

WEDNESDAY, MAY 8, 2019

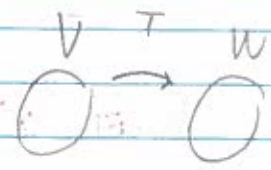
LECTURE 17 - DUAL SPACES (II) (SECTION 2.6)

SO FAR IN OUR MATRIX ADVENTURE, WE'VE SEEN THAT MATRIX MULTIPLICATION COMES FROM COMPOSITION OF LT, AND THAT A^{-1} COMES FROM THE INVERSE OF A LT. THIS BEGS THE Q: WHERE DOES A^T COME FROM? THE ANSWER LIES IN OUR DUAL SPACES.

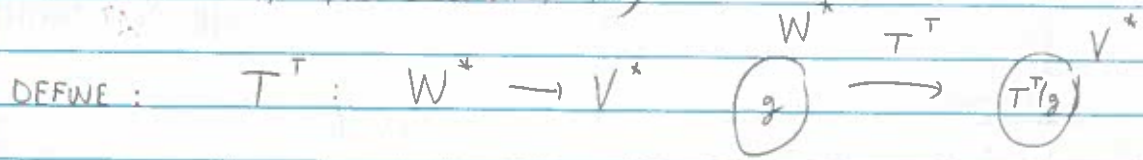
DEF $V^* = \mathcal{L}(V, \mathbb{F}) =$ LT FROM V TO \mathbb{F}

I - THE TRANSPOSE OF A LT

LET $T: V \rightarrow W$ BE A LT.



(IDEA JUST LIKE IN A^T WE FLIP THE ENTRIES OF A , FOR T^T WE'D LIKE TO "FLIP" THE ACTION OF T)



INPUT $g \in W^*$ (so $g: W \rightarrow \mathbb{F}$)

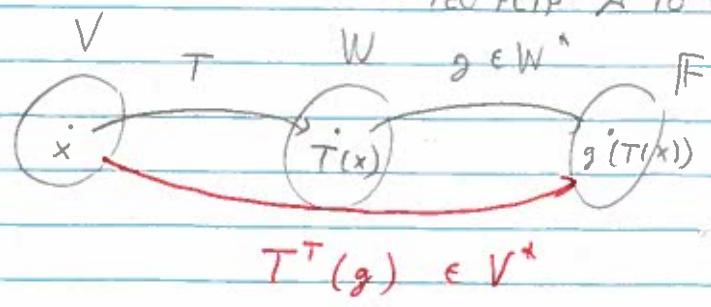
OUTPUT $T^T(g) \in V^*$ (so $T^T(g): V \rightarrow \mathbb{F}$)

DEF $T^T: W^* \rightarrow V^*$

$$\underbrace{T^T(g)}_{V^*}(x) = g(T(x)) \quad \text{FOR ALL } x \in V$$

(YOU FLIP T & g , JUST LIKE YOU FLIP A TO GET A^T)

PICTURE
(g FIXED)



(LET'S SHOW THAT THIS WORKS, NAMELY THAT THE MATRIX OF T^T IS A^T)

II - MATRIX OF T^T

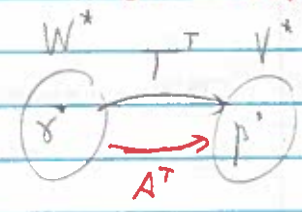
THEOREM LET $T: V \rightarrow W$ LT, $A = [T]_p$

LET $\beta^* = \{f_1, \dots, f_N\}$ BE THE DUAL BASIS OF β (IN V^*)

(MEANING $f_i(v_j) = \begin{cases} 1 & \text{IF } j=i \\ 0 & \text{IF } j \neq i \end{cases}$)

LET $\gamma^* = \{g_1, \dots, g_M\}$ " γ (IN W^*)

THEN $[T^T]_{\beta^*}^{\gamma^*} = A^T$



WHY?

1) CONSIDER $[T^T]_{\beta^*}^{\gamma^*} = \begin{bmatrix} f_1 \\ \vdots \\ f_N \end{bmatrix}$

GOAL CALCULATE $T^T(g_j)$ AND EXPRESS IT IN TERMS OF f_i

(RECALL FACT IF $f \in V^*$, THEN $f = \sum_{i=1}^N f(v_i) f_i$ EASY EXPANSION)

$$\begin{aligned} \text{So } \underbrace{T^T(g_j)}_{\in V^*} &= \sum_{i=1}^N \underbrace{T^T(g_j)(v_i)}_{\text{scalar}} f_i \\ &= \sum_{i=1}^N g_j(T(v_i)) f_i \end{aligned}$$

2) BUT BY DEF OF A , $A = \begin{bmatrix} w_1 \\ w_k \\ w_h \end{bmatrix} \begin{bmatrix} | \\ A_{ki} \\ | \\ T(v_i) \end{bmatrix}$

$$T(v_i) = \sum_{k=1}^M A_{ki} w_k$$

$$\begin{aligned} \text{so } g_j(T(v_i)) &= g_j \left(\sum_{k=1}^M A_{ki} w_k \right) \cdot g_j \\ &= \sum_{k=1}^M A_{ki} g_j(w_k) \\ &= A_{1i} \underbrace{g_j(w_1)}_0 + \dots + A_{ji} \underbrace{g_j(w_j)}_1 + \dots + A_{mi} \underbrace{g_j(w_m)}_0 \\ &= A_{ji} \end{aligned}$$

$$3) \text{ HENCE } T^T(g_j) = \sum_{i=1}^N A_{ji} f_i = \sum_{i=1}^N (A^T)_{ij} f_i$$

$$\text{so } [T^T]_{g^*}^{f^*} = A^T$$

CONCLUSION $[T^T]_{g^*}^{f^*} = ([T]_{f^*}^{g^*})^T$

EX IF $[T]_{f^*}^{g^*} = \begin{bmatrix} 1 & 0 \\ 1 & 2 \end{bmatrix}$, THEN $[T^T]_{g^*}^{f^*} = \begin{bmatrix} 1 & 0 \\ 1 & 2 \end{bmatrix}^T = \begin{bmatrix} 1 & 1 \\ 0 & 2 \end{bmatrix}$

(SEE BOOK / YOUTUBE FOR A CONCRETE EXPLANATION WHY THIS IS TRUE)

III - V^{**}

(SINCE V^* IS ITSELF A V.S, WE CAN DEFINE ITS DUAL, CALLED V^{**})

DEF $V^{**} = (V^*)^* = \mathcal{L}(V^*, \mathbb{F})$ (LI FROM V^* TO \mathbb{F})

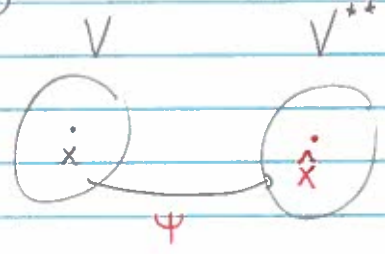
(NOW IF YOU THINK OF V^* IN TERMS OF SHADOWS, YOU MAY ASK: ARE YOU THE SHADOW OF YOUR OWN SHADOW? IN MATH, THE ANSWER IS YES!)

THEOREM IF $\dim(V) < \infty$, THEN V AND V^{**} ARE ISOMORPHIC

WHY? $\dim(V^{**}) = \dim((V^*)^*) = \dim(V^*) = \dim(V)$

BUT WHAT MAKES THIS SO GREAT IS THAT THERE'S A VERY ELEGANT ISOMORPHISM THAT BRINGS YOU FROM V TO V^{**} (JUST LIKE THE MIRROR IN LEGEND OF ZELDA)

ISOMORPHISM



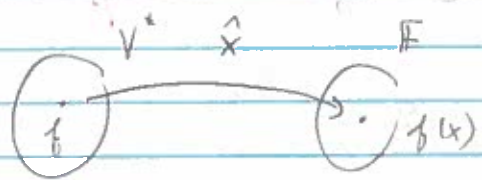
INPUT $x \in V$

OUTPUT $\hat{x} \in V^{**} = \mathcal{L}(V^*, \mathbb{F})$, so $\hat{x}: V^* \rightarrow \mathbb{F}$

DEF

$\hat{x}(f) = f(x)$ "EVALUATION AT x "

PICTURE
(FIX x)



(EX $V = \mathbb{R}$, $x = 2$, $\hat{x}(f) = f(2)$)

THEOREM

~~IF~~ IF $\dim(V) < \infty$, THEN $\Psi: V \rightarrow V^{**}$
 $\Psi(x) = \hat{x}$ IS AN ISOMORPHISM (URJULA)

WHY?

1) Ψ LINEAR: IF $x, y \in V$ AND $f \in V^*$, THEN

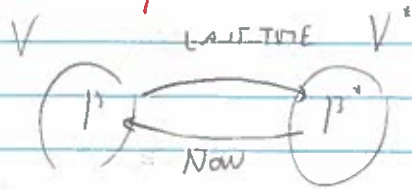
$$\begin{aligned} \Psi(x+cy)(f) &= \widehat{x+cy}(f) = f(x+cy) \quad \downarrow \text{ } f \text{ LT} \\ &= f(x) + cf(y) \\ &= \hat{x}(f) + c\hat{y}(f) \\ &= (\hat{x} + c\hat{y})(f) \\ &= (\Psi(x) + c\Psi(y))(f) \end{aligned}$$

$\Psi(x+cy) = \Psi(x) + c\Psi(y)$

2) Ψ 1-1 : SEE NCIEI / YT (SEE APPENDIX)

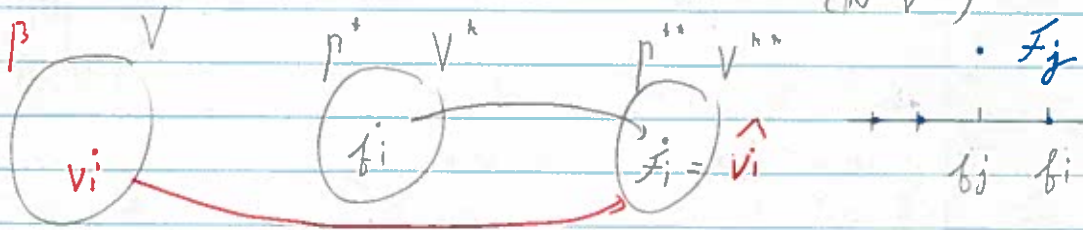
3) Ψ ONTO : U/C $\text{DM}(V^{**}) = \text{DM}(V)$.

CONOLLARY EVERY BASIS β^* OF V^* IS THE DUAL BASIS OF SOME BASIS β OF V



WHY? 1) LET $\beta^* = \{f_1, \dots, f_N\}$ BE A BASIS OF V^* (GUAL FND-12)

LET $\beta^{**} = (\beta^*)^* = \{\hat{f}_1, \dots, \hat{f}_N\}$ BE THE DUAL BASIS OF β^* (IN V^{**})



BY THE THEOREM, EACH $\hat{f}_i = \hat{v}_i$ FOR SOME $v_i \in V$

2) CLM $\beta = \{v_1, \dots, v_N\}$ WORKS!

JUST NEED TO CHECK $f_i(v_j) = \begin{cases} 0 & \text{IF } j \neq i \\ 1 & \text{IF } j = i \end{cases}$

BUT $f_i(v_j) = \hat{v}_j(f_i) = \hat{f}_j(f_i) = \begin{cases} 0 & \text{IF } i \neq j \\ 1 & \text{IF } i = j \end{cases}$ ✓

HENCE β^* IS THE DUAL BASIS OF β .

EX $V = \mathbb{R}^2$, $\beta^* = \{f_1, f_2\}$, $f_1(x, y) = x - 2y$,
 $f_2(x, y) = x + y$

CONJUGATE β^* IS THE DUAL BASIS OF $\beta = \left\{ \underset{v_1}{\left(\frac{1}{3}, -\frac{1}{3}\right)}, \underset{v_2}{\left(\frac{2}{3}, \frac{1}{3}\right)} \right\}$

EX $f_1(v_1) = f_1\left(\frac{1}{3}, -\frac{1}{3}\right) = \frac{1}{3} - 2\left(-\frac{1}{3}\right) = 1$

$f_1(v_2) = f_1\left(\frac{2}{3}, \frac{1}{3}\right) = \frac{2}{3} - 2\left(\frac{1}{3}\right) = 0$

APPENDIX WHY $\hat{\Psi}(x) = \hat{x}$ IS 1-1

PROOF SUPPOSE $\hat{x} = 0$, SHOW $x = 0$

SINCE $\beta = \{v_1, \dots, v_n\}$ IS A BASIS, $x = a_1 v_1 + \dots + a_n v_n$
FOR SOME $a_i \in \mathbb{F}$

THEN $\hat{x} = 0$

$\Rightarrow \widehat{(a_1 v_1 + \dots + a_n v_n)} = 0$

$\Rightarrow a_1 \hat{v}_1 + \dots + a_n \hat{v}_n = 0$

$\Leftrightarrow (a_1 \hat{v}_1 + \dots + a_n \hat{v}_n)(f) = 0$ FOR ALL $f \in V^*$

$\Rightarrow a_1 \hat{v}_1(f) + \dots + a_n \hat{v}_n(f) = 0$

$\Rightarrow a_1 f(v_1) + \dots + a_n f(v_n) = 0$ (*)

NOW LET $f = f_1$ IN (*) TO GET:

$a_1 \underbrace{f_1(v_1)}_1 + a_2 \underbrace{f_1(v_2)}_0 + \dots + a_n \underbrace{f_1(v_n)}_0 = 0$

$\Rightarrow \underline{a_1 = 0}$

SIMILARLY, LET $f = f_2$ TO GET $a_2 = 0$, ETC.

SO $a_1 = 0, \dots, a_n = 0$, HENCE $x = a_1 v_1 + \dots + a_n v_n = 0 v_1 + \dots + 0 v_n = 0$ ■