher than the data SNR\(_d\)). Note that a large pilot power does not affect the peak transmit power as OTFS spreads each delay–Doppler symbol in the entire time–frequency plane thanks to the ISFFT operation.

In Fig. 5 we perform comparisons of BER versus SNR\(_d\) for different Doppler frequencies with SNR\(_p\) = 40 dB, \( l_{\nu} = 20 \), \( \mathcal{T} = 3\nu \), and 4-QAM. Consider UE speeds of 30, 120, and 500 Kmph corresponding to maximum Doppler tap \( k_{\nu} = 1, 4, \) and 16, respectively. We observe that the proposed estimation scheme exhibits highly similar performance under different Doppler frequencies except a slight performance improvement under higher Doppler frequencies (i.e., \( k_{\nu} = 16 \)). This is due to the fact that more guard symbols and less data symbols are transmitted, leading to better data detection capability at higher SNR\(_d\). Since OTFS performs similarly at different frequencies, in the following, we consider only the UE speed of 120 kmph.

We next investigate the effect of the channel estimation threshold \( \mathcal{T} \) on the system performance. Fix SNR\(_p\) = 40 dB. Fig. 6 displays BER versus SNR\(_d\) with different \( \mathcal{T} \). We observe that the BER performance improves as \( \mathcal{T} \) increases. For small threshold values, the path false detection probability is higher (i.e., it is more likely to detect non-existent paths), which degrades the BER performance. However, at the same time, increasing the threshold beyond a certain value may cause the likely miss detection of paths with small path-gains, resulting in performance loss. Hence, there is an optimal threshold to balance the false detection and miss detection probabilities. For the given system parameters, we observe that the optimal threshold is approximately \( 3\nu \).
B. The fractional Doppler case

Fig. 8 shows the BER for different SNR$_p$ with a threshold of $\mathcal{T} = 3\sigma$. In this case, the pilot and guard symbols occupy approximately 8% of an OTFS frame. Similar to the integer Doppler case, as more pilot power is used, the error performance is improved. As SNR$_p = 50$ dB, OTFS with our proposed embedded channel estimation attains similar performance as OTFS with known channel information. We can see that larger pilot power is required for channels with fractional Doppler shifts than integer Doppler shifts. Last, we compare the BERs of OTFS with channel estimation and OFDM with known channel information and find that OTFS significantly outperforms OFDM, demonstrating the effectiveness of OTFS over delay–Doppler channels.

In Fig. 9, we illustrate the effectiveness of the proposed channel estimation schemes with full and reduced guard symbols, respectively, using 16-QAM, SNR$_p = 60$ dB, and $\mathcal{T} = 3\sigma$. We see that with the higher pilot power (i.e., 60 dB), the performance of our channel estimation scheme with full guard symbols is the same as that of the ideal case. Moreover, with 16-QAM, more guard symbols are required (i.e., $k = 10$, about 3.6% guard symbols overhead) to achieve a performance close to the full guard symbols case, when compared to the 4-QAM case that adopts $k = 5$, about 2.3% guard symbols overhead. This is due to the fact that the data detection of 16-QAM case is more sensitive to the channel estimation and hence requires more guard symbols.

C. OTFS under low latency communications

As next-generation wireless communications mostly require low latency communications, we next simulate the proposed OTFS channel estimation schemes under such scenario. Fig. 10 shows the OTFS performance for low latency application with $N = 16$ and $M = 128$, corresponding to frame duration of 1.1 ms. We consider the channel estimation scheme with full guard symbols as the reduced guard symbols case will not improve significantly the spectral efficiency with small $N$. We observe that the OTFS performance with channel estimation is very close to the ideal case with SNR$_p = 60$ dB. Hence, we can conclude that the proposed channel estimation schemes are very efficient under low latency communications.

V. EXTENSIONS TO MIMO AND MULTIUSER UPLINK/DOWNLINK

In this section, we extend our embedded channel estimation for point-to-point SISO OTFS systems to MIMO and multi-user uplink/downlink, respectively.

A. Point-to-point MIMO

In a MIMO system, each transmit (Tx) antenna arranges its own pilot, guard, and information symbols on the delay–Doppler grid for transmission (see Fig. 11). The pilot symbol is used to estimate the channels from that Tx antenna to each receive (Rx) antenna. At each Rx antenna, different groups of
received symbols are used for channel estimation from that Rx antenna to the Tx antennas, and for data detection from the Tx antennas. Moreover, the received symbols for data detection of the Rx antennas are jointly decoded using MP algorithm. The symbol arrangements from the Tx antennas have to be carefully designed to facilitate the channel estimation and data detection at the Rx antennas. In the following, we describe one such arrangement.

Consider a MIMO system with arbitrary $N_t \geq 1$ and $N_r \geq 1$. For ease of presentation, we consider channels with integer Doppler shifts and the case of fractional Doppler shifts is a straightforward extension. Inspired by our previous study in Section III, we propose the following symbol arrangement $x^n[k,l]$ for the $n_t$-th Tx antenna ($n_t = 1, \ldots, N_t$)

$$x^n[k,l] = \begin{cases} 
x_p & k = k_p, l = l_p + (n_t - 1)(l_r + 1), 
0 & k_p - 2k_r \leq k \leq k_p + 2k_r, 
l_p - l_r \leq l \leq l_p + N_t l_r + N_t - 1, 
x^n_d[k,l] & \text{otherwise} 
\end{cases}$$

where $x^n_d[k,l]$ denotes the data symbol at location $[k,l]$ of $n_t$-th Tx antenna. We can see that the pilot symbols of the Tx antennas are sufficiently separated (by the maximum delay tap $l_r$ along the delay axis) so that they do not interfere with each other at the Rx antennas, as demonstrated in Fig. 11 for an exemplary MIMO system with three Tx antennas.

At the $n_r$-th Rx antenna ($n_r = 1, \ldots, N_r$), the received symbols $y^n_r[k,l], k_p - k_r \leq k \leq k_p + k_r, l_p - l_r \leq l \leq l_p + N_t l_r + N_t - 1$, are used for channel estimation to the $n_t$-th Tx antenna. These received symbols are affected by the pilot signal of the $n_t$-th Tx antenna and by the channel between the $n_t$-th Tx and $n_r$-th Rx antennas only, as shown in Fig. 12. Hence, the channel estimation technique in Section III can be applied straightforwardly. The remaining received symbols of the $n_t$-th Rx antenna are functions of the data symbols from all the Tx antennas and thus a joint detection in (11) can be applied. We omit the details for brevity.

### B. Multiuser

Consider a multiuser system, where single-antenna users communicate with base station in uplink or downlink. The base station has either single or multiple antennas. In the following, we present embedded channel estimation schemes using Tx symbol arrangement for the users and base station.

1) Uplink: Consider single-antenna base station. We assume orthogonal resource allocation among the users.

One example of the Tx symbol arrangements for three-user case is shown in Fig. 13. For each user, in each OTFS frame, the grid locations $[k,l], k_p - 2k_r \leq k \leq k_p + 2k_r, l_p - l_r \leq l \leq l_p + N_u l_r + N_u - 1$ are used for pilot and guard symbols, where $N_u$ is the number of users. The pilot symbols of the users are located sufficiently apart at suitable locations as in the MIMO case. Moreover, each user occupies only a non-overlapping portion of the rest of the grid locations for its data transmissions with the remaining grid locations being used for zero symbols since orthogonal resource allocations is required, as shown in Fig. 13 where green, blue, and yellow grids contains data for Users 1, 2, and 3, respectively.

The data portion for each user depends on the resource requirement/allocation. Based on the Tx symbol arrangements, the base station exploits suitable received symbols for channel estimation and data detection for the users.

**Remark 1:** When the base station has multiple antennas, the grid locations for pilot and guard symbols for the users remain intact. However, each user can exploit a larger portion, even full remaining grids for data transmissions, similar to the MIMO case.

2) Downlink: Consider single-antenna base station, transmitting a pilot symbol being enclosed with guard symbols, similar to the point-to-point SISO case. This pilot signal is used by all the users to estimate the channel from itself to the base station. The rest of delay–Doppler grid locations...
Pilot + guard symbols

In particular, we arrange symbols required for the different channel estimation methods and detection of its own data. Appropriate groups of received symbols for channel estimation represent the guard symbols between users. Each user exploits user interferences, as shown in Fig. 14, where yellow grids be sufficiently separated using guard symbols to avoid inter-user interference. As shown in Fig. 14, where yellow grids represent the guard symbols between users. Each user exploits appropriate groups of received symbols for channel estimation and detection of its own data.

Table I summarizes the total number of pilot and guard symbols required for different embedded channel estimation schemes.

| Method                                | Pilot + guard symbols |
|---------------------------------------|-----------------------|
| SISO - integer Doppler                | \((2L_x + 1)(4K_r + 1)\) |
| SISO - fractional Doppler             | \((2L_x + 1)(N)\)     |
| SISO - fractional Doppler reduced guard symbols | \((2L_x + 1)(4(K_r + \hat{k}) + 1)\) |
| MIMO - \(N_r\) transmit antennas     | \((N_r + 1)L_x + N_u\) \((4(K_r + \hat{k}) + 1)\) |
| Multiuser uplink - \(N_u\) users with 1 antenna | \((N_u + 1)L_x + N_u\) \((4(K_r + \hat{k}) + 1)\) |
| Multiuser downlink - base station with 1 antenna | \((2L_x + 1)(4(K_r + \hat{k}) + 1)\) |

is used for data transmissions to the users. Since orthogonal resource allocation is required, data symbols for users should be sufficiently separated using guard symbols to avoid inter-user interferences, as shown in Fig. 14 where yellow grids represent the guard symbols between users. Each user exploits appropriate groups of received symbols for channel estimation and detection of its own data.

Table I summarizes the total number of pilot and guard symbols required for the different channel estimation methods in our paper.

VI. CONCLUSION

In this work, we have developed embedded pilot-aided OTFS channel estimation schemes. In particular, we arrange pilot, guard, and information symbols in the delay–Doppler grids to suitably avoid interference between pilot and data symbols. We design such arrangements for OTFS with ideal and rectangular pulses over channels with integer or fractional Doppler paths, respectively. At the receiver, channel estimation is performed based on a threshold method and the estimated channel information is used for data detection via a MP algorithm. We compare by simulations the error performance of OTFS using the proposed channel estimation schemes and OTFS with perfectly known channel information and observe only a marginal performance loss. Further, we show that OTFS with our channel estimation significantly outperforms OFDM with ideal channel information. Extensions of the proposed schemes to MIMO and multi-user uplink/downlink have been presented.

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REFERENCES

[1] R. Hadani, S. Rakib, M. Tsatsanis, A. Monk, A. J. Goldsmith, A. F. Molisch, and R. Calderbank, “Orthogonal time frequency space modulation,” in Proc. IEEE WCNC, San Francisco, CA, USA, March 2017.

[2] R. Hadani, S. Rakib, S. Kons, M. Tsatsanis, A. Monk, C. Ibars, J. Delfeld, Y. Hebron, A. J. Goldsmith, A.F. Molisch, and R. Calderbank, “Orthogonal time frequency space modulation,” Available online: https://arxiv.org/pdf/1808.00519.pdf.

[3] R. Hadani, A. Monk, “OTFS: A new generation of modulation addressing the challenges of 5G,” OTFS Physics White Paper, Coherence Technologies, 7 Feb. 2018. Available online: https://arxiv.org/pdf/1802.02623.pdf.

[4] P. Raviteja, K. T. Phan, Q. Jin, Y. Hong, and E. Viterbo, “Low-complexity iterative detection for orthogonal time frequency space modulation,” in Proc. IEEE WCNC, Barcelona, April 2018.

[5] P. Raviteja, K. T. Phan, Y. Hong, and E. Viterbo, “Interference cancellation and iterative detection for orthogonal time frequency space modulation,” IEEE Trans. Wireless Commun., Available online: https://arxiv.org/abs/1802.05242.

[6] P. Raviteja, K. T. Phan, Y. Hong, and E. Viterbo, “Embedded delay-Doppler channel estimation for orthogonal time frequency space modulation,” accepted in IEEE VTC2018-fall, Chicago, USA, August 2018.

[7] Li Li, H. Wei, Y. Huang, Y. Yao, W. Ling, G. Chen, P. Li, and Y. Cai, “A simple two-stage equalizer With simplified orthogonal time frequency space modulation over rapidly time-varying channels,” available online: https://arxiv.org/abs/1709.02505.

[8] T. Zemen, M. Hofer, and D. Loeschenbrand, “Low-complexity equalization for orthogonal time and frequency signaling (OTFS),” available online: https://arxiv.org/pdf/1710.09916.pdf.
[9] Thomas Zemen, Markus Hofer, David Loeschenbrand, and Christoph Pacher, “Iterative detection for orthogonal precoding in doubly selective channels”, available online: https://arxiv.org/pdf/1710.09912.pdf.

[10] K. R. Murali, and A. Chockalingam, “On OTFS modulation for high-Doppler fading channels,” in Proc. ITA’2018, San Diego, Feb. 2018.

[11] M. K. Ramachandran, and A. Chockalingam, “MIMO-OTFS in high-Doppler fading channels: Signal detection and channel estimation,” available online: https://arxiv.org/abs/1805.02209.

[12] A. Farhang, A. Rezazadeh, Reyhani, L. E. Doyle and B. Farhang-Boroujeny, “Low complexity modem structure for OFDM-based orthogonal time frequency space modulation,” in IEEE Wireless Communications Letters, vol. 7, no. 3, pp. 344-347, June 2018.

[13] A. Rezazadeh, Reyhani, A. Farhang, M. Ji, R. R. Chen and B. Farhang-Boroujeny, “Analysis of discrete-time MIMO OFDM-based orthogonal time frequency space modulation,” in Proc. 2018 IEEE International Conference on Communications (ICC), Kansas City, MO, pp. 1-6, 2018.

[14] R. Hadani and S. Rakib, “OTFS methods of data channel characterization and uses thereof.” U.S. Patent 9 444 514 B2, Sept. 13, 2016.

[15] A. Fish, S. Gurevich, R. Hadani, A. M. Sayeed, and O. Schwartz, “Delay-Doppler channel estimation in almost linear complexity,” IEEE Trans. Inf. Theory, vol. 59, no. 11, pp. 7632–7644, Nov 2013.

[16] A. Monk, R. Hadani, M. Tsatsanis, and S. Rakib, “OTFS - Orthogonal time frequency space: A novel modulation technique meeting 5G high mobility and massive MIMO challenges.” Technical report. Available online: https://arxiv.org/ftp/arxiv/papers/1608/1608.02993.pdf

[17] W.C Jakes, Jr., Microwave Mobile Communications. Wiley, NY, 1974.

[18] E. LTE, “Evolved universal terrestrial radio access (E-UTRA); base station (BS) radio transmission and reception (3GPP TS 36.104 version 8.6. 0 release 8), July 2009,” ETSI TS, vol. 136, no. 104, p. V8.

[19] D. N. C. Tse, P. Viswanath, Fundamentals of wireless communications. U.K., Cambridge: Cambridge Univ. Press, 2005.