

## Principal component analysis to compress acquired data offshore

Juan Luis Larrabe (1), Miguel Angel Gómez (1), Francisco José Alvarez (2), Elena Gastiasoro (2), M. Carmen Rey (2), Victoria E. Mielgo (2), Enrique Hilario (2)

(1) Dept. Navigation Sciences, Engineers and Shipbuilders, H.T.S. Nautical and Naval Machines, Maria Diaz de Haro, 68.Portugalete 48920 Bizkaia, SPAIN

(2) Research Unit; Hospital of Cruces, Barakaldo, Bizkaia SPAIN

Tfn: 034 94 6014847 email: [jl.larrabe@ehu.es](mailto:jl.larrabe@ehu.es)

**Abstract** - Telecommunications offshore have connectivity in virtually all parts of the globe via satellite, with increasing bandwidth and lower cost, but still far from levels that are onshore. The principal component analysis (PCA) is a statistical technique that has found application in fields such as biometrics or compression of images, being a common tool for finding patterns in multidimensional data sets. The hypothesis for this work was that it was possible to use the theory of PCA to compress, with sufficient accuracy, the large amount of data that are collected on board to a vessel and then sent by satellite in a more economical or rapid way than the traditional one. The material used were 44 samples of 182 different signals, collected from 19 different equipment on board to "Castillo de Villalba" Liquid Natural Gas carrier vessel. With these data, the PCA algorithm was applied using a computer program developed by the authors, generating new data packets to send by satellite. Different strategies were used in order to ensure that the coefficient of correlation  $r$  between original and reconstructed data onshore were equal or greater than 0.95. The results showed that it was possible to save 46.9% in the number of data sent via satellite, in the case of grouping all the 182 signs, with a mean  $r = 0.95 \pm 0.08$ . This strategy is appropriate for onshore vessel equipment telediagnostic and maintenance decision making, with telecommunication cost or time savings.

**Keywords** - 1. Ship, 2. Telecommunication, 3. Satellite, 4. Compression, 5. Non-exact.

### INTRODUCCIÓN

Communications at sea are in the process of evolution. The coverage by the satellite is virtually the entire globe for major technologies used today, either Iridium, Inmarsat or very small aperture terminals (VSAT). Moreover, where more progress is being made is in the bandwidth, increasing it, as well as the dwindling cost of communications and hardware equipment necessary. This paper presents a data non-exact compression method by applying principal components analysis (PCA) for monitoring the condition of equipment on board which allows lower cost of communication or reduce the occupation time of the bandwidth for a given amount of data sampled.

In order to reduce offshore satellite communication fees, there are two ways to compact information: exact and non-exact computer data compression. Exact compression algorithms usually exploit statistical redundancy to represent the sender's data more concisely without error.

Another compression technique, called non-exact data compression or perceptual coding, is possible if some loss of fidelity is acceptable. Generally, a non-exact data compression will be guided by research on how people perceive the data in question. Non-exact data compression provides a way to obtain the best fidelity for a given amount of compression. In some cases, transparent (unnoticeable) compression is desired; in other cases, fidelity is sacrificed to reduce the amount of data as much as possible.

Principal Component analysis (PCA) is a statistical technique with application in fields such as face recognition and image compression, and is a common technique for finding patterns in data of high dimension.

The other main advantage of PCA is that once you have found these patterns in the data, it is possible to compress it, by reducing the number of dimensions, without much loss of information.

For this work, the departure hypothesis was based in the possibility to use PCA theory to manage great quantity of data collected onboard by vessel control system, to compress and send it through satellite.

## OBJECTIVES

1. To develop a computer program to perform PCA compress and uncompress algorithm with collected data onboard.
2. To find the best strategy to compress data using PCA.

## MATERIALS AND METHODS

The data used were collected on board a ship for transporting liquefied natural gas LNG (Castillo de Villalba) through its integrated automation system (IAS, Norcontrol, Norway). This device generates a spreadsheet file every 12 hours, which represents the condition of 182 different signals of the 19 major subsystems of the vessel: Main Turbine, Boiler Common, Boiler No. 1 Boiler No 2, Turbo Generator No 1, Turbo Generator No 2, Diesel Generator, Boiler Water Readings, Feed Cond. System, Evaporators, Water Tanks, Fuel Oil, Marine Diesel Oil, Gas Oil, Sludge and Bilge, Others, LD Compressors and Fridges-Air Conditioning.

Two computer programs were developed by the authors (Labview 8.2, National Instrument, Austin TX). One of them performs PCA and generated the packets to send by satellite offshore. The second program uncompressed data onshore. All results were displayed graphically and saved in file format compatible with spreadsheet programs. Figure 1 shows the block diagram of the transmission method.

The designed computer application chosen in sequence the eigenvectors from highest to lowest eigenvalue and calculated the mean correlation coefficient  $r$  of all the variables from the matrix with the real data  $[Data]_{m \times n}$  and the received matrix  $[ReceivedData]_{m \times n}$ . When  $r$  was greater or equal than a given threshold, the data package to send was prepared. In the case of this work, the threshold chosen was  $r \geq 0.95$ . The figure 2 shows the front panel of the that program.

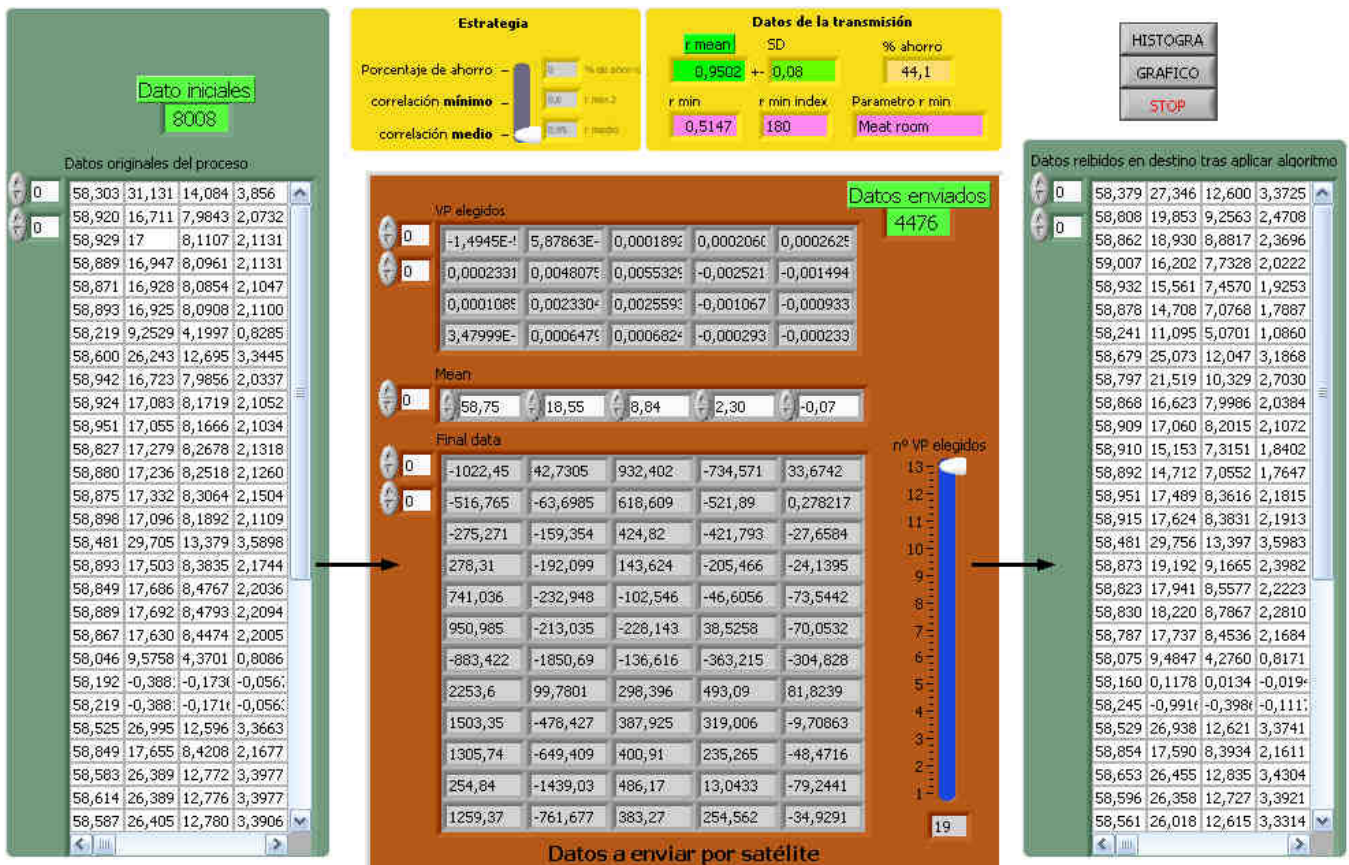


Figure. 1. Front panel of the designed computer application. In the left side are the real data collected onboard. In the center are the three packets sent by satellite. In the right side it is shown received data.

### 3 RESULTS

TABLE 1  
OBTAINED TRANSMISSION RESULTS SENDING ALL COLLECTED ONBOARD VARIABLES TOGETHER

	Number of Signals	Number of principal components used	Coefficient correlation	Number of original data	Number of sent data	File space saved
All equipments together	182	18	0.95±0.08	8008	4250	46.9%

TABLE 2  
OBTAINED TRANSMISSION RESULTS SENDING EACH VESSEL SUBSYSTEM INDEPENDENTLY

		Number of Signals	Number of principal components used	Coefficient correlation	Number of original data	Number of sent data	File space saved
1	Main Turbine	34	6	0.95±0.11	1496	502	66.4%
2	Boiler Common A	4	4	1±0	176	196	-11.4%
3	Boiler Common B	3	2	1±0	132	97	26.5%
4	Boiler n°1	12	6	0.96±0.09	528	348	34.1%
5	Boiler n°2	12	7	0.95±0.11	528	404	23.5%
6	Turbo Generator No 1	12	2	0.97±0.04	528	124	76.5%
7	Turbo Generator No 2	12	3	0.99±0.02	528	180	65.9%
8	Diesel Generator	17	2	0.97±0.08	748	139	81.4%
9	Boiler Water Readings	4	4	1±0	176	196	-11.4%
10	Feed Cond. System	12	7	0.95±0.12	528	404	23.5%
11	Evaporators	2	2	1±0	88	94	-6.8%
12	Water Tanks	7	5	0.98±0.03	308	262	14.9%
13	Fuel Oil	18	9	0.95±0.08	792	576	27.3%
14	Marine Diesel Oil	3	3	1±0	132	144	-9.1%
15	Gas Oil	4	3	0.96±0.08	176	148	15.9%
16	Bilge and Sludges	2	2	1±0	88	94	-6.8%
17	Others	3	2	1±0.01	132	97	26.5%
18	LD Compressors	17	5	0.96±0.09	748	322	57.0%
19	Fridges - Air Conditioning	4	4	1±0	176	196	-11.6%
	<b>Total</b>	<b>182</b>			<b>8008</b>	<b>4523</b>	<b>43.5%</b>

## CONCLUSION

The software developed for transmission using PCA significantly reduces the amount of data sent via satellite, reducing time and cost of communication in case of transmission of all signals together. Alternatively, PCA technique may increase the number of samples sent for a defined time and cost.

For some subsystems of the ship, it is advantageous the transmission of their signals separately, bringing savings of 81.4% in the amount of data to send with very high mean correlation coefficient ( $r = 0.97 \pm 0.08$ ). For other subsystems, due a low correlation between variables, the PCA is not advantageous with regard to sending the raw data. The software should detect these situations and use the less cost way.

PCA compression strategy is appropriate for making onshore maintenance decisions about onboard equipment with a strong correlation between sampled signals as propulsion subsystem, generation plant, etc, reducing communication cost.

## ACKNOWLEDGMENTS

Our sincere thanks to the Castillo de Villalba ship crew and especially to D. Pablo Vegas, for his invaluable help.

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