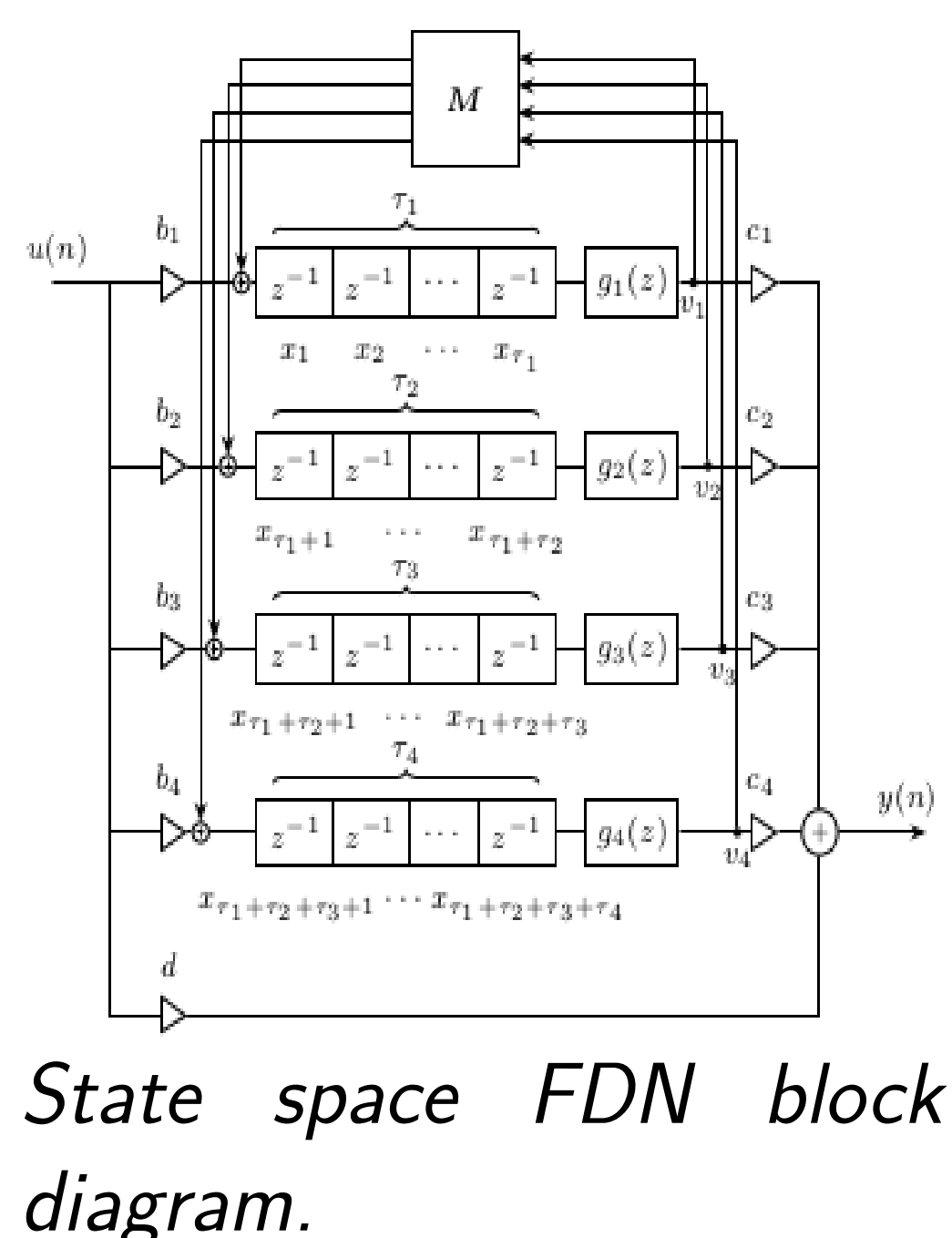


## Objectives

- Find the modal decomposition of Delay Network Reverberators using a state space formulation.
- Introduce a parameterized orthonormal mixing matrix which can be continuously varied from identity to Hadamard.
- Investigate the effect of smoothly varying mixing matrix on frequency and damping of modes of Delay Network Reverberators, including Feedback Delay Network (FDN) reverberators.
- Quantify the perceptual effect of increasing mixing by calculating the Normalized Echo Density (NED) of Feedback Delay Network (FDN) impulse responses over time.
- Derive an empirical relationship between mixing matrix, average delay line length and mixing time of the FDN reverberator.

## Delay Network Reverberators

- Used to synthesize reverberation.
- Impulse response has a set of sparse early reflections with increasing density over time.
- Feedback delay networks have a unitary feedback matrix (mixing matrix),  $M$ , to mix the outputs of the delay lines [1].



- FDN reverberators have delay line filters,  $g_i(z)$ , to yield a single desired frequency dependent  $T_{60}$  response [2].
- Delay Network Reverberator design parameters are mixing matrix, shelf filters and number and length of delay lines.

## References

- [1] M. Gerzon, "Unitary (energy-preserving) multichannel networks with feedback," *Electronics Letters*, vol. 12, no. 11, pp. 278-279, 1976.
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- [3] G. Weinreich, "Coupled piano strings," *The Journal of the Acoustical Society of America*, vol. 62, no. 6, pp. 1474-1484, 1977.
- [4] J. S. Abel and P. Huang, "A simple, robust measure of reverberation echo density," in *Audio Engineering Society Convention 121*. Audio Engineering Society, 2006.
- [5] S. J. Schlecht and E. A. Habets, "Feedback delay networks: Echo density and mixing time," *IEEE/ACM Transactions on Audio, Speech, and Language Processing*, vol. 25, no. 2, pp. 374-383, 2017.

## Modal Decomposition

- State space equations:
 
$$\mathbf{x}(n) = \mathbf{A}\mathbf{x}(n-1) + \mathbf{b}u(n)$$

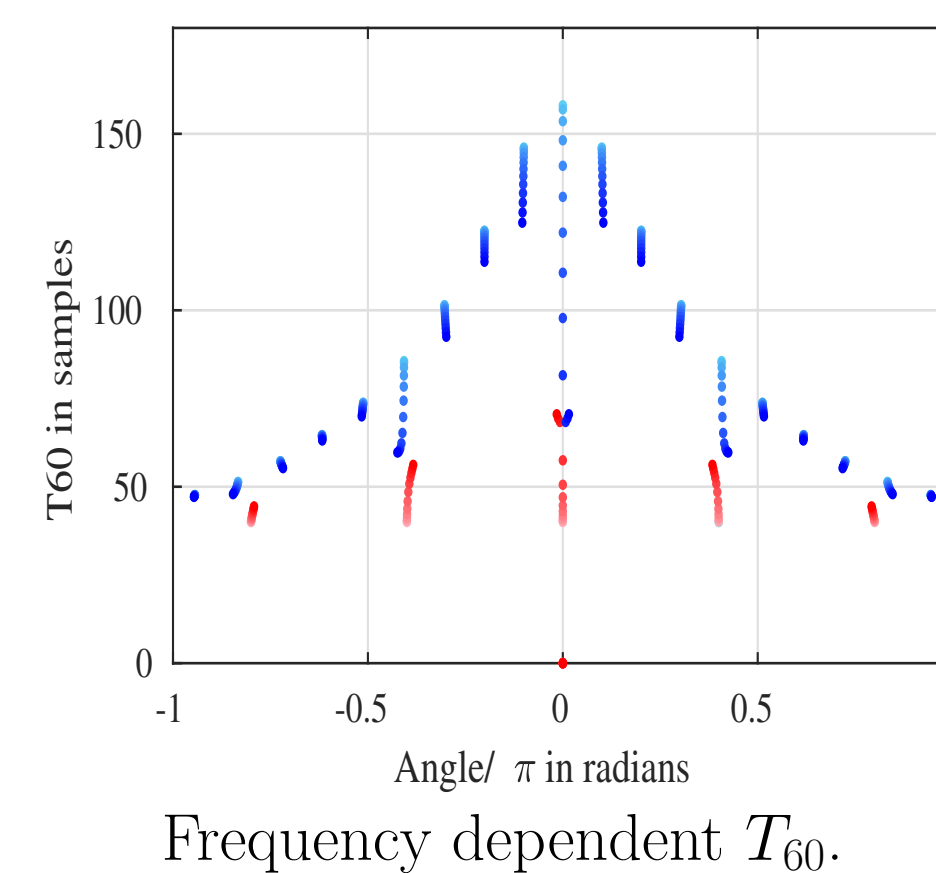
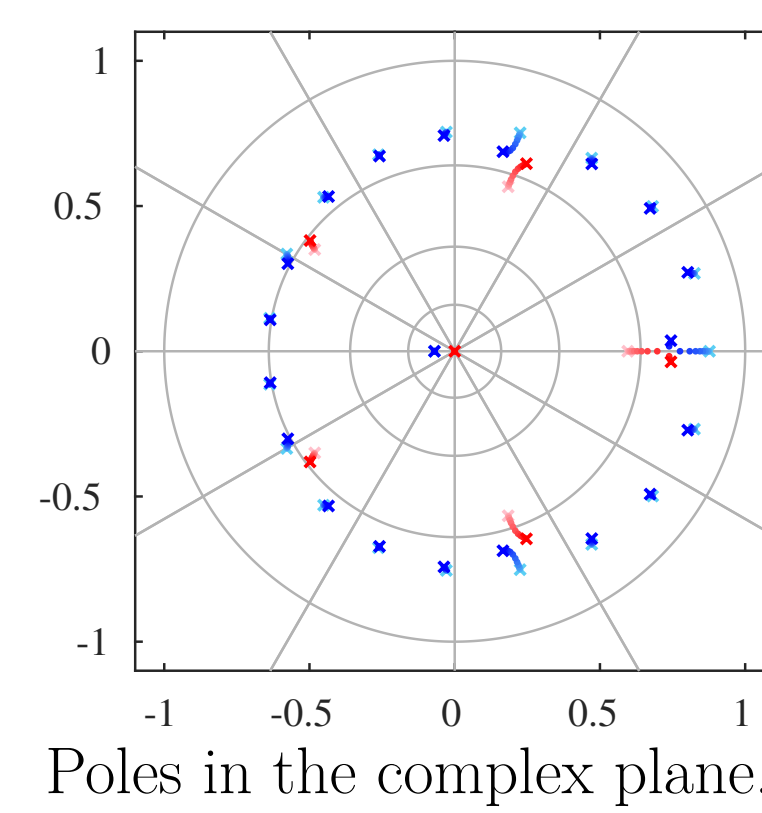
$$y(n) = \mathbf{c}^T\mathbf{x}(n) + du(n)$$
- Modes of the DNR are the eigenvalues of the state transition matrix  $\mathbf{A}$ .
- $\mathbf{A}$  is a sparse block matrix whose order is the sum of delay line lengths. The sub-matrix sizes are given by the delay line lengths plus the associated filter order.

## Mixing Matrix Effect

$$\mathbf{R}(\theta) = \begin{bmatrix} \cos \theta & \sin \theta \\ -\sin \theta & \cos \theta \end{bmatrix}$$

$$\mathbf{M}(\theta) = \mathbf{R}(\theta) \otimes \mathbf{R}(\theta) \otimes \dots \otimes \mathbf{R}(\theta)$$

- $\mathbf{M}(0) = \mathbf{I}$ , identity matrix (parallel delay lines).
- $\mathbf{M}(\frac{\pi}{4}) = \mathbf{H}$ , Hadamard matrix (maximum mixing among delay lines).
- Vary  $\theta$  (mixing angle) in small increments from 0 to  $\frac{\pi}{4}$ .
- With more mixing, modes that are close in frequency approach each other in damping rapidly and then deflect in frequency.
- Damping of low frequency modes affected more than damping of high frequency modes.
- Similar behavior is observed in piano strings [3].



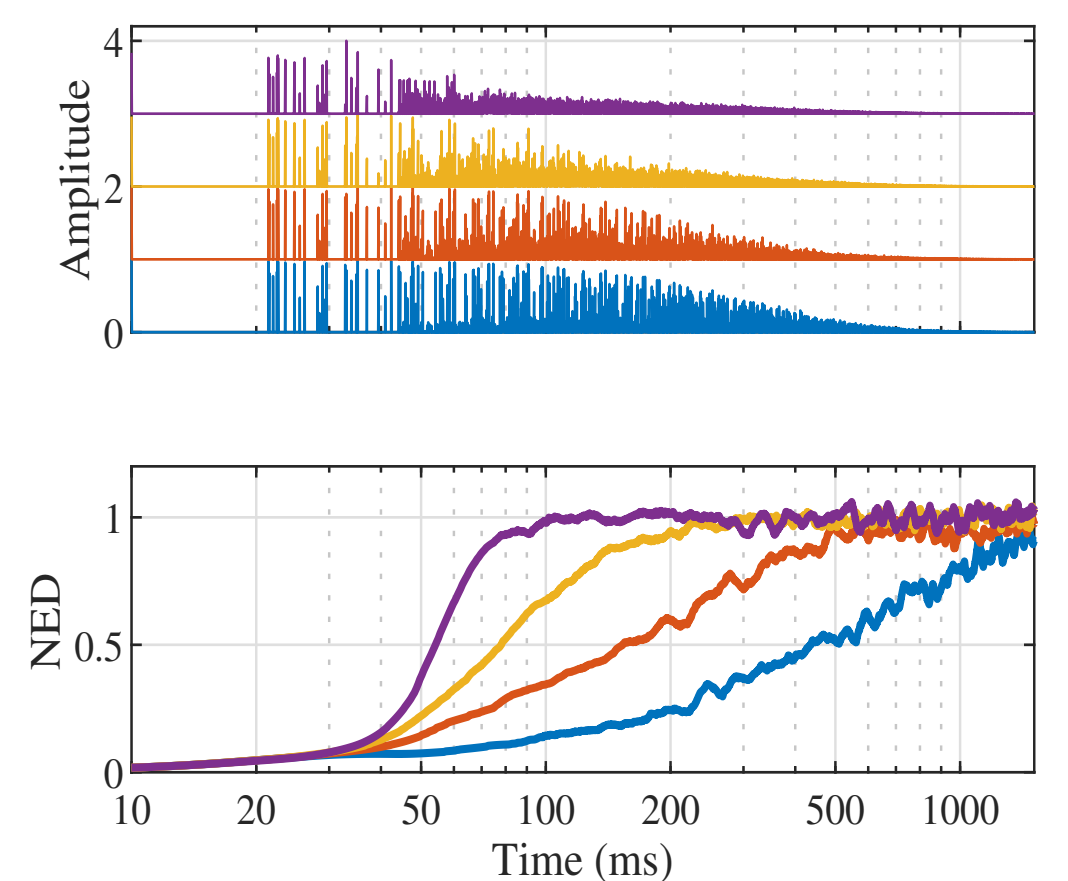
Two delay line example. Red indicates scalar gain, blue indicates shelf filter in delay line.

## Decay Filter Design

- In FDN reverberators, decay filters are designed such that all delay lines independently produce the same  $T_{60}$  frequency response.
- Physical rooms produce multiple, concurrent  $T_{60}$  responses.
- One set of filters can model air absorption, another set of filters can model absorption by materials in the room.
- Mixing matrix can emulate occupancy or clutter of a room, or coupled rooms.

## Echo Density

- Normalized Echo Density (NED) profile [4] is a perceptual measure of echo density over time, and is used to indicate mixing time.
- NED is calculated for a 16 delay line FDN with random delay lengths uniformly distributed between 10-20 ms at a sampling frequency of 48 kHz with  $T_{60DC} = 4$  s and  $T_{60Nyquist} = 2$  s.

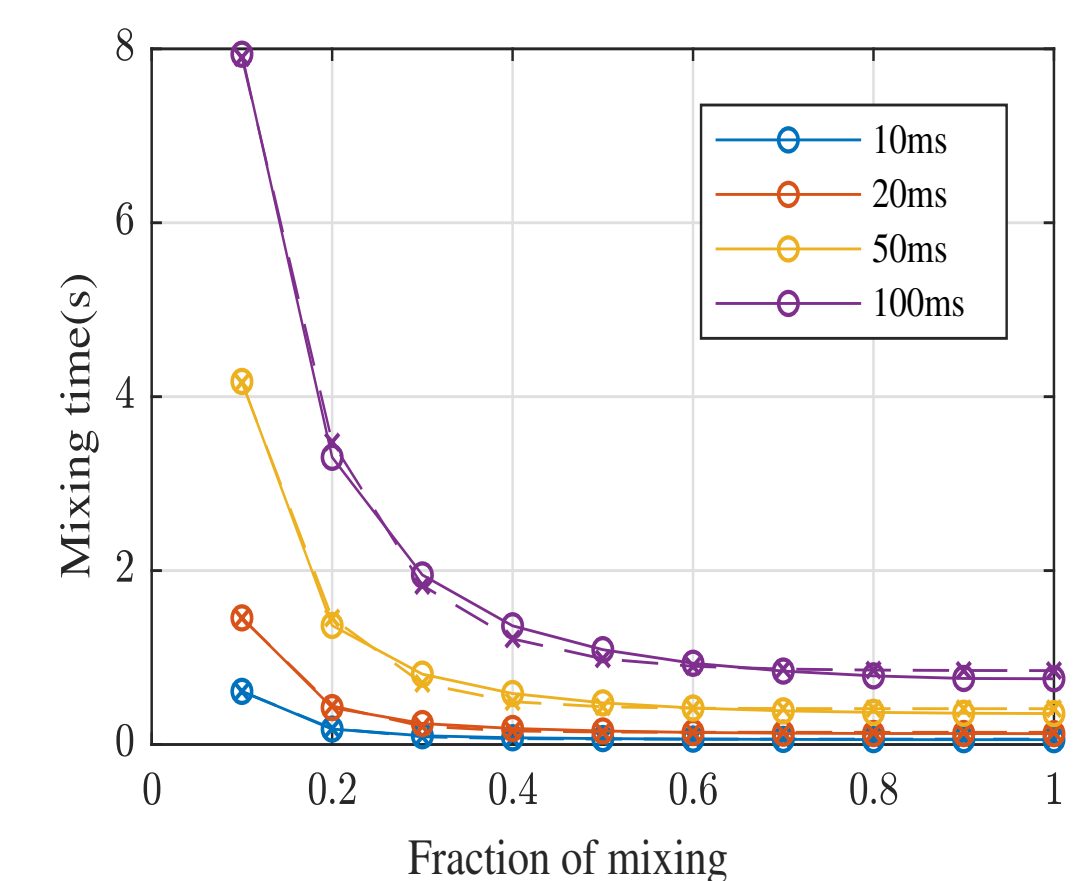


Impulse Responses and NED profiles for mixing matrices with 10%, 20%, 30%, and 100% mixing (bottom to top).

- Reverberator impulse response becomes Gaussian more quickly with increase in mixing.

## Mixing Time

- Defined as the time when NED reaches the threshold of 0.9.
- Schlecht [5] has a mechanism to determine the mixing time given a mean delay line length for a random orthogonal mixing matrix.
- Here we have a closed form expression for mixing time vs. mixing angle given a mean delay line length.
- Monte Carlo simulations performed for 4 mean delay line lengths,  $\bar{\tau} = 10, 20, 50, 100$  ms.



Mixing time as a function of mixing angle  $\theta$  (divided by  $\frac{\pi}{4}$ ).

$$t_{mix} = 0.25\bar{\tau} \exp[-(20.25 - 0.09\bar{\tau})\theta]$$

## Conclusion

- Explicitly derived the modal decomposition of delay network reverberators.
- Described how mixing affects modal behavior, NED profile and mixing time.
- Derived closed-form expression for mixing time vs. mixing angle.