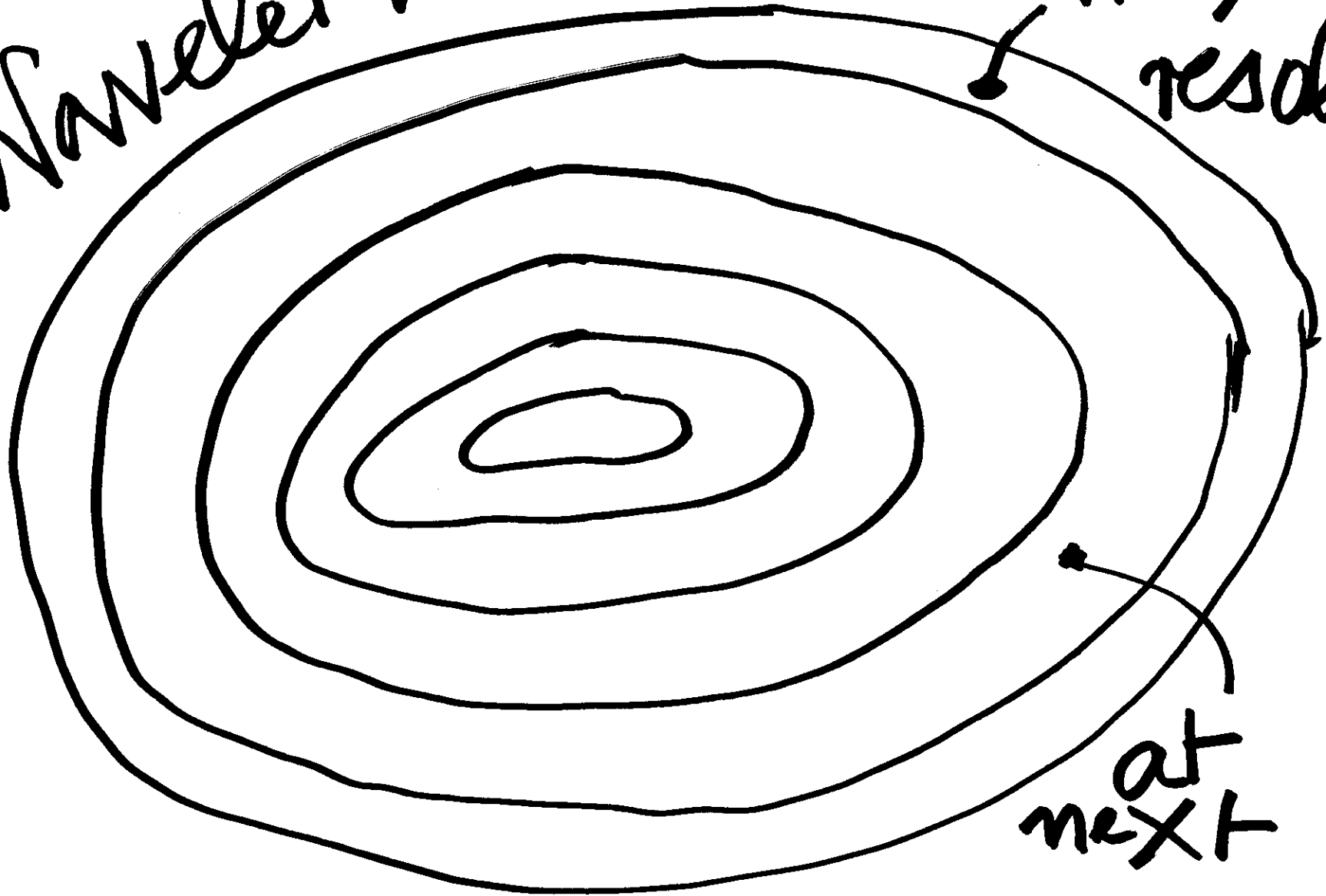


# LECTURE 3

## THE HAAR (MRA) MULTIRESOLUTION ANALYSIS

Wavelet translates at max<sup>D</sup> resolution

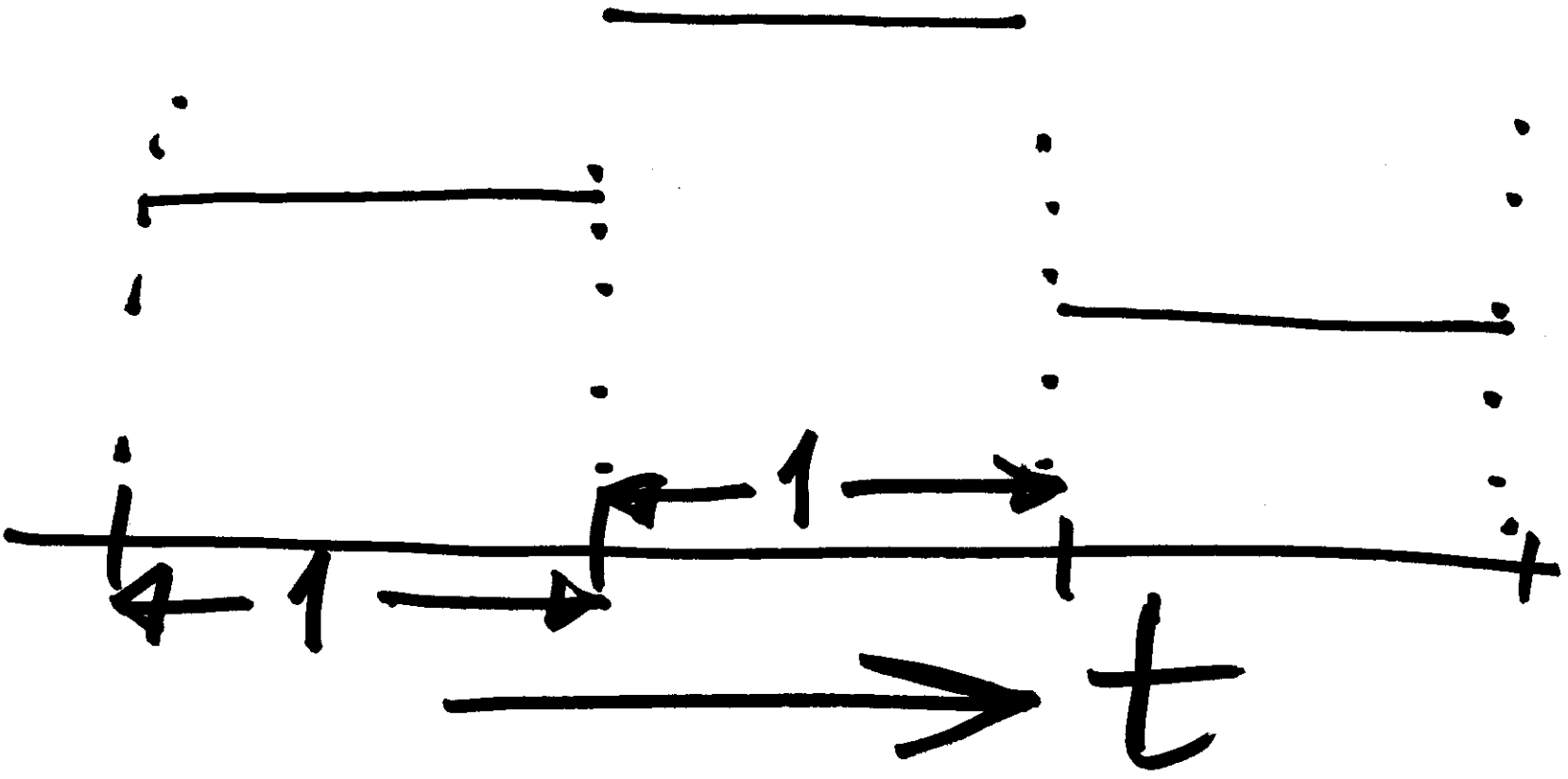


at next

We are essentially  
"peeling off" shell  
by shell using  
different dilates and  
translates!

Focal point:

Piecewise constant  
approximation on  
unit intervals



What function  $\phi(t)$   
is such that its  
integer translates  
can span this space?

$\mathbb{Z}$ : set of integers

$\forall$ : 'for all'

linear space of functions:  
a set of functions, such  
that their linear combinations  
fall in the same set.

The space of piecewise  
constant functions  
on the standard

unit intervals!  
 $\forall n \in \mathbb{Z} \quad [n, n+1]$



$V_0: \left\{ \begin{array}{l} x(t), \text{ such that} \\ x(\cdot) \in \mathcal{L}_2(\mathbb{R}) \end{array} \right.$

and  $x(\cdot)$  is piecewise  
constant on all  $[n, n+1[$  }  
n integer  
↑↑ belongs to'

We say  $V_0$ , because of  
piecewise constancy  
on intervals of

$$\text{size } \bar{2}^0 = 1$$

Similarly

$$V_1 : \{ x(t), x \in L_2(\mathbb{R}) \}$$

and  $x(\cdot)$  is piecewise constant on standard

$$2^{-1} \text{ intervals } \left[ n \cdot 2^{-1}, (n+1) \cdot 2^{-1} \right[ \\ \forall n \in \mathbb{Z} \quad \left. \vphantom{\int} \right\}$$

In general  $V_m$

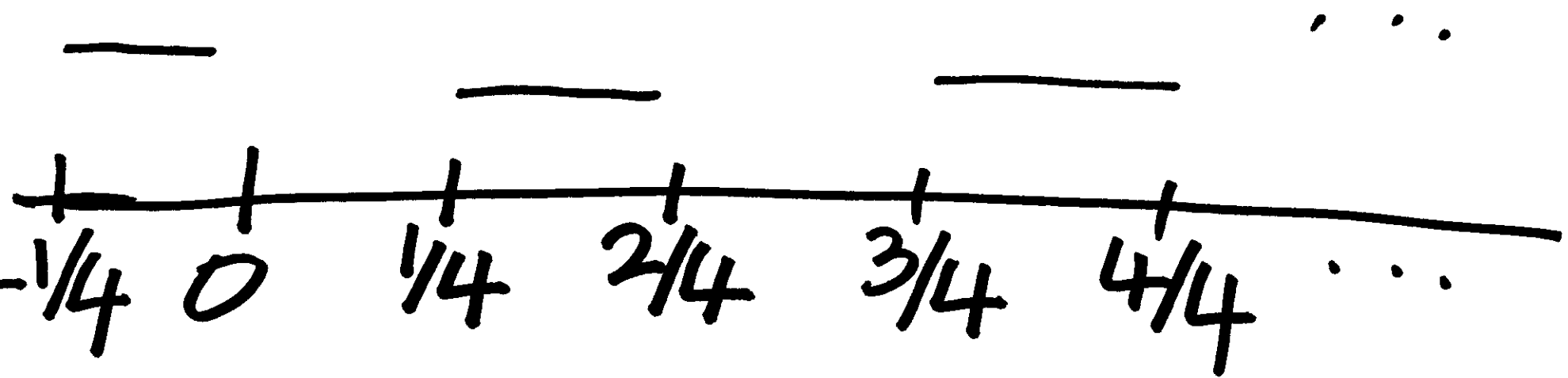
$$= \{x(t), x \in L_2(\mathbb{R})\}$$

and  $x(\cdot)$  is piecewise

constant on all

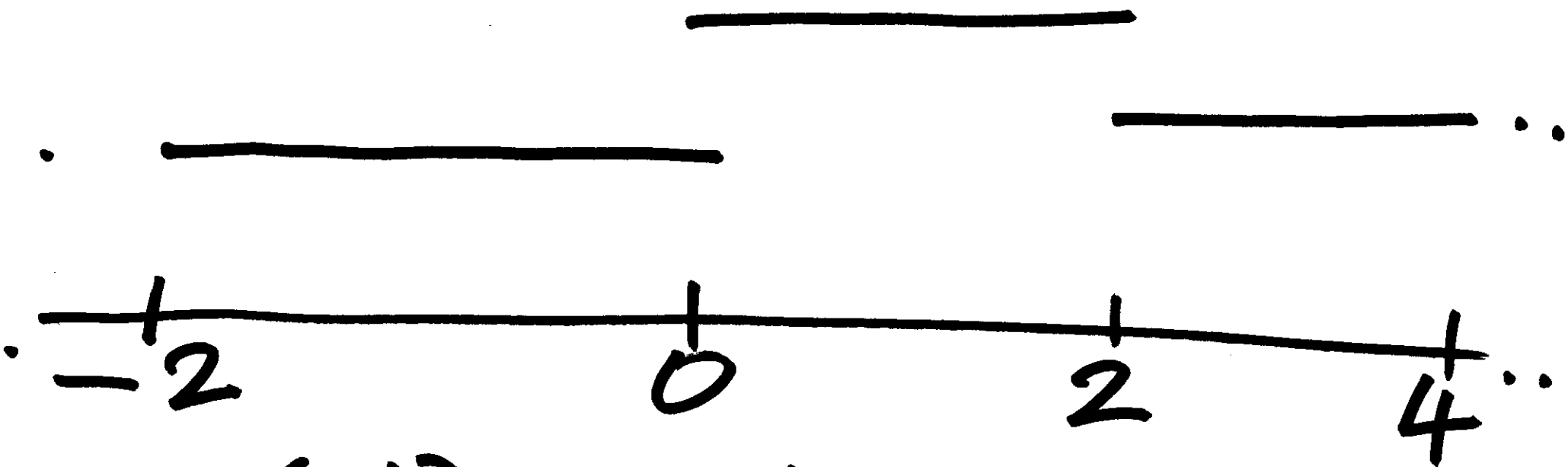
$$\left\{ \left[ n \cdot 2^{-m}, (n+1) \cdot 2^{-m} \right] \mid n \in \mathbb{Z} \right\}$$

Example of  $x(t) \in \mathcal{V}_2$   
( $\in \mathcal{L}_2(\mathbb{R})$ )



The absolute squared  
sum of the piecewise  
constant values, in  
all  $V_m$ , must be  
( $\in L_2(\mathbb{R})$ ) convergent

Example of  $x(\cdot) \in V_{-1}$



$$2^{-(-1)} = 2^1 = 2$$

'A ladder of subspaces'

implied:

$$\cdot V_{-2} \subset V_{-1} \subset V_0 \subset V_1 \subset V_2 \dots$$

Intuitively



towards

$L_2(\mathbb{R})!$



What happens when we  
go leftwards?

$$\dots V_{-2} \subset V_{-1} \subset V_0 \subset V_1 \subset V_2 \dots$$



Piecewise constants on  
LARGER INTERVALS

$L_2$  norm of functions  
going leftward

$$= \sum_n |c_n|^2$$

$$= \lim_{m \rightarrow -\infty} \sum_n |c_n|^2$$

If  $2^{|m|} \sum_n |c_n|^2$  must  
converge, no matter  
how large  $|m|$  is,  
then  $\sum_n |c_n|^2 \rightarrow 0$

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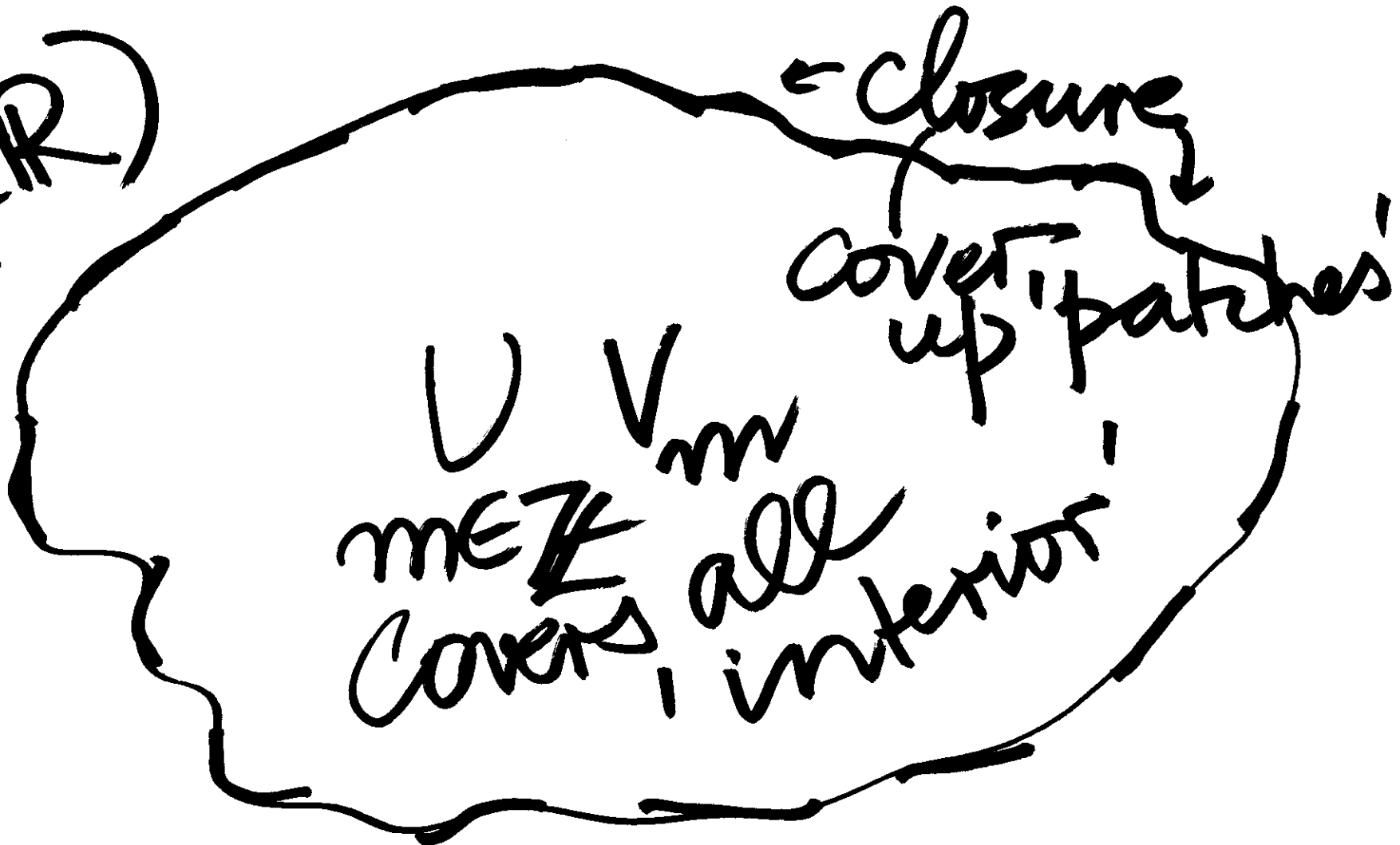
Moving upwards:

Union

closure  $\rightarrow$

$$\bigcup_{M \in \mathcal{L}} V_M = \mathcal{L}(\mathbb{R})$$

$L_2(\mathbb{R})$



closure

cover up patches

$\cup V_m$   
MEK all  
covers, interior

Making 'downwards'  
Intersection!

$$\bigcap_{m \in \mathbb{Z}} V_m = \{0\}$$

trivial  
subspace

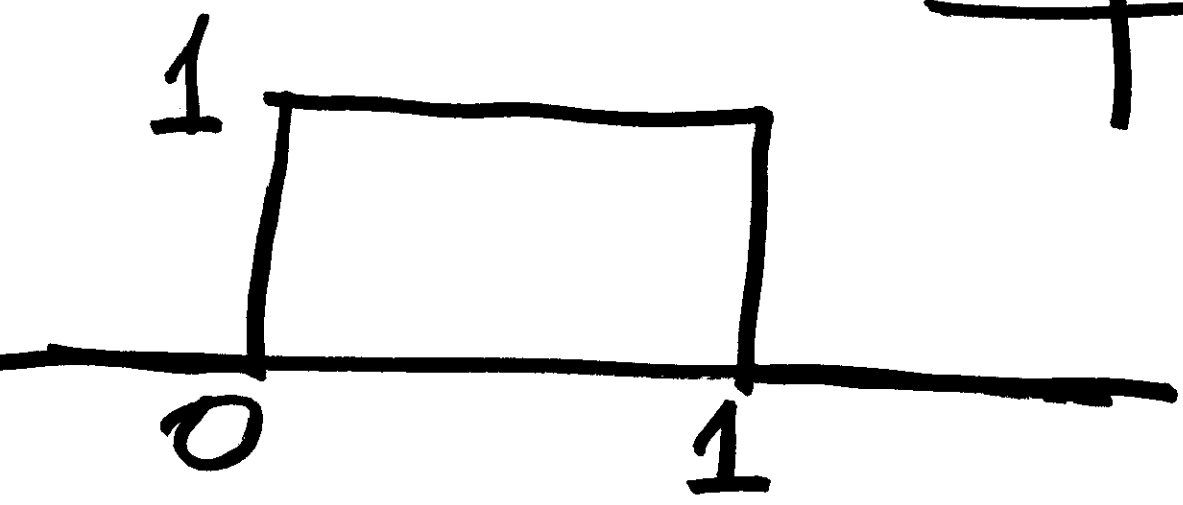
We say  $\{f_1, \dots, f_k, \dots\}$   
span a linear space  
if any function in the  
space can be generated  
by linear combinations  
of this set

What function  $\phi(t)$

and its integer

translates span

$V_0$ ?

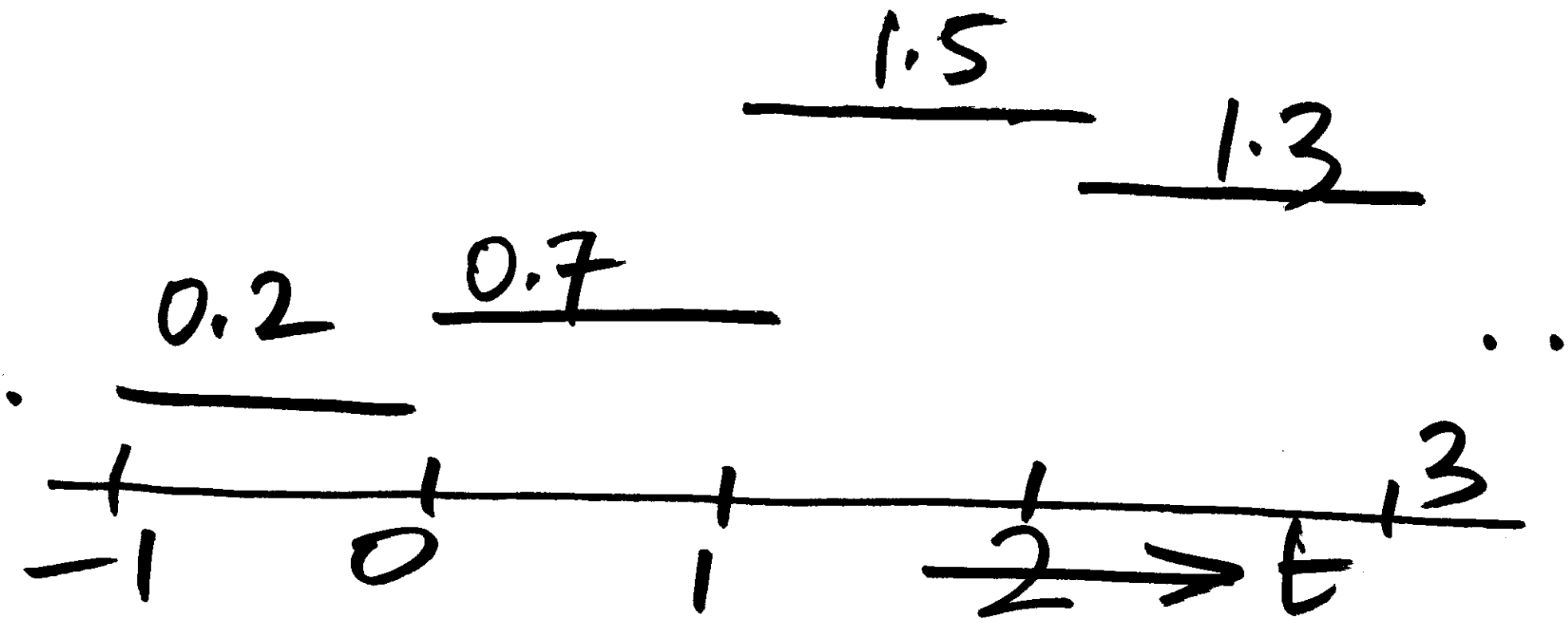




Any function in  $V_0$   
can be written

$$\sum_{n \in \mathbb{Z}} c_n \phi(t - n)$$

↑ ↑ ↑  
piecewise constants // integer translates of  $\phi(\cdot)$



$$\begin{aligned}
 & \dots + 0.2\phi(t+1) + 0.7\phi(t) \\
 & + 1.5\phi(t-1) + 1.3\phi(t-2) \\
 & \quad + \dots
 \end{aligned}$$

Any space  $V_m$  can be  
similarly constructed

$$V_m = \text{span}_{n \in \mathbb{Z}} \left\{ \phi \left( \begin{matrix} m \\ 2t - n \end{matrix} \right) \right\}$$

$\phi(t)$  is called the  
Scaling Function  
(in this case of  
the Haar Multiresolution  
?? Analysis!)

$$\dots V_{-2} \subset V_{-1} \subset V_0 \subset V_1 \subset V_2 \dots$$

With these properties ??

is called a  
Multiresolution Analysis  
(MRA)

# Axioms of a Multiresolution

Analysis

Ladder of subspaces of

$$L_2(\mathbb{R}): \dots V_{-2} \subset V_{-1} \subset V_0 \subset V_1 \subset V_2 \dots$$

-                      -                      -                      -

such that

$$1. \quad \overline{\bigcup_{m \in \mathbb{Z}} V_m} = \mathcal{L}_2(\mathbb{R})$$

$$2. \quad \bigcap_{m \in \mathbb{Z}} V_m = \{0\}$$

Contd...

3. There exists  $\phi(t)$   
such that

$$V_0 = \text{span} \left\{ \phi(t-n) \right\}_{n \in \mathbb{Z}}$$

4.  $\left\{ \phi(t-n) \right\}_{n \in \mathbb{Z}}$  is an  
ORTHOGONAL  
SET!



5. If  $f(t) \in V_m$ ,

then  $f\left(\frac{-m}{2}t\right) \in V_0$   
 $\forall m \in \mathbb{Z}$

6. If  $f(t) \in V_0$ ,  $\forall n \in \mathbb{Z}$   
then  $f(t-n) \in V_0$

Theorem: Given these  
axioms, there exists  
 $\psi(\cdot) \in L_2(\mathbb{R})$  so that  
 $\{\psi(2^m t - n)\}_{m \in \mathbb{Z}, n \in \mathbb{Z}}$  span  
 $L_2(\mathbb{R})$