

TITLE

REFLECTIVE WAVE DEVICE FOR SIMULTANEOUS EVENT DETECTION AND
5 SIGNAL RECONSTRUCTION USING COMPRESSIVE MEASUREMENTS

BACKGROUND

Sonar underwater imaging has diversified since it was first
10 developed and now has a wide range of applications. With pre-
sent day technology small-scale devices, which may be remote
controlled or even autonomous robots, can be deployed for un-
derwater surveillance. The range of applications includes de-
tection of hazardous materials in a harbour, mine sweeping,
15 geophysical surveys, surveillance of naval traffic and oth-
ers. In particular, for small-scale devices it is desirable
to provide image-processing units that are efficient with re-
gard to processing and memory requirements and at the same
time reasonably fast.

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Compressive sensing, which is also known as compressed sens-
ing, compressive sampling, or sparse sampling, is a signal
processing technique for efficiently acquiring and recon-
structing a signal by finding solutions to underdetermined
25 linear systems. By utilizing knowledge about a signal's spar-
sity, the signal may be reconstructed with fewer samples than
the Nyquist-Shannon theorem would require. Herein, sparsity
of the signal refers to the degree to which the signal is
represented by just a few coefficients of a given set of base
30 functions, the other coefficients being zero, close to zero
or at least much smaller.

Most of the known compressive sensing systems are of two kinds: imaging and subsequent reconstruction from compressive measurements or detection of an event directly from the compressive measurements. For example, the US 2013/0128042 discloses an event detection method using a compressive-sensing hyperspectral imaging architecture. Therein, an incident light beam is split up into its spectral components. An image portion or its time sequence is examined in the selected spectral range for a pre-determined trigger condition such as exceedance of a pre-determined magnitude or of a pre-determined rate of change.

According to the US 2013/0128042, an event detection is performed in the compressed sensed samples. By contrast, a method and device according to the present specification allows an event detection to be performed simultaneously during the reconstruction of a compressed sensed image.

For easier reading of the present specification, references are listed below and they are referred in the specification text using the names of the authors as abbreviation.

"Wright, Nowak, Figueiredo": S. J. Wright, R. Nowak, and M. A. T. Figueiredo, "Sparse reconstruction by Separable Approximation," IEEE Transactions on Signal Processing, vol. 57, no. 7, pp. 2479-2493, July 2009.

"Kim, Koh, Lustig, Boyd, Grinvesky": S. Kim, K. Koh, M. Lustig, S. Boyd, and D. Grinvesky, "An interior-point method for large-scale ℓ_1 -regularized least squares," IEEE Journal on Selected Topics in Signal Processing, vol. 1, no. 4, pp. 606-617, Dec. 2007.

"Cevher, Sankaranarayanan, Duarte, Dikpal": Volkan Cevher and Aswin Sankaranarayanan and Marco F. Duarte and Dikpal Reddy and Richard

- 5 "Baraniuk": G. Baraniuk, "Compressive sensing for background subtraction" in Proc. European Conf. Comp. Vision (ECCV), Berlin, Germany, 2008.

BRIEF DESCRIPTION OF THE SEVERAL VIEWS OF THE DRAWINGS

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An image reconstruction system according to the present specification provides the ability for simultaneous event detection, corresponding scene reconstruction and whole image reconstruction irrespective of an event in real time. In the
15 present specification a system and method is disclosed that can be used for simultaneous reconstruction of the scene and detection of event in real time using suitable optimization and reconstruction algorithms, respectively. Herein, a simultaneous execution of two processes is understood in a general
20 sense that the two processes comprise common steps and/or comprise steps that are executed in parallel for both processes.

According to the present specification, a method for event
25 detection and reconstruction of image raw data in a reflective wave device is disclosed, in particular for a simultaneous or real-time event detection which is performed during the data acquisition and reconstruction of image raw data. Herein, a reflective wave device refers to a device for generating and receiving sound waves or electromagnetic waves
30 such as a sonar, a seismic device, or any form of radar.

Image raw data is acquired from a sensor for sensing reflected sound waves or electromagnetic waves and a compressed representation of the image raw data is with compressive sensing. Compressive sensing, which is explained in further detail in the specification text below, involves a sparse representation of the image raw data in a suitable set of base functions and a random projection. The random projection reduces the amount of data, wherein the randomness of the random projection helps to avoid image artefacts that are due to a systematic bias.

The compressed representation is processed frame-by-frame, wherein the frames may represent in particular rows or columns of a two-dimensional image, or also equal sized blocks of data of the two-dimensional image. The two-dimensional dimension may also be provided by a slice of a three-dimensional image and the physical units may for example be space units, time units or units resulting from a transformation of the data, such as a Fourier transformation, a Wavelet transformation, a Radon transformation or others.

During the frame-by-frame processing of the compressed representation a detection of events is performed which is based on a current frame of the compressed representation. Herein, the frame-by-frame processing comprises a frame-by-frame image reconstruction.

If an event is detected in the current frame of the compressed representation, a pre-determined number of frames that precede the current frame is received. Herein, "preceding" is defined according to an order in which the frames are processed.

An event is reconstructed based on a detection subset, wherein the detection subset is derived from the current frame and the pre-determined number of retrieved frames. In particular, the detections subset can also be identical with the current
5 frame and the pre-determined number of retrieved frames. The reconstruction of the event comprises reconstruction of event data such as event type, event time, event location, rate of change etc. By contrast, a reconstruction of an event scene refers to a more detailed reconstruction of a spatial arrangement of the event. This may, among others, involve ori-
10 entation, spatial extent, size and other features defining a spatial arrangement.

As soon as an event is detected in a frame that is currently
15 being processed, the processing unit can trigger an adequate reaction. According to the present specification it is not necessary to defer the event detection until a complete image has been reconstructed but, rather, the event detection is performed during the process of image reconstruction.

20 According to a further embodiment, the detection subset is stored in memory slots of a buffer "B1". The size of the buffer "B1" is larger than the amount required to store the detection subset by a buffering size. The buffering size depends on the time required to transmit the detection subset
25 to a processing unit. In the context of the present specification, the detection subset for reconstructing the event corresponds to $(R-t)$ slots that represent $(R-t)$ frames and the buffering size corresponds to t slots representing t
30 frames.

According to yet another embodiment, the detection subset is copied to a second buffer "B2" and the content of the second

buffer "B2" is sent to a scene reconstruction unit, if an event is detected in the current frame.

According to the present specification, there are various possibilities in which a detected event may be highlighted or signalled.

According to one embodiment, in the case that an event is detected, a data message is generated which comprises event data of the detected event, such as event time, location, type, intensity. This can, in turn trigger an output of a signal that is indicative of the detected event, such as a light signal or an acoustic warning or a display of event details on a screen, LCD display or the like. In addition, the complete reconstructed image or part of it may be output.

According to another embodiment, if an event is detected, an event scene is reconstructed, which is in particular based on the detection subset and which is indicate of the spatial arrangement of the event and/or of the change thereof. The reconstruction of the event scene may comprise, for example, the spatial orientation and extension of the event, a direction of movement of the event, a rate of change of the event etc.

According to yet another embodiment, if an event is detected an image in which the event scene is marked is reconstructed, wherein the image represents the raw data. The marked event scene is based on the detection subset.

Furthermore, the method may comprise a detection whether an event is present in the current frame using a part P of selected measurements or coefficients for the current frame.

The selection of only a part P of the selected measurements or coefficients further reduces the amount of data.

According to a further embodiment, the compressive sensing
5 comprises a random projection that is chosen such that 50% or less of the input data is used, which means that the complete input set of data need not to be used. In particular, the random projection can be performed using a random projection matrix with a ratio of rows to columns, or columns to rows,
10 as the case may be, which is 50% or less.

This will in general result in a sub-Nyquist sampling, wherein the Nyquist frequency is defined by a desired level of resolution. The random selection avoids artefacts in the re-
15 constructed image due to a systematic bias.

In particular, the derivation of the compressed representation may comprise an acquisition of a two-dimensional image and partitioning of the two-dimensional image in one-
20 dimensional frames. For a predetermined number p of the one-dimensional frames repeating the steps of generating a random projection of a frame and of representing the random projection by M measurements or coefficients of a set of base functions to generate a sparse vector of base function coefficients are repeated.
25

For further reducing the amount of data a part P of the M measurements or coefficients may be selected for use in event detection. For example, if the event occupies only a small
30 region of the frame and the base functions are concentrated around a region, only coefficients of base functions contribute which cover the event region.

It is detected if an event has occurred according to a pre-determined event criterion based on the P selected measurements or coefficients. The event criterion may in particular comprise comparison with a threshold or a threshold event.

5

A two-dimensional image according to the present specification may represent a two-dimensional distribution of sensor signals, such as sonar signals. The two-dimensional distribution may be spatial but it may also be spatiotemporal distribution. In general, the dimensions of the image may also result from a transformation of the original image. For example, a Fourier transformation with respect to two space dimensions will result in a two-dimensional image in which the axes represent frequencies.

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In a further aspect, the present application discloses a reflective wave device comprising a sensor for acquisition of image raw data for sensing the reflected acoustic or electromagnetic waves and a computation unit with a processor, a memory and an output unit. The computation unit comprising a software program which provides for deriving a compressed representation of the image raw data with compressive sensing, frame-by-frame processing of the compressed representation. During the frame-by-frame processing of the compressed representation, a detection of an event is performed based on a current frame of the compressed representation. Herein, the frame-by-frame processing comprises a frame-by-frame image reconstruction.

30 If an event is detected in the current frame of the compressed representation, a pre-determined number of frames that precede the current frame, is retrieved, wherein the numbering of the frames is defined according to the order in

which the frames are processed. This order may correspond to the natural order or rows or the natural order of columns in which the image data is acquired.

5 An event is reconstructed based on a detection subset, wherein the detection subset is derived from - or is identical with - the current frame and the pre-determined number of retrieved frame. The reconstructed event is compared with a pre-determined threshold event and a flag signal is output if
10 the reconstructed event matches the threshold event.

In a further aspect, the present specification disclose a reflective wave device in which the abovementioned functions are realized partially or entirely by specific dedicated
15 hardware components, such as application specific integrated circuits or electric circuitry. Part of the functions may also be realized by software modules. The software modules and the specific hardware components are referred as "units" or "sub-units".

20

The reflective wave device according to this aspect comprises a sensor for acquisition of image raw data, which is operable for sensing the reflected waves. In particular, the sensor may be part of an image acquisition device for acquiring a
25 two-dimensional image.

Furthermore, the reflective wave device comprises a compressive sensing unit for deriving a compressed representation from the image raw data. The compressive sensing unit may in
30 turn comprise a first sub-unit for selecting a current frame from the image raw data and for generating a random projection of the frame and a second sub-unit for representing the frame by M measurements or coefficients of a pre-determined

set of base functions and a third sub-unit for selecting a subset of P measurements or coefficients from the M measurements or coefficients.

5 Moreover, the reflective wave device comprises a detection unit with a sub-unit for detecting an event based on the current frame. The detection unit is furthermore operative to retrieve a pre-determined number of frames which precede the current frame according to the order in which the frames are
10 processed, to reconstruct an event based on a detection subset, wherein the detection subset is derived from, or is identical to, the current frame and the pre-determined number of retrieved frames, to compare the reconstructed event with a pre-determined event criterion, such as a threshold event,
15 and to output a flag signal if the reconstructed event matches the event criterion.

According to a further embodiment, the reflective wave device comprises a buffering unit with a buffer "B1", a size of the
20 buffer "B1" being larger than the amount required to store the detection subset by a buffering size, wherein the buffering size depends on a time required to transmit the detection subset to a processing unit.

25 According to yet another embodiment, the reflective wave device comprises a second buffer "B2". A size of the second buffer is sufficient for storing the detection subset.

Furthermore, the current specification disclose a mobile underwater sonar device, which may be self-propelled or moved
30 by an external device such as a string. The sonar device comprises one of the abovementioned reflective wave devices. The

reflective wave device is provided at, or in other words inside or onto, a body of the mobile underwater sonar device.

The sensor for acquiring the image raw data is provided by
5 one or more acoustic sensors that are arranged laterally, which is starboard or larboard, to a direction of travel of the mobile underwater sonar device.

Furthermore, the current specification discloses a ship with
10 one of the abovementioned reflective wave devices. The reflective wave device is provided at, or in other words in or onto, a body of the ship. The sensor for acquiring the image raw data is provided by one or more acoustic sensors that are arranged laterally, which is starboard or larboard, to a di-
15 rection of travel of the ship.

Moreover, the current specification discloses an unmanned aerial vehicle with one of the abovementioned reflective wave devices. The reflective wave device is provided at, or in
20 other words in or onto, a body of the unmanned aerial vehicle. The sensor for acquiring the image raw data is provided by one or more radar sensors that are arranged laterally to a direction of travel of the unmanned aerial vehicle, which may be at the bottom or slightly sideways but also at other loca-
25 tions.

Moreover, the present specification discloses an aircraft with one of the abovementioned reflective wave. The reflective wave device is provided at, or in other words in or on
30 an outer surface of, a body of the aircraft. The sensor for acquiring the image raw data is provided by one or more radar sensors that are arranged laterally to a direction of travel

of the aircraft, which may be at the bottom or slightly sideways but also at other locations.

The object of the present specification is now explained with
5 reference to the following Figures in which

- Fig. 1 shows a diagram of a data reconstruction and event detection system,
- Fig. 2 shows a method for data reconstruction and event
10 detection using the system of Fig. 1,
- Fig. 3 shows a row of an original signal,
- Fig. 4 shows a randomly sampled sparse signal,
- Fig. 5 shows a signal that is reconstructed from the signal of Fig. 4,
- 15 Fig. 6 shows an original image,
- Fig. 7 shows an image that is reconstructed from the sparse image according to the SpaRSa algorithm,
- Fig. 8 shows a raw data image,
- Fig. 9 shows a row-wise event detection derived from the
20 image of Fig. 8,
- Fig. 10 shows a row of an original signal,
- Fig. 11 shows a randomly sampled signal from the signal of Fig. 10,
- Fig. 12 shows a row-wise detection result,
- 25 Fig. 13 shows a row of an original signal,
- Fig. 14 shows a detection probability as a function of a number of measurements,
- Fig. 15 shows detection probabilities as a function of a number of measurements for an algorithm with and
30 without reconstruction,
- Fig. 16 shows a sonar device comprising the detection system of Fig. 1, and

Fig. 17 shows a sectional enlargement of Fig. 1 that illustrates a buffer management according to the specification.

5 DETAILED DESCRIPTION

In the following description, details are provided to describe the embodiments of the present specification. It shall be apparent to one skilled in the art, however, that the embodiments may be practised without such details.

For example, various basis functions may be used in order to achieve a sparsely populated representation of the image data in terms of basis function coefficients. In particular, one may choose a set of wavelet functions that differs from the Daubechies D10 wavelets of the present specification, for example one may choose the basis function from the D2, D4, ..., D8 or from the D12, D14, ..., D20 Daubechies wavelets.

Instead of an algorithm that is based on the l_1 norm, other convex optimization or greedy algorithms can be used to find an approximation of the original image, see for example "Wright, Nowak, Figueiredo". In general, any of the known compressive sensing reconstruction algorithms may be used in a device or in a method according to the present specification.

While the subject of the current specification is explained with respect to a sonar, it may also be used for a radar using electromagnetic waves or even for medical image acquisition devices, such as nuclear magnetic resonance imaging devices.

Fig. 1 shows a system 1 for simultaneous image reconstruction and event detection. Therein, block 10 represents the $N \times N$ sonar processed image 10 from the raw data. Block 20 represents a compressive sensing unit 20 (CSU) for generating a compressive sensed input signal from the $N \times N$ raw image. Block 30 represents a detection unit 30 where the compressively sensed samples are used for detection. Block 40 represents a scene recovery unit (SRU) 40, which takes the frame information from the detection unit and passes the information on to a control unit 50 for reconstruction of the event scene and/or the complete image. Block 50 represents the control unit (CU) 50 for passing control signals to the buffering unit 60 and to a reconstruction unit 70. Block 60 represents the buffering unit 60, which serves as a temporary storage of the compressively sensed data for reconstruction purposes.

Block 70 represents the reconstruction unit 70. The reconstruction unit 70 comprises two processing units which are not shown in Fig. 1. The processing units may be provided by special purpose hardware such as a graphics processing unit (GPU) or a field programmable gate array (FPGA). During operation, the processing units schedule the task of reconstruction of the scene corresponding to the samples in the buffering unit 60 and also schedule the reconstruction of the event scene simultaneously. Block 80 represents a user interface unit 80 which receives inputs that are specific to the application for example-the scenes to be recovered, the number of frames spanned by the target. By way of example, the user interface unit 80 may be provided by a LCD screen and a keypad, by an input device that is connectable to an image acquisition device by cable or by wireless connection.

As an example for a signal acquisition device, a sonar is shown in Fig. 16.

Fig. 2 shows a flow diagram of a method for image reconstruction and event detection using the system 1 of Fig. 1. Fig. 2 is now explained in further detail in the context of sonar signal processing.

In a step 11, an $N \times N$ sonar image is acquired from raw data of a sonar. Specifically, the $N \times N$ sonar image is obtained by translating the raw acoustic measurements obtained from back scattered responses into images. In a step 12, the images are processed row-wise or column wise depending on the swath of the sensor array. The rows or the columns form one-dimensional subsets of the two-dimensional $N \times N$ image. Each row or column of size N is referred to as a frame. In a step 13, the frame number p is initialized to 1.

In one specific embodiment, the acoustic signal acquisition is done in such a way that the sparsity of the $N \times N$ image is exploited at various levels. To this end, randomness is introduced at various levels, for example by suitable placements of the transmitters and the receivers in the number of pulses emitted by the transmitter. The introduction of randomness includes the use of random linear sensor arrays, of sparse sampled irregular arrays or of a steerable electronic array of antennas for signal acquisition.

In a step 22, a first sub-unit of the compressive sensing unit (CSU) 20 uses a random matrix for each frame to capture M measurements, where M is much less than the total number N of samples in a row or in a column. The number M of measurements depends on the sparsity of the signal. The number of

captured samples M is stored in the buffering unit 60 and is stored along with the frame number p.

According to the present specification, the M measurements
5 are used for event detection in step 22 and the following steps and, in a step 61, the M measurements are buffered and passed on to a reconstruction unit 70 in step 71.

In a step 23, a second sub-unit of the CSU 20 uses a portion
10 P of the M input samples for detection of an event in the frame. The number of samples P is much less than the number M of captured samples. The number P depends on the kind of input signal and is generally less than the number M of input samples. The event could be a target in the context of sonar
15 signals, such as a sea mine.

In steps 31, 32 and 33 the detection unit 30 uses a suitable detection algorithm in the compressed domain to detect an event. An event is detected in steps 31 and 32, if more than
20 f consecutive frames pass the detection algorithm, wherein step 31 is carried out by a first sub-unit and step 32 is carried out by a second sub-unit of the detection unit 30. The number f is provided in step 81 as a user defined input of the user interface 80.

25

When a target is detected in step 32, the last frame information of the set of f frames that satisfies the detection criteria is passed on to the scene recovery unit 40.

30 In step 33 it is decided if a pre-determined number of frames has been reached. If yes, the next N x N image is acquired in step 35 and the algorithm loops back to step 13. Otherwise,

the frame counter p is incremented by one and the algorithm loops back to step 21.

In step 41 a first sub-unit of the SRU 40 checks if a scene recovery is required, which depends on the application and is provided by the user input interface. In steps 42 and 51, a second sub unit of the SRU 40 passes on the frame information p to the control unit 50. After passing the scene information, the flow continues with the step 33 of checking the end of frames. This synchronization condition is indicated in Fig. 2 by the two circled letter symbols "A'".

During operation, the control unit 50 controls the buffer unit 60 and the reconstruction unit 70. Furthermore, the control unit 50 keeps track of the frame number p , gets the scene information from the scene recovery unit 40 and passes the scene information on to the buffering unit 60 for processing. Furthermore, the control unit 50 decides when the buffer of the buffering unit 60 is to be flushed and when the reconstruction unit 70 is to be activated.

The buffering unit 60 comprises a buffer with two storage spaces, B1 and B2. The storage space B1 can store R frames of length M while the storage space B2 can store T frames of length M , wherein R is greater than T . T is chosen greater than f , the number of rows or columns spanned by the target, i.e., the size should be greater than f . The size of the storage space B1 should be greater than the size of the storage space B2 so that no frames are lost in the process of buffering and at the same time no frames with overlap are getting reconstructed.

The buffer B1 comprises t extra slots for storing the incoming frames when the reconstruction of the $(R - t)$ frames is carried out. Herein, a "slot" refers to a memory space, which is sufficient to take up the relevant information of one
5 frame. This may be, by way of example, the memory space required to store M measurements or coefficients of a suitably chosen set of base functions.

The total size of the t extra slots depends on the time taken
10 for passing on the frames to the RU 70. The size of R , T , t , and thereby of the corresponding memory space, depends on the signal. After the first $(R - t)$ slots of storage space B1 are filled with the frames, the control unit 50 signals to pass a copy of the set of frames to the reconstruction unit 70 for
15 image recovery in a step 71. The incoming frames are then stored in the next t free slots. The control unit 50 also checks on the value of p in step 33 of Fig. 2.

After $(R - t)$ frames of the storage space B1 are passed on to
20 the RU 70, the CU 50 checks for the frame number of the frame that is currently getting processed in the detection unit 30. If, for example, the i -th frame is being processed, then all frames before the $(i - f)$ th frame are cleared from the storage space B1. The CU 50 also keeps track of the last frame
25 number that was passed on to the reconstruction unit 70 for reconstruction.

Supposed d is the last frame number that was passed on to the RU 70. When the CU 50 passes on the next $(R - t)$ slots to the
30 RU 70 it will check the starting frame number, h , of the next set of $(R - t)$ slots. The CU 50 signals the RU 70 to reconstruct the event scene from the set of frames starting from

the h -th or from the $(d + 1)$ th frame number, whichever is the lowest.

If an event is detected at the k -th frame, then $[k-f, k]$

5 frames are accessed from storage space B1. These frames are copied to the storage space B2. The frames from the storage space B2 are passed on to the reconstruction unit 70 for the event scene recovery.

10 Once the set of target frames are passed to the storage space B2, the CU 50 resets the storage space B2. According to one embodiment, the event scene is recovered separately as described above. According to another embodiment, the event scene is highlighted in the reconstructed image by passing on
15 the detected frames information, thus not requiring a separate buffer B2.

The reconstruction unit 70 provides three options for output:

- (i) the reconstructed image itself
- 20 (ii) the event scene alone
- (iii) the reconstructed image with the event scene marked on it.

The reconstruction unit 70 comprises two processing units
25 (FPGA, GPU etc.) of which one unit is used for reconstruction of the scene of the event from the frames in the storage space B2 and the other unit is used for reconstruction of the image scene part by part as a set of $(R - t)$ frames from the storage space B1.

30

A small buffer in the reconstruction unit 70 is used to store the intermediate reconstructed images. The consecutive sets of $(R - t)$ frames, which cover the whole image, are later

combined to form the whole image. The latter step is carried out in the case when a complete reconstruction of the whole image scene needs to be provided simultaneously. The reconstruction unit 70 uses one of many available compressive reconstruction algorithms. Suitable compressive reconstruction units can be found in "Wright, Nowak, Figueiredo" and "Baraniuk".

For enabling faster processing, an implementation of the algorithm may be GPU based. The number of processing units in the reconstruction unit need not be limited to two, but can have any number. The user interface 80 provides information specific to the signal and the scene, like the number of frames f spanned by the target, the M/N ratio, the P/M ratio, the sparsity of the signal, or the size of the buffers t , R and T .

For the localization of the event scene one processing unit of the two processing units in the reconstruction unit 70 processes the set of the f frames in parallel. In the reconstruction unit 70, the average of the first ten sparse vectors is assumed as a background training vector. The i -th sparse vector is subtracted from the background sparse vector. K samples of the subtracted vector are taken, with K being much smaller than the length T of the vector. An l_1 norm reconstruction of the vector gives the location of anomaly values in the vector. The l_1 norm may be implemented by computing to the sum of the moduli for a given sequence of vector values. The background reduction is one of several techniques that can be used for event detection.

Typically, the anomaly values are located in consecutive locations in the vector. A similar process is done for all the

f frame vectors thereby providing a localization of the event. When all the f frames are stacked up there will be a consecutive set of values in the row and the column thus defining a region. The exact set of points constituting the region of the target is marked. Thus, the proposed system is capable of delivering a complete image with the target region defined and/or the target region alone.

Experimental result and analysis

10

Figs. 3 - 15 show an evaluation of one of the side-scan sonar images acquired with a Klein 2000 side-scan sonar device of Klein Associates, Inc., of Nashua, New Hampshire, at a sound frequency of 500 kHz. Each image line or frame consists of both the starboard and portside images, wherein starboard and portside, which is also known as "larboard", refer to the right and left side in the direction of travel, respectively.

Some images contain one underwater mine each and some do not contain any mine. A careful analysis of the data set shows that the distortions introduced by yaw, pitch and roll movements of the sonar device in the water are relatively small and need not be addressed in this particular case. The magnitudes of the coefficients are provided in arbitrary units (a.u.).

The nature of the side-scan sonar is such that the raw data exhibits across-track geometric distortion (slant-range distortion). Hence, in order to have an accurate determination of the location of a target, slant-range correction (ground-range projection) is required. In the examples shown, the sonar imagery is resampled to 0.1 m x 0.1 m per pixel. In this context, a pixel is also referred to as a "bin". A resulting

size of the sonar image is 1034 x 1491. According to the example of Figs. 3 to 15, the sonar image is processed row-wise. These captured measurements are passed on to the buffer.

5

A random projection matrix Φ of dimension $M \times N$ with $M = 776$ and $N = 1491$ is used to capture the input vector measurements y in steps 21 and 22 of Fig. 2. The fraction M/N , which is 0.52 in the given example, is typically in the range [0.5, 0.8]. The sonar signal is assumed to be sparse in a given wavelet basis. The data is processed row-wise in accordance with the sensing approach.

10

Fig. 3 shows an original side scan signal, wherein a signal intensity in arbitrary units (a.u.) is plotted as a function of the measurement bins. Fig. 4 shows a randomly sample sparse signal that is derived from the original signal by applying a sparsity inducing matrix, also known as transformation matrix, and the random projection matrix Φ to the original signal. Fig. 5 shows a side scan sonar row vector recovered from the Daubechies (D10) wavelet. The row-wise processing can be extended for the entire sonar image.

20

Each of the input compressed sensed vectors is copied to the buffering unit 60, which comprises two memory slots B1 and B2. The memory slot B1 can hold up to 20 frames whereas the memory slot B2 can hold up to 10 frames. The size of the memory slot B2 is decided as twice the number f frames spanned by the target, which in this case is 5. The size of the memory slot B1 is twice the size of the memory slot B2.

25

30

After the memory slot B1 is filled with up to 10 frames the control unit signals the buffer to copy those 10 frames to

the reconstruction unit 70. The control unit 50 then checks for the current frame that is being processed. If the 20-th frame is getting processed, the CU 50 sends control signals to delete all the frames before the 15-th frame (20-5). The
5 buffer keeps track of the last frame number that was passed on to the reconstruction unit 70. If the current frame minus the number of target frames is more than the last frame number passed on to the reconstruction unit 70, then the last frame number is retained.

10

For example, if the last frame number that was passed on to the reconstruction unit 70 is 20 and the frame being processed by the detection unit 30 is 27 then the CU 50 checks if 22 ($= 27-5$) is greater than 20 and retains the smallest of
15 both numbers i.e., 20. In this way, it is ensured that no frames are lost in reconstruction and no overlapping happens.

The next time after 10 slots of the memory slot B1 gets filled, the CU 50 copies the next 10 slots, starting from the
20 last frame number, to the reconstruction unit 70. In between, if a target is detected at the 18-th frame, then frames in the range $[13 (=18-5), 18]$ are copied to the memory slot B2. The CU 50 then copies these frames to RU 70 and resets the memory slot B2. The size of the memory slot B2 is maintained
25 in such a way that even if there are two consecutive set of mine frames they can be detected.

Each of the sparse vectors s is reconstructed using the SpaRSA approach according to "Wright, Nowak, Figueiredo". A re-
30 constructed sonar image according to SpaRSA is as shown in Fig. 7. If the 50-th frame is detected to contain an underwater mine then the CU 50 copies the 6 frames with frame numbers $50 - 5$ to 50 on to B2, which is passed on to the recon-

struction unit 70. This procedure is repeated for the rest of the image.

Fig. 6 shows an original image taken at a portside of the sonar scanner with a prominent feature 111 and Fig. 7 shows a reconstructed image with a prominent feature 112. The reconstructed image of Fig. 7 was reconstructed using random sampling of 49% of the data, corresponding to a ratio $M/N = 0.49$ of the dimensions of the random projection matrix Φ .

Compressive background subtraction according to "Cevher, Sankaranarayanan, Duarte, Dikpal" was done on the sonar image from images of a database acquired by the "Klein 2000" sonar side scan system. The row-wise detection results for a sonar image having homogenous background are shown in Figs. 12 and 13. The raw data of Fig. 12 shows a prominent feature 115, which is reflected in the row detection event 116 the detection diagram of Fig. 13. The row detection event 116 occurs approximately at row 800. This corresponds to the extension of the prominent feature 115 between rows 800 and 900.

For the event detection, the input image was slant range corrected and the number of samples in the row was reduced to 500. Each row of the original data is compressively sensed by a random matrix Φ (50×500) as shown in Figs. 8 to 11. Thus, 50 random measurements out of 500 are captured. These measurements could also be a subset P of the M measurements which are initially captured, as illustrated by the reduction step 23 of Fig. 2. The number of samples P is much less than M and the range of P/M is typically $[0.1, 0.5]$.

Then, compressive background subtraction is carried out for each row of the sonar image. The row which crosses the set

threshold is marked as the row containing the target. The events are marked by the event detection result 114 in Fig 9, which corresponds to the prominent feature 113 of Fig. 8, and by the event detection result 116 of Fig. 13, which corresponds to the prominent feature 115 of Fig. 12.

The background training was done using the first 10 rows of the image. The DU 30 gathers information on the first 10 samples stored in the buffer at the start.

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The impact of the variation of the number of measurements on the target detection is as shown in Fig. 14. The probability of detection exponentially rises with increase in the number of the measurements. The number of measurements reaches a regime after which the increase in the detection improvement is very marginal. It is to be noted that already for M equal to $0.15 N$ the probability of detection reaches 1.

Further, it can be inferred from Fig. 15 that the number of measurements required for good detection after reconstruction is more than the number of measurements required when detection is performed directly on the measurements. This is because for a good reconstruction of a sonar image M is lower bounded by the sparsity.

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Fig. 16 shows a sonar data acquisition system 120 according to the present application. The sonar data acquisition system of Fig. 16 comprises a pulse generator 121, a sender/receiver 122 which comprises a sound coupling device 125 such as a loudspeaker or a piezocrystal, an A/D converter 123 and a signal processor 124. The signal processor 124 comprises the image reconstruction and event detection system 1 of Fig. 1.

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In Fig. 1, the uncompressed signal is symbolized by the letter "y".

Fig. 17 shows a sectional enlargement of Fig. 1 that illustrates a buffer management according to the specification. According to the embodiment of Fig. 17, the buffering unit comprises a first buffer 65, labelled as "B1", and a second buffer 66, labelled as "B2". The first buffer 65 has sufficient memory for storing R frames and the second buffer 66 has sufficient memory for storing T frames, wherein R is greater than T. Data flows from the compressive sensing unit 20 to the first buffer 65, from the first buffer 65 to the second buffer 66, from the first buffer 65 to the reconstruction unit 70 and from the second buffer 66 to the reconstruction unit 70 are indicated by respective arrow symbols.

Although the above description contains much specificity, these should not be construed as limiting the scope of the embodiments but merely providing illustration of the foreseeable embodiments. Especially the above stated advantages of the embodiments should not be construed as limiting the scope of the embodiments but merely to explain possible achievements if the described embodiments are put into practise. Thus, the scope of the embodiments should be determined by the claims and their equivalents, rather than by the examples given.

The embodiments can also be described with the following lists of elements being organized into items. The respective combinations of features which are disclosed in the item list are regarded as independent subject matter, respectively, that can also be combined with other features of the application.

1. A method for event detection and reconstruction of image raw data in a reflective wave device, the method comprising:
 - 5 - acquisition of image raw data of a sensor,
 - derivation of a compressed representation of the image raw data with compressive sensing,
 - frame-by-frame processing of the compressed representation,
 - 10 - during the frame-by-frame processing of the compressed representation, wherein the frame-by-frame processing comprises a frame-by-frame image reconstruction,
 - performing a detection of events based on a current frame of the compressed representation,
 - 15 wherein, if an event is detected in the current frame:
 - retrieving a pre-determined number of frames, the pre-determined number of frames preceding the current frame,
 - reconstructing an event based on a detection/reconstruction subset, wherein the detection subset
 - 20 is derived from the current frame and the pre-determined number of retrieved frames.
2. Method according to item 1, comprising:
 - 25 - storing the detection/reconstruction subset in a buffer "B1", the size of the buffer being larger than the amount required to store the detection/reconstruction subset by a buffering size, wherein the buffering size depends on the time required to transmit the detection/reconstruction subset to a processing unit.
 - 30
3. Method according to item 2, comprising:
 - if an event is detected:

- copying the detection/reconstruction to a second buffer "B2",
- sending the content of the second buffer "B2" to a scene reconstruction unit.

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4. Method according to one of the preceding items comprising:

if an event is detected, generating a data message, the data message comprising event data of the detected event.

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5. Method according to one of the preceding items comprising, if an event is detected, reconstructing an event scene.

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6. Method according to one of the preceding items comprising:

if an event is detected, reconstructing an image in which the event scene is marked.

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7. The method of one of the preceding items, comprising
 - detecting whether an event is present in the current frame using a part P of selected coefficients or measurement subset for the current frame.

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8. The method according to one of the preceding items, wherein the compressive sensing comprises a random projection of the input set that is chosen such that the complete input set of data need not to be used.

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9. A reflective wave device comprising:
 - a sensor for acquisition of image raw data,

a computation unit with a processor, a memory and an output unit, the computation unit comprising a software program which provides the following method steps:

- 5 - deriving a compressed representation of the image raw data with compressive sensing,
- frame-by-frame processing of the compressed representation,
- during the frame-by-frame processing of the compressed representation, wherein the frame-by-frame processing
10 comprises a frame-by-frame image reconstruction,
- performing a detection of events based on a current frame of the compressed representation,
 wherein, if an event is detected in the current frame:
 - 15 - retrieving a pre-determined number of frames, the pre-determined number of frames preceding the current frame,
 - reconstructing an event based on a detection subset, wherein the detection subset is derived from the current frame and the pre-determined number of retrieved frames,
 - comparing the reconstructed event with a pre-
20 determined threshold event,
 - outputting a flag signal if the reconstructed event matches the threshold event.

10. A reflective wave device comprising:
 - 25 - a sensor for acquisition of image raw data,
 - a compressive sensing unit for deriving a compressed representation from the image raw data,
 - a detection unit for detecting an event based on the current frame, for reconstructing an event based on a
30 detection subset, wherein the detection subset is derived from the current frame and the pre-determined number of retrieved frames, for comparing the reconstructed event with a pre-determined event criterion and for out-

putting a flag signal if the reconstructed event matches the event criterion.

11. A reflective wave device according to item 9 or item 10,
5 further comprising
 - a buffering unit with a buffer "B1", a size of the buffer "B1" being larger than the amount required to store the detection subset by a buffering size, wherein the buffering size depends on a time required to trans-
10 mit the detection subset to a processing unit.
12. A reflective wave device according to item 11, the re-
flective wave device comprising a second buffer "B2", a
size of the second buffer being sufficient for storing
15 the detection subset.
13. A mobile underwater sonar device with a reflective wave
device according to one of the items 9 to 12, the re-
flective wave device being provided at a body of the mo-
20 bile underwater sonar device, wherein the sensor for ac-
quiring the image raw data is provided by one or more
acoustic sensors that are arranged laterally to a direc-
tion of travel of the mobile underwater sonar device.
- 25 14. A ship with a reflective wave device according to one of
the items 9 to 12, the reflective wave device being pro-
vided at a body of the ship, wherein the sensor for ac-
quiring the image raw data is provided by one or more
acoustic sensors that are arranged laterally to a direc-
30 tion of travel of the ship.
15. An unmanned aerial vehicle with a reflective wave device
according to one of the items 9 to 12, the reflective

wave device being provided at a body of the unmanned
aerial vehicle, wherein the sensor for acquiring the im-
age raw data is provided by one or more radar sensors
that are arranged laterally to a direction of travel of
5 the unmanned aerial vehicle.

16. An aircraft with a reflective wave device according to
one of the items 9 to 12, the reflective wave device be-
ing provided at a body of the aircraft, wherein the sen-
10 sor for acquiring the image raw data is provided by one
or more radar sensors that are arranged laterally to a
direction of travel of the aircraft.

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CLAIMS

1. A method for event detection and reconstruction of image raw data in a reflective wave device, the method comprising:
- 5 - acquisition of image raw data of a sensor,
 - derivation of a compressed representation of the image raw data with compressive sensing,
 - frame-by-frame processing of the compressed representation,
- 10 - during the frame-by-frame processing of the compressed representation, wherein the frame-by-frame processing comprises a frame-by-frame image reconstruction,
 - performing a detection of events based on a current
- 15 frame of the compressed representation,
 wherein, if an event is detected in the current frame:
 - retrieving a pre-determined number of frames, the pre-determined number of frames preceding the current frame,
 - reconstructing an event based on a detec-
- 20 tion/reconstruction subset, wherein the detection subset is derived from the current frame and the pre-determined number of retrieved frames.
2. Method according to claim 1, comprising:
- 25 - storing the detection/reconstruction subset in a buffer "B1", the size of the buffer being larger than the amount required to store the detection/reconstruction subset by a buffering size, wherein the buffering size depends on the time required to transmit the detec-
- 30 tion/reconstruction subset to a processing unit.
3. Method according to claim 2, comprising:
 if an event is detected:

- copying the detection/reconstruction to a second buffer "B2",
- sending the content of the second buffer "B2" to a scene reconstruction unit.

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4. Method according to claim 1 comprising:
if an event is detected, generating a data message, the data message comprising event data of the detected event.

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5. Method according to claim 1 comprising, if an event is detected, reconstructing an event scene.

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6. Method according to claim 1 comprising:
if an event is detected, reconstructing an image in which the event scene is marked.

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7. The method of claim 1, comprising
 - detecting whether an event is present in the current frame using a part P of selected coefficients or measurement subset for the current frame.

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8. The method according to claim 1, wherein the compressive sensing comprises a random projection of the input set that is chosen such that the complete input set of data need not to be used.

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9. A reflective wave device comprising:
 - a sensor for acquisition of image raw data,a computation unit with a processor, a memory and an output unit, the computation unit comprising a software program which provides the following method steps:

- deriving a compressed representation of the image raw data with compressive sensing,
- frame-by-frame processing of the compressed representation,
- 5 - during the frame-by-frame processing of the compressed representation, wherein the frame-by-frame processing comprises a frame-by-frame image reconstruction,
- performing a detection of events based on a current frame of the compressed representation,
- 10 wherein, if an event is detected in the current frame:
 - retrieving a pre-determined number of frames, the pre-determined number of frames preceding the current frame,
 - reconstructing an event based on a detection subset, wherein the detection subset is derived from the current
 - 15 frame and the pre-determined number of retrieved frames,
 - comparing the reconstructed event with a pre-determined threshold event,
 - outputting a flag signal if the reconstructed event matches the threshold event.
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- 10. A reflective wave device comprising:
 - a sensor for acquisition of image raw data,
 - a compressive sensing unit for deriving a compressed representation from the image raw data,
 - 25 - a detection unit for detecting an event based on the current frame, for reconstructing an event based on a detection subset, wherein the detection subset is derived from the current frame and the pre-determined number of retrieved frames, for comparing the reconstructed
 - 30 event with a pre-determined event criterion and for outputting a flag signal if the reconstructed event matches the event criterion.

11. A reflective wave device according to claim 9, further comprising
- 5 - a buffering unit with a buffer "B1", a size of the buffer "B1" being larger than the amount required to store the detection subset by a buffering size, wherein the buffering size depends on a time required to transmit the detection subset to a processing unit.
12. A reflective wave device according to claim 11, the reflective wave device comprising a second buffer "B2", a size of the second buffer being sufficient for storing the detection subset.
- 10 13. A mobile underwater sonar device with a reflective wave device according to claim 9, the reflective wave device being provided at a body of the mobile underwater sonar device, wherein the sensor for acquiring the image raw data is provided by one or more acoustic sensors that are arranged laterally to a direction of travel of the
- 15 20 mobile underwater sonar device.
14. A ship with a reflective wave device according to claim 9, the reflective wave device being provided at a body of the ship, wherein the sensor for acquiring the image raw data is provided by one or more acoustic sensors that are arranged laterally to a direction of travel of the ship.
- 25 15. An unmanned aerial vehicle with a reflective wave device according to claim 9, the reflective wave device being provided at a body of the unmanned aerial vehicle, wherein the sensor for acquiring the image raw data is provided by one or more radar sensors that are arranged
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laterally to a direction of travel of the unmanned aerial vehicle.

16. An aircraft with a reflective wave device according to
claim 9, the reflective wave device being provided at a
body of the aircraft, wherein the sensor for acquiring
the image raw data is provided by one or more radar sensors that are arranged laterally to a direction of travel of the aircraft.