DSP-CIS

Part-II: Filter Design & Implementation

Chapter-5: Filter Realization

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Filter Design Process

• <u>Step-1</u>: Define filter specs

Pass-band, stop-band, optimization criterion,...

Step-2 : Derive optimal transfer function

FIR or IIR design

Chapter-4

• Step-3: Filter realization (block scheme/flow graph)

Direct form realizations, lattice realizations,... Chapter-5

• <u>Step-4</u>: Filter implementation (software/hardware)

Finite word-length issues, ...

Chapter-6

Question: implemented filter = designed filter?

'You can't always get what you want' -Jagger/Richards (?)

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FIR Filter Realization

FIR Filter Realization

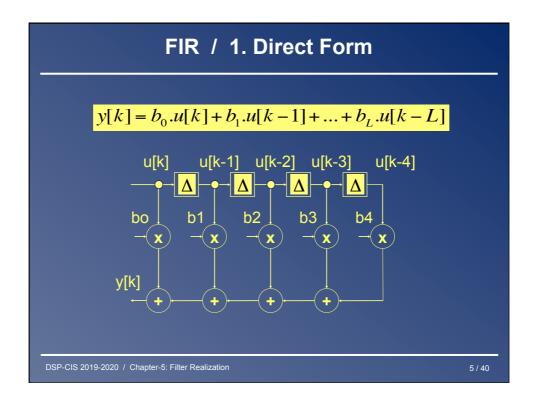
=Construct (realize) LTI system (with delay elements, adders and multipliers), such that I/O behavior is given by..

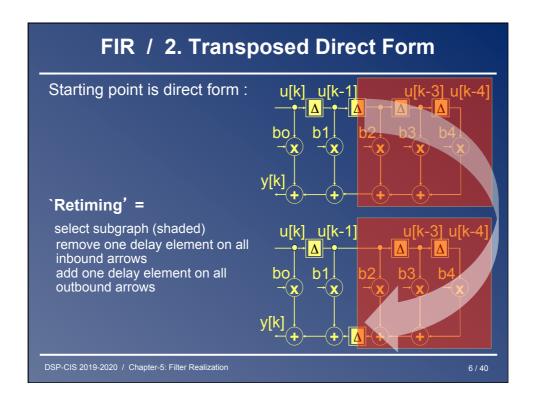
$$y[k] = b_0.u[k] + b_1.u[k-1] + ... + b_L.u[k-L]$$

Several possibilities exist...

- 1. Direct form
- 2. Transposed direct form
- 3. Lattice realization (LPC lattice)
- 4. Lossless lattice realization
- 5. Frequency-domain realization: see Part-IV

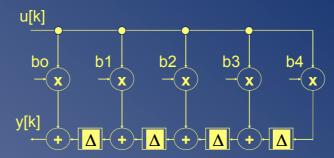
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FIR / 2. Transposed Direct Form

`Retiming': repeated application results in...



i.e. `transposed direct form '(named after 'transposed' state space model)

(=different software/hardware ('pipeline delays'), same i/o-behavior)

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FIR / 3. Lattice Realization

Derived from combined realization of...

$$H(z)$$
: $y[k] = b_0.u[k] + b_1.u[k-1] + ... + b_L.u[k-L]$

...with `flipped' version of H(z)

$$\tilde{H}(z) = z^{-L}.H(z^{-1}): \quad \tilde{y}[k] = b_L.u[k] + b_{L-1}.u[k-1] + ... + b_0.u[k-L]$$

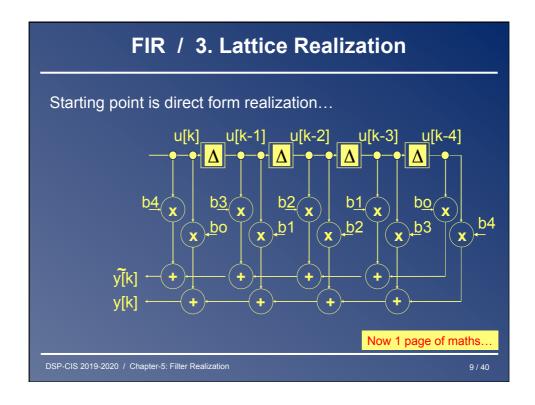
Reversed (real-valued) coefficient vector results in...

$$\left|\widetilde{H}(z)\right|_{z=e^{j\omega}}^2=\widetilde{H}(z).\widetilde{H}(z^{-1})\Big|_{z=e^{j\omega}}=\ldots=\left|H(z)\right|_{z=e^{j\omega}}^2$$

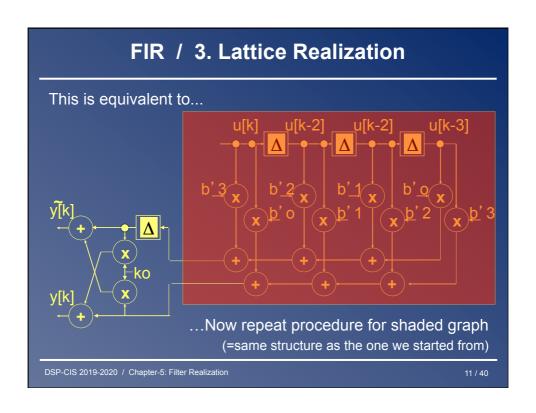
i.e. - same magnitude response

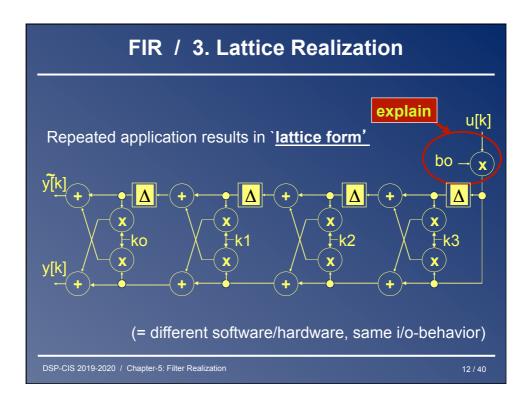
- different phase response

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FIR / 3. Lattice Realization
$$\begin{bmatrix} \tilde{Y}(z) \\ Y(z) \end{bmatrix} = \begin{bmatrix} b_4 & b_3 \\ b_0 & b_1 \end{bmatrix} \begin{bmatrix} b_2 & b_1 & b_0 \\ b_2 & b_3 & b_4 \end{bmatrix} \cdot \begin{bmatrix} 1 \ z^{-1} \ \dots \ z^{-4} \end{bmatrix}^T \cdot U(z)$$
With $\kappa_0 = \frac{b_4}{b_0}$ if $(b_0 \neq 0)$ and $(|\kappa_0| \neq 1)$ this can be rewritten as
$$\begin{bmatrix} \tilde{Y}(z) \\ Y(z) \end{bmatrix} = \begin{bmatrix} 1 & \kappa_0 \\ \kappa_0 & 1 \end{bmatrix} \begin{bmatrix} 0 & b_{13} & b_{12} & b_{13} & b_$$





FIR / 3. Lattice Realization

- Also known as `linear predictive coding (LPC) lattice '
 Ki's are so-called `reflection coefficients'
 Every set of bi's corresponds to a set of Ki's, and vice versa
- Procedure for computing Ki's from bi's corresponds to the well-known `Schur-Cohn' stability test (from control theory):
 Problem = for a given polynomial B(z), how do we find out if all the zeros of B(z) are 'stable' (i.e. lie inside unit circle)?
 Solution = from bi's, compute reflection coefficients Ki's (=procedure on previous slides). Zeros are (proved to be) stable iff all Ki's statisfy |Ki|<1!
- Procedure (page 10) breaks down if |Ki|=1 is encountered. Then have to select other realization (direct form, lossless lattice, ...) for B(z)
- Lattice form not overly relevant at this point, but sets stage for similar derivations that lead to more relevant realizations (read on...)

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FIR / 4. Lossless Lattice Realization

Derived from combined realization of H(z)...

$$H(z)$$
: $y[k] = b_0.u[k] + b_1.u[k-1] + ... + b_L.u[k-L]$

...with

$$\tilde{\tilde{H}}(z): \qquad \tilde{\tilde{y}}[k] = \tilde{\tilde{b}}_0.u[k] + \tilde{\tilde{b}}_1.u[k-1] + \dots + \tilde{\tilde{b}}_L.u[k-L]$$

...which is such that

$$H(z).H(z^{-1}) + \widetilde{\widetilde{H}}(z).\widetilde{\widetilde{H}}(z^{-1}) = 1$$
 (*)

PS: Interpretation?... (see next slide)

PS: May have to scale H(z) to achieve this (why?) (scaling omitted here)

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FIR / 4. Lossless Lattice Realization

PS: Interpretation?

When evaluated on the unit circle, formula (*) is equivalent to (for filters with real-valued coefficients)

$$|H(z)|_{z=e^{j\omega}}^{2} + |\widetilde{\widetilde{H}}(z)|_{z=e^{j\omega}}^{2} = 1$$

$$-\pi$$

$$|\widetilde{\widetilde{H}}(e^{j\omega})|^{2}$$

$$|H(e^{j\omega})|^{2}$$

i.e. $\frac{H(z)}{H(z)}$ and $\frac{\widetilde{H}(z)}{H(z)}$ are 'power complementary' (= form a 1-input/2-output 'lossless' system, see also below)

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FIR / 4. Lossless Lattice Realization

PS: How is $\frac{\widetilde{H}(z)}{\widetilde{H}(z)}$ computed ?

How is
$$H(z)$$
 computed?
$$\widetilde{\widetilde{H}}(z).\widetilde{\widetilde{H}}(z^{-1}) = \underbrace{1 - H(z).H(z^{-1})}_{R(z)}$$

Note that if $z_{i \text{ (and } z^*)}$ is a root of R(z), then $1/z_{i \text{ (and } 1/z^*)}$ is also a root of R(z). Hence can factorize R(z) as...

$$\tilde{\tilde{H}}(z).\tilde{\tilde{H}}(z^{-1}) = \alpha^2 \prod_i (z^{-1} - z_i)(z - z_i) \longrightarrow \tilde{\tilde{H}}(z) = \alpha \prod_i (z^{-1} - z_i)$$

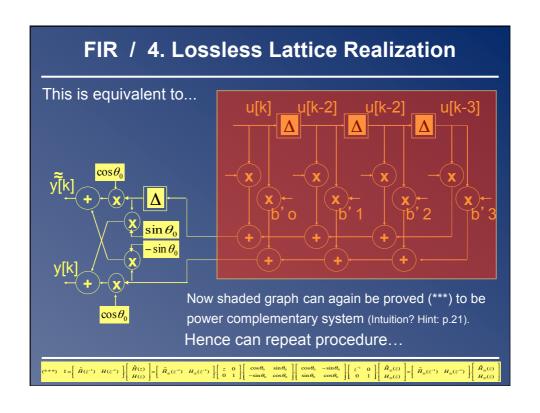
Note that z_i 's can be selected such that all roots of $\frac{\widetilde{H}(z)}{\widetilde{H}(z)}$ lie inside the unit circle, i.e. $\frac{\widetilde{H}(z)}{\widetilde{H}(z)}$ is a minimum-phase FIR filter.

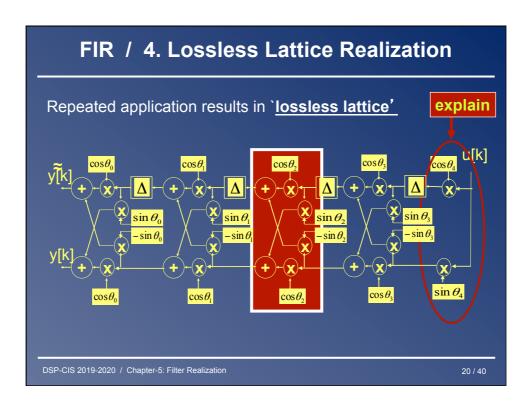
This is referred to as spectral factorization, $\frac{\widetilde{H}(z)}{H(z)}$ =spectral factor.

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FIR / 4. Lossless Lattice Realization
$$\begin{bmatrix} \tilde{Y}(z) \\ Y(z) \end{bmatrix} = \begin{bmatrix} \tilde{b}_0 \\ b_0 \\ b_1 \end{bmatrix} \begin{bmatrix} \tilde{b}_1 \\ b_2 \\ b_3 \end{bmatrix} \begin{bmatrix} \tilde{b}_4 \\ b_4 \\ b_4 \end{bmatrix} \cdot \begin{bmatrix} 1 \ z^{-1} \ \dots \ z^{-4} \end{bmatrix}^T \cdot U(z)$$
From (*) (page 14), it follows that (**)
$$b_0.b_4 + \tilde{b}_0.\tilde{b}_4 = 0 \implies \begin{bmatrix} \tilde{b}_0 \\ b_0 \end{bmatrix} \cdot \begin{bmatrix} \tilde{b}_4 \\ b_4 \end{bmatrix} = 0 \implies \begin{bmatrix} \tilde{b}_0 \\ b_0 \end{bmatrix} \perp \begin{bmatrix} \tilde{b}_4 \\ b_4 \end{bmatrix} = \text{orthogonal vectors}$$
Hence there exists a rotation angle θ_0 such that
$$\begin{bmatrix} \tilde{Y}(z) \\ Y(z) \end{bmatrix} = \begin{bmatrix} \cos\theta_0 & -\sin\theta_0 \\ \sin\theta_0 & \cos\theta_0 \end{bmatrix} \begin{bmatrix} 0 & \tilde{b}'_0 & \tilde{b}'_1 & \tilde{b}'_2 & \tilde{b}'_3 \\ b'_0 & b'_1 & b'_2 & b'_3 & 0 \end{bmatrix} \cdot \begin{bmatrix} 1 \ z^{-1} \ \dots \ z^{-4} \end{bmatrix}^T \cdot U(z)$$

$$= \begin{bmatrix} \cos\theta_0 & -\sin\theta_0 \\ \sin\theta_0 & \cos\theta_0 \end{bmatrix} \cdot \begin{bmatrix} z^{-1} & 0 \\ 0 & 1 \end{bmatrix} \cdot \begin{bmatrix} \tilde{b}'_0 & \tilde{b}'_1 & \tilde{b}'_2 & \tilde{b}'_3 \\ b'_0 & b'_1 & b'_2 & b'_3 \end{bmatrix} \begin{bmatrix} 1 \ z^{-1} \ \dots \ z^{-3} \end{bmatrix}^T \cdot U(z)$$
order reduction
$$(**) \ 1 - H(z) \cdot H(z^{-1}) + \tilde{H}(z) \cdot \tilde{H}(z^{-1}) - (b_0 \cdot b_4 + \tilde{b}_0 \cdot \tilde{b}_1) \cdot (z^4 + z^4) + (\omega) \cdot (z^3 + z^{-3}) + \dots + (\omega) \cdot z^{-3} \end{bmatrix} = 18/40$$





FIR / 4. Lossless Lattice Realization

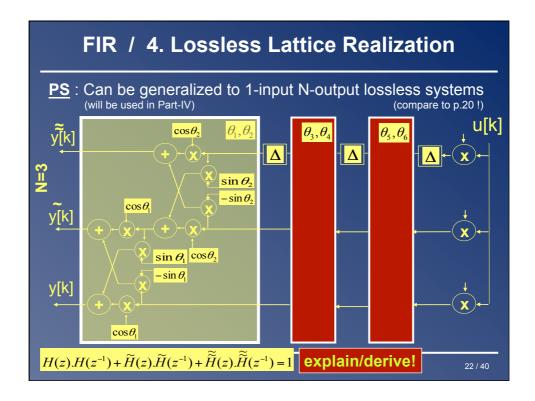
Lossless lattice:

- · Also known as `paraunitary lattice '
- Each 2-input/2-output section is based on an orthogonal transformation, which preserves norm/energy/power

$$\begin{bmatrix} OUT_1 \\ OUT_2 \end{bmatrix} = \begin{bmatrix} \cos\theta & -\sin\theta \\ \sin\theta & \cos\theta \end{bmatrix} \cdot \begin{bmatrix} IN_1 \\ IN_2 \end{bmatrix} \Rightarrow (IN_1)^2 + (IN_2)^2 = (OUT_1)^2 + (OUT_2)^2$$

i.e. forms a 2-input/2-output <u>lossless</u>' system (=time-domain view) Overall system is realized as cascade of lossless sections (+delays), hence is itself also <u>lossless</u>' (see p.15, =freq-domain view)

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IIR Filter Realization

IIR Filter Realization

=Construct (realize) LTI system (with delay elements, adders and multipliers), such that I/O behavior is given by..

$$H(z) = \frac{B(z)}{A(z)} = \frac{b_0 + b_1 z^{-1} + \dots + b_L z^{-L}}{1 + a_1 z^{-1} + \dots + a_L z^{-L}}$$

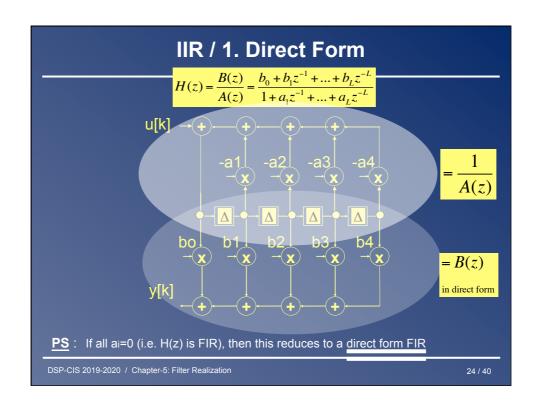
Several possibilities exist...

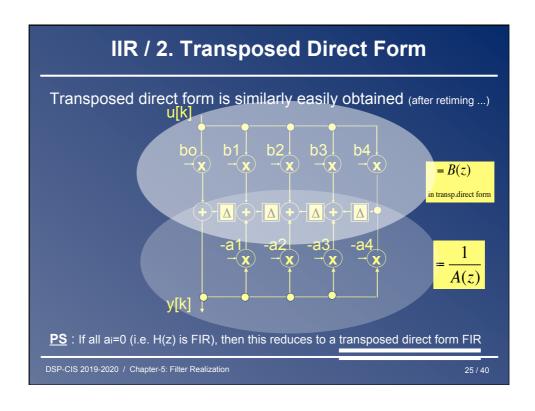
- 1. Direct form
- 2. Transposed direct form

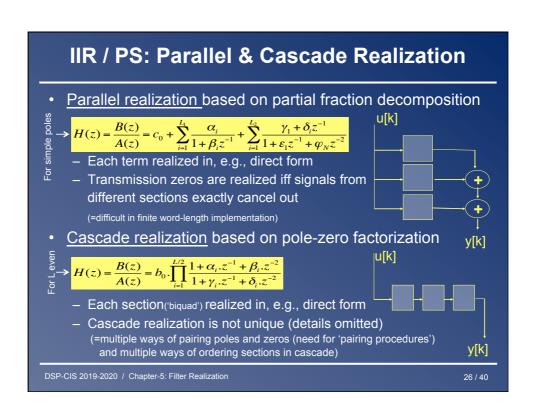
PS: Parallel and cascade realization

- 4. Lattice-ladder realization
- 5. Lossless lattice realization

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IIR / 3. Lattice-Ladder Realization

Derived from combined realization of

$$H(z) = \frac{B(z)}{A(z)} = \frac{b_0 + b_1 z^{-1} + \dots + b_L z^{-L}}{1 + a_1 z^{-1} + \dots + a_L z^{-L}}$$

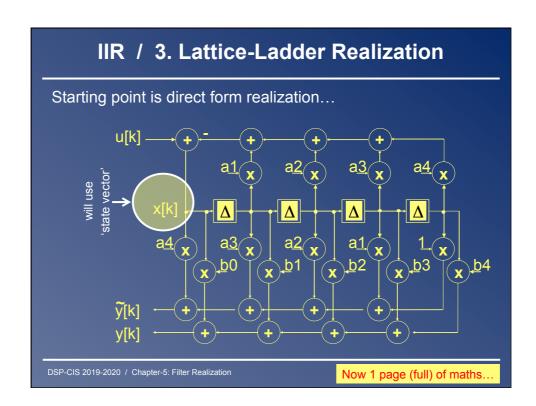
with...

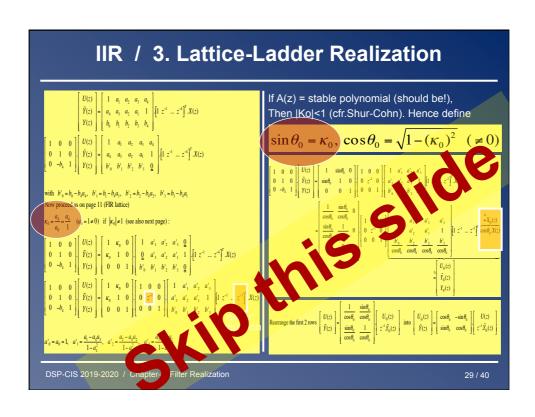
$$\tilde{H}(z) = \frac{\tilde{A}(z)}{A(z)} = \frac{a_L + a_{L-1}z^{-1} + \dots + 1.z^{-L}}{1 + a_1z^{-1} + \dots + a_Lz^{-L}}$$

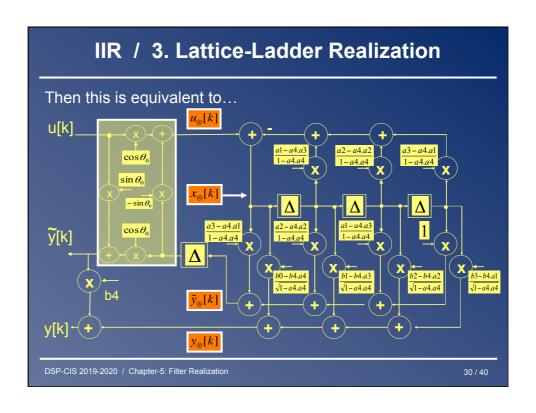
- Numerator polynomial is denominator polynomial with reversed coefficient vector (see also p.8)
- Hence $\widetilde{H}(z)$ is an `all-pass' (=`SISO lossless') filter:

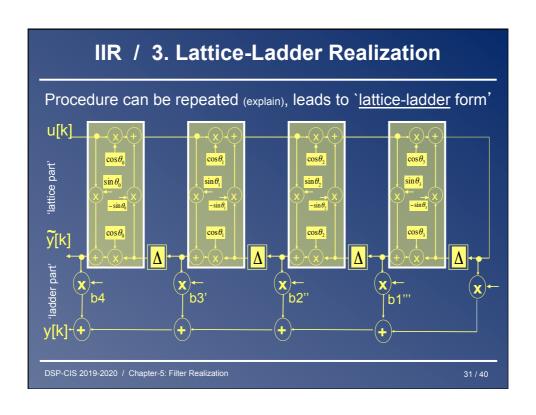
$$\tilde{H}(z).\tilde{H}(z^{-1}) = 1$$
 $\left| \tilde{H}(z) \right|_{z=e^{j\omega}}^{2} = \frac{\left| \tilde{A}(z) \right|_{z=e^{j\omega}}^{2}}{\left| A(z) \right|_{z=e^{j\omega}}^{2}} = 1$

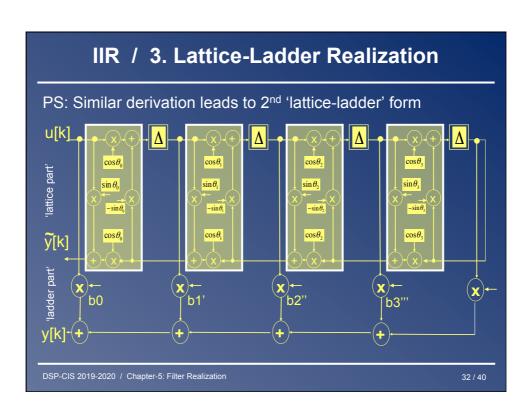
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IIR / 3. Lattice-Ladder Realization

- Ki's (=sin(thetai)!) are `reflection coefficients'
- Procedure for computing Ki's from ai's again corresponds to `Schur-Cohn' stability test
- Orthogonal transformations correspond to 2-input/2-output `lossless' sections (=time-domain view).

$$\begin{bmatrix} OUT_1 \\ OUT_2 \end{bmatrix} = \begin{bmatrix} \cos\theta & \sin\theta \\ -\sin\theta & \cos\theta \end{bmatrix} \cdot \begin{bmatrix} IN_1 \\ IN_2 \end{bmatrix} \Rightarrow (IN_1)^2 + (IN_2)^2 = (OUT_1)^2 + (OUT_2)^2$$

Cascade of lossless sections (+delays) is also `lossless' i.e. `all-pass' (see p.27, =freq-domain view)

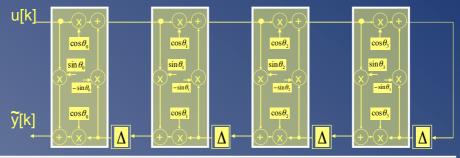
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IIR / 3. Lattice-Ladder Realization

<u>PS</u>: Note that the all-pass part corresponds to A(z) (i.e. L angles θ_i correspond to L coeffs while the ladder part corresponds to B(z). If all ai=0 (i.e. H(z) is FIR), then all θ_i =0, hence the all-pass part reduces to a delay line, and the lattice-ladder form reduces to a **direct-form FIR**.

 \underline{PS} : `All-pass' part (SISO u[k]->y[k]) is known as ` $\underline{Gray-Markel}$ ' structure



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IIR / 4. Lossless Lattice Realization

Derived from combined realization of (possibly rescaled, as on p.14)

$$H(z) = \frac{B(z)}{A(z)} = \frac{b_0 + b_1 z^{-1} + \dots + b_L z^{-L}}{1 + a_1 z^{-1} + \dots + a_L z^{-L}}$$

with...

$$\tilde{\tilde{H}}(z) = \frac{\tilde{\tilde{B}}(z)}{A(z)} = \frac{\tilde{\tilde{b}}_0 + \tilde{\tilde{b}}_1 \cdot z^{-1} + \dots + \tilde{\tilde{b}}_L \cdot z^{-L}}{1 + a_1 z^{-1} + \dots + a_L z^{-L}}$$

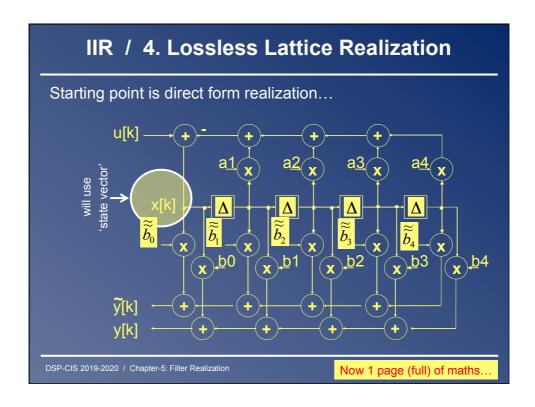
such that...

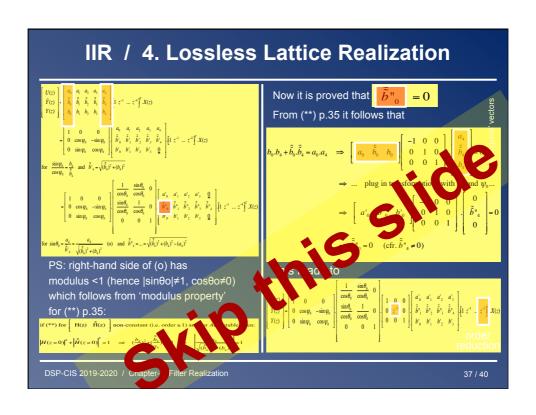
$$H(z).H(z^{-1}) + \tilde{\tilde{H}}(z).\tilde{\tilde{H}}(z^{-1}) = 1$$

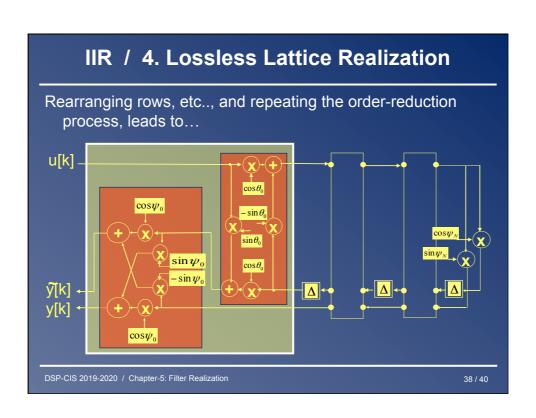
$$\Rightarrow B(z).B(z^{-1}) + \tilde{\tilde{B}}(z).\tilde{\tilde{B}}(z^{-1}) = A(z).A(z^{-1})$$
(**)

i.e. $\frac{\widetilde{H}(z)}{\widetilde{H}(z)}$ and $\frac{H(z)}{\widetilde{H}(z)}$ are `power complementary' (p.15)

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IIR / 4. Lossless Lattice Realization

Orthogonal transformations correspond to (3-input 3-output)
 lossless sections '

$$\begin{bmatrix} OUT_1 \\ OUT_2 \\ OUT_3 \end{bmatrix} = \begin{bmatrix} . & . & . \\ . & . & . \\ . & . & . \end{bmatrix} \begin{bmatrix} IN_1 \\ IN_2 \\ IN_3 \end{bmatrix}$$

$$\Rightarrow (IN_1)^2 + (IN_2)^2 + (IN_3)^2 = (OUT_1)^2 + (OUT_2)^2 + (OUT_3)^2$$

Overall system is realized as cascade of lossless sections (+delays), hence is itself also 'lossless'

- <u>PS</u>: If all a_i=0 (i.e. H(z) is FIR), then all θ_i=0 and then this reduces to <u>FIR lossless lattice</u>
- <u>PS</u> : If all φ≔0, then this reduces to Gray-Markel structure

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