

XIII. Number Theoretic Transform (NTT)

© 13-A Definition

◆ Number Theoretic Transform and Its Inverse

$$F(k) = \sum_{n=0}^{N-1} f(n) \alpha^{nk} \pmod{M}, k = 0, 1, 2, \dots, N-1$$

$$F(k) = \sum_{n=0}^{N-1} f(n) e^{-j \frac{2\pi}{N} nk}$$

$$f(n) = N^{-1} \sum_{k=0}^{N-1} F(k) \alpha^{-nk} \pmod{M}, n = 0, 1, 2, \dots, N-1 \quad f(n) \underset{INTT}{\overset{NTT}{\rightleftharpoons}} F(k)$$

Note :

(1) M is a **prime number**, \pmod{M} : 是指除以 M 的餘數

(2) N is a factor of $M-1$

(Note: when $N \neq 1$, N must be prime to M)

(3) N^{-1} is **an integer** that satisfies $(N^{-1})N \pmod{M} = 1$

(When $N = M-1$, $N^{-1} = M-1$)

(4) α is a root of unity of order N

$$\alpha^N = 1 \pmod{M}$$

$$\alpha^k \neq 1 \pmod{M}, k = 1, 2, \dots, N-1$$

When α satisfies the above equations and $N = M-1$, we call α the “primitive root”.

$$\begin{array}{l} \alpha^k \neq 1 \pmod{M} \quad \text{for } k = 1, 2, \dots, M-2 \\ \alpha^{M-1} = 1 \pmod{M} \end{array}$$

α^{-1} 的求法與 N^{-1} 相似

α^{-1} is an integer that satisfies $(\alpha^{-1})\alpha \pmod{M} = 1$

[Example 1]:

$$M = 5 \quad \alpha = 2 \quad \alpha^1 = 2 \pmod{5} \quad \alpha^2 = 4 \pmod{5} \quad \alpha^3 = 3 \pmod{5} \quad \alpha^4 = 1 \pmod{5}$$

(1) When $N = 4$

$$\begin{bmatrix} F[0] \\ F[1] \\ F[2] \\ F[3] \end{bmatrix} = \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & 2 & 4 & 3 \\ 1 & 4 & 1 & 4 \\ 1 & 3 & 4 & 2 \end{bmatrix} \begin{bmatrix} f[0] \\ f[1] \\ f[2] \\ f[3] \end{bmatrix}$$

$$\begin{aligned} &\langle (1, 2, 4, 3), (1, 4, 1, 4) \rangle \\ &= 1 + 8 + 4 + 12 = 25 \pmod{5} \\ &= 0 \pmod{5} \end{aligned}$$

(2) When $N = 2$ $\alpha = 4$

$$\begin{bmatrix} F[0] \\ F[1] \end{bmatrix} = \begin{bmatrix} 1 & 1 \\ 1 & 4 \end{bmatrix} \begin{bmatrix} f[0] \\ f[1] \end{bmatrix}$$

[Example 2]:

$M = 7$, $N = 6$: α cannot be 2 but can be 3.

$$\alpha = 2: \alpha^1 = 2 \pmod{7} \quad \alpha^2 = 4 \pmod{7} \quad \alpha^3 = 1 \pmod{7}$$

$$\alpha = 3: \alpha^1 = 3 \pmod{7} \quad \alpha^2 = 2 \pmod{7} \quad \alpha^3 = 6 \pmod{7}$$

$$\alpha^4 = 4 \pmod{7} \quad \alpha^5 = 5 \pmod{7} \quad \alpha^6 = 1 \pmod{7}$$

Advantages of the NTT:

Disadvantages of the NTT:

◎ 13-B 餘數的計算

(1) $x \pmod{M}$ 的值，必定為 $0 \sim M-1$ 之間

(2) $a + b \pmod{M} = \{a \pmod{M} + b \pmod{M}\} \pmod{M}$

例： $78 + 123 \pmod{5} = 3 + 3 \pmod{5} = 1$

$$(1,6) \quad 3306 \times 225 \pmod{11} = 7$$

(Proof): If $a = a_1M + a_2$ and $b = b_1M + b_2$, then

$$a + b = (a_1 + b_1)M + a_2 + b_2$$

$$772 \times 143 \pmod{7} = 2 \times 3 \pmod{7}$$

(3) $a \times b \pmod{M} = \{a \pmod{M} \times b \pmod{M}\} \pmod{M}$

$$= 6$$

例： $78 \times 123 \pmod{5} = 3 \times 3 \pmod{5} = 4$

(Proof): If $a = a_1M + a_2$ and $b = b_1M + b_2$, then

$$a \times b = (a_1b_1M + a_1b_2 + a_2b_1)M + a_2b_2$$

在 Number Theory 當中

只有 M^2 個可能的加法， M^2 個可能的乘法

可事先將加法和乘法的結果存在記憶體當中

需要時再“LUT”

LUT : lookup table

◎ 13-C Properties of Number Theoretic Transforms

P.1) Orthogonality Principle 跟FT很像

$$S_N = \sum_{n=0}^{N-1} \alpha^{nk} \alpha^{-n\ell} = \sum_{n=0}^{N-1} \alpha^{n(k-\ell)} = N \cdot \delta_{k,\ell}$$

proof : for $k = \ell$, $S_N = \sum_{n=0}^{N-1} \alpha^0 = N$

for $k \neq \ell$, $(\alpha^{k-\ell} - 1) S_N = (\alpha^{k-\ell} - 1) \sum_{n=0}^{N-1} \alpha^{n(k-\ell)} = \alpha^{N(k-\ell)} - 1 = 1 - 1 = 0$

$\because \alpha^{k-\ell} \neq 1 \quad \therefore S_N = 0$

P.2) The NTT and INTT are exact inverse 跟FT很像

proof :

$$\begin{aligned} g(n) &= \frac{1}{N} \sum_{k=0}^{N-1} F(k) \alpha^{-nk} = \frac{1}{N} \sum_{k=0}^{N-1} \left(\sum_{\ell=0}^{N-1} f(\ell) \alpha^{\ell k} \right) \alpha^{-nk} \\ &= \frac{1}{N} \sum_{\ell=0}^{N-1} f(\ell) \sum_{k=0}^{N-1} \alpha^{(\ell-n)k} = \frac{1}{N} \sum_{\ell=0}^{N-1} f(\ell) \cdot N \delta_{\ell,n} = f(n) \end{aligned}$$

P.3) Symmetry

$$f(n) = f(N-n) \quad \overset{\text{NTT}}{\Leftrightarrow} \quad F(k) = F(N-k)$$

$$f(n) = -f(N-n) \quad \overset{\text{NTT}}{\Leftrightarrow} \quad F(k) = -F(N-k)$$

P.4) INNT from NTT

$$f(n) = \frac{1}{N} \sum_{k=0}^{N-1} F(k) \alpha^{-nk} = \frac{1}{N} \sum_{(-k)=0}^{N-1} F(-k) \alpha^{nk} = \text{NTT of } \frac{1}{N} F(-k)$$

Algorithm for calculating the INNT from the NTT

(1) $F(-k)$: time reverse

$$F_0, F_1, F_2, \dots, F_{N-1} \xrightarrow[\text{reverse}]{\text{time}} F_0, F_{N-1}, \dots, F_2, F_1$$

(2) NTT[$F(-k)$]

(3) 乘上 $\frac{1}{N}$ = $M-1$

P.5) Shift Theorem

$$f(n + \ell) \leftrightarrow F(k) \alpha^{-\ell k}$$

$$f(n) \alpha^{n\ell} \leftrightarrow F(k + \ell)$$

P.6) Parseval's Theorem

$$N \sum_{n=0}^{N-1} f(n) f(-n) = \sum_{k=0}^{N-1} F^2(k)$$

$$N \sum_{n=0}^{N-1} f(n)^2 = \sum_{k=0}^{N-1} F(k) F(-k)$$

P.7) Linearity

$$a f(n) + b g(n) \leftrightarrow a F(k) + b G(k)$$

P.8) Reflection

$$\text{If } f(n) \leftrightarrow F(k) \quad \text{then } f(-n) \leftrightarrow F(-k)$$



P.9) Circular Convolution (the same as that of the DFT)

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$$\text{If } f(n) \leftrightarrow F(k)$$

$$g(n) \leftrightarrow G(k)$$

$$\text{then } f(n) \otimes g(n) \leftrightarrow F(k)G(k)$$

$$\text{i.e., } f(n) \otimes g(n) = INTT \{ NTT[f(n)] NTT[g(n)] \}$$

$$f(n) \cdot g(n) \leftrightarrow \frac{1}{N} F(k) \otimes G(k)$$

$$(\text{Proof}): INNT(NNT(f[n])NNT(g[n])) = N^{-1} \sum_{k=0}^{N-1} \alpha^{-nk} F(k)G(k)$$

$$= N^{-1} \sum_{k=0}^{N-1} \alpha^{-nk} \sum_{m=0}^{N-1} f[m] \alpha^{mk} \sum_{q=0}^{N-1} g[q] \alpha^{qk}$$

$$= \sum_{m=0}^{N-1} \sum_{q=0}^{N-1} f[m]g[q] N^{-1} \sum_{k=0}^{N-1} \alpha^{-nk} \alpha^{mk} \alpha^{qk}$$

$$= \sum_{m=0}^{N-1} \sum_{q=0}^{N-1} f[m]g[q] \delta[((m+q-n))_N]$$

$$= \sum_{m=0}^{N-1} \sum_{q=0}^{N-1} f[m]g[((n-m))_N] = f[n] \otimes g[n]$$

We apply the fact that

$$\sum_{k=0}^{N-1} \alpha^{nk} = \begin{cases} 1 & \text{if } n \text{ is a multiple of } N \\ 0 & \text{otherwise} \end{cases}$$

When $q = ((n-m))_N$
 $m+q-n$ is a multiple of N

© 13-D Efficient FFT-Like Structures for Calculating NTTs

- If N (transform length) is a power of 2, then the radix-2 FFT butterfly algorithm can be used for efficient calculation for NTT.

Decimation-in-time NTT

Decimation-in-frequency NTT

- The prime factor algorithm can also be applied for NTTs.

$$\begin{aligned}
F(k) &= \sum_{n=0}^{N-1} f(n) \alpha^{nk} = \sum_{r=0}^{\frac{N}{2}-1} f(2r) \alpha^{2rk} + \sum_{r=0}^{\frac{N}{2}-1} f(2r+1) \alpha^{(2r+1)k} \\
&= \sum_{r=0}^{\frac{N}{2}-1} f(2r) (\alpha^2)^{rk} + \alpha^k \sum_{r=0}^{\frac{N}{2}-1} f(2r+1) (\alpha^2)^{rk} \\
&= \begin{cases} G(k) + \alpha^k H(k) & , 0 \leq k \leq \frac{N}{2} - 1 \\ G(k - \frac{N}{2}) + \alpha^k H(k - \frac{N}{2}) & , \frac{N}{2} \leq k \leq N \end{cases}
\end{aligned}$$

where $G(k) = \sum_{r=0}^{N/2-1} f(2r) (\alpha^2)^{rk}$ $H(k) = \sum_{r=0}^{N/2-1} f(2r+1) (\alpha^2)^{rk}$

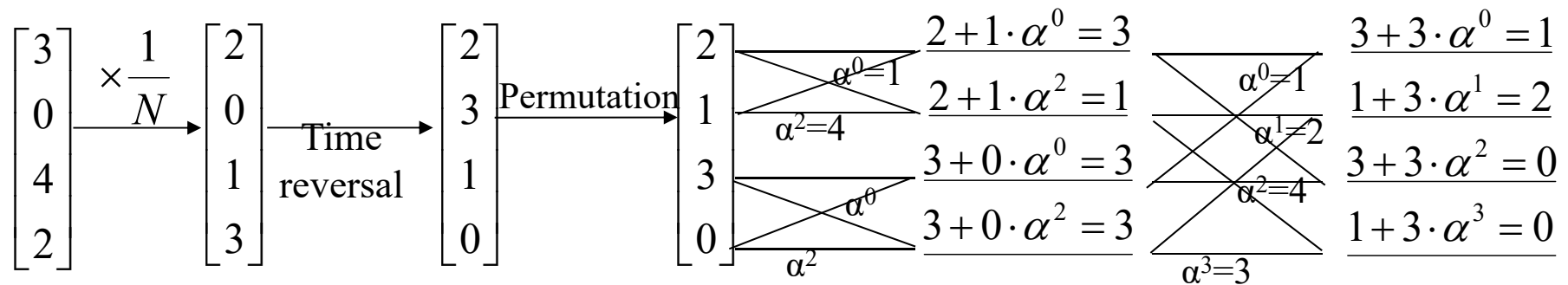
One N -point NTT \longrightarrow Two $(N/2)$ -point NTTs
plus twiddle factors

Original sequence $f(n) = (1, 2, 0, 0)$ $N = 4, M = 5$
 Permutation $(1, 0, 2, 0)$
 After the 1st stage $(1, 1, 2, 2)$
 After the 2nd stage $F(k) = (3, 0, 4, 2)$

$$\begin{bmatrix} 1 \\ 2 \\ 0 \\ 0 \end{bmatrix} \xrightarrow[\text{reversal}]{\text{Bit}} \begin{bmatrix} 1 \\ 0 \\ 2 \\ 0 \end{bmatrix} \xrightarrow{\begin{array}{c} \text{Stage 1} \\ \alpha^0=1 \\ \alpha^2=4 \end{array}} \begin{array}{l} \underline{1+0 \cdot \alpha^0 = 1} \\ \underline{1+0 \cdot \alpha^2 = 1} \\ \underline{2+0 \cdot \alpha^0 = 2} \\ \underline{2+0 \cdot \alpha^2 = 2} \end{array} \xrightarrow{\begin{array}{c} \text{Stage 2} \\ \alpha^0=1 \\ \alpha^1=2 \\ \alpha^2=4 \\ \alpha^3=3 \end{array}} \begin{array}{l} \underline{1+2 \cdot \alpha^0 = 3} \\ \underline{1+2 \cdot \alpha^1 = 5} \\ \underline{1+2 \cdot \alpha^2 = 9} \\ \underline{1+2 \cdot \alpha^3 = 17} \end{array} = \begin{bmatrix} 3 \\ 0 \\ 4 \\ 2 \end{bmatrix}$$

Inverse NTT by Forward NTT :

- 1) $1/N$
- 2) Time reversal
- 3) permutation
- 4) After first stage
- 5) After 2nd stage



◎ 13-E Convolution by NTT

假設 $x[n] = 0$ for $n < 0$ and $n \geq K$, $h[n] = 0$ for $n < 0$ and $n \geq H$

要計算 $x[n] * h[n] = z[n]$

且 $z[n]$ 的值可能的範圍是 $0 \leq z[n] < A$ (more general, $A_1 \leq z[n] < A_1 + T$)

(1) 選擇 M (the prime number for the modulus operator), 滿足

(a) M is a prime number, (b) $M \geq \max(H+K, A)$

(2) 選擇 N (NTT 的點數), 滿足

(a) N is a factor of $M-1$, (b) $N \geq H+K-1$

(3) 添 0:

$x_1[n] = x[n]$	for $n = 0, 1, \dots, K-1$,
$x_1[n] = 0$	for $n = K, K+1, \dots, N-1$
$h_1[n] = h[n]$	for $n = 0, 1, \dots, H-1$,
$h_1[n] = 0$	for $n = H, H+1, \dots, N-1$

$$(4) X_1[m] = \text{NTT}_{N,M}\{x_1[n]\}, \quad H_1[m] = \text{NTT}_{N,M}\{h_1[n]\}$$

$\text{NTT}_{N,M}$ 指 N -point 的 DFT (mod M)

$$(5) Z_1[m] = X_1[m]H_1[m], \quad z_1[n] = \text{INTT}_{N,M}\{Z_1[m]\},$$

$$(6) z[n] = z_1[n] \text{ for } n = 0, 1, \dots, H+K-1$$

(移去 $n = H+K, H+K+1, \dots, N-1$ 的點)

(More general, if we have estimated the range of $z[n]$ should be $A_1 \leq z[n] < A_1 + T$, then

$$z[n] = ((z_1[n] - A_1))_M + A_1$$

適用於 (1) $x[n]$, $h[n]$ 皆為整數

(2) $\text{Max}(z[n]) - \text{min}(z[n]) < M$ 的情形。

Consider the convolution of $(1, 2, 3, 0) * (1, 2, 3, 4)$

Choose $M = 17, N = 8$, 結果為：

• $\text{Max}(z[n]) - \text{min}(z[n])$ 的估測方法

假設 $x_1 \leq x[n] \leq x_2$, $z[n] = x[n] * h[n] = \sum_{m=0}^{H-1} h[m]x[n-m]$

則 $\text{Max}(z[n]) - \text{min}(z[n]) = (x_2 - x_1) \sum_{n=0}^{H-1} |h[n]|$

(Proof): $\text{Max}(z[n]) = \sum_{m=0}^{H-1} h_1[m]x_2 + \sum_{m=0}^{H-1} h_2[m]x_1$

where $h_1[m] = h[m]$ when $h[m] > 0$, $h_1[m] = 0$ otherwise

$h_2[m] = h[m]$ when $h[m] < 0$, $h_2[m] = 0$ otherwise

$$\text{min}(z[n]) = \sum_{m=0}^{H-1} h_1[m]x_1 + \sum_{m=0}^{H-1} h_2[m]x_2$$

$$\text{Max}(z[n]) - \text{min}(z[n]) = \sum_{m=0}^{H-1} h_1[m](x_2 - x_1) + \sum_{m=0}^{H-1} h_2[m](x_1 - x_2)$$

$$= (x_2 - x_1) \left\{ \sum_{m=0}^{H-1} h_1[m] - \sum_{m=0}^{H-1} h_2[m] \right\} = (x_2 - x_1) \sum_{m=0}^{H-1} |h[m]|$$

© 13-F Special Prime Numbers

Fermat Number : $M = 2^{2^p} + 1$

$$P = 0, 1, 2, 3, 4$$

$$M = 3, 5, 17, 257, 65537$$

$P \geq 5$ may not be prime.

Mersenne Number : $M = 2^p - 1$

$$P = 1, 2, 3, 5, 7, 13, 17, 19, \dots$$

$$M = 1, 3, 7, 31, 127, 8191, 131071, 524287, \dots$$

If $M = 2^p - 1$ is a prime number, p must be a prime number.

However, if p is a prime number, $M = 2^p - 1$ may not be a prime number.

The modulus operations for Mersenne and Fermat prime numbers are very easy for implementation.

$$2^k \pm 1$$

Example: 25 mod 7

$$\begin{array}{r}
 11 \\
 100a \overline{) 11001} \\
 \underline{100a} \\
 1011 \\
 \underline{100a} \\
 12 \\
 \downarrow \\
 100
 \end{array}
 \qquad a = -1$$

◎ 13-G Complex Number Theoretic Transform (CNT)

The integer field Z_M can be extended to complex integer field

If the following equation does not have a sol. in Z_M

$$x^2 = -1 \pmod{M} \quad \text{無解}$$

This means (-1) does not have a square root

When $M = 4k + 1$, there is a solution for $x^2 = -1 \pmod{M}$.

When $M = 4k + 3$, there is no solution for $x^2 = -1 \pmod{M}$.

For example, when $M = 13$, $8^2 = -1 \pmod{13}$.

$$2^1 = 2, \quad 2^2 = 4, \quad 2^3 = 8, \quad 2^4 = 3, \quad 2^5 = 6, \quad 2^6 = 12 = -1,$$

$$2^7 = 11, \quad 2^8 = 9, \quad 2^9 = 5, \quad 2^{10} = 10, \quad 2^{11} = 7, \quad 2^{12} = 1$$

When $M = 11$, there is no solution for $x^2 = -1 \pmod{M}$.

If there is no solution for $x^2 = -1 \pmod{M}$, we can define an imaginary number i such that

$$i^2 = -1 \pmod{M}$$

Then, “ i ” will play a similar role over finite field Z_M such that plays over the complex field.

$$(a + i b) \pm (c + i d) = (a \pm c) + i (b \pm d)$$

$$\begin{aligned} (a + i b) \cdot (c + i d) &= ac + i^2 bd + i bc + i ad \\ &= (ac - bd) + i (bc + ad) \end{aligned}$$

◎ 13-H Applications of the NTT

NTT 適合作 convolution

但是有不少的限制

新的應用： encryption (密碼學)

CDMA

References:

- (1) R. C. Agavard and C. S. Burrus, "Number theoretic transforms to implement fast digital convolution," *Proc. IEEE*, vol. 63, no. 4, pp. 550-560, Apr. 1975.
- (2) T. S. Reed & T. K. Truoay, "The use of finite field to compute convolution," *IEEE Trans. Info. Theory*, vol. IT-21, pp.208-213, March 1975
- (3) E. Vegh and L. M. Leibowitz, "Fast complex convolution in finite rings," *IEEE Trans ASSP*, vol. 24, no. 4, pp. 343-344, Aug. 1976.
- (4) J. H. McClellan and C. M. Rader, *Number Theory in Digital Signal Processing*, Prentice-Hall, New Jersey, 1979.
- (5) 華羅庚, "數論導引," 凡異出版社, 1997。

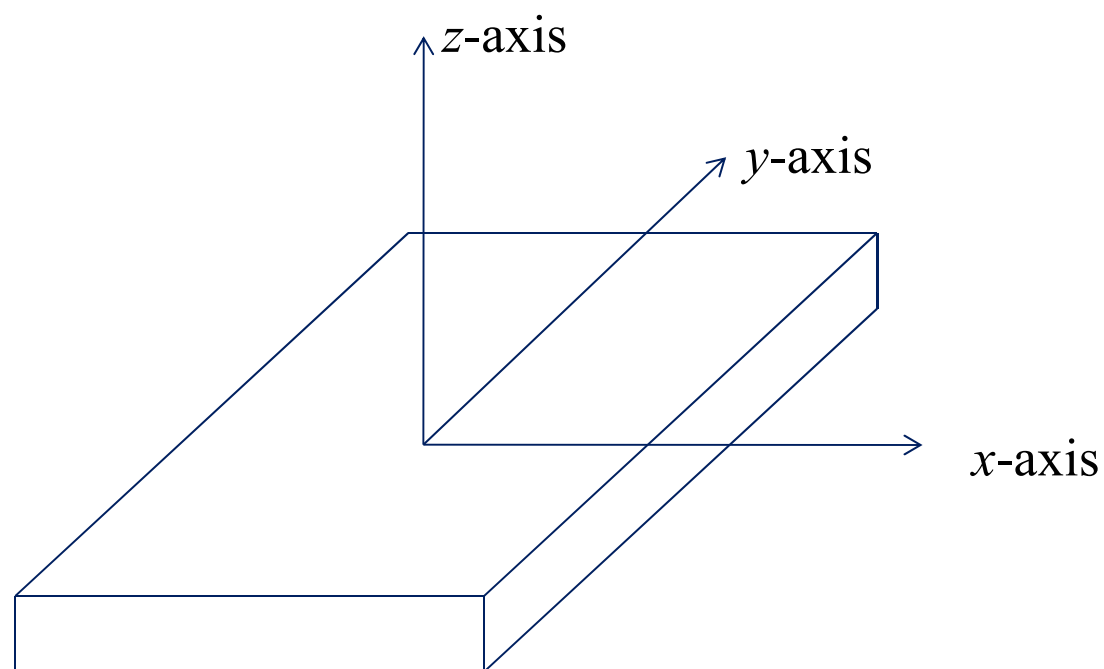
附錄十五 3-D Accelerometer 的簡介

3-D Accelerometer: 三軸加速器，或稱作加速規

許多儀器(甚至包括智慧型手機)都有配置三軸加速器

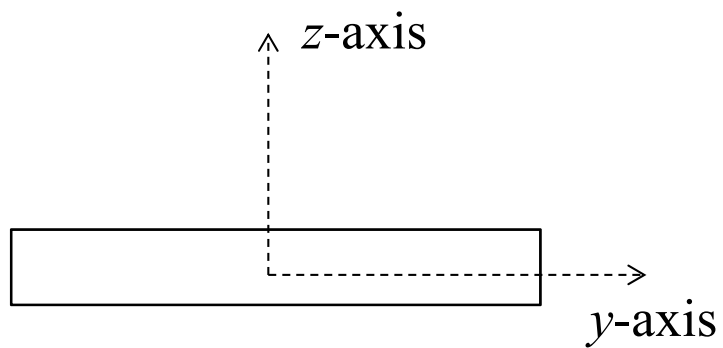
可以用來判別一個人的姿勢和動作

註：**Gyrator** (陀螺儀)可以用來量測物體旋轉之方向，可補 3-D Accelerometer 之不足，許多儀器(包括智慧型手機)也內建陀螺儀之裝置，3-D Accelerometer Signal Processing 和 gyration signal processing 經常並用



根據 x, y, z 三個軸的加速度的變化，來判斷姿勢和動作

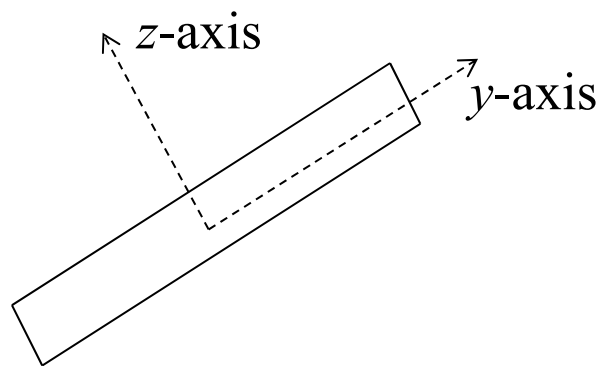
平放且靜止時， z -axis 的加速度為 $-g = -9.8$



$$y: 0$$

$$z: -9.8$$

tilted by θ



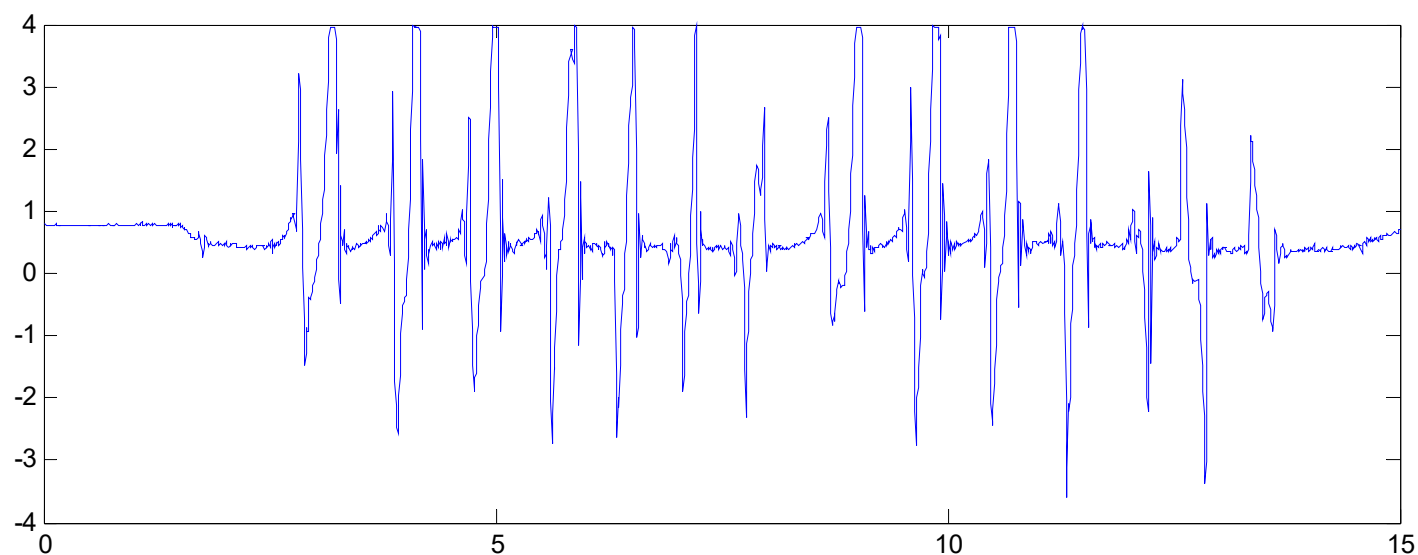
$$y: -9.8 \sin \theta$$

$$z: -9.8 \cos \theta$$

可藉由加速規傾斜的角度，來判斷姿勢和動作

例子：若將加速規放在腳上.....

走路時，沿著其中一個軸的加速度變化



應用： 動作辨別

運動 (訓練，計步器)

醫療復健，如 Parkinson 患者照顧，傷患復原情形

其他 (如動物的動作，機器的運轉情形的偵測)

3-D Accelerometer Signal Processing 是訊號處理的重要課題之一

一方面固然是因為應用多，另一方面， 3-D Accelerometer Signal 容易受 noise 之干擾，要如何藉由 3-D Accelerometer Signal 來還原動作以及移動速度，仍是個挑戰

XIV. Walsh Transform (Hadamard Transform)

© 14-A Ideas of Walsh Transforms

- 8-point Walsh transform

DFT
 $e^{-j\frac{2\pi}{N}mn}$

$$W[m,n] = \begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 \\ 1 & 1 & -1 & -1 & -1 & -1 & 1 & 1 \\ 1 & 1 & -1 & -1 & 1 & 1 & -1 & -1 \\ 1 & -1 & -1 & 1 & 1 & -1 & -1 & 1 \\ 1 & -1 & -1 & 1 & -1 & 1 & 1 & -1 \\ 1 & -1 & 1 & -1 & -1 & 1 & -1 & 1 \\ 1 & -1 & 1 & -1 & 1 & -1 & 1 & -1 \end{bmatrix} \begin{matrix} m \\ 0 \\ 1 \\ 2 \\ 3 \\ 4 \\ 5 \\ 6 \\ 7 \end{matrix}$$

zero-crossings = m

↑ 低頻

↓ 高頻

- Advantages of the Walsh transform:

- (1) Real
- (2) No multiplication is required
- (3) Some properties are similar to those of the DFT

- Forward and inverse Walsh transforms are similar.

$$\text{forward: } F[m] = \sum_{n=0}^{N-1} f[n]W[m,n], \quad \text{inverse: } f[m] = \frac{1}{N} \sum_{n=0}^{N-1} W[m,n]F[n]$$

- Alternative names of the Walsh transform:

Hadamard transform, Walsh-Hadamard transform

- Orthogonal Property $\sum_{n=0}^{N-1} W[m_0,n]W[m_1,n] = 0$ if $m_0 \neq m_1$ $\sum_{n=0}^{N-1} W[m,n]W[m,n] = N$
- Zero-Crossing Property
- Even / Odd Property
- Fast Algorithm

Useful for spectrum analysis

Sometimes also useful for implementing the convolution

Walsh transform 和 DFT, DCT 有許多相似處

$$W[m, n] = \begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 \\ 1 & 1 & -1 & -1 & -1 & -1 & 1 & 1 \\ 1 & 1 & -1 & -1 & 1 & 1 & -1 & -1 \\ 1 & -1 & -1 & 1 & 1 & -1 & -1 & 1 \\ 1 & -1 & -1 & 1 & -1 & 1 & 1 & -1 \\ 1 & -1 & 1 & -1 & -1 & 1 & -1 & 1 \\ 1 & -1 & 1 & -1 & 1 & -1 & 1 & -1 \end{bmatrix}, DFT[m, n] = \exp(-j2\pi m n/N),$$

$$\mathbf{DCT} = \begin{bmatrix} 1.0000 & 1.0000 & 1.0000 & 1.0000 & 1.0000 & 1.0000 & 1.0000 & 1.0000 \\ 1.3870 & 1.1759 & 0.7857 & 0.2759 & -0.2759 & -0.7857 & -1.1759 & -1.3870 \\ 1.3066 & 0.5412 & -0.5412 & -1.3066 & -1.3066 & -0.5412 & 0.5412 & 1.3066 \\ 1.1759 & -0.2759 & -1.3870 & -0.7857 & 0.7857 & 1.3870 & 0.2759 & -1.1759 \\ 1.0000 & -1.0000 & -1.0000 & 1.0000 & 1.0000 & -1.0000 & -1.0000 & 1.0000 \\ 0.7857 & -1.3870 & 0.2759 & 1.1759 & -1.1759 & -0.2759 & 1.3870 & -0.7857 \\ 0.5412 & -1.3066 & 1.3066 & -0.5412 & -0.5412 & 1.3066 & -1.3066 & 0.5412 \\ 0.2759 & -0.7857 & 1.1759 & -1.3870 & 1.3870 & -1.1759 & 0.7857 & -0.2759 \end{bmatrix}$$

References for Walsh Transforms

- [1] K. G. Beanchamp, *Walsh Functions and Their Applications*, Academic Press, New York, 1975.
- [2] B. I. Golubov, A. Efimov, and V. Skvortsov, *Walsh Series and Transforms: Theory and Applications*, Kluwer Academic Publishers, Boston, 1991.
- [3] H. F. Harmuth, “Applications of Walsh functions in communications,” *IEEE Spectrum*, vol. 6, no. 11, pp. 82-91, Nov. 1969.
- [4] H. F. Harmuth, *Transmission of Information by Orthogonal Functions*, Springer-Verlag, New York, 1972.

© 14-B Generate the Walsh Transform

2-point Walsh transform

$$e^{-j\frac{2\pi}{N}mn}$$

$$N=2$$

$$\mathbf{W}_2 = \begin{bmatrix} 1 & 1 \\ 1 & -1 \end{bmatrix}$$

$$e^{-j\pi mn}$$

$$=(-1)^{mn} \quad \mathbf{W}_2 = \text{butterfly} = \mathbf{F}_2$$

4-point Walsh transform

$$\mathbf{W}_4 = \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & 1 & -1 & -1 \\ 1 & -1 & -1 & 1 \\ 1 & -1 & 1 & -1 \end{bmatrix}$$

$$\mathbf{W}_4 \neq \mathbf{F}_4$$

$$\mathbf{F}_4 = \begin{bmatrix} & & & \\ & & & \\ & & & \\ & & & \end{bmatrix}$$

How do we obtain the 2^{k+1} -point Walsh transform from the 2^k -point Walsh transform ?

$$\text{Step 1} \quad \mathbf{V}_{2^{k+1}} = \begin{bmatrix} \mathbf{W}_{2^k} & \mathbf{W}_{2^k} \\ \mathbf{W}_{2^k} & -\mathbf{W}_{2^k} \end{bmatrix}$$

Step 2 根據 sign changes 將 rows 的順序重新排列

$$\mathbf{V}_{2^{k+1}} \xrightarrow{\text{permutation}} \mathbf{W}_{2^{k+1}}$$

已知 W_{2^k} 每個 row 的 sign change 數，由上到下分別為

$$0, 1, 2, 3, \dots, 2^k-1$$

則 $V_{2^{k+1}}$ 每個 row 的 sign change 數，由上到下分別為

$$0, 3, 4, 7, \dots, 2^{k+1}-1, 1, 2, 5, 6, \dots, 2^{k+1}-2,$$

若 row 的 index 由 0 開始

則 $V_{2^{k+1}}$ 第 n 個 row (n is even and $n < N/2$) 的 sign change 為 $2n$

(n is odd and $n < N/2$) 的 sign change 為 $2n + 1$

(n is even and $n \geq N/2$) 的 sign change 為 $2n+1-N$

(n is odd and $n \geq N/2$) 的 sign change 為 $2n-N$

要根據 sign change 的數目將 $V_{2^{k+1}}$ 的 row 重新排列

$$V_{2^{k+1}} \xrightarrow{\text{permutation}} W_{2^{k+1}}$$

$$\mathbf{W}_2 = \begin{bmatrix} 1 & 1 \\ 1 & -1 \end{bmatrix}$$

$$\mathbf{V}_4 = \begin{bmatrix} \mathbf{W}_2 & \mathbf{W}_2 \\ \mathbf{W}_2 & -\mathbf{W}_2 \end{bmatrix} = \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & \times & -1 & \times & 1 & \times & -1 \\ 1 & 1 & \times & -1 & -1 \\ 1 & \times & -1 & -1 & \times & 1 \end{bmatrix} \begin{matrix} 0 \\ 3 \\ 1 \\ 2 \end{matrix}$$

$$\mathbf{W}_4 = \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & 1 & -1 & -1 \\ 1 & -1 & -1 & 1 \\ 1 & -1 & 1 & -1 \end{bmatrix}$$

$$\mathbf{V}_8 = \begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & -1 & -1 & 1 & 1 & -1 & -1 \\ 1 & -1 & -1 & 1 & 1 & -1 & -1 & 1 \\ 1 & -1 & 1 & -1 & 1 & -1 & 1 & -1 \\ 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 \\ 1 & 1 & -1 & -1 & -1 & -1 & 1 & 1 \\ 1 & -1 & -1 & 1 & -1 & 1 & 1 & -1 \\ 1 & -1 & 1 & -1 & -1 & 1 & -1 & 1 \end{bmatrix} \begin{matrix} 0 \\ 3 \\ 4 \\ 7 \\ 1 \\ 2 \\ 5 \\ 6 \end{matrix}$$

Constraint for the number of points of the Walsh transform:

N must be a power of 2 (2, 4, 8, 16, 32,)

Although in Matlab it is possible to define the $12 \cdot 2^k$ point or the $20 \cdot 2^k$ point Walsh transform, the inverse transform require the floating-point operation.

hadamard (N)

© 14-C Alternative Forms of the Walsh Transform

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- Sequency ordering (i.e., Walsh ordering) using 標準定義 from zero-crossing for signal processing
- Dyadic ordering (i.e., Paley ordering) using for control
- Natural ordering (i.e., Hadamard ordering)using for mathematics

Sequency ordering	Dyadic ordering	Natural ordering	$W[m, n]$
	←→(Gray Code) ←→	→(Bit Reversal)	
row 0 =	row 0 =	row 0 =	[1, 1, 1, 1, 1, 1, 1, 1]
row 1 =	row 1 =	row 4 =	[1, 1, 1, 1, -1, -1, -1, -1]
row 2 =	row 3 =	row 6 =	[1, 1, -1, -1, -1, -1, 1, 1]
row 3 =	row 2 =	row 2 =	[1, 1, -1, -1, 1, 1, -1, -1]
row 4 =	row 6 =	row 3 =	[1, -1, -1, 1, 1, -1, -1, 1]
row 5 =	row 7 =	row 7 =	[1, -1, -1, 1, -1, 1, 1, -1]
row 6 =	row 5 =	row 5 =	[1, -1, 1, -1, -1, 1, -1, 1]
row 7 =	row 4 =	row 1 =	[1, -1, 1, -1, 1, -1, 1, -1]

- Dyadic ordering
Walsh transform

$$W[m,n] = \begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 \\ 1 & 1 & -1 & -1 & 1 & 1 & -1 & -1 \\ 1 & 1 & -1 & -1 & -1 & -1 & 1 & 1 \\ 1 & -1 & 1 & -1 & 1 & -1 & 1 & -1 \\ 1 & -1 & 1 & -1 & -1 & 1 & -1 & 1 \\ 1 & -1 & -1 & 1 & 1 & -1 & -1 & 1 \\ 1 & -1 & -1 & 1 & -1 & 1 & 1 & -1 \end{bmatrix}$$

- Natural ordering
Walsh transform

$$W[m,n] = \begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 1 & -1 & 1 & -1 & 1 & -1 & 1 & -1 \\ 1 & 1 & -1 & -1 & 1 & 1 & -1 & -1 \\ 1 & -1 & -1 & 1 & 1 & -1 & -1 & 1 \\ 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 \\ 1 & -1 & 1 & -1 & -1 & 1 & -1 & 1 \\ 1 & 1 & -1 & -1 & -1 & -1 & 1 & 1 \\ 1 & -1 & -1 & 1 & -1 & 1 & 1 & -1 \end{bmatrix}$$

- binary code $n = \sum_{p=1}^k b_p 2^{p-1}$ to gray code
When $N = 2^k$

$$g_k = b_k, \quad g_q = \text{XOR}(b_{q+1}, b_q) \quad \text{for } q = k-1, k-2, \dots, 1 \quad m = \sum_{q=1}^k g_q 2^{q-1}$$

- gray code to binary code

When $N = 2^k$

$$b_k = g_k, \quad b_q = \text{XOR}(b_{q+1}, g_q) \quad \text{for } q = k-1, k-2, \dots, 1$$

© 14-D Properties

(1) Orthogonal Property

(2) Zero-Crossing Property

(3) Even / Odd Property

(4) Linear Property

If $f[n] \Rightarrow F[m]$, $g[n] \Rightarrow G[m]$, (\Rightarrow means the Walsh transform)

then $a f[n] + b g[n] \Rightarrow a F[m] + b G[m]$

(5) Addition Property

$$W[m, n] \cdot W[l, n] = W[m \oplus l, n]$$

註： Addition modulo 2 (denoted by \oplus)

$$0 \oplus 0 = 1 \oplus 1 = 0, \quad 0 \oplus 1 = 1 \oplus 0 = 1,$$

$$\left(\sum_{p=0}^k a_k 2^p\right) \oplus \left(\sum_{p=0}^k b_k 2^p\right) = \sum_{p=0}^k (a_k \oplus b_k) 2^p$$

Example:

$$\begin{array}{rcccc} & 3 & & 0 & 1 & 1 \\ \oplus & 7 & & 1 & 1 & 1 \\ \hline & 4 & & 1 & 0 & 0 \end{array}$$

, therefore $3 \oplus 7 = 4$

\oplus : logic addition
(similar to **XOR**)

$$0 \oplus 0 = 0$$

$$1 \oplus 1 = 0$$

$$0 \oplus 1 = 1 \oplus 0 = 1$$

(6) Special functions

$$\delta[n] = 1 \text{ when } n = 0, \quad \delta[n] = 0 \text{ when } n \neq 0$$

$$\delta[n] \Rightarrow 1, \quad 1 \Rightarrow N \cdot \delta[n]$$

(7) Shifting property

$$\text{If } f[n] \Rightarrow F[m], \text{ then } f[n \oplus k] \Rightarrow W(k, m) \cdot F[m]$$

(8) Modulation property

$$\text{If } f[n] \Rightarrow F[m], \text{ then } W(k, n) \cdot f[n] \Rightarrow F[m \oplus k]$$

(9) Parseval's Theorem

$$\text{If } f[n] \Rightarrow F[m],$$

$$\text{If } f[n] \Rightarrow F[m], \quad g[n] \Rightarrow G[m],$$

$$\sum_{n=0}^{N-1} |f[n]|^2 = \frac{1}{N} \sum_{m=0}^{N-1} |F[m]|^2, \quad \sum_{n=0}^{N-1} f[n]g[n] = \frac{1}{N} \sum_{m=0}^{N-1} F[m]G[m]$$

(10) Convolution Property

If $f[n] \Rightarrow F[m]$, $g[n] \Rightarrow G[m]$,

then $h[n] = f[n] \star g[n] \Rightarrow F[m] G[m]$

$$f[n] \star g[n] = W^{-1} (W(f[n]) W(g[n]))$$

W : Walsh transform

W^{-1} : inverse Walsh transform

\star means the “logical convolution”

$$h[n] = f[n] \star g[n] = \sum_{l=0}^{N-1} f[l] g[n \oplus l] = \sum_{l=0}^{N-1} f[n \oplus l] g[l]$$

logic addition

For example, when $N = 8$,

$$h[3] = f[0]g[3] + f[1]g[2] + f[2]g[1] + f[3]g[0] + f[4]g[7] + f[5]g[6] + f[6]g[5] + f[7]g[4]$$

$$h[2] = f[0]g[2] + f[1]g[3] + f[2]g[0] + f[3]g[1] + f[4]g[6] + f[5]g[7] + f[6]g[4] + f[7]g[5]$$

n=2

l=0

$$\begin{array}{r} 010 \\ 000 \\ \hline 010 \end{array}$$

l=1

$$\begin{array}{r} 010 \\ 001 \\ \hline 011 \end{array}$$

l=2

$$\begin{array}{r} 010 \\ 010 \\ \hline 000 \end{array}$$

l=3

$$\begin{array}{r} 010 \\ 011 \\ \hline 001 \end{array}$$

Comparison : In digital signal processing, we often use

linear convolution (standard form of convolution)

$$\sum_{l=0}^{N-1} f[l]g[n-l]$$

circular convolution

$$H[n] = \sum_{l=0}^{N-1} f[l]g[((n-l))_N]$$

$$IDFT_N \{ DFT_N[f[n]] DFT_N[g[n]] \} = \sum_{l=0}^{N-1} f[l]g[((n-l))_N]$$

For example, when $N = 8$,

$$H[3] = f[0]g[3] + f[1]g[2] + f[2]g[1] + f[3]g[0] + f[4]g[7] + f[5]g[6] + f[6]g[5] \\ + f[7]g[4]$$

$$H[2] = f[0]g[2] + f[1]g[1] + f[2]g[0] + f[3]g[7] + f[4]g[6] + f[5]g[5] + f[6]g[4]$$

$$n=2 \quad + f[7]g[3]$$

© 14-E Butterfly Fast Algorithm

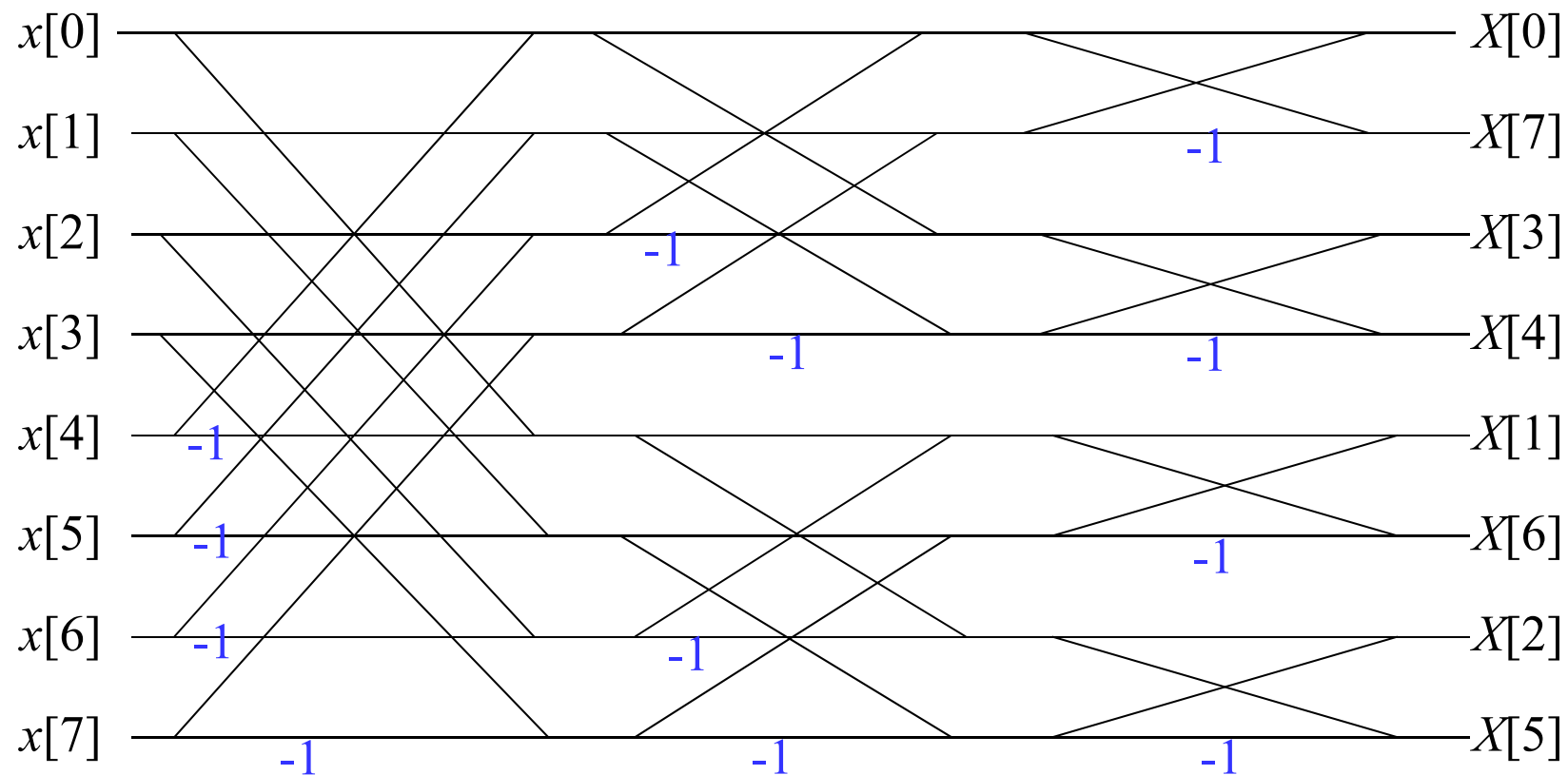
no twiddle factors

(Method 1) John L. Shark's Algorithm

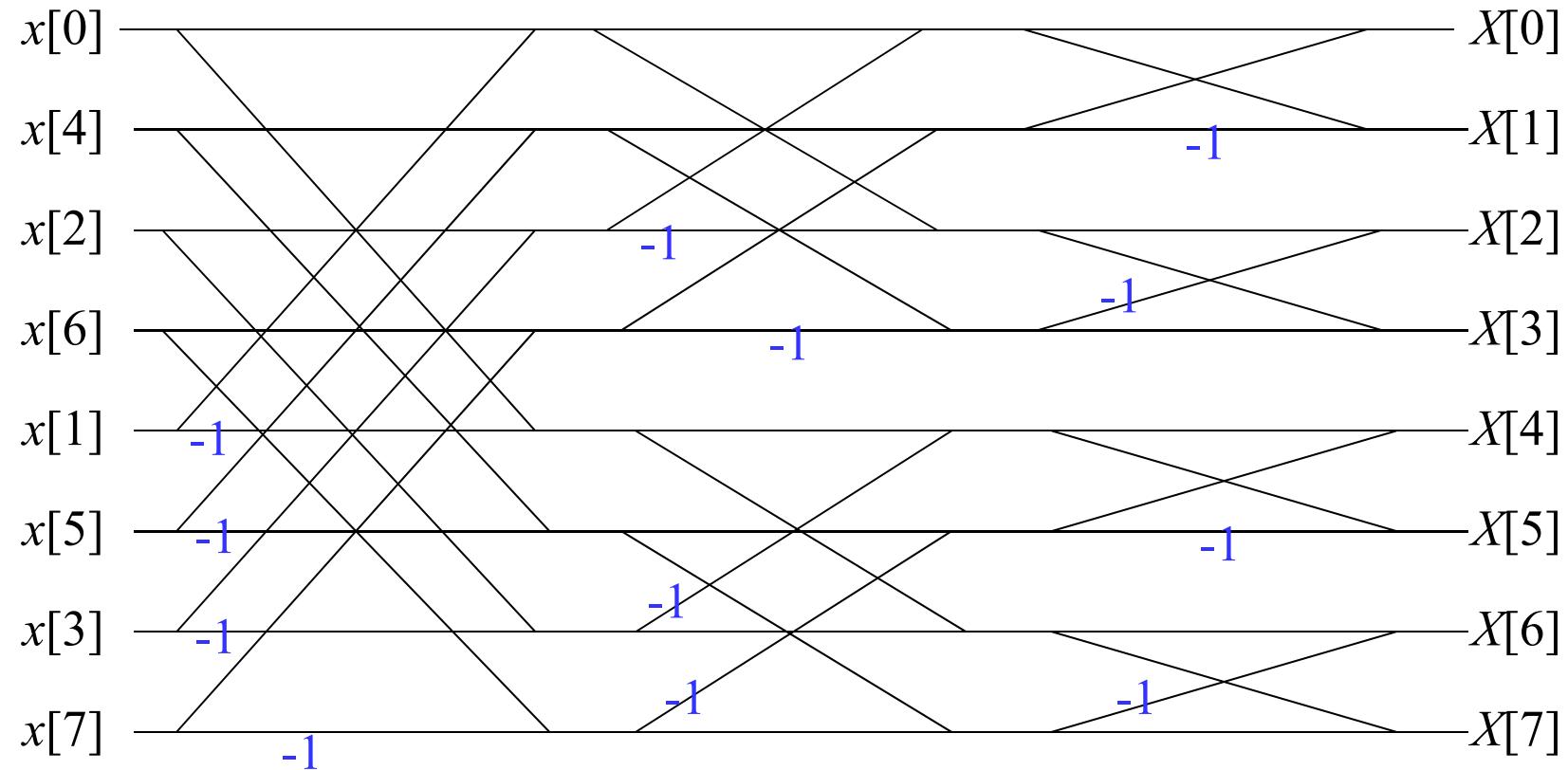
8點：3個stage

1個 stage：8個加法

3個stage 總共 24個加法



(Method 2) Manz's Sequence Algorithm



There are other fast implementation algorithm for the Walsh transform.

◎ 14-F Applications

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Walsh transform 適合作 spectrum analysis，但未必適合作 convolution

↓
may not be better than DFT, DCT

Applications of the Walsh transform

Bandwidth reduction

High resolution

Modulation and Multiplexing

Information coding

Feature extraction

ECG signal (in medical signal processing) analysis

心電圖
Hadamard spectrometer

Avoiding quantization error

stair-like



- The Walsh transform is suitable for the function that is a combination of Step functions

most important application
of the Walsh transform



New Applications: CDMA (code division multiple access)

◎ 14-G Jacket Transform

把部分的 1 用 $\pm 2^k$ 取代

4-point Jacket transform

$$\mathbf{J}_4 = \begin{bmatrix} 1 & x & x & 1 \\ 1 & w & -w & -1 \\ 1 & -x & -x & 1 \\ 1 & -w & w & -1 \end{bmatrix}$$

$$w = 2^k, \quad x = 2^h,$$

2nd row

$w = \frac{1}{2}$

$[1 \quad \frac{1}{2} \quad -\frac{1}{2} \quad -1]$

2^{k+1} -point Jacket

$$\mathbf{J}_{2^{k+1}} = \mathbf{P} \begin{bmatrix} \mathbf{J}_{2^k} & \mathbf{J}_{2^k} \\ \mathbf{J}_{2^k} & -\mathbf{J}_{2^k} \end{bmatrix}$$

\mathbf{P} : row permutation

4th row

$[1 \quad -\frac{1}{2} \quad \frac{1}{2} \quad -1]$

[Ref] M. H. Lee, "A new reverse Jacket transform and its fast algorithm," *IEEE Trans. Circuits Syst.-II*, vol. 47, pp. 39-46, 2000.

© 14-H Haar Transform

$$\mathbf{y} = \mathbf{H}\mathbf{x}$$

$$H_2 = W_2 = F_2$$

$$N=2 \quad \mathbf{H}_2 = \begin{bmatrix} 1 & 1 \\ 1 & -1 \end{bmatrix}$$

2 ADDs

$$N=4 \quad \mathbf{H}_4 = \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & 1 & -1 & -1 \\ 1 & -1 & 0 & 0 \\ 0 & 0 & 1 & -1 \end{bmatrix}$$

x: 1變-1

2+4=6 ADDs

$$\begin{bmatrix} y_1 \\ y_2 \end{bmatrix} = H_2 \begin{bmatrix} x_1 + x_2 \\ x_3 + x_4 \end{bmatrix}$$

$$y_3 = x_1 - x_2$$

$$y_4 = x_3 - x_4$$

$$N=8$$

$$\mathbf{H}_8 =$$

$$\begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 \\ 1 & 1 & -1 & -1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 & 1 & -1 & -1 \\ 1 & -1 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & -1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 & -1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 1 & -1 \end{bmatrix}$$

$$\begin{bmatrix} y_1 \\ y_2 \\ y_3 \\ y_4 \end{bmatrix} = H_4$$

$$\begin{bmatrix} x_1 + x_2 \\ x_3 + x_4 \\ x_5 + x_6 \\ x_7 + x_8 \end{bmatrix}$$

$$y_7 = x_5 - x_6, y_5 = x_1 - x_2$$

$$y_8 = x_7 - x_8, y_6 = x_3 - x_4$$

2nd ~ Nth rows

all has 1 zero crossing

$$6 + 8 = 14 \text{ ADDs}$$

↑
H₄

[Ref] H. F. Harmuth, *Transmission of Information by Orthogonal Functions*, Springer-Verlag, New York, 1972

$N = 16$

$N=32$, 13th row $[0 \dots 0 \underbrace{11-10}_{16\text{個}} \underbrace{12\text{個}0}_{12\text{個}} \dots 0]$

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$$\mathbf{H}_{16} = \begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 & -1 & -1 & -1 & -1 \\ 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 \\ 1 & 1 & -1 & -1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 & 1 & -1 & -1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 1 & -1 & -1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 1 & -1 & -1 \\ 1 & -1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & -1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 & -1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 1 & -1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & -1 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & -1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & -1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & -1 \end{bmatrix}$$

$N=32$

7th row?

18th row?

$H[m, n]$ 的值 ($m = 0, 1, \dots, 2^k-1, n = 0, 1, \dots, 2^k-1$) :

$$H[0, n] = 1 \text{ for all } n$$

If $2^h \leq m < 2^{h+1}$

$$H[m, n] = 1 \text{ for } (m - 2^h)2^{k-h} \leq n < (m - 2^h + 1/2)2^{k-h}$$

$$H[m, n] = -1 \text{ for } (m - 2^h + 1/2)2^{k-h} \leq n < (m - 2^h + 1)2^{k-h}$$

$$H[m, n] = 0 \text{ otherwise}$$

運算量比 Walsh transforms 更少

Applications: localized spectrum analysis, edge detection

AD 1972

Transforms	Running Time	terms required for NRMSE < 10^{-5}
DFT	9.5 sec	43
Walsh Transform	2.2 sec	65
Haar Transform	0.3 sec	128

Main Advantage of the Haar Transform

- (1) Fast (but this advantage is no longer important)
- (2) Analysis of the local high frequency component
(The wavelet transform is a generalization of the Haar transform)
- (3) Extracting local features
(Example: Adaboost face detection)

Haar \longrightarrow Wavelet transform

附錄十六 SCI Papers 查詢方式

我們經常聽到 SCI 論文，impact factor....那麼什麼是 SCI 和 impact factor？
什麼樣的論文是 SCI Papers? Impact factor 號如何查詢？

SCI 全名：Science Citation Index

(A) SCI 相關網站：ISI Web of Knowledge

連結至 ISI Web of Knowledge

<http://admin-apps.webofknowledge.com/JCR/JCR?RQ=HOME>

註：必需要在台大上網，或是在其他有付錢給 ISI 的學術單位上網，
才可以使用 ISI Web of Knowledge

(B) 在 **Go to Journal Profile**

輸入你想查詢的期刊 (完整名稱)

輸入

The screenshot shows the Clarivate Journal Citation Reports homepage. The header includes the Clarivate logo, navigation links for 'Journal Citation Reports', 'Browse journals', and 'Browse categories', and user options like 'My favorites', 'Sign In', and 'Register'. The main content area has a purple background with the text 'The world's leading journals and publisher-neutral data'. A search bar is prominently displayed in the center, containing the placeholder text 'Journal name, JCR abbreviation, ISSN, eISSN or category'. A red oval highlights the search bar, and a red arrow points to it from the Chinese text '輸入' (Input) above. Below the search bar, there is a section titled 'Already have a manuscript?' with a description and a 'Match my manuscript' button. A small help icon with the number '12' is visible in the bottom right corner.

若有搜尋到，則代表這個期刊是 SCI 期刊

並且會顯示出這個期刊的 impact factor

Impact Factor (影響係數)

The screenshot displays the journal profile for IEEE Transactions on Image Processing. The page is divided into several sections: Journal information, Publisher information, and Journal's performance. The Journal's performance section includes the Journal Impact Factor (JIF) for 2020, which is 10.856, highlighted by a red circle. Below this, there is a table showing the Journal Impact Factor trend for 2020, with a value of 9.662. The table also includes a link to view the calculation. The Journal Impact Factor contributing items section shows a list of articles, with the first article being 'FFDNet: Toward a Fast and Flexible Solution for CNN-Based Image Denoising'.

Journal Citation Reports Browse journals Browse categories

Home > Journal profile

JCR YEAR

2020

IEEE TRANSACTIONS ON IMAGE PROCESSING

ISSN
1057-7149

EISSN
1941-0042

JCR ABBREVIATION
IEEE T IMAGE PROCESS

ISO ABBREVIATION
IEEE Trans. Image Process.

Journal information

EDITION
Science Citation Index Expanded (SCIE)

CATEGORY
COMPUTER SCIENCE, ARTIFICIAL INTELLIGENCE - SCIE
ENGINEERING, ELECTRICAL & ELECTRONIC - SCIE

LANGUAGES
English

REGION
USA

1ST ELECTRONIC JCR YEAR
1997

Publisher information

PUBLISHER
IEEE-INST ELECTRICAL ELECTRONICS ENGINEERS INC

ADDRESS
445 HOES LANE, PISCATAWAY, NJ 08855-4141

PUBLICATION FREQUENCY
12 issues/year

Journal's performance

Journal Impact Factor

The Journal Impact Factor (JIF) is a journal-level metric calculated from data indexed in the Web of Science Core Collection. It should be used with careful attention to the many factors that influence citation rates, such as the volume of publication and citations characteristics of the subject area and type of journal. The Journal Impact Factor can complement expert opinion and inform of journal quality. In the context of academic evaluation for tenure, it is inappropriate to use a journal-level metric as a proxy measure for individual researchers, institutions, or articles. [Learn more](#)

2020 JOURNAL IMPACT FACTOR

10.856

[View calculation](#)

JOURNAL IMPACT FACTOR WITHOUT SELF CITATIONS

9.662

[View calculation](#)

Journal Impact Factor contributing items

[Export](#)

Citable Items (914)		Citing Sources (900)
TITLE	CITATION COUNT	
FFDNet: Toward a Fast and Flexible Solution for CNN-Based Image Denoising	133	

[Export](#)

(C) 關於 impact factor (影響係數)：

若一個 journal 裡面的文章，被別人引用的次數越多，則這個 journal 的 impact factor 越高

一般而言，impact factor 在 3.5 以上的 journals，已經算是高水準的期刊

中等水準的期刊的 impact factors 在 1.5 到 3.5 之間

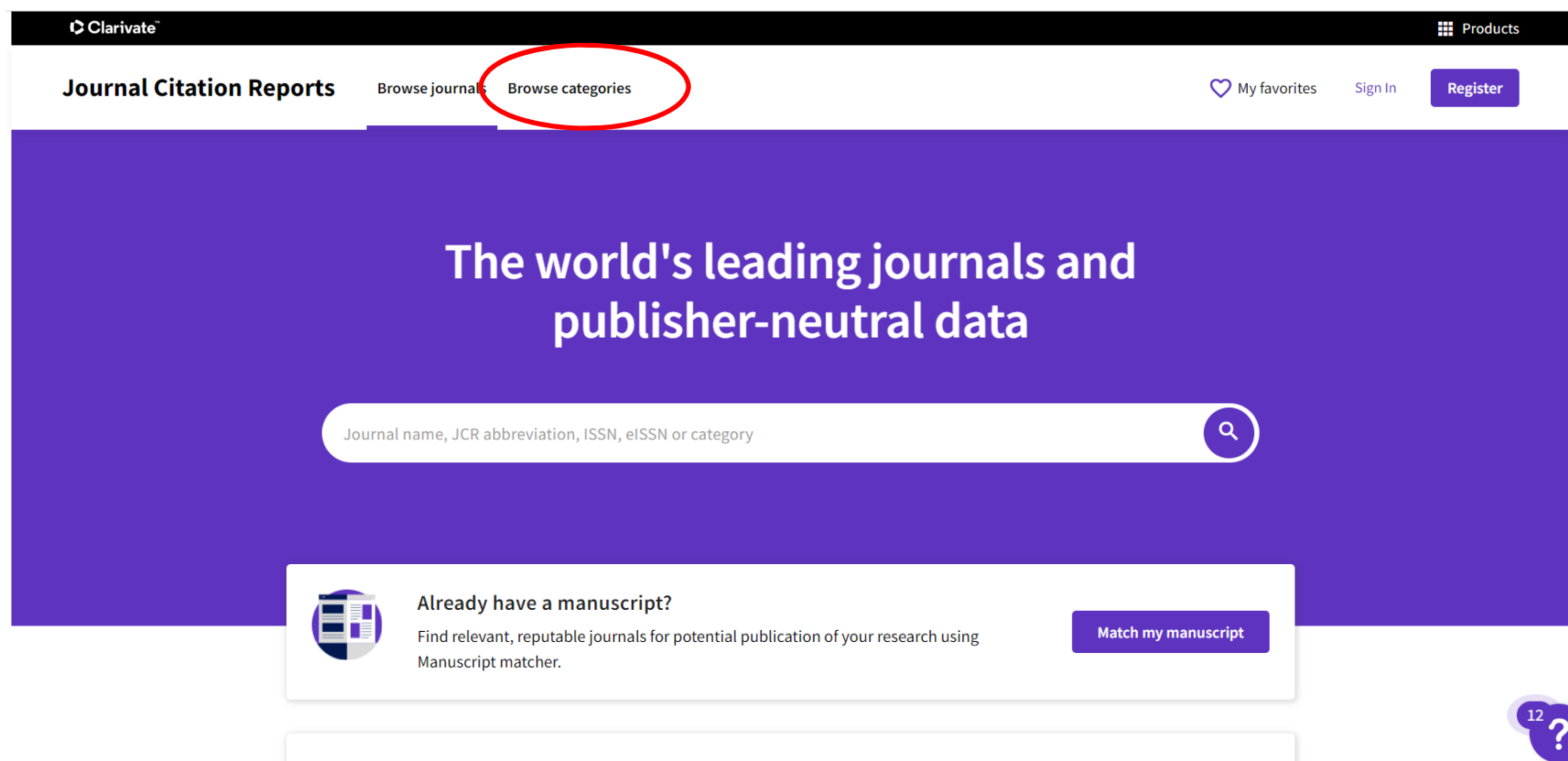
Nature 的 impact factor 為 49.962

Science 的 impact factor 為 47.728





IEEE 系列的期刊的 impact factors 通常在 2 到 13 之間

(D) 要查詢一個領域有哪些 SCI journals

連結至 ISI Web of Knowledge 之後，點選「Browse Category」



再選擇要查詢的 category，如

	NUMBER OF CATEGORIES	NUMBER OF JOURNALS	NUMBER OF CITABLE ITEMS	
 Economics & Business	21	3,188	239,113	
 Engineering	41	3,387	722,757	
Covers multiple subspecialties of engineering in a variety of industries.				
AGRICULTURAL ENGINEERING				
AUTOMATION & CONTROL SYSTEMS				
CONSTRUCTION & BUILDING TECHNOLOGY				
ENGINEERING, AEROSPACE				
ENGINEERING, BIOMEDICAL				
ENGINEERING, CHEMICAL				
ENGINEERING, CIVIL				
ENGINEERING, ELECTRICAL & ELECTRONIC				
ENGINEERING, ENVIRONMENTAL				
ENGINEERING, GEOLOGICAL				
ENGINEERING, INDUSTRIAL				
ENGINEERING, MANUFACTURING				

(E) EI (Engineering Village)

官方網站： www.engineeringvillage.org

<http://www.engineeringvillage.com/search/quick.url>

查詢期刊或研討會是否為 EI

<http://tul.blog.ntu.edu.tw/archives/4627>

(F) SSCI (Social Science Citation Index)

比較偏向於社會科學

<http://www.thomsonscientific.com/cgi-bin/jrnlst/jloptions.cgi?PC=J>

(G) Conference 排名

Microsoft Academic Search 有列出各領域知名的 conferences 並加以排名
(大致上也是被引用越多的排名越前面)

和通訊與信號處理相關的 conferences，大多排名於

<http://academic.research.microsoft.com/RankList?entitytype=3&topDomainID=2&subDomainID=0&last=0&start=1&end=100>

或

<http://academic.research.microsoft.com/RankList?entitytype=3&topDomainID=8&subDomainID=0&last=0&start=1&end=100>

(H) H Index

論文除了量以外，也要注意 citation 的次數

將發表的論文的 citation 次數從高到低做排序

如果排名第 N 名的論文 citation 數量大於等於 N

但是排名第 $N+1$ 名的論文 citation 數量小於等於 $N+1$

則 $H \text{ index} = N$

Example: 假設有一個學者發表了10篇論文， citation 由多到少分別為

33, 24, 18, 13, 9, 7, 4, 3, 1, 1

則這個學者的 H-index 為 6

寫論文和投稿的經驗談

研究生經常會寫論文並且投稿。要如何讓論文投稿之後能夠順利的被接受，相信是同學們所期盼的，畢竟每篇論文都是大家花了不少時間的心血結晶，若論文能夠順利的被接受，也代表了自己的成果總算獲得了肯定。然而，影響論文是否被接受的因素很多，一個好的研究成果，還是配合好的編寫技巧，才可以被一流的期刊或研討會所接受。以下是個人關於論文編寫與投稿的經驗談：

(1) 你的論文的「賣點」(優點)是什麼？人家有沒有辦法一眼看得出來你論文的「賣點」？

寫論文其實就是在推銷商品，而所謂的「商品」，就是你的「研究成果」。要說服人家接受你的商品，首先就是要強調你的商品的「賣點」。

(2) 和既有的方法的比較是否足夠？

要證明你所提出的方法是有效的，最好的方式，就是和既有的方法相比較，而且比較的對象越多越好，越新越好。

- (3) 和前人的方法相比，你的方法**創新**的地方在何處？審稿者是否能看得出來你論文創新的地方？
- (4) 就算你的文章和理論相關，最好也多提出實際應用的例子
- (5) 參考資料越多越好，越新越好
(在研究一個領域時，論文 survey 的量要足夠)
- (6) Previous work (前人已經提出的概念) 精簡介紹即可，多強調自己的貢獻。Introduction 加上 Previous work 最好不要超過一篇論文的四分之一
- (7) 英文表達能力要有一定的水準

(8) 可以多用數學式和圖來解釋概念，有時會比文字還清楚

通常東方人英文表達能力有限。審稿者經常會看你們的圖表和數學式(而非文字)來判斷你們論文的品質

(9) 同樣的道理，可以用「條列式」的方式來取代一大段文字來描述方法的觀念、流程、或優點

(10) 可以用 Conference 的期限來要求自己多寫研討會論文，之後再陸續改成期刊論文投稿，如此一年的論文量將很可觀

(11) 多注意格式，不同的期刊或研討會，對格式的要求也不同

(12) 最後，問自己一個問題：

如果你是審稿者，你會滿意你寫的這一篇論文嗎？

若答案是肯定的再投稿

XV. Orthogonal Transform and Multiplexing

© 15-A Orthogonal and Dual Orthogonal

Any $M \times N$ discrete linear transform can be expressed as the matrix form:

$$\underbrace{\begin{bmatrix} y[0] \\ y[1] \\ y[2] \\ \vdots \\ y[M-1] \end{bmatrix}}_{\mathbf{Y}} = \underbrace{\begin{bmatrix} \phi_0^*[0] & \phi_0^*[1] & \phi_0^*[2] & \cdots & \phi_0^*[N-1] \\ \phi_1^*[0] & \phi_1^*[1] & \phi_1^*[2] & \cdots & \phi_1^*[N-1] \\ \phi_2^*[0] & \phi_2^*[1] & \phi_2^*[2] & \cdots & \phi_2^*[N-1] \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ \phi_{M-1}^*[0] & \phi_{M-1}^*[1] & \phi_{M-1}^*[2] & \cdots & \phi_{M-1}^*[N-1] \end{bmatrix}}_{\mathbf{A}} \underbrace{\begin{bmatrix} x[0] \\ x[1] \\ x[2] \\ \vdots \\ x[N-1] \end{bmatrix}}_{\mathbf{X}}$$

$$y[m] = \langle x[n], \phi_m[n] \rangle = \sum_{n=0}^{N-1} x[n] \phi_m^*[n]$$

\uparrow
 inner product

Orthogonal: $\langle \phi_k[n], \phi_h[n] \rangle = \sum_{n=0}^{N-1} \phi_k[n] \phi_h^*[n] = 0$ **when $k \neq h$**

orthogonal transforms 的例子：

- discrete Fourier transform
- discrete cosine, sine, Hartley transforms
- Walsh Transform, Haar Transform
- discrete Legendre transform
- discrete orthogonal polynomial transforms

Hahn, Meixner, Krawtchouk, Charlier

為什麼在信號處理上，我們經常用 orthogonal transform?

Orthogonal transform 最大的好處何在？

In communication, the basis $\phi_k[n]$ is used to transmit the data in the k^{th} channel

$$y[n] = x_1 \phi_1[n] + x_2 \phi_2[n] + \dots + x_N \phi_N[n]$$

to retrieve x_1

$$\langle y[n], \phi_1[n] \rangle = x_1 \langle \phi_1[n], \phi_1[n] \rangle + x_2 \langle \phi_2[n], \phi_1[n] \rangle + \dots + x_N \langle \phi_N[n], \phi_1[n] \rangle$$

$$x_1 = \frac{\langle y[n], \phi_1[n] \rangle}{\langle \phi_1[n], \phi_1[n] \rangle}$$

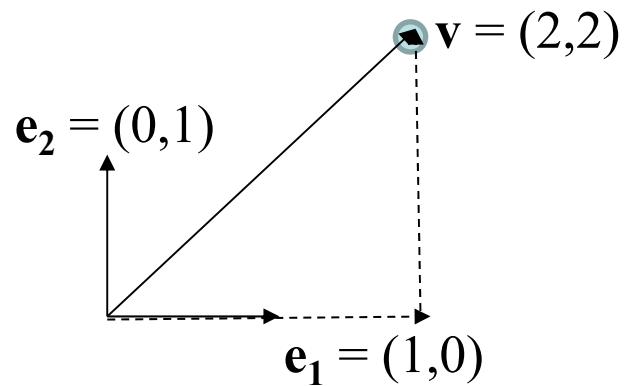
$$\text{for CDMA } x_k = \frac{\langle y[n], w_k[n] \rangle}{N}$$

$w_k[n]$ is the k^{th} row of the N -point Walsh matrix

如果是orthogonal 要還原訊號時，
不同channel 傳送的東西就不會互相
干擾，比較能夠簡單還原

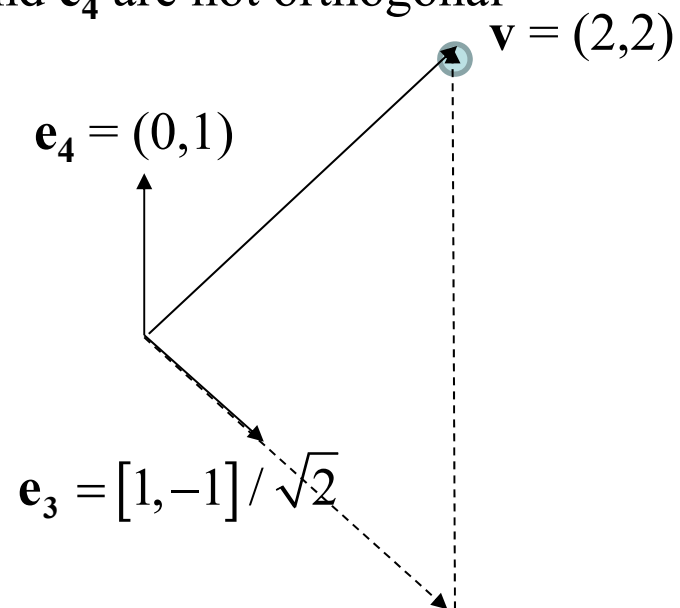
在壓縮部分，如果是orthogonal，記憶體用的越多，誤差就越少

\mathbf{e}_1 and \mathbf{e}_2 are orthogonal



$$\mathbf{v} = 2\mathbf{e}_1 + 2\mathbf{e}_2$$

\mathbf{e}_3 and \mathbf{e}_4 are not orthogonal



$$\mathbf{v} = 2\sqrt{2}\mathbf{e}_3 + 4\mathbf{e}_4$$

- If partial terms are used for reconstruction

for orthogonal case,

perfect reconstruction: $x[n] = \sum_{m=0}^{N-1} C_m^{-1} y[m] \phi_m[n]$

partial reconstruction: $x_K[n] = \sum_{m=0}^{K-1} C_m^{-1} y[m] \phi_m[n] \quad K < N$

reconstruction error of partial reconstruction

$$\begin{aligned}
 \|x[n] - x_K[n]\|^2 &= \sum_{n=0}^{N-1} \left\| \sum_{m=K}^{N-1} C_m^{-1} y[m] \phi_m[n] \right\|^2 \\
 &= \sum_{n=0}^{N-1} \sum_{m=K}^{N-1} C_m^{-1} y[m] \phi_m[n] \sum_{m_1=K}^{N-1} C_{m_1}^{-1} y^*[m_1] \phi_{m_1}^*[n] \\
 &= \sum_{m=K}^{N-1} \sum_{m_1=K}^{N-1} C_m^{-1} y[m] C_{m_1}^{-1} y^*[m_1] \sum_{n=0}^{N-1} \phi_m[n] \phi_{m_1}^*[n] \\
 &= \sum_{m=K}^{N-1} \sum_{m_1=K}^{N-1} C_m^{-1} y[m] C_{m_1}^{-1} y^*[m_1] C_m \delta[m - m_1] = \sum_{m=K}^{N-1} C_m^{-1} |y[m]|^2
 \end{aligned}$$

由於 $C_m^{-1} |y[m]|^2$ 一定是正的，可以保證 K 越大, reconstruction error 越小

For non-orthogonal case,

perfect reconstruction: $x[n] = \sum_{m=0}^{N-1} B[n, m] y[m] \quad \mathbf{B} = \mathbf{A}^{-1}$

partial reconstruction: $x_K[n] = \sum_{m=0}^{K-1} B[n, m] y[m] \quad K < N$

reconstruction error of partial reconstruction

$$\begin{aligned} \|x[n] - x_K[n]\|^2 &= \sum_{n=0}^{N-1} \left\| \sum_{m=K}^{N-1} B[n, m] y[m] \right\|^2 \\ &= \sum_{n=0}^{N-1} \sum_{m=K}^{N-1} B[n, m] y[m] \sum_{m_1=K}^{N-1} B^*[n, m_1] y^*[m_1] \\ &= \sum_{m=K}^{N-1} \sum_{m_1=K}^{N-1} y[m] y^*[m_1] \sum_{n=0}^{N-1} B[n, m] B^*[n, m_1] \end{aligned}$$

由於 $y[m] y^*[m_1] \sum_{n=0}^{N-1} B[n, m] B^*[n, m_1]$ 不一定是正的，

無法保證 K 越大, reconstruction error 越小

◎ 15-B Frequency and Time Division Multiplexing

傳統 Digital Modulation and Multiplexing：使用 Fourier transform

- Frequency-Division Multiplexing (FDM)

$$z(t) = \sum_{n=0}^{N-1} X_n \exp(j2\pi f_n t) \quad X_n = 0 \text{ or } 1$$

X_n can also be set to be -1 or 1

When (1) $t \in [0, T]$ (2) $f_n = n/T$

$$z(t) = \sum_{n=0}^{N-1} X_n \exp\left(j \frac{2\pi n t}{T}\right)$$

it becomes the orthogonal frequency-division multiplexing (OFDM) in the continuous case.

Furthermore, if the time-axis is also sampled

$$\underline{t = mT/N}, \quad m = 0, 1, 2, \dots, N-1$$

$$z\left(m \frac{T}{N}\right) = \sum_{n=0}^{N-1} X_n \exp\left(j \frac{2\pi nm}{N}\right)$$

(OFDM in the discrete case)

then the OFDM is equivalent to the transform matrix of the inverse discrete Fourier transform (IDFT), which is one of the discrete orthogonal transform.

Modulation: $Y_m = z\left(m \frac{T}{N}\right) = \sum_{n=0}^{N-1} A[m, n] X_n$

$$\mathbf{A} = \begin{bmatrix} 1 & 1 & 1 & \dots & 1 \\ 1 & e^{j\frac{2\pi}{N}} & e^{j\frac{4\pi}{N}} & \dots & e^{j\frac{2(N-1)\pi}{N}} \\ 1 & e^{j\frac{4\pi}{N}} & e^{j\frac{8\pi}{N}} & \dots & e^{j\frac{4(N-1)\pi}{N}} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 1 & e^{j\frac{2(N-1)\pi}{N}} & e^{j\frac{4(N-1)\pi}{N}} & \dots & e^{j\frac{2(N-1)(N-1)\pi}{N}} \end{bmatrix}$$

$t \in [0, T]$
sampling for t-axis

(i) orthogonal
different channels will not
interfere with one another
(ii) fast algorithm

如果是orthogonal 要還原訊號時，
不同channel 傳送的東西就不會互
相干擾，比較能夠簡單還原

跟inverse的傅立葉轉換是一樣的，就可以利用原本的快速傅立葉演算法

Modulation:
$$Y_m = \sum_{n=0}^{N-1} A[m, n] X_n$$

Demodulation:
$$X_n = \frac{1}{N} \sum_{m=0}^{N-1} A^*[m, n] Y_m$$

Example: $N = 8$

$$X_n = [1, 0, 1, 1, 0, 0, 1, 1] \quad (n = 0 \sim 7)$$

- **Time-Division Multiplexing (TDM)**

$$z(0) = X_0, \quad z\left(\frac{T}{N}\right) = X_1, \quad z\left(2\frac{T}{N}\right) = X_2, \quad \dots, \quad z\left((N-1)\frac{T}{N}\right) = X_{N-1}$$

$$y(m) = z\left(m\frac{T}{N}\right) = \sum_{n=0}^{N-1} A[m,n]X_n$$

$$\mathbf{A} = \begin{bmatrix} 1 & 0 & 0 & \dots & 0 \\ 0 & 1 & 0 & \dots & 0 \\ 0 & 0 & 1 & \dots & 0 \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & 0 & \dots & 1 \end{bmatrix} \quad (\text{also a discrete orthogonal transform})$$

思考：

既然 time-division multiplexing 那麼簡單

那為什麼要使用 frequency-division multiplexing
和 orthogonal frequency-division multiplexing (OFDM)?

◎ 15-C Code Division Multiple Access (CDMA)

除了 **frequency**-division multiplexing 和 **time**-division multiplexing，是否還有其他 multiplexing 的方式？

使用其他的 orthogonal transforms
即 code division multiple access (CDMA)

CDMA is an important topic in **spread spectrum** communication

參考資料

[1] M. A. Abu-Rgheff, *Introduction to CDMA Wireless Communications*, Academic, London, 2007

[2] 邱國書, 陳立民譯, “CDMA 展頻通訊原理,” 五南, 台北, 2002.

CDMA 最常使用的 orthogonal transform 為 Walsh transform

$$\begin{bmatrix} y_1 \\ y_2 \\ y_3 \\ y_4 \\ y_5 \\ y_6 \\ y_7 \\ y_8 \end{bmatrix} = \begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 \\ 1 & 1 & -1 & -1 & -1 & -1 & 1 & 1 \\ 1 & 1 & -1 & -1 & 1 & 1 & -1 & -1 \\ 1 & -1 & -1 & 1 & 1 & -1 & -1 & 1 \\ 1 & -1 & -1 & 1 & -1 & 1 & 1 & -1 \\ 1 & -1 & 1 & -1 & -1 & 1 & -1 & 1 \\ 1 & -1 & 1 & -1 & 1 & -1 & 1 & -1 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \\ x_5 \\ x_6 \\ x_7 \\ x_8 \end{bmatrix}$$

channel 1
 channel 2
 channel 3
 channel 4
 channel 5
 channel 6
 channel 7
 channel 8

channel 1 channel 2

$$W = W^T$$

$$n^{\text{th}} \text{ column} = n^{\text{th}} \text{ row}$$

當有兩組人在同一個房間裡交談 (A 和B交談)， (C 和D交談)，
如何才能夠彼此不互相干擾？

(1) Different Time

(2) Different Tone

(3) Different Language

CDMA 分為：

- (1) Orthogonal Type (2) Pseudorandom Sequence Type

Orthogonal Type 的例子： 兩組資料 $[1, 0, 1]$ $[1, 1, 0]$

(1) 將 0 變為 -1 $[1, -1, 1]$ $[1, 1, -1]$

(2) $1, -1, 1$ modulated by $[1, 1, 1, 1, 1, 1, 1, 1]$ (channel 1)
 $\xrightarrow{\text{channel 1 x1 } W_1}$ $[1, 1, 1, 1, 1, 1, 1, 1]$ $\xrightarrow{-W_1 \text{ channel 1 x -1}}$ $[-1, -1, -1, -1, -1, -1, -1, -1]$ $\xrightarrow{W_1 \text{ channel 1 x1}}$ $[1, 1, 1, 1, 1, 1, 1, 1]$
 $1, 1, -1$ modulated by $[1, 1, 1, 1, -1, -1, -1, -1]$ (channel 2)
 $\xrightarrow{\text{channel 2x1 } W_2}$ $[1, 1, 1, 1, -1, -1, -1, -1]$ $\xrightarrow{W_2 \text{ channel 2x1}}$ $[1, 1, 1, 1, -1, -1, -1, -1]$ $\xrightarrow{\text{channel 2x-1 } -W_2}$ $[-1, -1, -1, -1, 1, 1, 1, 1]$

(3) 相合

$[2, 2, 2, 2, 0, 0, 0, 0, 0, 0, 0, 0, -2, -2, -2, -2, 0, 0, 0, 0, 2, 2, 2, 2]$

demodulation

 y_1 y_2 y_3
 $[2, 2, 2, 2, 0, 0, 0, 0, 0, 0, 0, 0, -2, -2, -2, -2, 0, 0, 0, 0, 2, 2, 2, 2]$
 $w_1 = [1, 1, 1, 1, 1, 1, 1, 1]$ $[1, 1, 1, 1, 1, 1, 1, 1]$ $[1, 1, 1, 1, 1, 1, 1, 1]$

内積 = 8

$$\frac{8}{8} = 1$$

$$\langle y_2, w_1 \rangle = -8$$

$$\frac{-8}{8} = -1$$

$$\Downarrow$$

$$0$$

$$\langle y_3, w_1 \rangle = 8$$

$$\frac{8}{8} = 1$$

 $w_2 = [1, 1, 1, 1, -1, -1, -1, -1]$

$$\frac{\langle y_1, w_2 \rangle}{8} = 1$$

$$\frac{\langle y_2, w_2 \rangle}{8} = 1$$

$$\frac{\langle y_3, w_4 \rangle}{8} = -1 \Rightarrow 0$$

If $y_2[5], y_2[6]$ are missed $\hat{y}_2 = [0, 0, 0, 0, 0, 0, -2, -2]$ If $y_1[4]$ is missed $\hat{y}_1 = [2, 2, 2, 0, 0, 0, 0, 0]$

$$\frac{\langle \hat{y}_1, w_1 \rangle}{8} = \frac{6}{8} > 0 \Rightarrow 1$$

$$\frac{\langle \hat{y}_1, w_2 \rangle}{8} = \frac{6}{8} > 0 \Rightarrow 1$$

$$\frac{\langle \hat{y}_2, w_1 \rangle}{8} = -\frac{4}{8} < 0 \Rightarrow -1$$

$$\frac{\langle \hat{y}_2, w_2 \rangle}{8} = \frac{4}{8} > 0 \Rightarrow 1$$

注意：

- (1) 使用 N -point Walsh transform 時，總共可以有 N 個 channels
- (2) 除了 Walsh transform 以外，其他的 orthogonal transform 也可以使用
- (3) 使用 Walsh transform 的好處

- Orthogonal Transform 共通的問題: 需要同步 synchronization

$$\mathbf{R}_1 = [1, 1, 1, 1, 1, 1, 1, 1]$$

$$\mathbf{R}_2 = [1, 1, 1, 1, -1, -1, -1, -1]$$

$$\mathbf{R}_5 = [1, -1, -1, 1, 1, -1, -1, 1]$$

$$\mathbf{R}_8 = [1, -1, 1, -1, 1, -1, 1, -1]$$

但是某些 basis, 就算不同步也近似 orthogonal

$$\langle \mathbf{R}_1[n], \mathbf{R}_1[n] \rangle = 8, \quad \langle \mathbf{R}_1[n], \mathbf{R}_k[n] \rangle = 0 \text{ if } k \neq 1$$

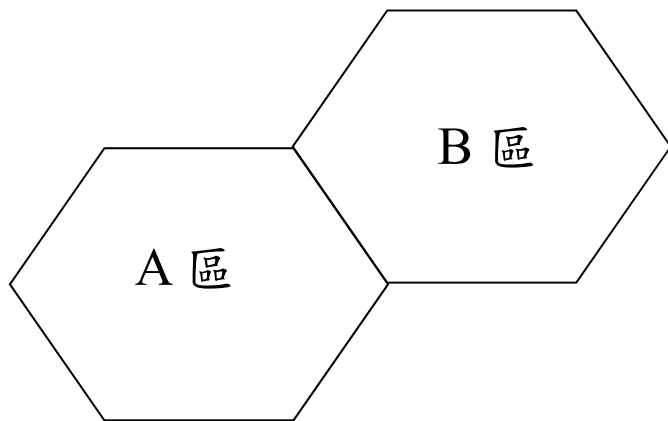
$$\langle \mathbf{R}_1[n], \mathbf{R}_k[n-1] \rangle = 2 \text{ or } 0 \quad \text{if } k \neq 1.$$

這裡的 shift 為 circular shift

CDMA 的優點：

- (1) 運算量相對於 frequency division multiplexing 減少很多
- (2) 可以減少 noise 及 interference 的影響
- (3) 可以應用在保密和安全傳輸上
- (4) 就算只接收部分的信號，也有可能把原來的信號 recover 回來
- (5) 相鄰的區域的干擾問題可以減少

相鄰的區域，使用差距最大的「語言」，則干擾最少



假設 A 區使用的 orthogonal basis 為 $\phi_k[n], k = 0, 1, 2, \dots, N-1$

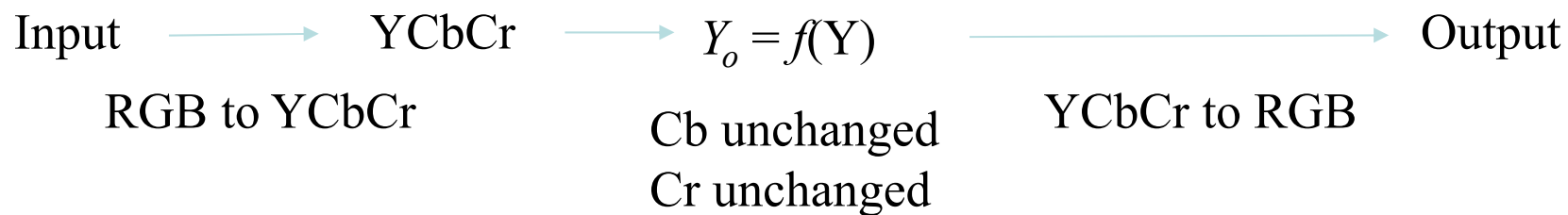
B 區使用的 orthogonal basis 為 $\mu_h[n], h = 0, 1, 2, \dots, N-1$

設法使 $\max \left(\left| \frac{\langle \phi_k[n], \mu_h[n] \rangle}{\langle \phi_k[n], \phi_k[n] \rangle} \right| \right)$ 為最小

$$k = 0, 1, 2, \dots, N-1, h = 0, 1, 2, \dots, N-1$$

附錄十七 常用的影像修飾方法

(1) Lightening and Darkening

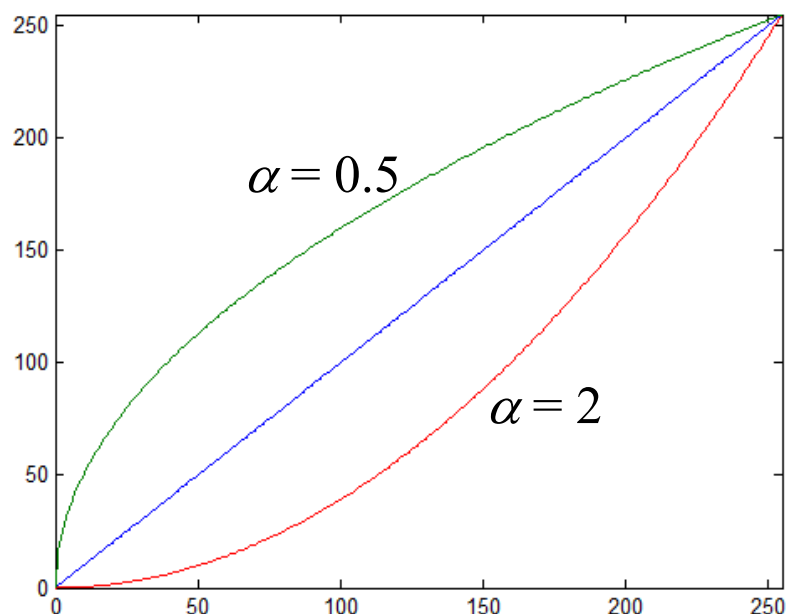


Example:

$$f(Y) = 255 \left(\frac{Y}{255} \right)^\alpha$$

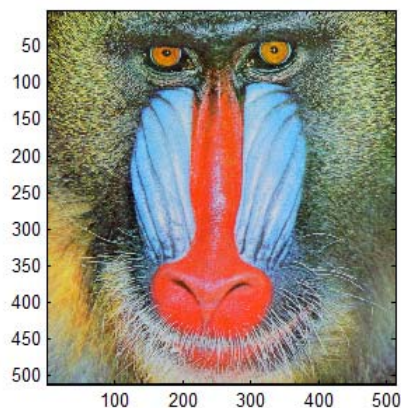
$\alpha < 1$: lightening

$\alpha > 1$: darkening

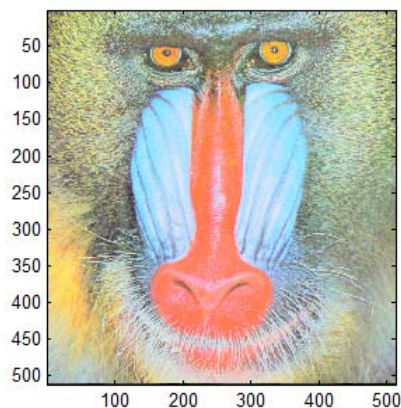


附錄十七 常用的影像修飾方法

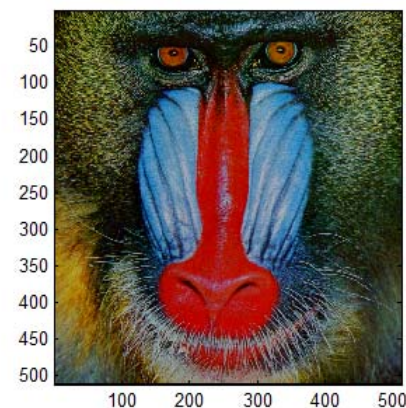
original image



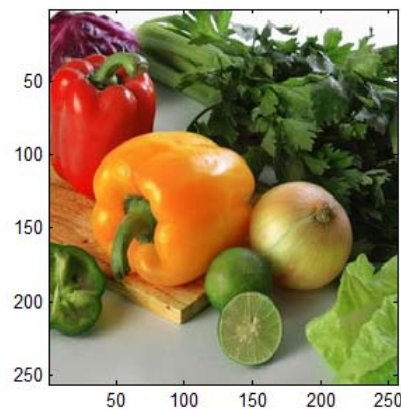
lighten



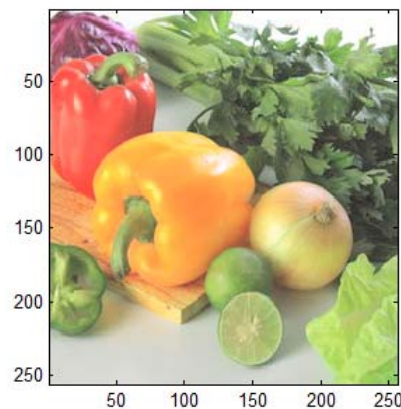
darken



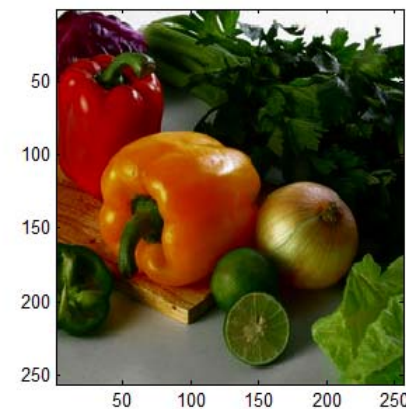
original image



lighten



darken




附錄十七 常用的影像修飾方法

(2) Morphology

(2-1) Erosion (去除區域外圍)

$$A[m,n] = A[m,n] \& A[m-1,n] \& A[m+1,n] \& A[m,n-1] \& A[m,n+1]$$

*	*	*	*	*	*	*
*	*	*	*	0	*	*
*	*	0	0	0	0	*
*	0	0	0	0	0	*
*	0	0	0	0	0	*
*	0	0	0	0	0	*
*	*	0	0	0	*	*
*	*	*	0	*	*	*
*	*	*	*	*	*	*



*	*	*	*	*	*	*
*	*	*	*	*	*	*
*	*	*	*	0	*	*
*	*	0	0	0	*	*
*	*	0	0	0	*	*
*	*	0	0	0	*	*
*	*	*	0	*	*	*
*	*	*	*	*	*	*
*	*	*	*	*	*	*

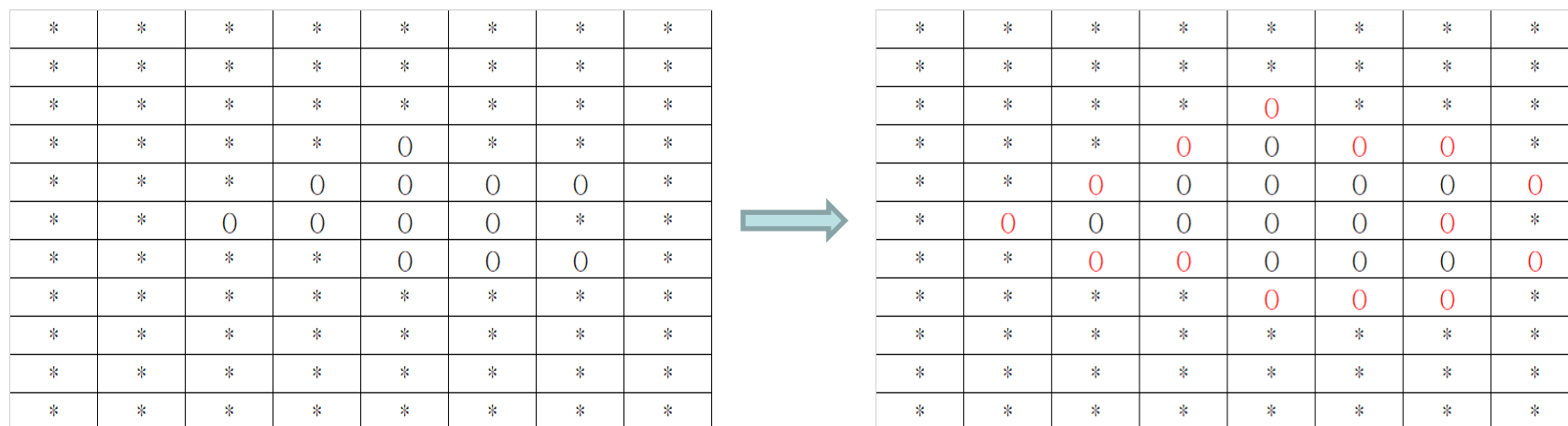
Erosion for a Non-binary Image

$$A[m,n] = \min \{ A[m,n], A[m-1,n], A[m+1,n], A[m,n-1], A[m,n+1] \}$$

附錄十七 常用的影像修飾方法

(2-2) Dilation (擴大區域)

$$A[m,n] = A[m,n] \vee A[m-1,n] \vee A[m+1,n] \vee A[m,n-1] \vee A[m,n+1]$$



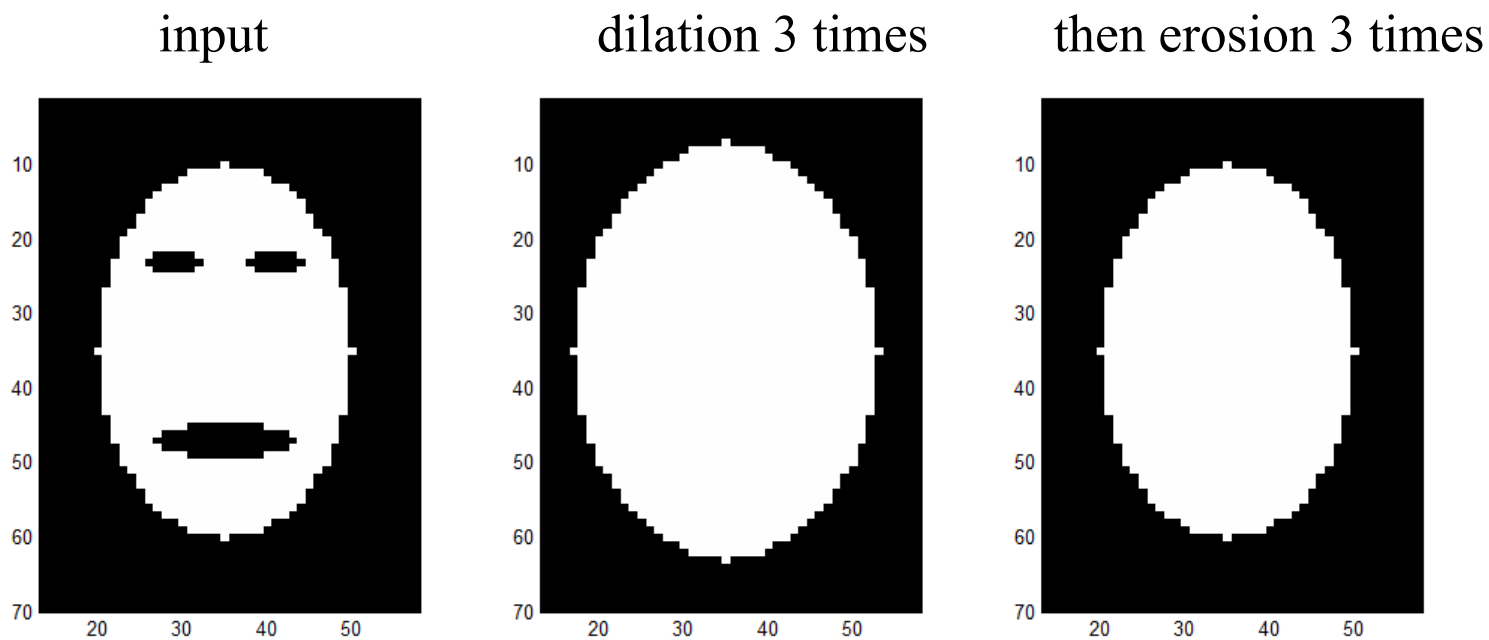
Dilation for a Non-binary Image

$$A[m,n] = \text{Max}\{A[m,n], A[m-1,n], A[m+1,n], A[m,n-1], A[m,n+1]\}$$

附錄十七 常用的影像修飾方法

(2-3) Closing (Hole Filling)

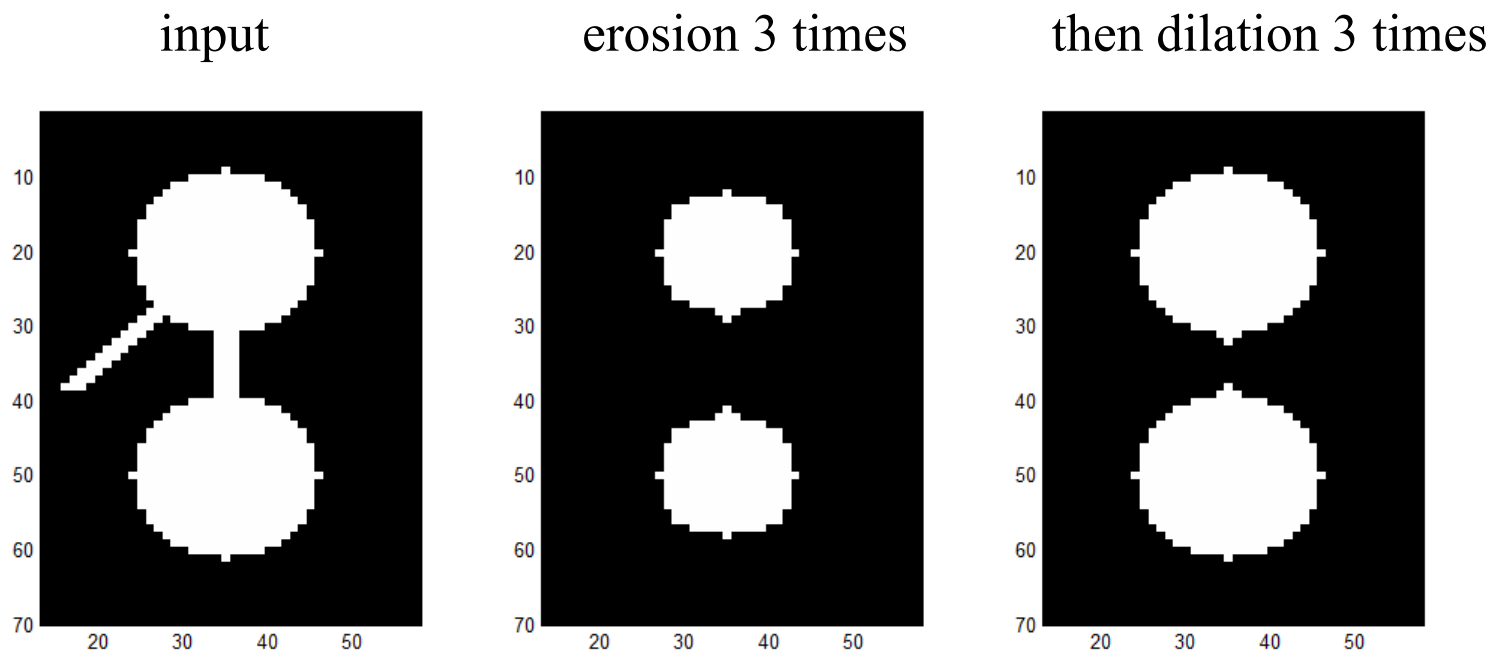
closing = dilation k times + erosion k times



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(2-4) Opening

opening = erosion k times + dilation k times



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(3) Edge enhancement

$$\text{input image} + \alpha |\text{edge detection output}|$$

Original image



With edge enhancement



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(4) Dehaze (除霧)



He, Kaiming, Jian Sun, and Xiaoou Tang. "Single image haze removal using dark channel prior." *IEEE Trans. Pattern Anal. Mach. Intell.*, vol. 33, pp. 2341-2353, 2011.

附錄十七 常用的影像修飾方法

Haze Model $\mathbf{I}(\mathbf{x}) = \mathbf{J}(\mathbf{x})t(\mathbf{x}) + \mathbf{A}(1 - t(\mathbf{x}))$

$\mathbf{J}(\mathbf{x})$: scene, $\mathbf{I}(\mathbf{x})$: observed image

$t(\mathbf{x})$: transmission, \mathbf{A} : intensity for the whole-haze case

$\mathbf{A}(1 - t(\mathbf{x}))$: airlight

定義 dark channel $\mathbf{J}^{dark}(\mathbf{x})$

$$J^{dark}(\mathbf{x}) = \min_{c \in \{r, g, b\}} \left(\min_{\mathbf{y} \in \Omega(\mathbf{x})} (J^c(\mathbf{y})) \right),$$

$\Omega(\mathbf{x})$: some patch (a small region)

Dark channel 為一個影像在一個小範圍區域當中，RGB 的最小值

一個正常影像的 dark channel 大多近於 0

一個受 haze 影響的影像，dark channel 常常不為 0

附錄十七 常用的影像修飾方法

Dehaze 的方法與流程

$$\mathbf{I}(\mathbf{x}) = \mathbf{J}(\mathbf{x})t(\mathbf{x}) + \mathbf{A}(1 - t(\mathbf{x}))$$

$$J^{dark}(\mathbf{x}) = \min_c \left(\min_{\mathbf{y} \in \Omega(\mathbf{x})} (J^c(\mathbf{y})) \right) = 0. \quad \min_c \left(\min_{\mathbf{y} \in \Omega(\mathbf{x})} \left(\frac{J^c(\mathbf{y})}{A^c} \right) \right) = 0$$

$$\frac{\mathbf{I}(\mathbf{x})}{A^c} = \frac{\mathbf{J}(\mathbf{x})}{A^c} t(\mathbf{x}) + 1 - t(\mathbf{x})$$

$$\tilde{t}(\mathbf{x}) = 1 - \min_c \left(\min_{\mathbf{y} \in \Omega(\mathbf{x})} \left(\frac{I^c(\mathbf{y})}{A^c} \right) \right)$$

find the transmission $t(\mathbf{x})$

\mathbf{A} : the 95% largest intensity of $\mathbf{I}(\mathbf{x})$

$$\mathbf{J}(\mathbf{x}) = \frac{\mathbf{I}(\mathbf{x})}{t(\mathbf{x})} + \mathbf{A} \left(1 - \frac{1}{t(\mathbf{x})} \right)$$

recover the original image

He, Kaiming, Jian Sun, and Xiaoou Tang. "Single image haze removal using dark channel prior." *IEEE Trans. Pattern Anal. Mach. Intell.*, vol. 33, pp. 2341-2353, 2011.

期末的勉勵

- 人生難免會有挫折，最重要的是，我們面對挫折的態度是什麼
- 長遠的願景要美麗，短期的目標要務實

祝各位同學暑假愉快！

各位同學在研究上或工作上，有任何和 digital signal processing 或 time frequency analysis 方面的問題，歡迎找我來一起討論。