

Proactive Anti-Eavesdropping With Trap Deployment in Wireless Networks

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Abstract—Due to the open nature of the wireless medium, wireless communications are especially vulnerable to eavesdropping attacks. This article designs a new wireless communication system to deal with eavesdropping attacks. The proposed system can enable a legitimate receiver to get desired messages and meanwhile an eavesdropper to hear “fake” but meaningful messages by combining confidentiality and deception, thereby confusing the eavesdropper and achieving additional concealment that further protects exchanged messages. Towards this goal, we propose techniques that can conceal exchanged messages by utilizing wireless channel characteristics between the transmitter and the receiver, as well as techniques that can attract an eavesdropper to gradually approach a trap region, where the eavesdropper can get fake messages. We also provide both theoretical and empirical analysis of the established secure channel between the transmitter and the receiver. We develop a prototype system using Universal Software Defined Radio Peripherals (USRPs). Experimental results show that an eavesdropper at a trap location can receive fake information with a bit error rate (BER) close to 0, and the transmitter with multiple antennas can successfully deploy a trap area.

Index Terms—Eavesdropping attack, MU-MIMO, randomization, entrapment

1 INTRODUCTION

THE broadcast nature of the wireless medium makes wireless communications vulnerable to eavesdropping, which has been a classic security threat [2], [3], [4], [5] and continues to be prevalent now as attackers own increasingly advanced computational and communication capabilities. Traditional methods to defend against eavesdropping attacks for emerging wireless communication systems mainly consider the following aspects:

- *Cryptography*: A transmitter and a legitimate receiver can utilize a shared cryptographic key to encrypt a message so that eavesdroppers cannot correctly decrypt the message without the knowledge of the key.
- *Friendly jamming*: Researchers have proposed to use friendly jamming to achieve the confidentiality of wireless communications (e.g., [6], [7], [8], [9], [10]). Specifically, a receiver sends out radio interference signals to prevent an eavesdropper from decoding the messages transmitted by the legitimate sender.

Meanwhile, the receiver itself can cancel the impact of the interference signals and reconstruct original messages.

- *Proximity isolation*: Radio signal strength decreases as the distance between a receiver and an eavesdropper increases. Thus, the eavesdropper has a higher chance of intercepting exchanged messages if it can approach closer to the receiver. Accordingly, a natural way to address eavesdropping attacks is to enforce proximity isolation, i.e., providing physical protection on the receiver so that an eavesdropper cannot get close to the receiver.

These methods can greatly increase the difficulty for an eavesdropper to overhear exchanged messages, because the eavesdropper normally obtains random and meaningless bit sequences due to decryption failures, or signal interferences, or weak signal-to-noise ratio (SNR). However, they do not necessarily discourage the eavesdropper from making further efforts to access the target information. The random-looking bit sequence inevitably delivers a side-channel message to the eavesdropper that her eavesdropping is unsuccessful, and she may try alternative techniques to infer exchanged messages. For example, she may adopt social engineering approaches to steal passwords, launch power analysis (e.g., [11]), time analysis (e.g., [12]), and dictionary attacks (e.g., [13]) to break cryptographic keys, utilize signal cancellation techniques to remove the impact of friendly jamming signals [14], move around to search for signals with best SNR, or try to disable the physical protection on a receiver.

On the other hand, what happens if an eavesdropper can correctly receive a meaningful message (e.g., a message that can pass the cyclic redundancy check) instead of a random bit sequence? In this case, she probably thinks she has successfully obtained the information exchanged between a transmitter and a receiver. Intuitively, if the transmitter can

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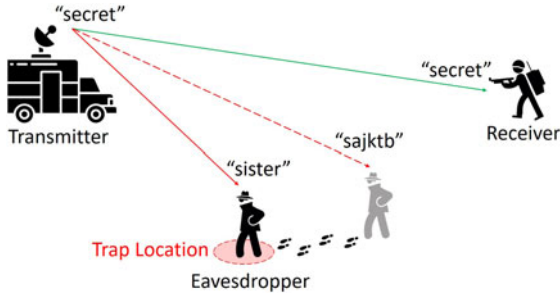


Fig. 1. Sending a deceptive command to the eavesdropper.

enable the receiver to get desired messages and meanwhile the eavesdropper to hear “fake” but meaningful messages in lieu of random-looking ones, the communicators can achieve additional camouflage that further protects exchanged messages. Inspired by this intuition, we would like to design a secure wireless communication scheme to provide an eavesdropper with bogus but meaningful information, thereby confusing the eavesdropper and mitigating the threat that an eavesdropper may adopt further ways to figure out the exchanged messages.

The existing Multi-user MIMO (MU-MIMO) technique can deliver a true message to the receiver and a fake one to an eavesdropper simultaneously. However, simply using MU-MIMO without considering security does not prevent eavesdropping. An eavesdropper can still access the message intended for the receiver if she happens to be close to the receiver. Thus, it is highly desirable to create new techniques that achieve both security and concurrent delivery of messages.

Towards this end, we create a randomization channel construction technique to deliver original messages to a target receiver and meanwhile to attract an eavesdropper to gradually approach a *trap region*, where the eavesdropper can get fake messages. This is motivated by the observation that a dog chases prey by following its scent. In the wireless context, we provide an eavesdropper with attractive signals to lead the eavesdropper to move towards the trap region. The eavesdropper obtains fake information once she falls into the trap. The defenders may also monitor the trap and arrest any eavesdropper who is lured to the trap.

We give an example to illustrate the application of the proposed technique in military communication, as shown in Fig. 1. A ground base station (i.e., transmitter) sends a secret message (denoted with “secret”) to a target communication soldier (i.e., legitimate receiver). An eavesdropper may intercept the message. If the transmitter simply utilizes the traditional cryptography and encrypts the message with a secret key shared with the receiver, the eavesdropper may obtain a meaningless and random message (e.g., “sajktb”) due to the lack of the key, and realizes that her eavesdropping fails. On the contrary, with the proposed scheme, we set up a trap location, and enable the eavesdropper moving to the trap to obtain a fake and meaningful message (e.g., “sister”). Such a fake message can be used as bait to achieve deception.

The proposed scheme consists of two parallel tasks. The first one guides an eavesdropper to a trap, and the second establishes a secure communication channel between the transmitter and the legitimate receiver, so that the

eavesdropper cannot decode exchanged messages even if she is nearby the receiver.

For the first task, our beginning step is to increase the probability that an eavesdropper can enter the trap. A very small trap region is not effective in catching an eavesdropper as the chance that the eavesdropper happens to be around this area is low. To enlarge the trap size, we propose to use multiple antennas to deliver fake messages to multiple neighborhood trap regions, so that these trap regions join together to form a trap area of a desired size. We then propose techniques to add specifically designed noise to signals to be transmitted, so that an eavesdropper observes increasing SNR of received signals and gradually clearer fake messages, as she moves close to the center of the trap area.

The second task establishes a secure channel between the transmitter and the receiver without leaking exchanged messages. A naive method is to send encrypted true messages to the receiver, and meanwhile send unencrypted fake messages to the traps. However, if an eavesdropper knows that traps are in use, the eavesdropper can tell if she is in a trap by examining whether or not received messages are encrypted. We would like the eavesdropper to obtain unencrypted fake messages even when she is nearby the receiver. In this paper, we propose techniques that can deceive the eavesdropper with fake messages and conceal true messages sent by the transmitter through utilizing wireless channel characteristics between the transmitter and the receiver. The contribution of this paper is summarized below.

- We propose to deliver true messages to a legitimate receiver and meanwhile inject fake messages to an eavesdropper to confuse the eavesdropper.
- We propose to deploy a trap to attract an eavesdropper, so that the eavesdropper obtains increasingly clear fake information as it approaches the center of the trap area.
- We propose to establish a secure communication channel between a transmitter and a receiver, and also design a scheme to guarantee the security of the exchanged messages even when an eavesdropper happens to obtain the established secret channel information.
- Experimental results show that both a legitimate receiver and an eavesdropper at a trap location can receive true and fake information, respectively, and that the transmitter can use multiple antennas to deploy a trap area, entrapping an eavesdropper by enabling the eavesdropper to experience increasing SNR from boundary to the center of the trap.

2 SYSTEM OVERVIEW

2.1 Task I: Entrapping an Eavesdropper

The wireless channel introduces distortion to the signals that travel through the wireless medium [15]. To enable a receiver to correctly decode a message, a typical way is to perform pre-coding on outgoing messages so that the signal distortion can be canceled when the messages arrive at the receiver. This pre-coding process requires that a transmitter knows the channel effect, which is used to adjust outgoing

messages to cancel the signal distortion. The channel effect can be measured from the channel between the transmitter and a desired receiver.

Thus, the transmitter needs to pre-code outgoing fake messages according to the channel effect between itself and a selected location, referred to as a *trap location*, and then transmits pre-coded messages. The eavesdropper can then correctly decode these fake messages when she is at the trap location. However, the following research challenges exist.

Enlarging the Trap. According to the channel spatial correlation property of wireless channel [16], if the eavesdropper is close to the trap location (e.g., less than several wavelengths away from this location), it may still decode received messages. We refer to the region centered at the trap location, within which the eavesdropper can probably decode received messages, as a *trap region*. For an eavesdropper residing in a trap region, the message decoding success rate increases as the eavesdropper moves closer to the trap location. In practice, the size of a trap region is determined by communication frequency, transmit power, and several environmental factors like geography, surrounding obstacles, etc. As mentioned earlier, if the trap region is too small, it may be difficult to lure the eavesdropper to fall into the trap. To solve this challenge, we propose to use multiple antennas to transmit fake messages to multiple trap locations simultaneously. The corresponding adjacent trap regions centered at these trap locations can thus form a large *trap area* to trap the eavesdropper.

Attracting an Eavesdropper. To enlarge a trap, fake messages are sent to multiple trap locations via multiple antennas. Thus, when an eavesdropper moves inside of a trap area, she may observe a high message decoding rate at multiple nearby locations. This may make the trap area suspicious to the eavesdropper. Ideally, we would like an eavesdropper to find only one location that ensures a high communication quality. To solve this challenge, we propose to guide an eavesdropper in a trap area to move towards the center of this area, where she can receive fake information. We propose to introduce artificial noises to signals to be transmitted to control the SNR of signals received in a trap area. Specifically, signals received at the boundary of the trap area exhibit a weak SNR, which incurs a high BER and makes the message decoding difficult. As the eavesdropper moves from the boundary to the center of the trap area, the SNR increases and message decoding becomes increasingly easy. Signals received at the center show the strongest SNR, enabling the eavesdropper to have the highest communication quality.

2.2 Task II: Establishing a Secure Channel

To prevent an eavesdropper from obtaining the target information, we add specially designed random signals to the original signals to be transmitted to the wireless channel. These random signals will randomize the entire traffic flow received by the eavesdropper and accordingly make the eavesdropper unable to recognize and decode signals sent by the transmitter.

Towards the design of a secure channel, we propose a method to allow the transmitter to further randomize the channel effect during the communication, such that the channel effect estimated by the receiver is a value specified

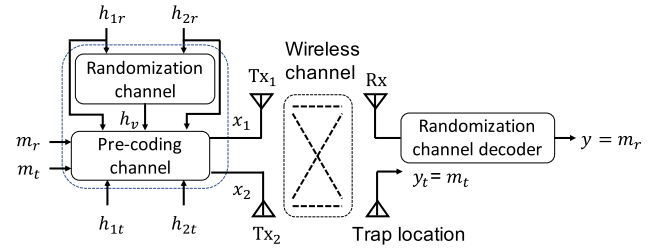


Fig. 2. Basic structure of the proactive anti-eavesdropping system.

by the transmitter and can be updated at any time. The transmitter pre-codes outgoing messages according to the value in lieu of the actual channel effect. The receiver can correctly decode the true messages, but an eavesdropper obtains fake messages after decoding when she is in close proximity to the receiver.

2.3 System Design

The first and second tasks are parallel, because we would like to send the true messages and fake ones to a legitimate receiver and an eavesdropper at the same time. The parallelism is achieved by utilizing multiple antennas to concurrently transmit pre-coded signals. Without loss of generality, we assume that the transmitter has two transmit antennas Tx_1 and Tx_2 . Fig. 2 illustrates the parallel construction of the proposed system. Let h_{1r} and h_{2r} denote the channel effect between Tx_1 and the receiver Rx, and that between Tx_2 and Rx, respectively. Further let h_{1t} and h_{2t} denote the channel effect between Tx_1 and a selected trap location, and that between Tx_2 and the trap location, respectively. By performing channel estimation with the wireless signals emitted by the receiver or a helper node at the trap location, the transmitter can obtain the knowledge of the above four channel effects. With h_{1r} and h_{2r} , the transmitter can utilize the proposed randomization channel construction technique (detailed in Section 4) to agree on the specified channel effect h_v with the receiver. The specified channel can enable the transmitter and the receiver to establish a secure communication channel.

The transmitter then uses h_v , h_{1r} , h_{2r} , h_{1t} , h_{2t} as inputs to the trapping algorithm (detailed in Section 5) to encode a true message m_r and a fake message m_t . The algorithm outputs are two encoded messages x_1 and x_2 , which are sent by Tx_1 and Tx_2 concurrently. m_r and m_t are encoded in a way that when x_1 and x_2 arrive at the receiver, the combined signal cancels the fake message component (i.e., the received signal y equals m_r), and when they arrive at the eavesdropper at the trap location, the combined signal cancels the true message component (i.e., the received signal y_t equals m_t).

3 SYSTEM MODEL

We consider a generic wireless scenario that consists of a transmitter, a receiver, and an eavesdropper.

Legitimate System Model. The legitimate receiver can be hidden from the eavesdropper's view. For example, in tactical communications, wireless transceivers are camouflaged so that they are not discovered by the enemy. The transmitter aims to send a secret message to the receiver and meanwhile a fake message to entrap a potential eavesdropper.

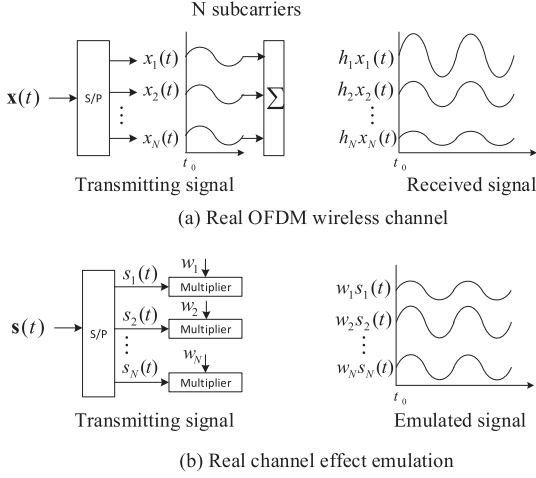


Fig. 3. Construction of a specified channel.

We assume that the transmitter can perform channel estimation to measure the channel effect between itself and the receiver's location or a trap location. This can be achieved by running existing channel estimation algorithms [16] on wireless signals emitted by the receiver, or a helper node pre-deployed at the trap location by the transmitter. Note that helper nodes do not need to be sophisticated high-end wireless devices, and they can be any low-cost wireless devices that can perform basic wireless communication functions. We also assume that the transmitter can authenticate received signals through traditional cryptography or device fingerprinting methods. As a result, the eavesdropper is unable to impersonate the legitimate receiver to the transmitter by actively sending signals.

Adversarial System Model. We assume that the eavesdropper does not know the receiver's location and has the ability to move across a target area. The eavesdropper aims to decode the messages transmitted between legitimate parties. To achieve this objective, if the eavesdropper cannot intercept a useful signal at the current location for a certain time window, the eavesdropper will move to other locations to search for interested wireless signal.

4 RANDOMIZATION CHANNEL DESIGN

Although two tasks are parallel, to understand the proposed entrapment, one needs to have an understanding of how to establish a secure communication channel.

4.1 OFDM Preliminary

OFDM encodes digital signals using multiple subcarriers that are transmitted at multiple radio frequencies. As shown in Fig. 3a, an original signal $x(t)$ is encoded into N subcarrier signals, represented by $[x_1(t), x_2(t), \dots, x_N(t)]^T$, through a serial-to-parallel (S/P) module. The signals are transmitted at N different frequencies. The receiver accordingly observes the superposition of N signals, each of which is distorted by the wireless channel associated with the corresponding frequency.

The distortion h_i introduced by the i^{th} channel to the i^{th} subcarrier signal can be represented by a complex value, which is normally considered constant over a small period called coherent time. The vector $[h_1, h_2, \dots, h_N]^T$ is referred

to as the channel impulse response of OFDM signals. The i^{th} received subcarrier signal $y_i(t)$ can be denoted with $y_i(t) = h_i x_i(t) + n(t)$, where $n(t)$ denotes the channel noise [16]. To adapt transmissions to current channel conditions, the communicators are required to perform channel estimation. A normal way to estimate channel impulse response is that the transmitter sends a public training signal to the receiver. With $y_i(t)$ and the training signal, the receiver can then compute h_i from the above equation using existing estimation tools like the Least Square (LS) or Minimum Mean Square Error (MMSE) estimator.

4.2 Construction of a Specified Channel

We consider a transmitter of two antennas and a receiver of one antenna. Accordingly, for the i^{th} subcarrier, the corresponding channel impulse response is formed by two values. We represent the channel impulse response between each of the transmitter's antenna and the receiver using a vector $\mathbf{H}_i = [h_{i1r}, h_{i2r}]$, and denote the training signal transmitted by each antenna as $\mathbf{s}_i(t) = [s_{i1}(t), s_{i2}(t)]^T$. As wireless channel is additive, the i^{th} subcarrier signal $y_i(t)$ received by the receiver can be represented by

$$y_i(t) = h_{i1r} s_{i1}(t) + h_{i2r} s_{i2}(t) + n(t) = \mathbf{H}_i \mathbf{s}_i(t) + n(t). \quad (1)$$

For normal channel estimation, the receiver can estimate $\mathbf{H}_i$ from Eq. (1). Unlike normal channel estimation, the goal for constructing a specified channel is to enable the receiver to estimate a channel specified by the transmitter. Towards this goal, we multiply selected coefficients with the training signals. Specifically, as shown in Fig. 3b, the signal $s_i(t)$ on each subcarrier goes through a multiplier with the coefficient w_i specified by the transmitter.

$y_i(t)$ can be then represented by (we omit the noise term to simplify the presentation)

$$y_i(t) = \begin{bmatrix} h_{i1r} & h_{i2r} \end{bmatrix} \begin{bmatrix} w_{i1} & 0 \\ 0 & w_{i2} \end{bmatrix} \begin{bmatrix} s_{i1}(t) \\ s_{i2}(t) \end{bmatrix} = \mathbf{H}_i \mathbf{W}_i \mathbf{s}_i(t), \quad (2)$$

where w_{i1} and w_{i2} denote the weight coefficients selected by the transmitter for the first and second antennas, respectively, and $\mathbf{W}_i = \text{diag}(w_{i1}, w_{i2})$. The transmitter would like the receiver to obtain a channel estimation outcome equal to the specified channel impulse response $\mathbf{H}_{vi} = [h_{iv}, h_{iv}]$ (both antennas are tuned to the same specified channel impulse response h_{iv}). This means that the transmitter needs to make the following equation hold, $\mathbf{H}_i \mathbf{W}_i \mathbf{s}_i(t) = \mathbf{H}_{vi} \mathbf{s}_i(t)$. The transmitter can thus solve $\mathbf{W}_i$, and we obtain

$$\mathbf{W}_i = \begin{bmatrix} h_{i1r}^{-1} h_{iv} & 0 \\ 0 & h_{i2r}^{-1} h_{iv} \end{bmatrix}. \quad (3)$$

The transmitter then sets the weight coefficients for the i^{th} subcarrier according to $\mathbf{W}_i$, so that the receiver can estimate a specified channel impulse response $\mathbf{H}_{vi} = [h_{iv}, h_{iv}]$.

4.3 Receiver versus Eavesdropper

Once the specified channel is created, for an original transmit signal $\mathbf{x}_i(t) = [x_{i1}(t), x_{i2}(t)]^T$, the i^{th} subcarrier signal received by the receiver is

$$y_i(t) = \mathbf{H}_{vi} \mathbf{x}_i(t) = \begin{bmatrix} h_{iv} & h_{iv} \end{bmatrix} \begin{bmatrix} x_{i1}(t) \\ x_{i2}(t) \end{bmatrix}. \quad (4)$$

The receiver knows h_{iv} , and thus can solve the combined original signal $x_{i1}(t) + x_{i2}(t)$ from Eq. (4), i.e., $y_i(t) = h_{iv}(x_{i1}(t) + x_{i2}(t))$. To transmit an original signal $x(t)$ to the receiver, the transmitter can split $x(t)$ into two signals $r(t)$ and $x(t) - r(t)$, where $r(t)$ is a random signal, and then transmits $r(t)$ and $x(t) - r(t)$ through the first and second antennas respectively. The receiver obtains $x_{i1}(t) + x_{i2}(t) = r(t) + x(t) - r(t) = x(t)$.

For an eavesdropper, the i^{th} received subcarrier signal is

$$y_{ie}(t) = \begin{bmatrix} h_{i1e} & h_{i2e} \end{bmatrix} \begin{bmatrix} w_{i1} & 0 \\ 0 & w_{i2} \end{bmatrix} \begin{bmatrix} x_{i1}(t) \\ x_{i2}(t) \end{bmatrix}, \quad (5)$$

where h_{i1e} and h_{i2e} denote the real channel impulse responses between the transmitter's first and the second antenna and the eavesdropper, respectively. The eavesdropper does not know the coefficients w_{i1} and w_{i2} , because they are calculated based on secret value h_{iv} that is selected by the transmitter (as shown in Eq. (3)). As a result, she is unable to decode the message $x_{i1}(t) + x_{i2}(t)$ with Eq. (5).

Once the specified channel is established, even if the eavesdropper moves very close to the receiver, she still cannot know the original signal $x_{i1}(t) + x_{i2}(t)$ due to the lack of the knowledge of h_{iv} . The received message at the eavesdropper can be denoted as $y_{ie}(t) = h_{iv}(x_{i1}(t) + x_{i2}(t))$. The transmitter can then set $y_{ie}(t)$ to a fake signal and solve the specified channel impulse response h_{iv} from this equation.

Security of the Specified Channel. If the eavesdropper knows the specified channel h_{iv} and happens to be at the receiver's location when the transmitter and the receiver are performing secure communication, with the above design, she is able to decode the secret message (i.e., $x_{i1}(t) + x_{i2}(t)$) in the same way that the legitimate receiver does. Note that the transmitter never transmits h_{iv} through the wireless channel. To obtain h_{iv} , the eavesdropper may employ the following two schemes:

- *Co-located attack:* move to exactly the same location with the receiver when the specified channel is establishing;
- *Guessing attack:* guess the specified channel h_{iv} or the selected coefficients.

However, as the eavesdropper does not know the real location of the receiver, and also the specified channel establishment process normally takes a short time (e.g., less than one second), the co-located attack rarely happens. The communicators can further randomize their schedule of channel establishment activities, i.e., the transmitter sends multiplied training signal to the receiver at random time. In this way, the eavesdropper cannot predict this schedule and thus take advantage of it to break the communication system, and surveillance tools may be adopted to detect eavesdroppers within this short time window. Normally, if the eavesdropper can manage to be co-located with the receiver all the time, including the specified channel establishment process and the entire eavesdropping phase, it then knows h_{iv} and is able to decode $x_{i1}(t) + x_{i2}(t)$. However, the eavesdropper meanwhile significantly increases the risk of being

detected by the receiver. In the following section, we show new techniques to guarantee the security of the secure communication system when the eavesdropper adopts the second scheme (i.e., guessing attack).

4.4 Dealing With a Lucky Eavesdropper

A lucky eavesdropper may successfully guess the specified channel impulse response h_{iv} or the selected coefficients. To prevent such a guessing attack, we propose to *further encode original signals to make decoding at an eavesdropper as hard as decoding a random signal* (even if the eavesdropper knows h_{iv}), whereas decoding at a receiver remains the same way as discussed in Section 4.3. The basic idea is to generate one-time, non-repeated random signals for every transmission and add random signals to original signals, such that random signals cancel at the receiver but remain at the eavesdropper.

Specifically, let $n_{i1}(t)$ and $n_{i2}(t)$ denote the random signals added to the original signals $x_{i1}(t)$ and $x_{i2}(t)$ that are transmitted by the first and second antennas respectively. The i^{th} subcarrier signal received by the receiver is thus

$$y_i(t) = \begin{bmatrix} h_{iv} & h_{iv} \end{bmatrix} \begin{bmatrix} x_{i1}(t) + n_{i1}(t) \\ x_{i2}(t) + n_{i2}(t) \end{bmatrix}.$$

If $n_{i1}(t)$ and $n_{i2}(t)$ are of the opposite phase (i.e., $n_{i2}(t) = -n_{i1}(t)$), then the random signals can be canceled, i.e.,

$$\begin{aligned} y_i(t) &= h_{iv}(x_{i1}(t) + n_{i1}(t)) + h_{iv}(x_{i2}(t) - n_{i1}(t)) \\ &= h_{iv}(x_{i1}(t) + x_{i2}(t)). \end{aligned} \quad (6)$$

The receiver can thus directly solve the desired signal $x(t) = x_{i1}(t) + x_{i2}(t)$ from this Equation.

We then analyze how the random signals impact the eavesdropper when $n_{i2}(t) = -n_{i1}(t)$. Lemma 1 demonstrates that the eavesdropper indeed receives a random signal.

Lemma 1. *The received signal $y_{ie}(t)$ at the eavesdropper is random, represented by $h_{iv}(h_{i1e}h_{i1r}^{-1}x_{i1}(t) + h_{i2e}h_{i2r}^{-1}x_{i2}(t) + x_{\text{rnd}}(t))$, where $x_{\text{rnd}}(t)$ is a non-zero random signal.*

Proof. For an eavesdropper, the i^{th} received subcarrier signal can be represented by

$$\begin{aligned} y_{ie}(t) &= \begin{bmatrix} h_{i1e} & h_{i2e} \end{bmatrix} \begin{bmatrix} w_{i1} & 0 \\ 0 & w_{i2} \end{bmatrix} \begin{bmatrix} x_{i1}(t) + n_{i1}(t) \\ x_{i2}(t) - n_{i1}(t) \end{bmatrix} \\ &= h_{i1e}h_{i1r}^{-1}h_{iv}(x_{i1}(t) + n_{i1}(t)) + h_{i2e}h_{i2r}^{-1}h_{iv}(x_{i2}(t) - n_{i1}(t)) \\ &= h_{iv}(h_{i1e}h_{i1r}^{-1}x_{i1}(t) + h_{i2e}h_{i2r}^{-1}x_{i2}(t) + x_{\text{rnd}}(t)), \end{aligned} \quad (7)$$

where $x_{\text{rnd}}(t) = (h_{i1e}h_{i1r}^{-1} - h_{i2e}h_{i2r}^{-1})n_{i1}(t)$. We can see that the random signals can be canceled at the eavesdropper (i.e., $x_{\text{rnd}}(t) = 0$) only when $h_{i1e}h_{i1r}^{-1} - h_{i2e}h_{i2r}^{-1} = 0$. Note that h_{i1r} and h_{i2r} are the channel impulse responses between the receiver and the transmitter's first and second antennas respectively, and h_{i1e} and h_{i2e} are the channel impulse responses between the eavesdropper and the transmitter's first and second antennas respectively. The transmitter can separate both antennas by a distance $d \geq l/2$ (l denotes the wavelength) [17], [18], such that the channel between the receiver/eavesdropper and the transmitter's first antenna is uncorrelated with that between the receiver/eavesdropper

and the second antenna. For example, for 2.4 GHz signal, its wavelength is equal to 12.5 cm. Thus, the distance between the two transmit antennas should be larger than 6.25 cm in order to yield zero channel correlation. This means $h_{i_{1r}} \neq h_{i_{2r}}$ and $h_{i_{1e}} \neq h_{i_{2e}}$. The chance that $h_{i_{1e}} h_{i_{1r}}^{-1}$ happens to be equal to $h_{i_{2e}} h_{i_{2r}}^{-1}$ can be negligible, since the eavesdropper is far-away from the receiver and $h_{i_{1e}} \neq h_{i_{1r}}$ and $h_{i_{2e}} \neq h_{i_{2r}}$. Lemma 2 presents that the two ratios (i.e., $h_{i_{1e}}/h_{i_{2e}}$ and $h_{i_{1r}}/h_{i_{2r}}$) are not equal. Therefore, $n_{i_1}(t)$ is not canceled, leading $x_{\text{rad}(t)}$ not equal to 0. Even if the eavesdropper can know h_{i_v} , the received signal $y_{ie}(t)$ is still random to her due to the existence of $n_{i_1}(t)$. $\square$

Lemma 2. When the transmitter separates both antennas by a distance $d \geq l/2$, the eavesdropper can not guarantee that the channel impulse responses at the receiver and herself satisfy $h_{i_{1e}}/h_{i_{2e}} = h_{i_{1r}}/h_{i_{2r}}$.

Proof. We utilize the spherical coordinate $(D_{mn}, \theta_{mn}, \phi_{mn})$ to describe the relative positions of transmit antenna m and receive antenna n , where D_{mn} is the distance between the two antennas, and θ_{mn} and ϕ_{mn} denote the vertical and horizontal angels from the receive antenna n to the transmit antenna m , respectively. The impulse response of an OFDM subchannel in free space can be modeled as below [19]

$$h_{i_{mn}} = \mathcal{F}^{-1}\{H_{mn}(f_i)\} = \mathcal{F}^{-1}\left\{\frac{\alpha_{mn}(\theta_{mn}, \phi_{mn}, f_i)e^{-j\frac{2\pi f D_{mn}}{c}}}{D_{mn}}\right\},$$

where $\mathcal{F}^{-1}\{\cdot\}$ denotes the inverse Fourier transform operator, the constant c is the light speed, and $\alpha_{mn}(\theta_{mn}, \phi_{mn}, f_i)$ (α_{mn} for short) is the product of the antenna patterns [20] of transmit and receiver antennas in the given direction (θ_{mn}, ϕ_{mn}) for a particular subcarrier frequency f_i . Therefore, to make $h_{i_{1e}}/h_{i_{2e}} = h_{i_{1r}}/h_{i_{2r}}$ always hold, the eavesdropper should make the following equation hold (to facilitate proving, we ignore the impact of the phase change)

$$\frac{\alpha_{1r}}{D_{1r}} / \frac{\alpha_{2r}}{D_{2r}} = \frac{\alpha_{1e}}{D_{1e}} / \frac{\alpha_{2e}}{D_{2e}}. \quad (8)$$

However, the transmitter can separate both antennas by a distance $d \geq l/2$, such that for the receiver, there are $\alpha_{1r} \neq \alpha_{2r}$ and $D_{1r} \neq D_{2r}$, while for the eavesdropper, there are $\alpha_{1e} \neq \alpha_{2e}$ and $D_{1e} \neq D_{2e}$. On the other hand, since the eavesdropper does not know the exact location of the receiver, the variables α_{1r} , α_{2r} , D_{1r} , D_{2r} in Eq. (8) are unknown to the eavesdropper. Thus the eavesdropper cannot make Eq. (8) be satisfied, i.e., we have $h_{i_{1e}}/h_{i_{2e}} \neq h_{i_{1r}}/h_{i_{2r}}$. $\square$

Furthermore, we perform real-world experiments to verify Lemma 2 by exploring the relationship between the two ratios of channel amplitudes (i.e., $|h_{i_{1e}}/h_{i_{2e}}|$ and $|h_{i_{1r}}/h_{i_{2r}}|$). We define a new metric Δ , called ratio proximity, to describe how close the two ratios (e.g., R_1 and R_2) are. It can be calculated by dividing the minimum valued ratio by the maximum one, i.e., $\Delta = R_1/R_2$, where $R_1 \leq R_2$. Thus, the ratio proximity of $|h_{i_{1e}}/h_{i_{2e}}|$ and $|h_{i_{1r}}/h_{i_{2r}}|$ is

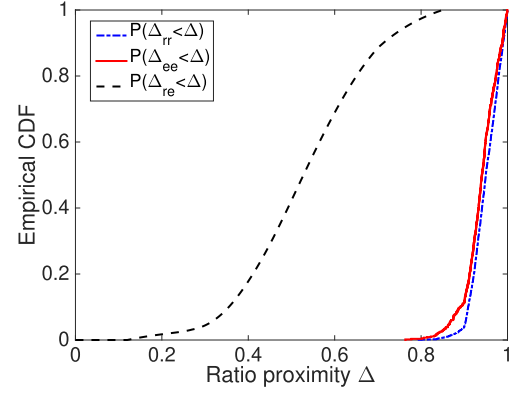


Fig. 4. CDFs of Δ_{rr} , Δ_{ee} , and Δ_{re} .

$$\Delta_{re} = \frac{\min(|h_{i_{1e}}/h_{i_{2e}}|, |h_{i_{1r}}/h_{i_{2r}}|)}{\max(|h_{i_{1e}}/h_{i_{2e}}|, |h_{i_{1r}}/h_{i_{2r}}|)}. \quad (9)$$

For comparison, we utilize Δ_{rr} and Δ_{ee} to denote the ratio proximities of two adjacent calculated ratios at the receiver and the eavesdropper, respectively. We can find that the value of Δ ranges from 0 to 1, and a smaller Δ denotes that the two ratios deviate more from each other. Specifically, when $\Delta = 1$, it means the two ratios are totally equal.

Fig. 4 depicts the empirical CDFs $P(\Delta_{rr} < \Delta)$, $P(\Delta_{ee} < \Delta)$ and $P(\Delta_{re} < \Delta)$. We can see that Δ_{rr} and Δ_{ee} are both quite near 1, suggesting the continuously calculated ratios (i.e., $|h_{i_{1r}}/h_{i_{2r}}|$ or $|h_{i_{1e}}/h_{i_{2e}}|$) at the receiver or the eavesdropper are similar. However, Δ_{re} is less than 0.8 with a probability of 97.5%. This demonstrates that the simultaneously calculated ratios (i.e., $|h_{i_{1r}}/h_{i_{2r}}|$ and $|h_{i_{1e}}/h_{i_{2e}}|$) at the receiver and the eavesdropper deviate from each other.

Impact of Transmitter/Receiver Movement. Once the transmitter or the receiver moves to a new location, the transmitter can re-launch the proposed randomization channel technique to build a new secure channel with the receiver.

Security Discussion. [21] discovers a known-plaintext attack against physical layer security schemes, and [22] further improves the efficiency of this discovered attack. Such an attack has two requirements. First, the attackers know the channel information between the transmitter and themselves. Second, the attackers know parts of the transmitted data. With both requirements satisfied, the attackers can train an adaptive filter to decode the unknown data. The proposed scheme, however, creates a secure channel to randomize all the signals sent by the transmitter. Thus, it is difficult for the attackers to successfully guess the randomized signals to launch this attack against the proposed scheme.

SNR Difference at the Receiver and the Eavesdropper. We now discuss the impact of original signal encoding from the SNR perspective, and analyze how the added random signals decrease the SNR of the eavesdropper.

We denote the signals from the two transmit antennas as s_1 and s_2 . Also, we use $h_1(t)$ and $h_2(t)$ to represent the channels between the respective transmit antenna and the receiver. Note that each channel effect can be modeled by a zero-mean complex Gaussian random variable with the same average power P_c [23]. Besides, let P_t represent the transmit power for both signals. Thus, the signal at the

receiver becomes $r = s_1 h_1(t) + s_2 h_2(t)$, and its mean value μ is 0. We can then obtain the power P_s of the received signal with its variance $\text{Var}(r)$, i.e., $P_s = \text{Var}(r) = E[r^2] - \mu^2 = E[r^2]$, where $E[\cdot]$ represents ensemble average. Therefore, we have

$$\begin{aligned} P_s &= E[(s_1 h_1(t) + s_2 h_2(t))^2] \\ &= 2P_c P_t + 2\rho P_c P_t, \end{aligned}$$

where $\{\cdot\}^*$ denotes complex conjugate and ρ is the channel correlation coefficient that equals $\frac{E[h_1(t)h_2(t)^*]}{\sqrt{E[h_1(t)]^2}E[h_2(t)]^2} = \frac{E[h_1(t)h_2(t)^*]}{P_c}$ [24].

Similarly, we can obtain the power of the added random signals at the eavesdropper or the legitimate receiver. We let n_1 and n_2 denote the added random signals that are of the opposite phase (i.e., $n_1 = -n_2$). We use P_r to denote the transmit power for each added random signal. The received combined power of the two added random signals can be computed by $E[(n_1 h_1(t) + n_2 h_2(t))^2] = 2P_c P_r - 2\rho P_c P_r$.

At the legitimate receiver, the observed channels from the two antennas are manipulated and correlated with each other, so the corresponding channel correlation coefficient equals 1. When the transmitter adds random signals to original signals, the power of the original signals becomes $2P_c P_t + 2P_c P_t = 4P_c P_t$ and that of the added random signals is $2P_c P_r - 2P_c P_r = 0$. On the other hand, the channels between the respective transmit antenna and the eavesdropper are uncorrelated from each other. As a result, their channel correlation coefficient equals 0. We then obtain the powers of the original signals and the added random signals at the eavesdropper as $2P_c P_t$ and $2P_c P_r$, respectively.

SNR is defined as the ratio of the original signal power to the noise power. The noise here consists of the channel noise (with the power P_n) and the added random signals. As channel noise from each channel combines, the power of channel noise is doubled at the receiver or the eavesdropper. Therefore, the SNR at the receiver can be computed as

$$\text{SNR}_r = \frac{4P_c P_t}{2P_n + 0} = \frac{2P_c P_t}{P_n}. \quad (10)$$

Similarly, the SNR at the eavesdropper can be calculated as

$$\text{SNR}_e = \frac{2P_c P_t}{2P_n + 2P_c P_r} = \frac{P_c P_t}{P_n + P_c P_r}. \quad (11)$$

The power of the added random signals is usually chosen much higher than the ratio of the channel noise power to the average power of the channel effect, i.e., $P_r \gg P_n/P_c$. Consequently, we have a large SNR at the legitimate receiver, i.e., $\text{SNR}_r = \frac{2P_t}{(P_n/P_c)}$, and meanwhile the SNR at the eavesdropper is $\text{SNR}_e = \frac{P_t}{(P_n/P_c + P_r)} \approx \frac{P_t}{P_r}$, indicating that the transmitter is able to make the SNR at the eavesdropper be significantly low by adjusting P_r . For example, when $P_r = P_t$, $\text{SNR}_e \approx 0\text{dB}$, and thus the eavesdropper cannot separate the original signals from the added random signals.

4.5 Multiple Collaborative Eavesdroppers

We consider a generic situation with a transmitter owning N transmit antennas and λ collaborative single-antenna eavesdroppers (or an eavesdropper owning λ receive antennas). The transmitter enables each of its transmit antennas to

establish a specified channel with the single-antenna receiver, and can add random signals to any pair of antennas. Let $\mathcal{S} = \{i_1, i_2, \dots, i_K\}$ and $\bar{\mathcal{S}} = \{p_1, p_2, \dots, p_K\}$ denote the sets formed by the indexes of the antennas that transmit the original and the opposite random signals respectively, where $K = \frac{N}{2}$. Let h_{qe_j} represent the real channel impulse response between the q^{th} antenna and the j^{th} eavesdropper, w_q denotes the weight coefficient selected for the q^{th} antenna, $s(t)$ is the public training signal, and $n_k(t)$ is the k^{th} added random signal for $1 \leq k \leq K$. Correspondingly, the signals received by eavesdroppers can be modeled as

$$\begin{cases} y_{e_1}(t) = s(t) \sum_{q=1}^N h_{qe_1} w_q + \sum_{k=1}^K n_k(t) (h_{i_{e_1} k} w_{i_k} - h_{p_{e_1} k} w_{p_k}) \\ \vdots \\ y_{e_\lambda}(t) = s(t) \sum_{q=1}^N h_{qe_\lambda} w_q + \sum_{k=1}^K n_k(t) (h_{i_{e_\lambda} k} w_{i_k} - h_{p_{e_\lambda} k} w_{p_k}) \end{cases} \quad (12)$$

Suppose that each eavesdropper knows the channel between each transmit antenna and herself. The eavesdroppers can then determine the channel impulse response h_{qe_j} for $1 \leq q \leq N$ and $1 \leq j \leq \lambda$. The unknowns of Eq. (12) are the coefficients $w_1, \dots, w_N$ and random signals $n_1(t), \dots, n_K(t)$. If the number of eavesdroppers is equal to or larger than the number of unknowns, i.e., $\lambda \geq N + K = \frac{3N}{2}$, Eq. (12) is a regular or overdetermined linear system and thus the eavesdroppers can solve the unknowns from Eq. (12).

Gaining all the channel information imposes a strong requirement for the eavesdroppers. Moreover, the eavesdroppers still face a significant challenge in solving the coefficients, as they do not know which random signal is associated with which transmitter. For each random signal, the transmitter randomly assigns two antennas to send the original and opposite ones, and thus for a given random signal, the eavesdroppers cannot fill in the corresponding i_k and p_k in Eq. (12).

The only way that the eavesdroppers may use is the brute force search, in which they try all possible permutations of i_k and p_k to solve Eq. (12). When N is small, e.g., $N = 5$, there are 120 possibilities of the permutations, while when N is increased to 15, the number of such possibilities becomes $15! = 1.3 \times 10^{12}$. Also, when N is large, e.g., $N = 21$, the number of linear equations that the eavesdroppers have to solve is $21! = 5.1 \times 10^{19}$, which is greater than 2^{64} . In general, the computational complexity for multiple eavesdroppers to collaborate to reveal the coefficients is $O(N!)$. This implies that solving coefficients $w_1, \dots, w_N$ is as hard as solving an NP-Complete problem. When N is sufficiently large, it is impossible for eavesdroppers to solve the coefficients within a reasonable time frame due to the exponential time complexity.

5 PLACING THE TRAP

For the i^{th} subcarrier, let $m_{it}(t)$ and $m_{ir}(t)$ denote the fake and original signals to be delivered to the trap location and the receiver, respectively. Further let h_{i1t} and h_{i2t} denote channel impulse response between the trap location and the transmitter's first and second antennas. Let $y_{ir}(t)$ and $y_{it}(t)$ denote the i^{th} subcarrier signal received by the receiver and the trap location respectively. According to Eq. (6), to deliver $m_{ir}(t)$ to the receiver, we have $x_{i1}(t) + x_{i2}(t) = m_{ir}(t)$. On the

other hand, according to Eq. (7), $y_{it}(t)$ received at the trap location can be represented by $y_{it}(t) = h_{i1t}w_{i1}(x_{i1}(t) + n_i(t)) + h_{i2t}w_{i2}(x_{i2}(t) - n_i(t))$. Similarly, to deliver $m_{it}(t)$ to the trap location, we need the equation $y_{it}(t) = m_{it}(t)$ to hold. Let $\delta_{it}(t) = (h_{i1t}w_{i1} - h_{i2t}w_{i2})n_i(t)$. We thus have

$$\begin{bmatrix} m_{it}(t) - \delta_{it}(t) \\ m_{ir}(t) \end{bmatrix} = \begin{bmatrix} h_{i1t} & h_{i2t} \\ w_{i1}^{-1} & w_{i2}^{-1} \end{bmatrix} \begin{bmatrix} w_{i1} & 0 \\ 0 & w_{i2} \end{bmatrix} \begin{bmatrix} x_{i1}(t) \\ x_{i2}(t) \end{bmatrix}.$$

Therefore, the actual signals $x_{i1}(t)$ and $x_{i2}(t)$ to be transmitted by the first and second antennas are calculated by

$$\begin{aligned} \begin{bmatrix} x_{i1}(t) \\ x_{i2}(t) \end{bmatrix} &= \begin{bmatrix} w_{i1} & 0 \\ 0 & w_{i2} \end{bmatrix}^{-1} \begin{bmatrix} h_{i1t} & h_{i2t} \\ w_{i1}^{-1} & w_{i2}^{-1} \end{bmatrix}^{-1} \begin{bmatrix} m_{it}(t) - \delta_{it}(t) \\ m_{ir}(t) \end{bmatrix} \\ &= \mathbf{C}_i \begin{bmatrix} m_{it}(t) - \delta_{it}(t) \\ m_{ir}(t) \end{bmatrix}, \end{aligned} \quad (13)$$

where we refer to $\mathbf{C}_i$ as the pre-coding matrix of the original signals $m_{it}(t)$ and $m_{ir}(t)$.

5.1 Trapping an Eavesdropper

To attract an eavesdropper to move towards the center of the trap area, the transmitter uses multiple antennas to place multiple adjacent traps, and adjusts the SNR at trap locations, such that the signal decoding rate increases as the eavesdropper goes across trap locations.

5.1.1 Placing Multiple Traps

The transmitter uses M antennas to concurrently transmit the fake signal $m_{it}(t)$ to N trap locations, and the original signal $m_{ir}(t)$ to the receiver. We know that two antennas can deliver different signals to two locations simultaneously. Generally, $N+1$ antennas can send signals to $N+1$ locations (i.e., N trap locations plus the receiver's location), and thus $M = N+1$. Remember that we use $\mathcal{S} = \{i_1, i_2, \dots, i_K\}$ and $\bar{\mathcal{S}} = \{p_1, p_2, \dots, p_K\}$ to denote the sets formed by the indexes of the antennas that transmit the original and the opposite random signals respectively, where $K = \frac{M}{2}$.

We can extend Eq. (13) from one trap location to N trap locations. Let $\alpha_{it}(t) = m_{it}(t) - n_i(t) \sum_{j=1}^{M/2} (h_{ij}w_{ij} - h_{pj}w_{pj})$, where $i_j \in \mathcal{S}$ and $p_j \in \bar{\mathcal{S}}$. Let $h_{i_k t_j}$ denote channel impulse response between the trap location j and the transmitter's k^{th} antenna, where $j \in \{1, 2, \dots, N\}$ and $k \in \{1, 2, \dots, M\}$. Let $x_{ik}(t)$ denote the signal to be transmitted by the k^{th} antenna. After generalizing Eq. (13), we get

$$\begin{bmatrix} x_{i1}(t) \\ x_{i2}(t) \\ \vdots \\ x_{iM}(t) \end{bmatrix} = \mathbf{W}_i^{-1} \begin{bmatrix} h_{i1t_1} & h_{i2t_1} & \cdots & h_{iMt_1} \\ h_{i1t_2} & h_{i2t_2} & \cdots & h_{iMt_2} \\ \vdots & \vdots & \ddots & \vdots \\ h_{i1t_N} & h_{i2t_N} & \cdots & h_{iMt_N} \\ w_{i1}^{-1} & w_{i2}^{-1} & \cdots & w_{iM}^{-1} \end{bmatrix}^{-1} \begin{bmatrix} \alpha_{it}(t) \\ \alpha_{it}(t) \\ \vdots \\ m_{ir}(t) \end{bmatrix}, \quad (14)$$

where $\mathbf{W}_i = \text{diag}(w_{i1}, \dots, w_{iM})$ and w_{ik} is the weight coefficients selected by the transmitter for the k^{th} antenna.

Furthermore, combined with eavesdropper detection and tracking techniques (e.g., [25]), the proposed system can be performed more efficiently as the legitimate users can directly deploy a trap along the eavesdropper's possible route.

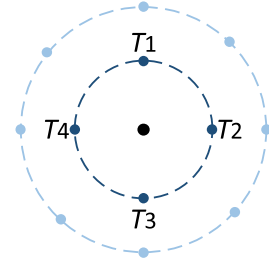


Fig. 5. An example of entrapment.

5.1.2 Adjusting SNR

The transmitter would like to control the decoding quality at trap locations by adding a disturbance signal to $\alpha_{it}(t)$. Accordingly, $x_{ik}(t)$ can be calculated by

$$\begin{bmatrix} x_{i1}(t) \\ x_{i2}(t) \\ \vdots \\ x_{iM}(t) \end{bmatrix} = \mathbf{W}_i^{-1} \begin{bmatrix} h_{i1t_1} & h_{i2t_1} & \cdots & h_{iMt_1} \\ h_{i1t_2} & h_{i2t_2} & \cdots & h_{iMt_2} \\ \vdots & \vdots & \ddots & \vdots \\ h_{i1t_N} & h_{i2t_N} & \cdots & h_{iMt_N} \\ w_{i1}^{-1} & w_{i2}^{-1} & \cdots & w_{iM}^{-1} \end{bmatrix}^{-1} \begin{bmatrix} \alpha_{it}(t) + D_1(t) \\ \alpha_{it}(t) + D_2(t) \\ \vdots \\ \alpha_{it}(t) + D_N(t) \\ m_{ir}(t) \end{bmatrix} \quad (15)$$

where $D_j(t)$ is the disturbance signal generated for the j^{th} trap location. Fig. 5 shows a simple example of configuring the SNR. Dots on this figure represent trap locations. The trap location at the center has the highest SNR and the trap locations on the inner circle have weaker SNRs than the center trap location. The trap locations on the outer circle have the weakest SNR. Note that trap locations on the same circle (e.g., T1, T2, T3, and T4) experience the similar SNRs.

The power of the disturbance signal $D_j(t)$ can be selected according to the BER required at the specific trap location. The theoretical BER can be denoted by $\alpha_M Q(\sqrt{\beta_M \text{SNR}_{bit}})$ [16], where SNR_{bit} denotes the SNR per information bit, Q -function is defined as $Q(x) = \frac{1}{\sqrt{2\pi}} \int_x^\infty e^{-\frac{x^2}{2}} dx$, and α_M and β_M are constants determined by the modulation scheme. When we specify the BER at a particular trap location, we can then derive the required SNR using the given BER functions. SNR is the ratio of the transmit power to the noise power, i.e., $\text{SNR} = \frac{P_t}{N_c + P_j}$, where P_t is the transmit power, N_c is the channel noise power, and P_j is the disturbance signal power. Since the disturbance signal is usually chosen much larger than the channel noise, we neglect the impact from the channel noise on SNR. Now we have both SNR and P_t , we can obtain the disturbance signal power P_j . In general, we can generate a random gaussian noise signal of zero-mean and variance of P_j . Then, we can construct the combined transmit signals by adding disturbance signals to the original transmit signals.

5.1.3 Complexity at the Transmitter

To pre-code outgoing messages, the transmitter requires to perform matrix inverse and multiplication operations according to Eq. (15). Such matrix manipulation can be easily implemented using software (e.g., designing C++ modules of matrix inversion and multiplier) or hardware (e.g., utilizing multiply-accumulate units to achieve matrix multiplication).

Thus, it does not significantly incur software or hardware

complexity. Specifically, the transmitter needs to perform two matrix inverse and two matrix multiplication operations to determine the transmitted message at each antenna. Meanwhile, computing the inverse of an $M \times M$ matrix can be solved with the same asymptotic running time as multiplying two $M \times M$ matrices [26], whose running time is $O(M^3)$ with the naive matrix multiplication algorithm. New algorithms have been proposed to improve the computational complexity for matrix multiplication, and the current best upper bound is approximately $O(M^{2.37})$ [27]. Thus, the proposed pre-coding scheme can be finished in time $O(M^{2.37})$ at the transmitter. When N is small (e.g., $M = 2$, we have $M^{2.37} \approx 2$), the computational complexity is quite low.

5.2 Adversarial Indistinguishability

One concern is what happens if the trap strategy is disclosed and an eavesdropper knows N trap locations have been set up to catch her? In this case, receiving increasingly better signals can trigger the eavesdropper's alert and cautiousness. She may bypass trap locations and search for the transmitter's signal at other locations. Therefore, we need to achieve adversarial indistinguishability, i.e., making an adversary unable to distinguish the trap from the receiver's location. We define *reception area* as the geographical region centered at the legitimate receiver. Two requirements should be satisfied to achieve adversarial indistinguishability, (1) from an eavesdropper's perspective, the trap area and the reception area should have the same size; and (2) when an eavesdropper enters either the reception area or the trap area, she should have the same SNR observation. Two strategies are proposed to provide adversarial indistinguishability.

5.2.1 Strategy I

The transmitter also deploys a trap area centered at the receiver's location. The transmitter then utilizes $M = N + (N - 1) + 1$ antennas to create a trap area and a reception area, each consisting of N neighboring trap regions. Accordingly, Eq. (15) can be rewritten into

$$\begin{bmatrix} x_{i1}(t) \\ x_{i2}(t) \\ \vdots \\ x_{iM}(t) \end{bmatrix} = \mathbf{W}_i^{-1} \begin{bmatrix} h_{i1t1} & h_{i2t1} & \cdots & h_{iMt1} \\ h_{i1t2} & h_{i2t2} & \cdots & h_{iMt2} \\ \vdots & \vdots & \ddots & \vdots \\ h_{i1tM-1} & h_{i2tM-1} & \cdots & h_{iMtM-1} \\ w_{i1}^{-1} & w_{i2}^{-1} & \cdots & w_{iM}^{-1} \end{bmatrix}^{-1} \times \begin{bmatrix} \alpha_{it}(t) + D_{t1}(t) \\ \vdots \\ \alpha_{it}(t) + D_{tN}(t) \\ \alpha_{it}(t) + D_{r1}(t) \\ \vdots \\ \alpha_{it}(t) + D_{r(N-1)}(t) \\ m_{ir}(t) \end{bmatrix},$$

where $D_{tj}(t)$ and $D_{rj}(t)$ are the disturbance signals generated for the j^{th} trap location in the trap area and the reception area respectively. To make both areas exhibit the same SNR for an eavesdropper, we let $D_{tj}(t) = D_{rj}(t)$ ($j \in \{1, \dots, N-1\}$). The transmitter changes the original message $m_{ir}(t)$ into $m_{it}(t) + D_{tN}(t)$, such that when an eavesdropper is at the receiver's location, it will receive the fake message $m_{it}(t)$.

5.2.2 Strategy II

We confuse the eavesdropper by using randomization to switch between the trap and reception areas. Specifically, the transmitter works in two modes.

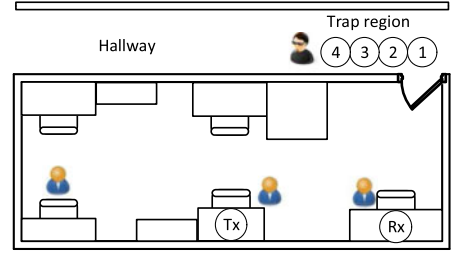


Fig. 6. Experiment environment.

- Trapping mode: the transmitter sets a trap area centered at a selected trap location, while sending secret messages to the receiver, as described in previous Section 5.1;
- Disturbing mode: the transmitter sets a trap area centered at the receiver's location, while dismantling the trap area that has been set during the trapping mode.

The transmitter randomly alternates between the trapping mode and the disturbing mode. As a result, when an eavesdropper receives increasingly better signals, she cannot figure out whether she is at the trap area or the reception area. She faces a dilemma: if she trusts the received signals, she may be trapped, monitored, and arrested. On the other hand, if she chooses to believe that this is a trap area, she will be unable to approach the receiver to steal the true messages.

6 EXPERIMENTAL EVALUATION

6.1 System Setup and Evaluation Metrics

We build the prototype system on top of USRPs [28] and GNURadio [29]. We use VERT2450 and VERT400 antennas of 2.4GHz and 1.2GHz respectively. The system includes a transmitter (Tx), a receiver (Rx), and an eavesdropper (Ex). Tx consists of five USRP X300s connected with a host computer through an Ethernet switch, and synchronized with Octo-Clock-G [30]. Rx and Ex are both standalone USRP X300s connected to PCs. Tx aims to deliver secret messages to Rx, and meanwhile deploy a trap area to mislead Ex. We run experiments in a campus building, with offices, computers, and assorted furniture. Fig. 6 shows our experiment topology. We select 4 neighboring trap locations in a hallway to attract Ex. We use BPSK to modulate an OFDM subcarrier, the bandwidth of which is set to 500KHz in our experiments. We consider a total of 64 subcarriers, including 48 occupied tones (i.e., subcarriers that are used for actual data transmission).

We utilize the following evaluation metrics: (1) SNR: the ratio of the power of a signal of interest to that of noise signals, including disturbance signals plus the channel noise; (2) Packet error rate (PER): the number of packets that are unsuccessfully decoded at the receiver to the number of totally received packets; and (3) BER: the ratio of the number of incorrectly received bits to the total number of received bits.

Both BER and PER can demonstrate the throughput performance of a communication system. However, PER reflects the link quality at a coarse-grained level, while BER provides a fine-grained indication of the link quality.

6.2 Channel Difference

We would like to evaluate the difference between obtained channels at two separated receivers. In our experiment, we

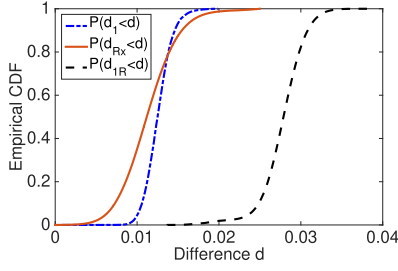


Fig. 7. CDFs of d_1 , d_{Rx} and d_{1Rx} .

compare the observed channels at Location 1 and Rx as marked in Fig. 6. To eliminate the impact of channel noise, we perform channel estimation 200 times.

Fig. 7 shows the empirical cumulative distribution functions (CDFs) of the euclidean distances d_1 and d_{Rx} between two channel impulse responses estimated at Location 1 and Rx, respectively, as well as the euclidean distance d_{1Rx} between one estimated at Location 1 and one at Rx. We can see the probability that d_{1Rx} is bigger than d_1 or d_{Rx} is almost 100%. This means we can distinguish channels observed at Location 1 and Rx. Channel estimations for other pairs of the 5 locations demonstrate similar results. This observation is consistent with the spatial uncorrelation property of wireless channels.

Channel similarity rate (CSR) models the relationship between the euclidean distance of two channels and channel similarity, and is denoted by $\eta = 1 - \frac{d}{d_0}$, where d_0 is the threshold, above which the two channels are thought to be different (i.e., measured at different places). Obviously, if η closes to 1 (i.e., $d < d_0$), the measured two channels are quite similar. For two estimated channels by the eavesdropper and the receiver respectively, we calculate the corresponding CSR, and explore its effect on whether the eavesdropper is able to intercept the channel specified by the transmitter.

6.3 Specified Channel Example

To establish the specified channel with Rx, Tx first estimates the real channel between itself and Rx, and then calculates the weight coefficients. Fig. 8 shows a specified channel example across 10 subcarriers. We can see that the estimated channel at Rx is similar to the channel specified at Tx, and both channels significantly deviate from the real channel. This demonstrates the feasibility of constructing a specified camouflage channel between the transmitter and the receiver.

To measure the concealment capability of the specified camouflage channel, we compare the SNRs for Ex at different distances away from Rx. We calculate SNR as $10 * \log_{10} \frac{P_{signal}}{P_{noise}}$. We draw a circle originating at Rx and place Ex

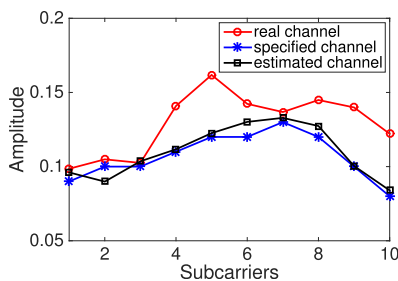


Fig. 8. Specified channel example.

TABLE 1
Observed SNRs at Different Locations

	Rx	Ex-0.25	Ex-0.50	Ex-0.75	Ex-1
η	0.8889	0.5926	0.3333	-0.0741	-0.0370
SNR (dB)	25.04	12.2	1.8	0.2	-0.1

at a radius ranging outward from 0.25 to 1 meter every 0.25m. Table 1 shows the observed SNRs at the receiver and the eavesdropper. We see that SNR at the receiver is much higher than that at the eavesdropper. With the distance between the eavesdropper and the receiver increasing, both the calculated channel similarity rate η and observed SNR gradually decrease. In particular, when the eavesdropper is 0.75m away from Rx, the observed SNR is as low as 0.2 dB, which is below the required SNR for the eavesdropper to correctly decode received messages.

Without a specified channel, the eavesdropper around the receiver is more likely to intercept secret messages. Fig. 9 shows the calculated PER at the eavesdropper when she is at the exact receiver's location and the locations that are 0.25m, 0.5m, 0.75m away from the receiver's location respectively. We can see that without a specified channel, when the eavesdropper reaches the exact location of the receiver, the packet error rate is less than 0.025 with a probability of 98.5%, i.e., secret communication between the transmitter and the receiver cannot be guaranteed. Meanwhile, the observed PER reduces as the eavesdropper moves closer to the receiver.

However, due to the existence of the specified channel, the PER observed by the eavesdropper is always close to 100%. Because of failures in decoding received messages, the eavesdropper will continue to search for other locations that can enable her to correctly decode received messages.

6.4 SNR and BER at a Trap Location

After establishing a specified channel, Tx begins to send true messages to Rx and meanwhile fake messages to Ex. In our experiment, we select Location 1 (as shown in Fig. 6) as a trap location. We first move Ex to Location 1 and record the observed SNR, and then gradually increase the distance d between Ex and the trap location at a step of 0.25m.

SNR Analysis. Central carrier frequency can also affect the size of the trap region as its change can cause the change of the signal wavelength and accordingly the distance required for the channel uncorrelation. Fig. 10 shows the observed SNRs at Ex when we gradually move it away

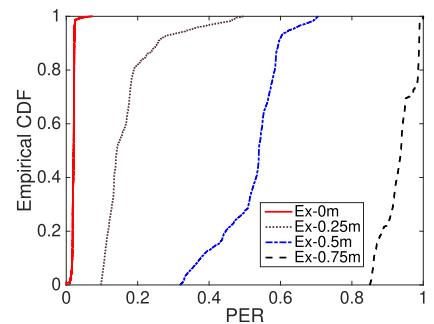


Fig. 9. Eavesdropper's PER.

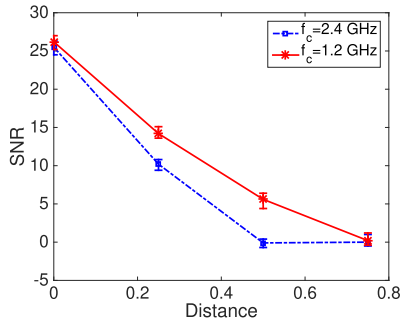


Fig. 10. Trap region exploration.

from the trap location for different central frequencies. We can see that for 2.4GHz, when Ex is 0.5m away from the trap location, the observed SNR at Ex approaches 0. This means that the radius of the trap region is about 0.5m, whereas for 1.2GHz, a larger radius of 0.75m can decrease SNR to a value that is approximately equal to 0. Thus, the size of a trap region can be changed by adjusting the central frequency.

BER Analysis: Fig. 11 compares the BER at Rx with that encountered by Ex when Ex is 0m, 0.25m, 0.50m, and 0.75m from a trap location. We can see that both Rx and Ex at the trap location can obtain low BERs below 0.06 with a probability of 90%. This means that our scheme can successfully enable Rx to obtain a true message and Ex entering the trap location to receive a fake message. Meanwhile, the BER observed by Ex increases as Ex moves away from the trap location. In particular, when Ex is 0.75m away from the trap location, the observed BER is close to 0.5, and hence it is difficult for Ex to receive any meaningful message.

6.5 Deployment of Multiple Traps

To show the effectiveness of deploying a trap area, we select four neighboring trap locations (Location 1 to 4) and choose Location 1 as the center, as shown in Fig. 6. We add disturbance noise signals to the fake picture and then transmit them to trap locations. Fig. 12 shows the picture received by the eavesdropper when she enters the trap area. We see that the eavesdropper experiences the best picture quality at Location 1, and the picture quality increases as she moves from Location 4 to 1. Thus, the eavesdropper will be eventually guided to Location 1 if she searches for pictures of high quality.

7 RELATED WORK

MIMO has been widely studied due to its capability of improving the spectral efficiency of wireless systems [31], [32], [33], [34]. MU-MIMO, as an advanced MIMO, has drawn increasing attention in recent years [35], [36], [37],

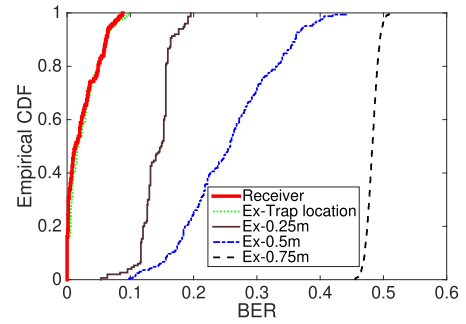


Fig. 11. Receiver's and Eavesdropper's BERs.

enabling a transmitter with multiple antennas to concurrently transmit messages to different receivers. The proposed system also uses multiple antennas but completely differs from a traditional MU-MIMO.

First, the proposed system provides secret communication. We achieve this by (1) constructing a specified channel between the transmitter and the receiver, and (2) inserting random signals to original signals, such that the random signals disrupt the decoding at an eavesdropper but cancel at a receiver. Second, instead of merely aiming to increase diversity or multiplexing gain, the proposed system aims to create a trap area. Due to the existence of specified channels and random signals, we cannot simply adopt the traditional MU-MIMO to pre-code transmit signals. Accordingly, we create a technique compatible with the randomization channel design. The proposed technique not only transmits messages to multiple potential wireless devices, but, more importantly, it can entrap an eavesdropper to move towards a target location.

It is an intuitive strategy to protect true messages among a sea of true and fake ones. Rivest [38] combines such a strategy with message authentication code algorithms to achieve confidentiality. [39] hides real secrets among a set of real and fake secrets, and aims to achieve both confidentiality and deception. Our work, however, combines the strategy with MIMO to implement the entrapment. Instead of directly sending out the intermingled messages, our work precodes the messages based on MIMO channel information, so that each selected trap location observes a well-designed fake message meanwhile the receiver obtains a true message. Besides, the fake messages in [38] aim to stop adversaries from distinguishing the true messages, while in our work, the fake messages also attract the adversaries' attention to the trap area.

There are extensive research efforts in friendly jamming [7], [8], [9], [10], [40], [41], which also use constructive signal canceling like our technique. For example, [41] combines friendly jamming with distance bounding to verify

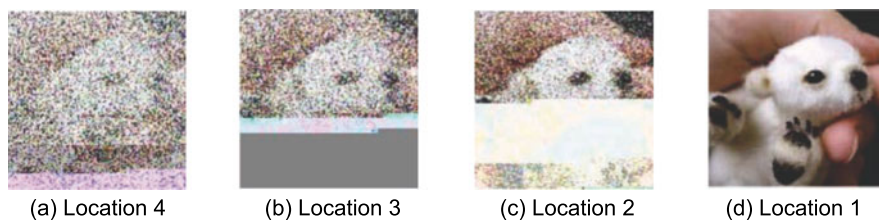


Fig. 12. We transmit a picture to the trap area. The eavesdropper gets pictures with increasing quality while moving from Location 4 to 1.

the location and velocity of vehicles. [40] further proposes a waveform design on jamming signals to enhance the friendly jamming efficiency. Our technique and friendly jamming have multiple differences. First, both methods take different strategies. Friendly jamming disrupts unauthorized communication and enables authorized receivers to get services, while our work enables adversaries to receive meaningful signals and makes legitimate parties communicate securely. Second, our work sets up an entrapment by attracting an eavesdropper to observe increasing SNR, while friendly jamming makes an eavesdropper unsuccessfully decode the message. Furthermore, the two tasks in our scheme, i.e., the secret communication between legitimate parties and the entrapment for adversaries, are parallel, while friendly jamming has no such design.

8 CONCLUSION

In this paper, we design an entrapment wireless system that attracts an eavesdropper to a specified trap location, where the eavesdropper can obtain a meaningful but fake message. We create techniques that enable a transmitter to establish a secure communication channel with the desired receiver such that the eavesdropper is unable to decode exchanged information. We also create techniques that can utilize multiple antennas to generate a large trap area to increase the probability of successfully entrapping an eavesdropper. We perform a real-world evaluation on the USRP X300 platforms running GNURadio to validate the performance of the proposed scheme.

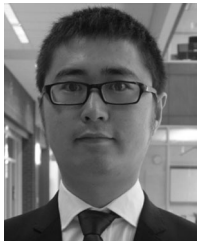
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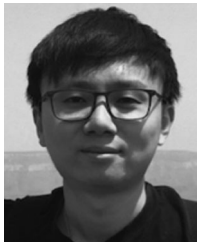
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