

# 3-D Multi-Input Multi-Output (MIMO) Pulsed Chaos Lidar Based on Time-Division Multiplexing

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**Abstract**—In this study, we propose and evaluate a 3D multi-input multi-output (MIMO) pulsed chaos lidar based on time-division multiplexing. By time-gating a chaos waveform sequentially at different times, chaos-modulated pulses for different channels that are uncorrelated with each other can be generated. To quantitatively evaluate the anti-interference/jamming capability, we investigated the detection performance of the MIMO chaos lidar under different jamming strengths and overlapped ratios between the jamming and the signal pulses. The overall detection probabilities of the chaos lidar and a conventional time-digital-converter-based pulsed lidar under the influence of interference/jamming were compared and we found that the chaos lidar exhibits strong resistance to the interference/jamming. Employing the 3D MIMO chaos lidar developed, we demonstrate 3D imaging under the influence of interference/jamming. By simultaneously scanning 2 different channels with overlapped field-of-views (FOVs), 3D images with large-FOV/low-resolution and small-FOV/high-resolution were obtained at the same time.

**Index Terms**—Semiconductor lasers, chaos, laser Radar, jamming, interference suppression, optical feedback, MIMO system.

## I. INTRODUCTION

LIDAR has the unique advantage of providing high-accuracy depth information up to a very long detection range. In recent years, 3D lidars have been widely used in applications such as autonomous vehicles, augmented reality/virtual reality, industrial automation, and simultaneous localization and mapping [1]–[4]. Conventional pulsed lidars use repeated optical pulses as the light source. They measure the time-of-flight of the pulses reflected from the target to obtain depth information [5], [6]. Although the concept is simple, using pulses without any specific patterns makes these lidars vulnerable to interference and malicious jamming [7]. To mitigate these issues, correlation-based lidars such as random-modulation continuous-wave (RM-CW) lidars [8]–[10] and chaos lidars [11]–[14] that utilize modulated light with specific patterns have been proposed.

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An RM-CW lidar emits light modulated with pseudo-random binary sequences. By calculating the cross-correlation between the transmitted and received sequences, the range of the target can be determined. Although RM-CW lidars can mitigate the influence of interference and jamming, high-speed optoelectronics are required to generate and modulate the codes.

Without the need for high-speed modulators and electronics for pattern generation and modulation, CW chaos lidars generate chaos-modulated light by utilizing intrinsic laser dynamics. [15]–[19]. They have no range ambiguity and are intrinsically resistant to interference and jamming because of their noise-like waveforms.

Despite these unique features, the correlation-based lidars with modulated CW waveforms typically have relatively low signal-to-noise ratios (SNRs) especially when the output power is limited by eye-safe regulations (average power less than 10 mW at 1550 nm) [20]–[23]. Although it is possible to increase the SNR by increasing the accumulation time window of detection, the detection throughput will be limited making them not suitable for real-time high-speed 3D imaging that requires fast detection with high throughput.

To take advantage of both the pulsed and modulated CW lidars, we proposed and studied a 3D pulsed chaos lidar system that utilizes chaos-modulated pulses to improve the SNR [24]–[27]. By employing a pulsed master oscillation power amplifier (MOPA) scheme and quadrant avalanche photodetectors (APDs) [28], [29], high-speed 3D imaging at a throughput of 100 kHz, a frame rate of 10 Hz, and a field-of-view (FOV) of  $24.5 \times 11.5$  degrees have been demonstrated. While the detection performance of the single-input single-output (SISO) chaos lidar system keeps being improved, its FOV is still limited by the mechanical turning angle of the micro-electro-mechanical system (MEMS) mirror and the physical parameters of the receiving optics. Moreover, the throughput and precision are also limited by the peak power and the energy of the generated pulses.

To increase the FOV and the throughput, multiple SISO lidars can be integrated into a multi-channel lidar [30], [31]. In conventional pulsed lidars, to avoid interference between channels, the FOV of each adjacent channel must be limited to reduce the overlapped region and the pulses of each channel must be emitted in sequence outside other's detection time windows to avoid ambiguity. When integrating with chaos lidars, the interference between the channels can be significantly mitigated.

In this study, we developed a MIMO 3D pulsed chaos lidar based on time-division multiplexing. By time-gating a CW chaos

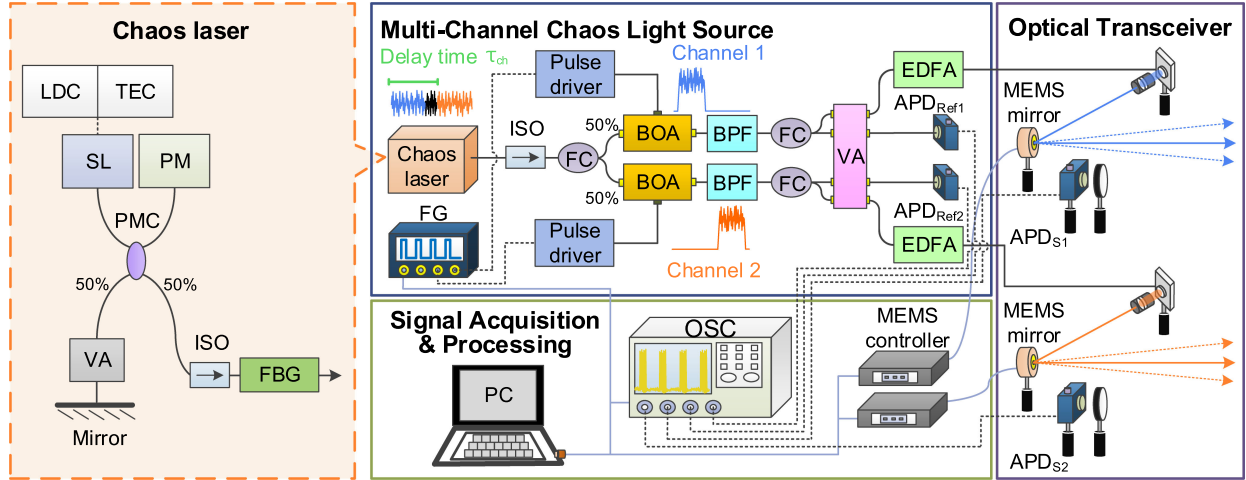


Fig. 1. Schematic of a MIMO 3D pulsed chaos lidar based on time-division multiplexing. LDC: laser diode controller; TEC: temperature controller; SL: semiconductor laser; PMC: polarization-maintaining fiber coupler; VA: variable optical attenuator; PM: power meter; ISO: isolator; FBG: fiber Bragg grating; BOA: booster optical amplifier; BPF: band-pass filter; FG: function generator; FC: fiber coupler; EDFA: Erbium-doped fiber amplifier; APD: avalanche photodetector; OSC: oscilloscope; PC: personal computer.

waveform at different times, we can generate multiple channels of chaos-modulated pulses with low correlation to each other. We investigated the correlation property of the pulses generated under different relative delay times  $\tau_{ch}$  and pulsewidths  $PW$ . We evaluated the peak to standard deviation of sidelobe level ( $PSL_{std}$ ), precision, and detection probability of the lidar under different relative jamming strengths and overlapped ratios to quantify its anti-interference/jamming capability. We compared the chaos lidar with the time-to-digital converter (TDC) based lidars and quantitatively evaluated their overall detection probability. For demonstration, we present 3D imaging under malicious jamming and demonstrate multi-channel 3D imaging with simultaneous large-FOV/low-resolution and small-FOV/high-resolution scanning.

## II. EXPERIMENTAL SETUP

Fig. 1 presents a schematic of a MIMO 3D pulsed chaos lidar based on time-division multiplexing (TDM). The system mainly comprises a multi-channel chaos light source, an optical transceiver, and a signal acquisition and processing module.

In the multi-channel chaos light source module, we use a 1550-nm single-mode semiconductor laser (Shengshi Optical SWLD-155005P8-FC/APC-PM) subject to optical feedback from a fiber mirror as the chaos laser. With a feedback strength  $\xi_{fb}$  (defined as the ratio between the reflected and emitted optical fields) of 0.017 and a feedback time delay  $\tau_{fb}$  of 65 ns controlled by the variable optical attenuator (VA) and the fiber length, the laser outputs CW chaos that has a broadened spectrum. We used a power meter (PM) to monitor  $\xi_{fb}$  and an isolator (ISO) to avoid any unwanted feedback. To better match with the detector bandwidth, we used a fiber Bragg grating (FBG; IXblue IXC-FBG-PS-1550-1-ATH-PM-C, linewidth  $<1$  GHz) to reduce the linewidths of the chaos waveforms and thus enhance the modulation depth for better detection capability [29].

To generate multi-channel chaos-modulated pulses, we can divide the laser output into the number of channels needed with

fiber couplers. For this experiment, we used a 50:50 fiber coupler to split the CW chaos into two channels and then send them into the corresponding booster optical amplifiers (BOA, Thorlabs BOA1130P) for pulse generation. By adjusting the relative onset delay times between the two pulse drivers (AeroDIODE, CCS-std) with the function generator (FG; Agilent 81150 A), we generated uncorrelated chaos-modulated pulses with the modulations time-gated from different parts of the CW chaos waveform. We then sent these pulses into the band-pass filters (BPF; Fiber Optic M-AD-1) to reduce the amplified spontaneous emissions from the BOAs and use two erbium-doped fiber amplifiers (EDFAs) (Channel 1: GIP CGBC1E3128001 A; Channel 2: GIP EFAS1EB128002 A) to amplify them in a pulsed MOPA configuration [28]. To record the waveforms of these two input pulses with channel 1 and channel 2 as the references, we used fiber couplers before the EDFAs to split the lights and detect them with two identical avalanche photodetectors (APD; Thorlabs APD430 C, 400 MHz). Here the input pulses of channel 1 and channel 2 arrive at the respective  $APD_{Ref1}$  and  $APD_{Ref2}$  sequentially with a relative channel delay time  $\tau_{ch}$  set by the FG. A multi-channel variable optical attenuator was also used to adjust the optical power in each optical path.

In the optical transceiver module, we used a two-axis MEMS mirror (Mirrorcle S6249) in each channel to scan the light emitted from the chaos light source. In channel 1 and channel 2, we used  $APD_{S1}$  and  $APD_{S2}$ , respectively, identical to those used for the references to detect the output pulses from the backscattered light as the signals.

In the signal acquisition and processing module, we used an oscilloscope (Tektronix MSO58) to simultaneously acquire the waveforms of the reference and signal at a sampling rate of 1.25 GHz. To measure the range of a target, we first used the second-order Chebyshev high-pass digital filter with a cutoff frequency of 1 MHz to remove the square-wave modulation in the waveforms that define the widths of the pulses. By calculating the lag time of the cross-correlation peak between the input pulse from the reference and the output pulse from

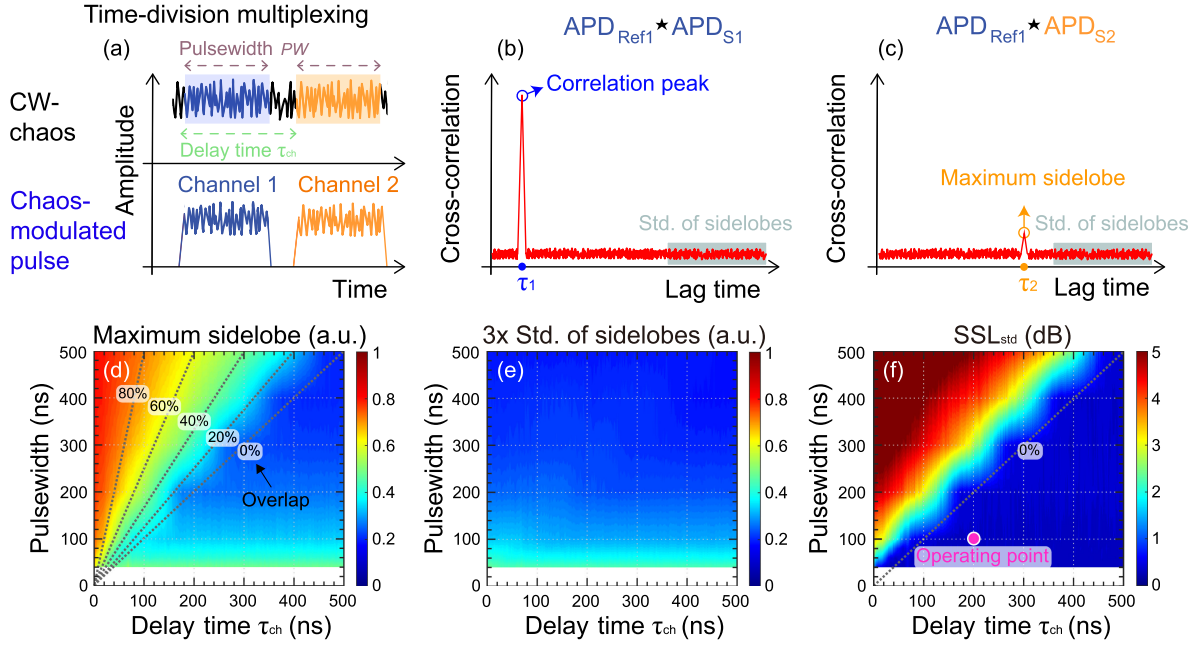


Fig. 2. (a) Schematic illustration of multi-channel chaos-modulated pulses generated by time-division multiplexing. (b) Cross-correlation between the reference and signal pulses of channel 1. (c) Cross-correlation between the reference pulse of channel 1 and the signal pulse of channel 2. (d) Maximum sidelobe, (e) 3 times the standard deviation of sidelobes, and (f)  $SSL_{std}$  under different  $PW$  and  $\tau_{ch}$ .

the signal with a personal computer, the range of the target can be determined. While some time-delay signatures (TDS) could exist in the cross-correlation trace inherited from the nature of the feedback scheme, we found that they hardly have any influence in lidar applications since only the strongest peak is being recorded. Not to mention that the TDS can always be effectively mitigated or shifted out of the detection window by optimizing the operational parameters or the feedback schemes [19], [32], [33]. In searching for the peak, we incorporated the Spline interpolation [34] to achieve better precision in this study. To automatically and continuously acquire ranges to render 3D images, the FG sends trigger signals to synchronize the pulse drivers, the MEMS mirrors, and the signal acquisitions in each module.

### III. CHARACTERISTICS OF MULTI-CHANNEL CHAOS

To prevent interference between channels, the operation condition to generate input pulses with minimized cross-correlation must be first characterized. As presented in Fig. 2, we investigated the correlation properties of the input pulses generated with different  $PW$  and  $\tau_{ch}$  between the channels. Fig. 2(a) illustrates the schematic of multi-channel chaos generated by the TDM. By time-gating different parts of the CW chaos that have uncorrelated oscillation waveforms, chaos-modulated pulses differing from one another can be generated. While multiple uncorrelated pulses can be generated in sequence to be used for several channels, we only demonstrate the case with 2 pulses for simplicity. For channel 1, the pulses from channel 2 can be viewed as the interference (or jamming).

Figs. 2(b) and 2(c) illustrate the cross-correlations between the signal pulse and the reference pulse of channel 1 and the signal pulse of channel 2 and the reference pulse of channel

1, respectively. The values of the correlation peak and the maximum sidelobe exhibit how similar they are and the lag times of  $\tau_1$  and  $\tau_2$  indicate the relative delays between them. We calculated the  $PSL_{std}$  (the value of correlation peak to 3 times the standard deviation of the sidelobes level) to evaluate the detection capability and the  $SSL_{std}$  (the value of maximum sidelobe to 3 times the standard deviation of the sidelobes level) to quantify the robustness against interference/jamming.

Figs. 2(d)–(f) present the maximum sidelobe, 3 times the standard deviation of the sidelobes, and the  $SSL_{std}$  obtained from the cross-correlations between the signal pulse of channel 2 and the reference pulse of channel 1 under different  $\tau_{ch}$  and  $PW$ . Here the pulse repetition frequency is 100 kHz, the correlation length is the same as the pulsewidth and the average output power of both channels from the EDFA is 10 dBm. As presented in Fig. 2(d), when  $\tau_{ch} = 0$  (no time separation when time-gating the two pulses), the cross-correlations between the pulses from the two channels are over 0.8 (1 means that the pulses in the two channels are completely identical) for different  $PW$ , where the discrepancy between the pulses is mainly because of the noises from the EDFAs and the APDs. As  $\tau_{ch}$  increases from 0 to the diagonal when  $\tau_{ch} = PW$  (0% overlap between the two pulses), the similarity of the two pulses decreases, and the correlation descends to a level of approximately 0.2. For  $\tau_{ch} \geq PW$ , the two pulses are completely separated without any overlapping and the two channels do not effectively interfere with each other. Note that the correlation increases again when the  $PW$  is shorter than about 80 ns even when the two pulses have 0% overlap. It is due to the shorter correlation lengths that are associated with the shorter pulsewidths [14].

As can be seen in Fig. 2(e), 3 times the standard deviations of the sidelobes are mostly below 0.2 for different  $\tau_{ch}$  and  $PW$ . For  $PW$  shorter than about 80 ns, similar to that shown in Fig. 2(d),



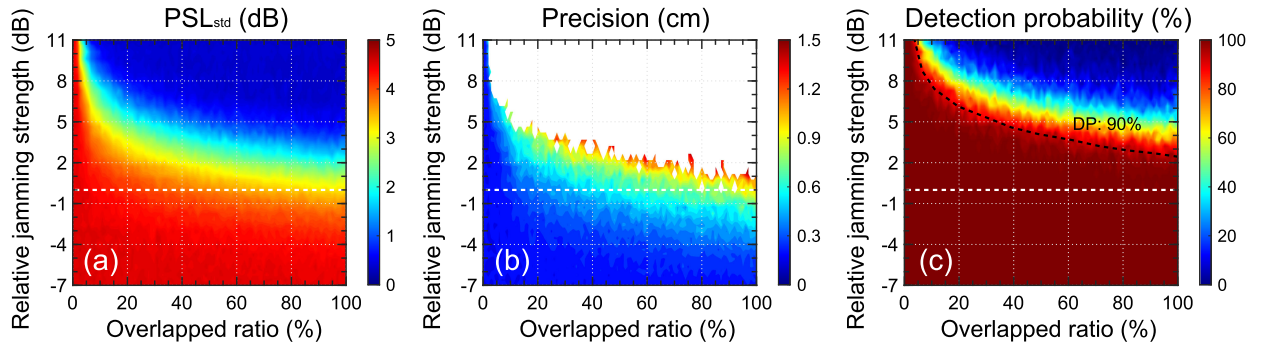


Fig. 3. (a)  $PSL_{std}$ , (b) precision, and (c) detection probability under different relative jamming strengths and overlapped ratios. The white dashed lines indicate a relative jamming strength of 0 dB. The black dashed curve in (c) indicates the boundary where the detection probability is 90%.

the value slightly increases to approximately 0.4 because of the shorter correlation lengths.

As illustrated in Fig. 2(f), the  $SSL_{std}$  (showing the ratio between Figs. 2(d) and 2(e)) is mostly 0 dB below the diagonal (0% overlap) when  $\tau_{ch} \geq PW$ . From the obtained results, we know that by time-gating the pulses with a relative channel delay time of  $\tau_{ch} \geq PW$ , interference between the channels can be minimized. For the following assessment and demonstration, we generate pulses with  $PW$  of 100 ns for a better range precision [28] and  $\tau_{ch}$  of 200 ns (100 ns time separation between pulses) between channel 1 and channel 2 for minimal interference.

#### IV. DETECTION PERFORMANCE UNDER INTERFERENCE AND JAMMING

To quantify the detection performance under the influence of interference and jamming, Figs. 3(a)–3(c) show the  $PSL_{std}$ , precision, and detection probability of one of the channels in the MIMO chaos lidar for different relative jamming strengths and overlapped ratios. Here the pulses from channel 1 are considered as the main signal and the pulses from channel 2 received by channel 1 at  $APD_{S1}$  are viewed as interference or jamming. The relative jamming strength is the ratio between the  $SNR$  of the jamming signal to the  $SNR$  of the main signal. The overlapped ratio is the portion of the main signal pulse that is overlapped with the jamming pulse in time. We set the  $SNR$  of the main signal to 8 dB and varied the  $SNR$  of the jamming signal from 1 to 19 dB to obtain a relative jamming strength of  $-7$  to 11 dB. The maximum jamming strength examined here is limited by the saturation power of the APDs used. To precisely vary the overlapped ratio continuously, we captured the jamming pulses of different strengths separately and then reproduced them with the main signal pulses with different overlapped ratios through digital signal processing. We have verified that these results are similar to those if the jamming pulses were actually overlapped with the main signal pulses. In Fig. 6, we present a demonstration of when the jamming and signal pulses are received by the  $APD_{S1}$  at the same time with actual overlapping.

As demonstrated in Fig. 3(a), with or without overlapping, the  $PSL_{std}$  exceeds 4 dB when the relative jamming strength is small. When there is no overlap (overlapped ratio of 0), the  $PSL_{std}$  can be maintained at a high level; greater than 4.5 dB

even when the relative jamming strength reaches as strong as 11 dB. In contrast to a conventional TDC-based pulsed lidar that typically fails to detect when the relative jamming strength is above 0 dB, the chaos lidar clearly exhibits its advantages in anti-interference and anti-jamming. Even for the most extreme case when the interference/jamming pulse is completely overlapped with the signal pulse (overlapped ratio of 100%), the  $PSL_{std}$  can still be maintained above 3 dB for a relative jamming strength of 0 dB (indicated by the white dashed line).

By taking the standard deviation from 100 measurements, Fig. 3(b) illustrates the precision of ranging under different relative jamming strengths and overlapped ratios. While the precision is governed by both the  $SNR$  and the bandwidth of the signal [35], [36], the precision indicates the same trend as that of the corresponding  $PSL_{std}$ . As can be seen, when there is no overlapping, the precision of the chaos lidar can be maintained at a very low value of 0.18 cm even when the relative jamming strength is as high as 11 dB. For the extreme case of 100% overlapping, the precision is still under 1.03 cm for a relative jamming strength of 0 dB (indicated by the white dashed line). Compared to some commercial 3D pulsed lidars with precisions in the range of several centimeters [24], [30], [31], the chaos lidar possessed a better precision even when under the influence of interference or jamming.

To evaluate the probability of a valid detection, in Fig. 3(c) we plot the detection probability of the chaos lidar under different relative jamming strengths and overlapped ratios. The valid detections account for those detections that have a range error of less than half of the sampling size. In this study, the sampling size is 12 cm associated with the sampling rate of 1.25 GHz. As can be seen, when the overlapped ratio is 0, the detection probability is maintained at 100% (the reddish region) even when the relative jamming strength is as high as 11 dB. While the detection probability gradually decreases as the overlapped ratio or the relative jamming strength increases, for an overlapped ratio of 100%, the detection probability can still hold at 100% for a relative jamming strength of 0 dB. The boundary of the highest jamming strength for the detection probability to be maintained higher than 90% is also plotted (black dashed curve).

From these results, we present that the MIMO chaos lidar is robust to interference and jamming. Although only the results of one of the channels (channel 1) in the MIMO chaos lidar under the influence of interference/jamming (from channel 2) is shown

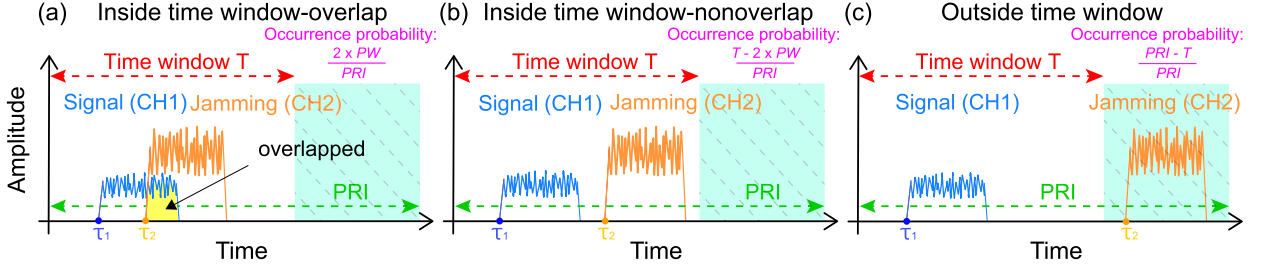


Fig. 4. Three possible scenarios of jamming: the jamming pulse arrives (a) inside the detection time window and has overlapped with the signal pulse either partially or completely, (b) inside the detection time window without overlapping with the signal pulse, and (c) outside the detection time window, respectively.

to prove the concept, the system can easily be expanded into a MIMO lidar with more channels without interfering with each other and yet be robust to jamming.

## V. OVERALL DETECTION PROBABILITY

While we have discussed the detection probability when the jamming (or similarly the interference) pulse is overlapped with the signal pulse, the occurrence probability ( $OP$ ) of the jamming pulse to overlap with the signal pulse in a practical scenario should also be taken into consideration.

Figs. 4(a)–4(c) present the three possible scenarios of jamming: the jamming pulse arrives (a) inside the detection time window and has overlapped with the signal pulse either partially or completely, (b) inside the detection time window without overlapping with the signal pulse, and (c) outside the detection time window. Here we use the signal pulse from channel 1 as the main signal and the pulse from channel 2 as the jamming signal.  $\tau_1$  and  $\tau_2$  are the lag times of the main signal pulse from channel 1 and the jamming pulse from channel 2 received by the same APD  $S_1$ ;  $PRI$  is the pulse repetition interval; Time window  $T$  is the receiving time window of the detector for signal processing, which also determines the maximum detection range of the system. The  $OP$ s of these 3 scenarios can therefore be expressed as  $(2 \times PW)/PRI$ ,  $(T - 2 \times PW)/PRI$ , and  $(PRI - T)/PRI$ , respectively. Since the  $PW$  in a pulsed lidar is usually much shorter than the  $PRI$  to gain a higher peak power for a better  $SNR$ , the  $OP$  for the pulses that have overlapped is typically low as illustrated in Fig. 4(a).

Figs. 5(a) and 5(b) present the detection probability of the chaos lidar and the TDC-based pulsed lidar when the jamming pulse arrives at the detector at a different  $\tau_2$ . Here we use  $\tau_1 = 2.5 \mu s$ ,  $T = 5 \mu s$ ,  $PRI = 10 \mu s$ ,  $PW = 100$  ns, and a relative jamming strength of 3 dB as an example.

As can be seen in Fig. 5(a), for  $\tau_2$  between 2.4 to 2.6  $\mu s$ , the jamming pulse overlaps with the signal pulse. The detection probability of the chaos lidar (blue circles) drops from 100% with minimal overlap to the lowest value of approximately 80% when the jamming pulse overlaps with the signal pulse completely when  $\tau_2 = \tau_1 = 2.5 \mu s$ . As for the TDC-based lidar, when the jamming pulse is considered stronger than the signal pulse, no valid detection can be made (i.e. detection probability is 0) other than when  $\tau_2 = \tau_1$ . In fact, for  $\tau_2 = \tau_1$ , false detection of the jamming pulse at  $\tau_2$  just happens to be at the same position as the signal pulse at  $\tau_1$ .

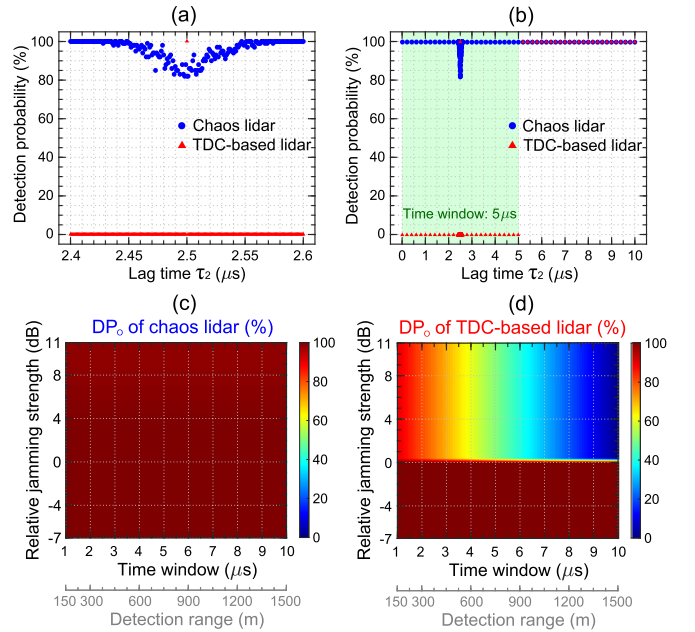


Fig. 5. (a)(b) Detection probability of the chaos and TDC-based lidars when the jamming pulse has a lag time of  $\tau_2$ . Here we use  $\tau_1 = 2.5 \mu s$ ,  $T = 5 \mu s$ ,  $PRI = 10 \mu s$ ,  $PW = 100$  ns, and a relative jamming strength of 3 dB as an example. (a) is a zoomed-in view of (b) at the vicinity of  $\tau_1 = 2.5 \mu s$ . (c)(d)  $DP_o$  of chaos and TDC-based lidars at different relative jamming strengths and time windows, respectively.

For the entire span of a  $PRI$ , as presented in Fig. 5(b), the chaos lidar has a detection probability of 100% except in the vicinity around  $\tau_2 = 2.5 \mu s$  as discussed in Fig. 5(a). As for the TDC-based lidar, valid detection can only be made when the jamming pulse is outside of the detection time window.

To account for both the detection probability and the occurrence probability, we evaluate the overall detection probability ( $DP_o$ ) of these lidars:

$$DP_o \equiv \sum_{\tau_2=0}^{PRI} DP(\tau_1, \tau_2) \times OP(\tau_1, \tau_2),$$

where  $DP_o$  is the sum of the  $DP$  multiplied by the  $OP$  for different  $\tau_2$ . Here we assumed that  $\tau_1$  is within the detection time window and  $\tau_2$  is randomly positioned in the  $PRI$ . While the respective  $DP_o$  of the chaos lidar and the TDC-based lidar are 98% and 50% for the cases presented in Figs. 5(a) and 5(b), respectively, we plot more comprehensive mappings of their

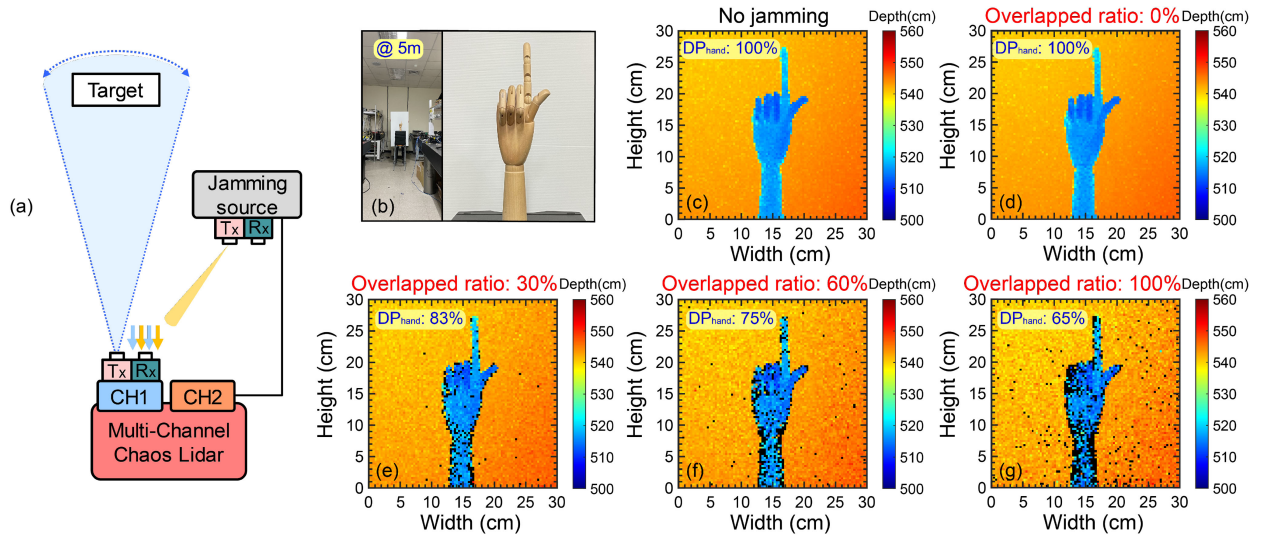


Fig. 6. (a) Illustration of a scenario where one of the channels in the MIMO chaos lidar is interfered with or jammed. Here channel 1 is viewed as the main signal and channel 2 is considered as the interference or jamming source. (b) Photograph of a wooden hand and its 3D rendering obtained using the acquired point cloud (c) without jamming, and jammed with overlapped ratios of (d) 0%, (e) 30%, (f) 60%, and (g) 100%, respectively.  $DP_{\text{hand}}$  is the detection probability accounting for the ratio of pixels that have valid detection of the hand.

$DP_o$  in Figs. 5(c) and 5(d) for the cases with different relative jamming strengths and detection time windows.

Fig. 5(c) depicts the  $DP_o$  of the chaos lidar under different relative jamming strengths and time windows. As can be seen, when considering both the  $DP$  and the  $OP$ , the  $DP_o$  is maintained at a very high level above 98% even when the relative jamming strength is 11 dB, which is much stronger than the signal. By contrast, as presented in Fig. 5(d) for the  $DP_o$  of the TDC-based lidar, the  $DP_o$  drops significantly when the detection encounters jamming that is stronger than the signal. Unlike the chaos lidar that can tolerate a significant amount of jamming benefited by the specific chaos-modulated waveforms used, the TDC-based lidar can escape from the influence of jamming only when the jamming pulse happens to arrive at a time outside of the detection time window. Therefore, as can be seen in Fig. 5(d), for a relative jamming strength above 0 dB, the  $DP_o$  decreases as the time window  $T$  increases. When  $T = PRI = 10 \mu\text{s}$  for a corresponding maximum detection range of 1500 m, the  $DP_o$  of the TDC-based lidar is essentially 0. While different system operation parameters tailored to different applications and scenarios can be used, in general, we show that the  $DP_o$  of the chaos lidar is much higher than the TDC-based lidar when experiencing strong jamming or equivalent interference.

## VI. DEMONSTRATION OF 3D IMAGING UNDER THE INFLUENCE OF INTERFERENCE OR MALICIOUS JAMMING

In Fig. 6, we demonstrate 3D imaging under the influence of interference and malicious jamming with different overlapped ratios. Fig. 6(a) depicts a scenario of the chaos lidar where the detection of channel 1 is being constantly interfered by channel 2. Here channel 2 can be viewed as an interference or malicious jamming emitting similar waveforms. As can be seen in Fig. 6(b), we placed a wooden hand 5 m away from the lidar

as the target. We set the average output power of channel 1 (main signal) to 10 mW which resulted in the received signal having an average  $SNR$  of 9 dB at the center area of the target and 4 dB at the edge of the hand. To ensure a very strong interference or jamming, we adjusted the output power of channel 2 so that the  $SNR$  of the received signal from channel 2 (considered as the interference or jamming signal) is 10 dB, which is stronger than the main signal across the whole scanning region. With a relative jamming strength between 1 to 6 dB, false detections are expected in a TDC-based lidar if the jamming pulses happen to arrive within the detection time window.

Fig. 6(c) presents the 3D rendering of the wooden hand obtained using the acquired point cloud without jamming. The image has a resolution of  $100 \times 100$  pixels taken at a  $PRI = 10 \mu\text{s}$  (detection throughput or pixel rate of 100 kHz). The profile of the hand and the details of the fingers are clearly depicted. In this image, all pixels on the hand have a valid detection where the range errors are all less than half of the sampling resolution in depth. As the result, the detection probability accounting for those pixels on the hand  $DP_{\text{hand}}$  is 100%.

Figs. 6(d)–6(g) present the 3D rendering of the wooden hand obtained by using the acquired point cloud with jamming pulses when the main signal and the jamming pulses are 0%, 30%, 60%, and 100% overlapped in time. The corresponding  $DP_{\text{hand}}$  are 100%, 83%, 75%, and 65%, where the black dots in the plots indicate the pixels without valid detection. As can be seen,  $DP_{\text{hand}}$  of 100% is achieved when the signal and the jamming pulses are not overlapped even under such strong jamming. As the overlapped ratio increases, the detection on the edge of the target is prone to fail because of the lower  $SNR$  of the main signal. Nevertheless, even under the most extreme case of an overlapped ratio of 100% (meaning that at every scanning pixel, the jamming pulses all arrive exactly at the same time as the main signal pulses), the contour of the hand is still observed and the  $DP_{\text{hand}}$  is kept higher than 65%.



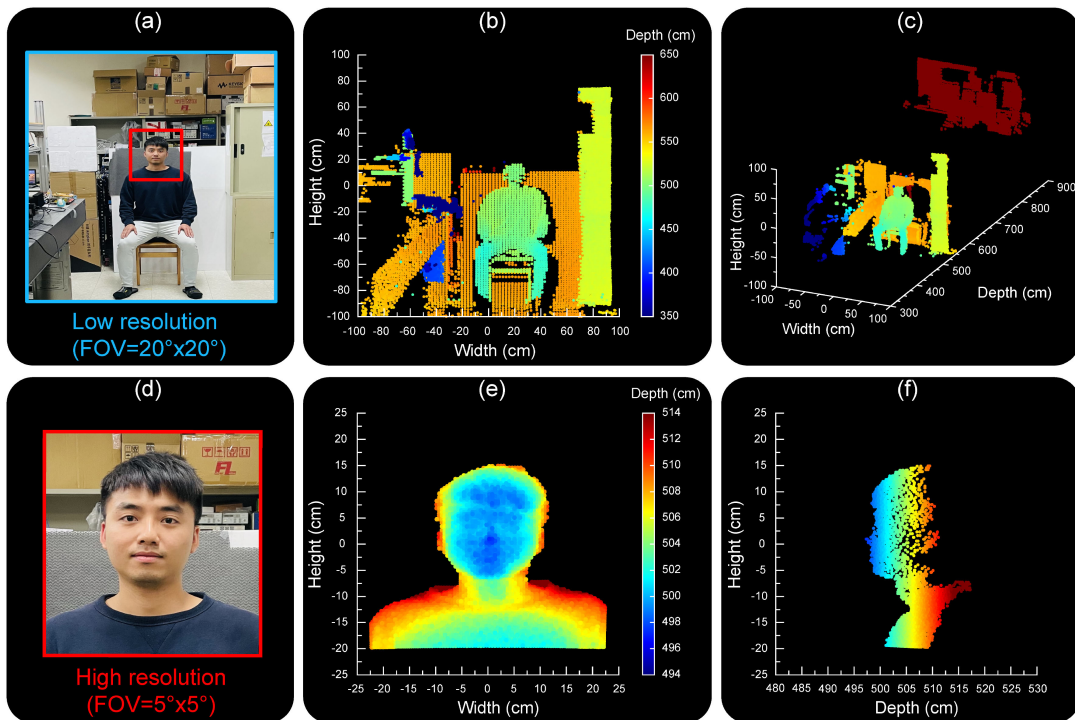


Fig. 7. (a) Photograph of a person seating in the laboratory environment and the (b) Front and (c) Bird's-eye views of its 3D rendering obtained using the acquired point cloud. (d) Photograph zoomed in on the face, the (e) Front, and (f) Side views of its 3D rendering obtained using the acquired point cloud. The large-FOV/low-resolution (blue box) and small-FOV/high-resolution (red box) images are scanned simultaneously. The FOVs, image resolutions, and angular resolutions are  $20 \times 20$  degrees,  $128 \times 128$  pixels, and  $0.16 \times 0.16$  degrees for the low-resolution scan and  $5 \times 5$  degrees,  $128 \times 128$  pixels, and  $0.04 \times 0.04$  degrees for the high-resolution scan, respectively. The person is seated approximately 5 m away from the lidar. The color in the 3D images depicts the depth.

## VII. DEMONSTRATION OF MULTI-CHANNEL IMAGING WITH FOV OVERLAPPED SCENES

To avoid interference, a conventional multi-channel pulsed lidar must either limit the FOV of each adjacent channel, emit the pulses of each channel at different times outside other's detection windows, or scan each channel with a particular pattern without overlapping each other on the same spot at the same time. By contrast, with a low correlation between each channel, the MIMO chaos lidar can scan a scene with channels overlapping each other but without interference.

In the demonstration presented in Fig. 7, we scanned a scene with two channels from the MIMO chaos lidar with overlapped FOVs. By scanning the two channels simultaneously, 3D images with large-FOV/low-resolution and small-FOV/high-resolution are obtained at the same time.

Figs. 7(a)–7(c) depict a photograph of a person seated 5 meters away from the lidar in a laboratory environment and the front and bird's-eye views of its 3D rendering obtained using the acquired point clouds. In the large FOV scan within the blue box, the FOV is  $20 \times 20$  degrees, the image resolution is  $128 \times 128$  pixels, and the angular resolution is 0.16 degrees both horizontally and vertically. To have such a large FOV, in this channel a quadrant APD (Idealphotonics QPD-1000) was used in the transceiver module to increase the detection area [29]. As can be seen, the posture of the person, the iron cabinet on the right, the optical table on the left, the cardboard, and the boxes behind are all clearly depicted.

By scanning simultaneously inside the red box shown in Fig. 7(a), the point clouds with a smaller FOV but higher resolution focus on the person's face are obtained. Figs. 7(d)–7(f) depict a photograph zoomed in on the face and the front and side views of its 3D rendering obtained using the acquired point clouds. In this small FOV scan, the FOV is  $5 \times 5$  degrees, the image resolution is still  $128 \times 128$  pixels, and the angular resolution is therefore increased by 4 times to 0.04 degrees both horizontally and vertically. Despite its low reflectivity and scattered nature, 3D images of the face with details in the orbits, nose, ears, and lips were obtained.

## VIII. CONCLUSION

In summary, we developed a 3D MIMO pulsed chaos lidar based on time-division multiplexing. By time-gating chaos waveform in sequence at different times, chaos-modulated pulses uncorrelated to each other can be generated when the relative channel delay time  $\tau_{ch}$  exceeds the pulsewidth  $PW$ . By using these pulses as the input pulse of each channel, interference among different channels can be mitigated. The  $PSL_{std}$ , precision, and detection probability under different relative jamming strengths and overlapped ratios were studied to quantify the anti-interference and anti-jamming capability. To consider both the detection probability and the occurrence probability for the jamming pulse to actually overlap with the signal pulse, the overall detection probabilities of the chaos lidar and TDC-based pulsed lidar were analyzed and compared. For relative jamming

strengths up to 11 dB, the overall detection probability of the chaos lidar can still be maintained above 98%.

For the first time, we demonstrated 3D imaging using MIMO chaos lidar under the influence of interference and malicious jamming. Moreover, by simultaneously scanning 2 different channels with overlapped FOVs, 3D images with large-FOV/low-resolution and small-FOV/high-resolution were obtained at the same time. From a system point of view, the detection throughput (pixel rate) was also doubled when the two channels are operated simultaneously. While we only show the results with 2 channels, MIMO chaos lidar with more channels can be easily realized. Moreover, we also studied an alternative scheme based on wavelength-division multiplexing which will be reported separately.

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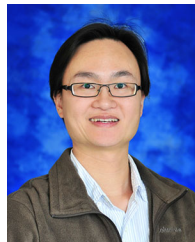
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