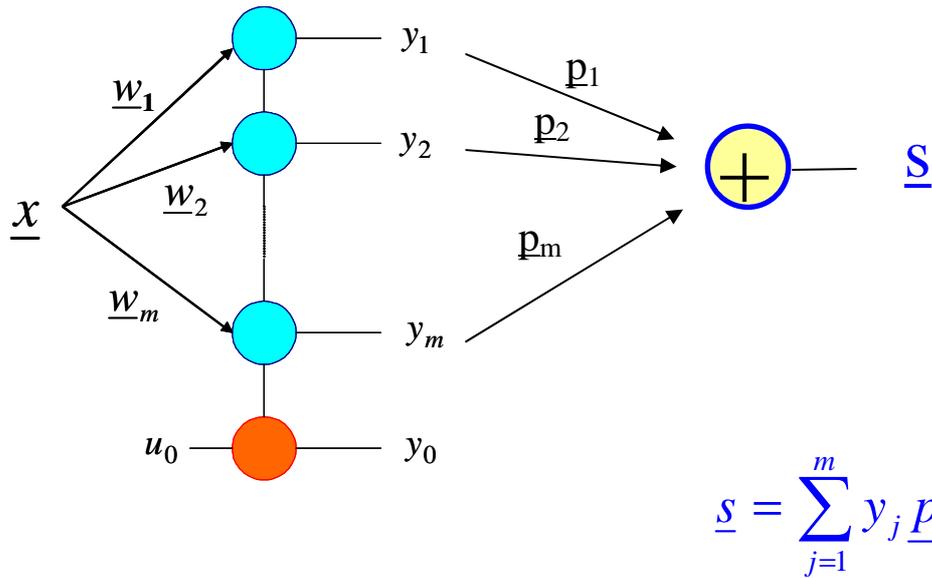


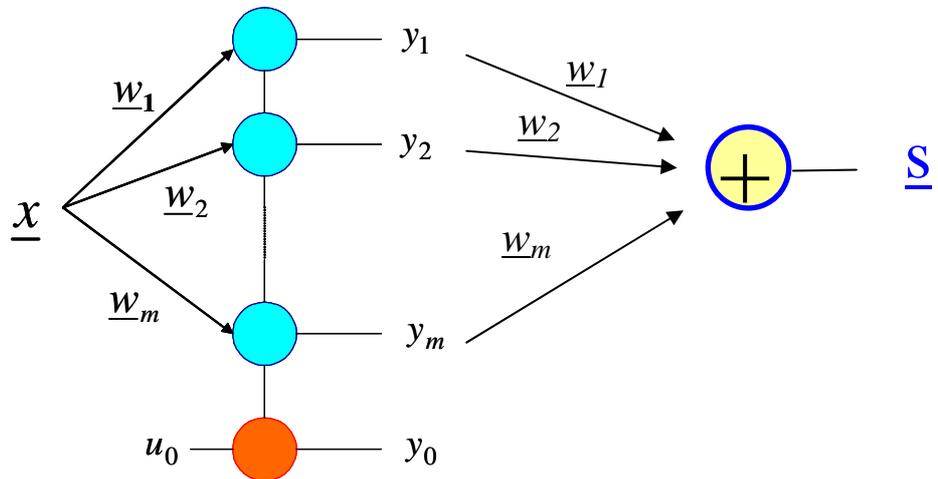
**Counterpropagation (tipo feedforward)**



**Memória hetero associativa**

$\underline{s} = \underline{p}_i \quad (y_i=1)$

Se  $\underline{p}_i = \underline{w}_i \quad \underline{x} = \underline{w}_i + \underline{r} \quad \Rightarrow \quad \underline{s} = \underline{w}_i$



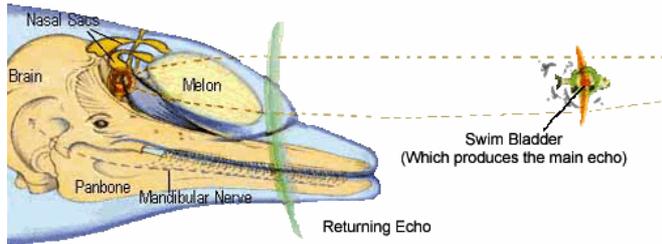
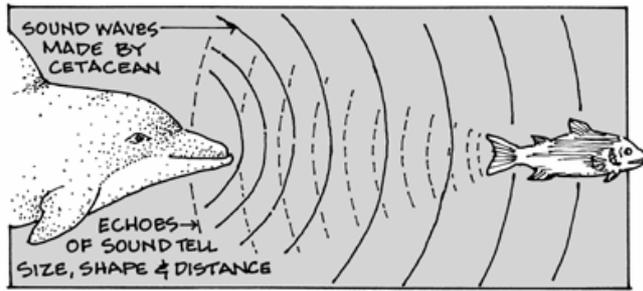
**Memória endereçável por conteúdo**

**Memória auto associativa**

**Filtragem não linear**

**Detecção de padrões desconhecidos**

## Ex 1: Dolphin Ecolocation



## Time to frequency patterns:

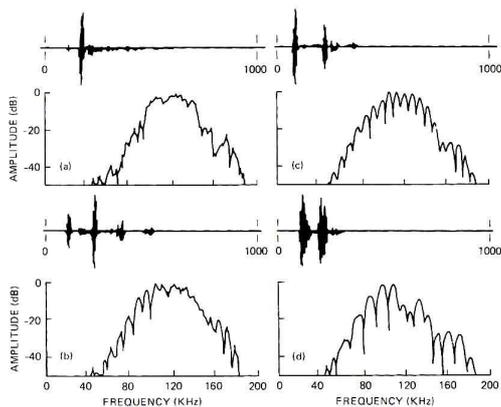
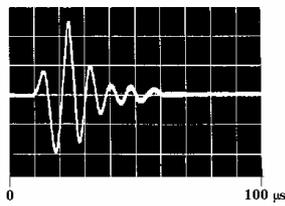
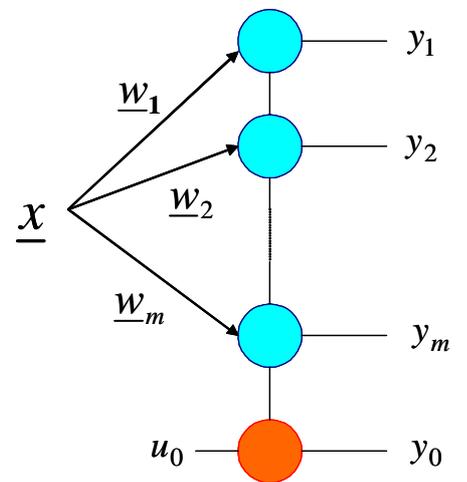
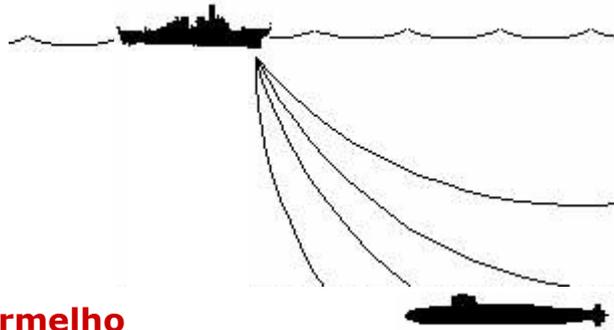


Figure 10-11. Amplitude display and Fourier transform for each item in the dolphin echolocation experiment. (From H. L. Roitblatt, et al. Dolphin Echolocation: Identification of returning echoes using a counterpropagation network. Proc. IJCNN. © 1989 IEEE.)



## Ex 2: Sonar Passivo

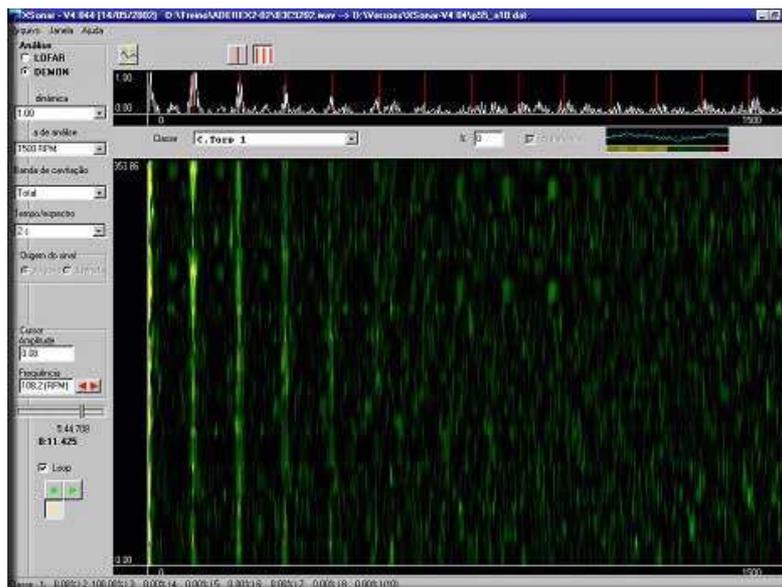


### A Caçada Ao Outubro Vermelho (The Hunt For Red October)



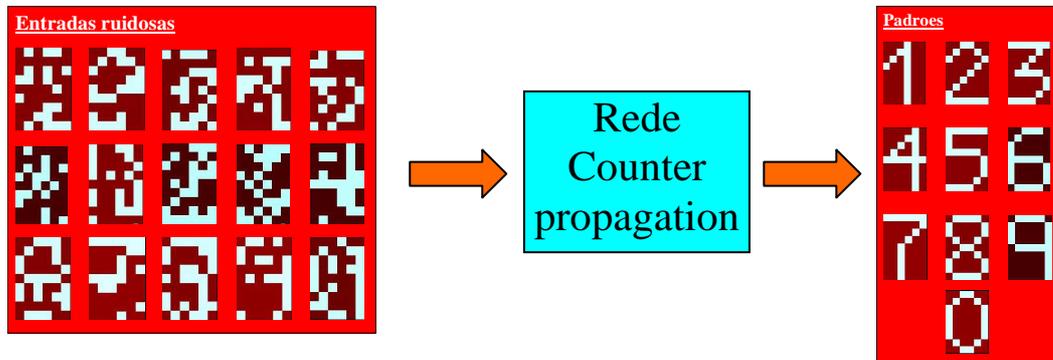
### Classificador de Contatos Sonar (IPqM / UFRJ):

Classificação de alvos via análises Lowfar e Demon do ruído irradiado utilizando-se **reconhecimento de padrões através de redes neurais**.



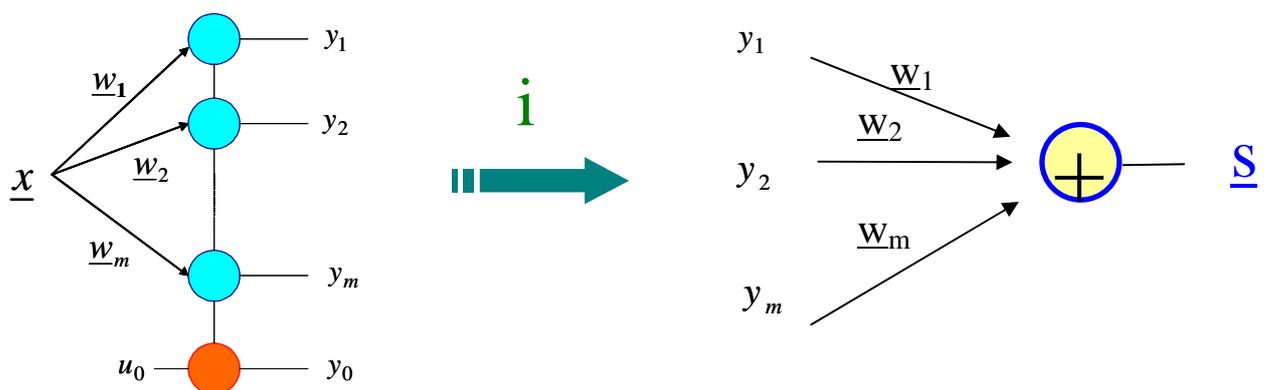
### Ex 3: OCR: Figuras com ruído

Obtenções de padrões a partir de sinais ruidosos:



### Compressão de informações

Compressão de imagens



## Imagem P&B

### BMP

1 quadro 4x4 pix = 16 pix

16 pix/quadro 8 bits/pix = 128 bits/quadro

### Compressao RN

1 quadro 4x4 pix

8 padroes/quadro 3 bits/padrao = 24 bits/quadro

Taxa de compressao:  $128/24 = 5.3 \text{ x}$

## Exemplo de Compressão

### Imagens original e comprimidas

(1x)



(11x)



(15x)



(28x)



## Efeito do codebook (compressão aprox 20x)

### codebook Lena



### codebook house

