

# Efficient structures for

## Decimators and Interpolators

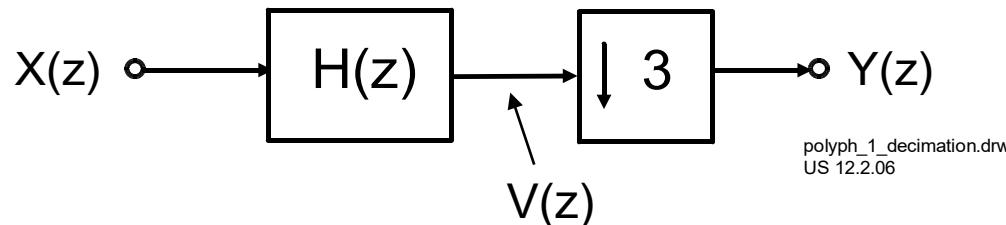
- An implementation example for an efficient structure for a decimator by a factor 3
- An implementation example for an efficient structure for an interpolator by a factor 3
- Multirate filters with optimum value for M for minimum computational effort

### Änderungen/Korrekturen:

06-Nov-11	Folien 32-35 ergänzt (Kzr)
11-Nov-12	Folien 43-47 komplett überarbeitet, Zeichnungen geändert,
06-Nov-13	Folien 18 kein Delay erforderlich
14-Nov-13	Folien 35 Bild gelöscht, farbige Markierung
24-Oct-14	Folien 35 Bedeutung der Filter geändert
24-Oct-14	Folien 43 Low-pass und High-pass im Bild vertauscht
11-Oct-16	Folie 32 $X_i(n) \rightarrow X_i(z)$ , $i=1, 2, 3, 4$ ersetzt im obigen Bild
14-Jun-19	Dateinamen. Struktur neu aufgebaut

## Decimation by 3: efficient structure [1]

- A decimation filter with decimation factor 3 (note:  $H(z)$  operates on **higher Fs**)



- We assume that  $H(z)$  is realized by using an **FIR filter**, transfer function  $H(z)$
- For demonstration purposes, we assume a filter degree of the filter, **N=8**.
- Thus

$$H(z) = V(z) / X(z)$$

$$\begin{aligned} H(z) = & b_0 + b_1 \cdot z^{-1} + b_2 \cdot z^{-2} + b_3 \cdot z^{-3} + b_4 \cdot z^{-4} \dots \\ & + b_5 \cdot z^{-5} + b_6 \cdot z^{-6} + b_7 \cdot z^{-7} + b_8 \cdot z^{-8} \end{aligned}$$

## Decimation by 3: efficient structure [2]

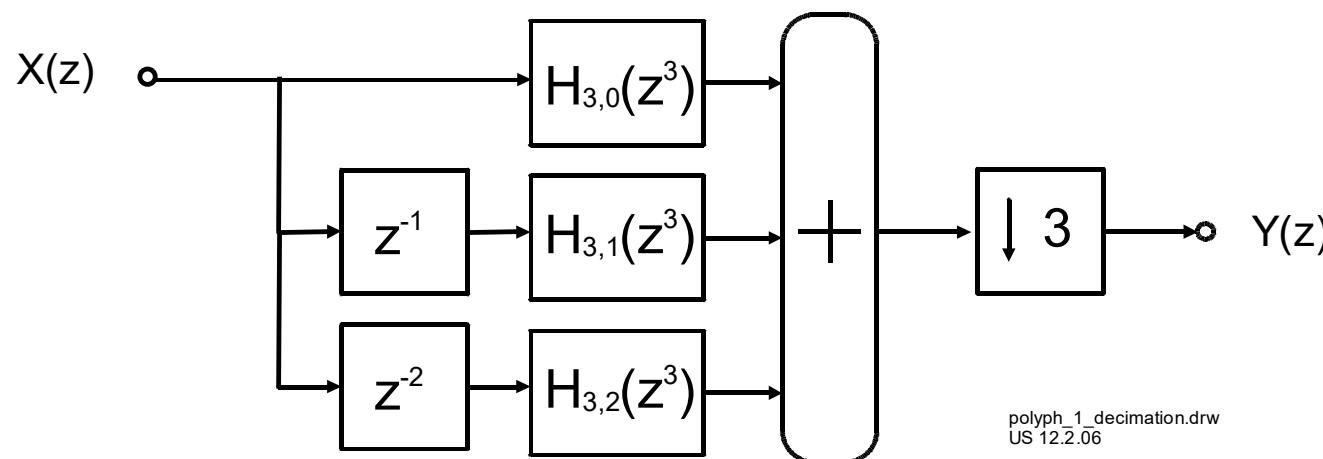
The polyphase decomposition for  $M=3$  : (note : components are in  $z^3$ )

$$H(z) = H_{3,0}(z^3) + z^{-1} \cdot H_{3,1}(z^3) + z^{-2} \cdot H_{3,2}(z^3)$$

$$H_{3,0}(z^3) = b_0 + b_3 \cdot z^{-3} + b_6 \cdot z^{-6},$$

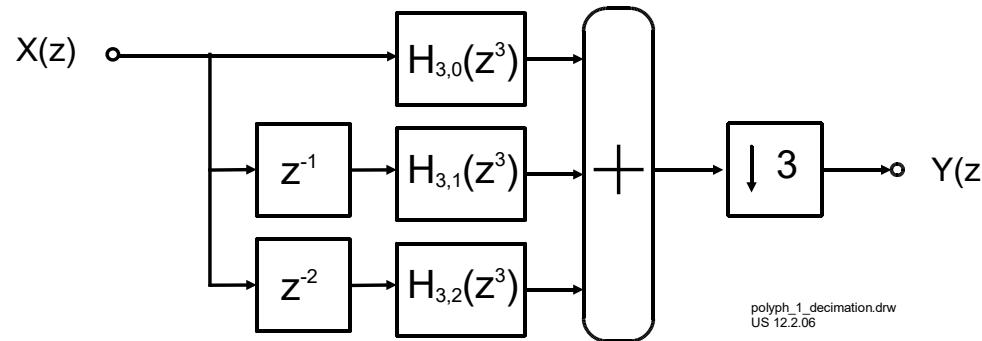
$$H_{3,1}(z^3) = b_1 + b_4 \cdot z^{-3} + b_7 \cdot z^{-6},$$

$$H_{3,2}(z^3) = b_2 + b_5 \cdot z^{-3} + b_8 \cdot z^{-6}$$

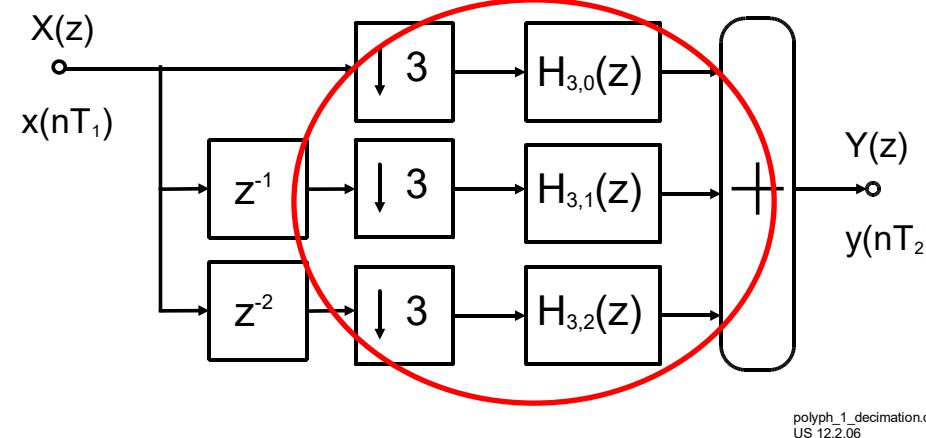


## Decimation by 3: efficient structure [3]

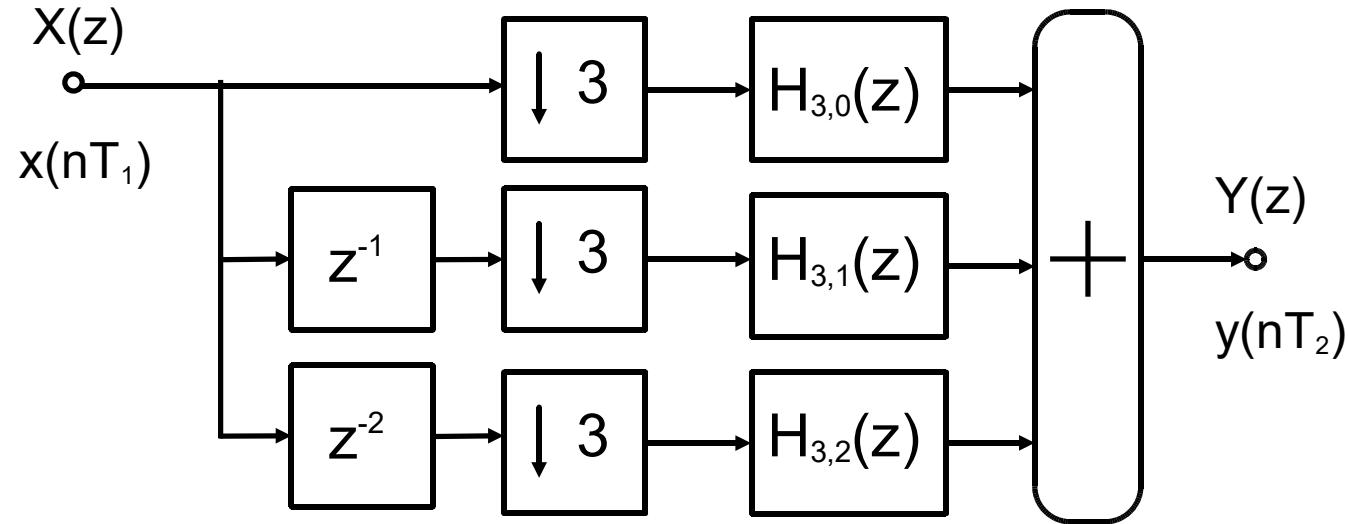
Again: Polyphase structure for decimation (delays are on input side)



Using first **noble** identity, we obtain (note  $H(\cdot)$  is now in  $z$ , not  $z^3$  any more !!)



## Decimation by 3: efficient structure [4]

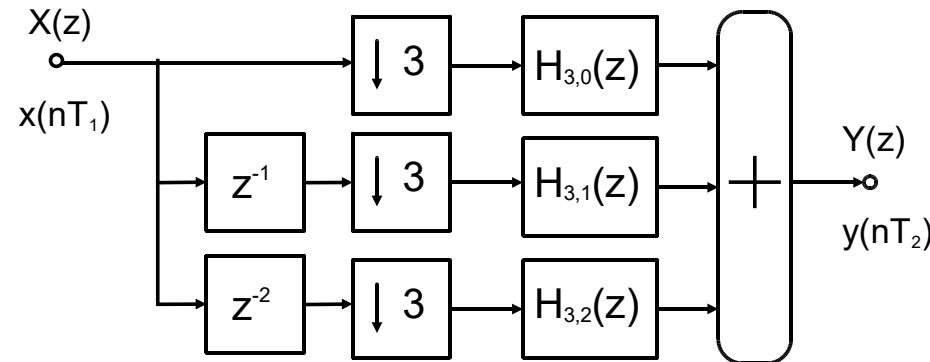


polyph\_1\_decimation.drw  
US 12.2.06

- Some **important** remarks for decimation
  - Samples  $x[3nT_1]$  are sent to → polyphase filter  $H_{3,0}(z)$
  - Samples  $x[3nT_1-1]$  are sent to → polyphase filter  $H_{3,1}(z)$
  - Samples  $x[3nT_1-2]$  are sent to → polyphase filter  $H_{3,2}(z)$

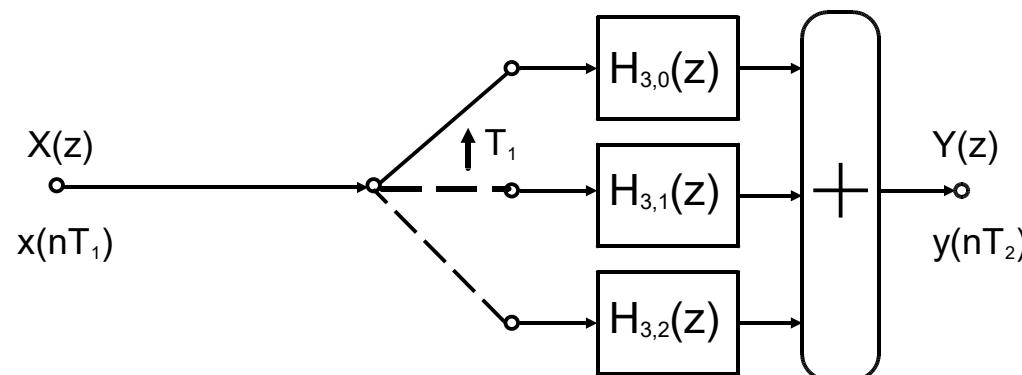
## Decimation by 3: efficient structure [5]

Again the previous structure with  $H_{3,0}, H_{3,1}, H_{3,2}$  in z



polyph\_1\_decimation.drw  
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**Efficient:** Using a de-interleaver instead, which rotates anti-clockwise with  $1/T_1$



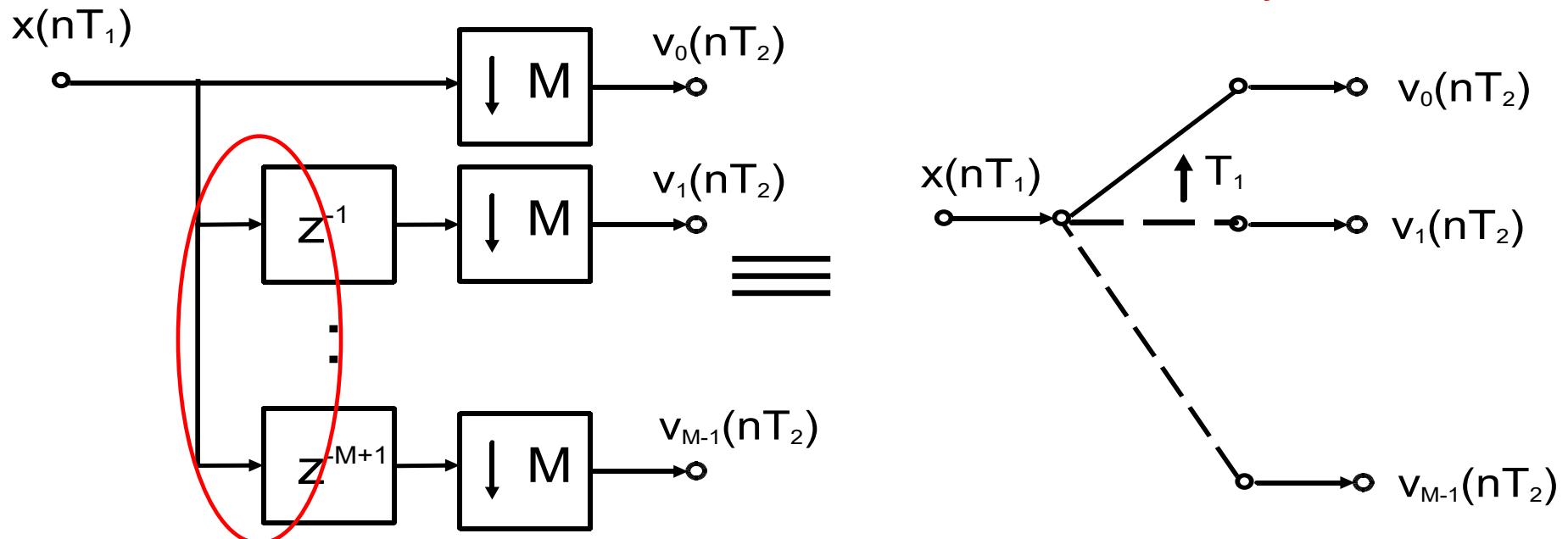
Important remark: the diagram to the left just shows the principle. It is not yet 100% correct.

polyph\_1\_decimation.drw  
US 12.2.06

## General de-interleaver (for general M)

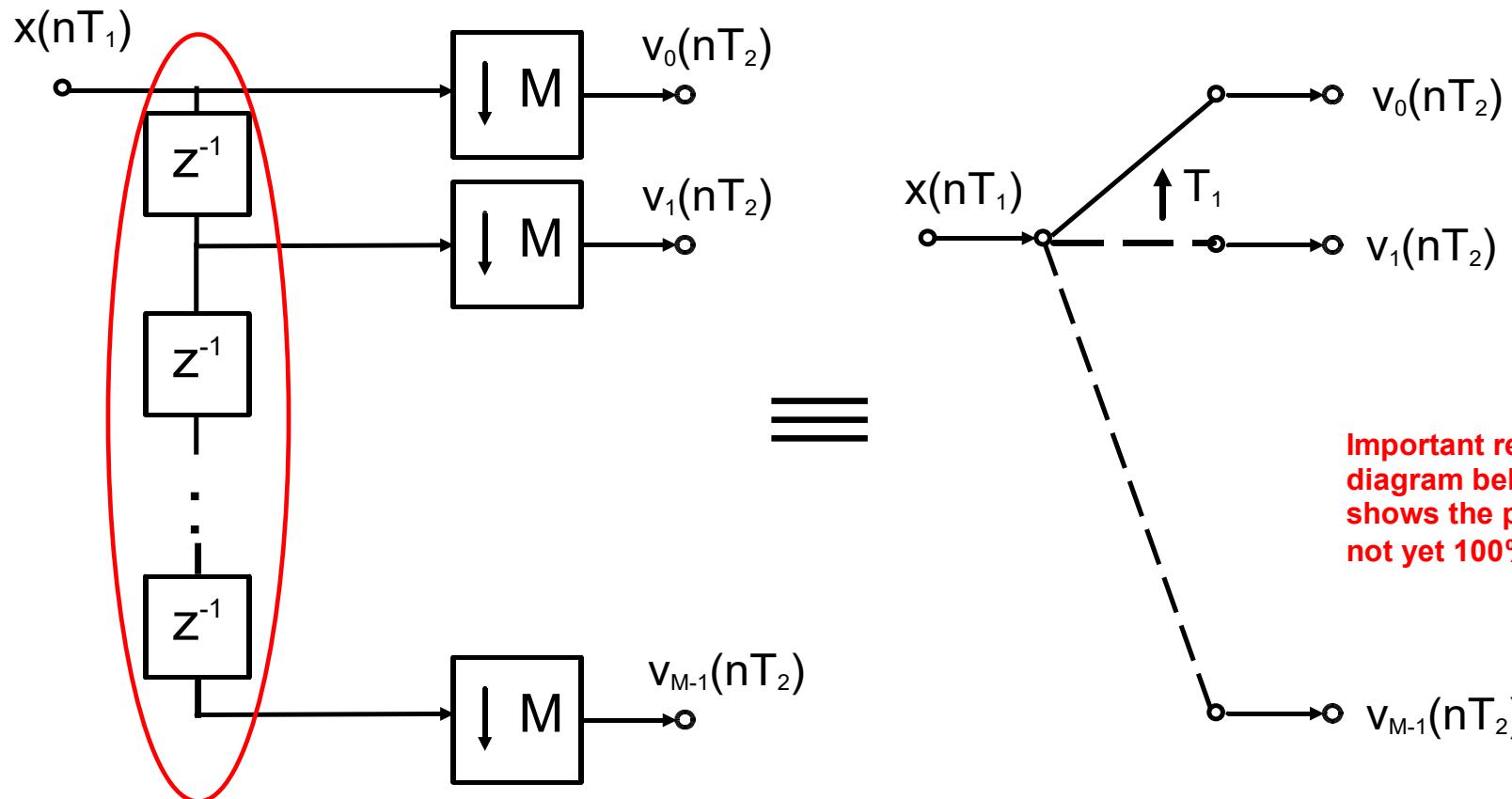
- The two signal-flow diagrams for the de-interleaver on this and on the next slide are equivalent
- The switch rotates anti-clockwise with  $1/T_1$

Important remark: the diagram below just shows the principle. It is not yet 100% correct.



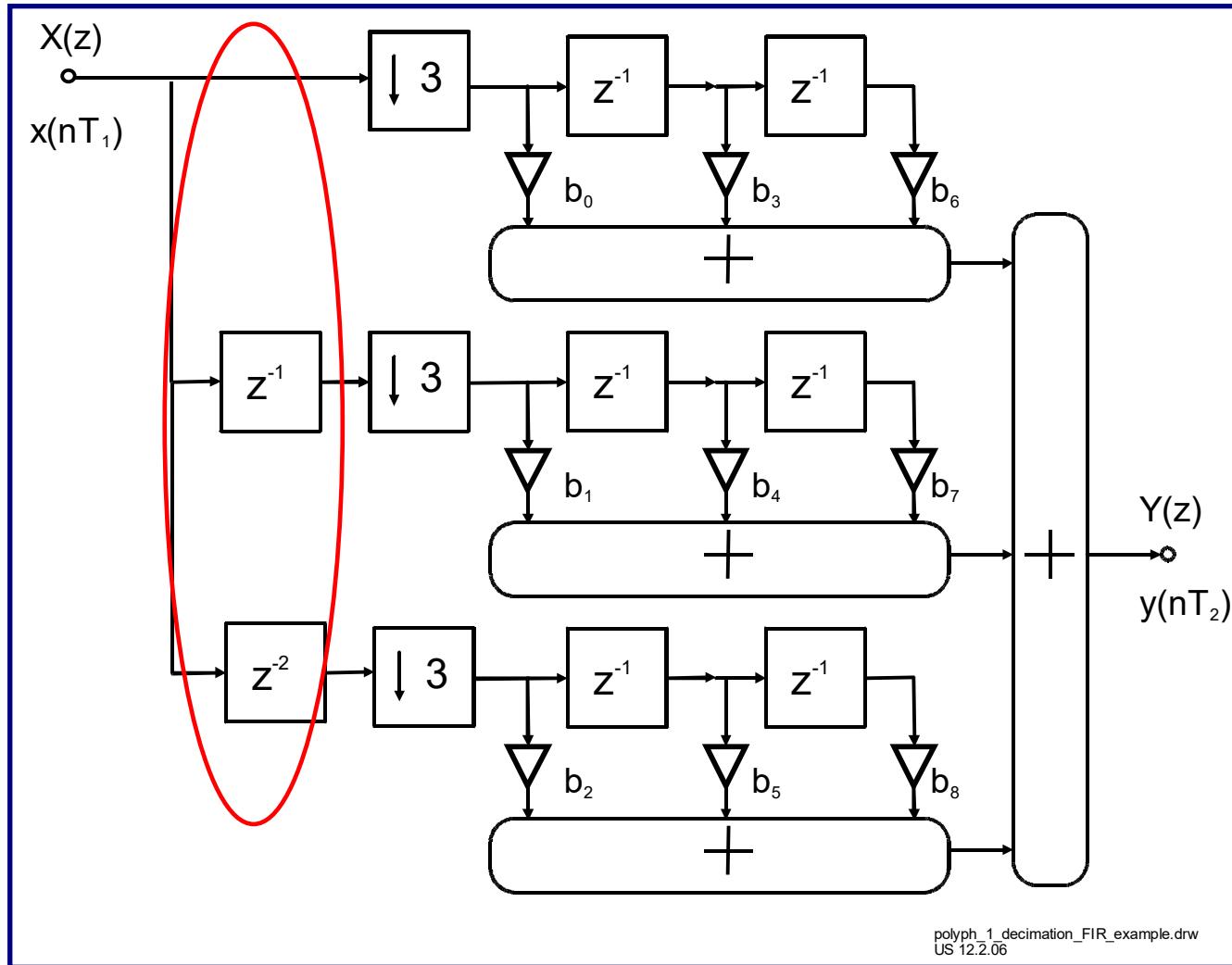
## General de-interleaver (for general M)

- The two signal-flow diagrams for the de-interleaver on this and on the [previous slide](#) are equivalent. The switch rotates anti-clockwise with  $1/T_1$



polyph\_1\_de\_interleaver.drw  
US 16.2.06, 3.4.06

## Decimation by 3: a) final efficient structure for N=8 [6]

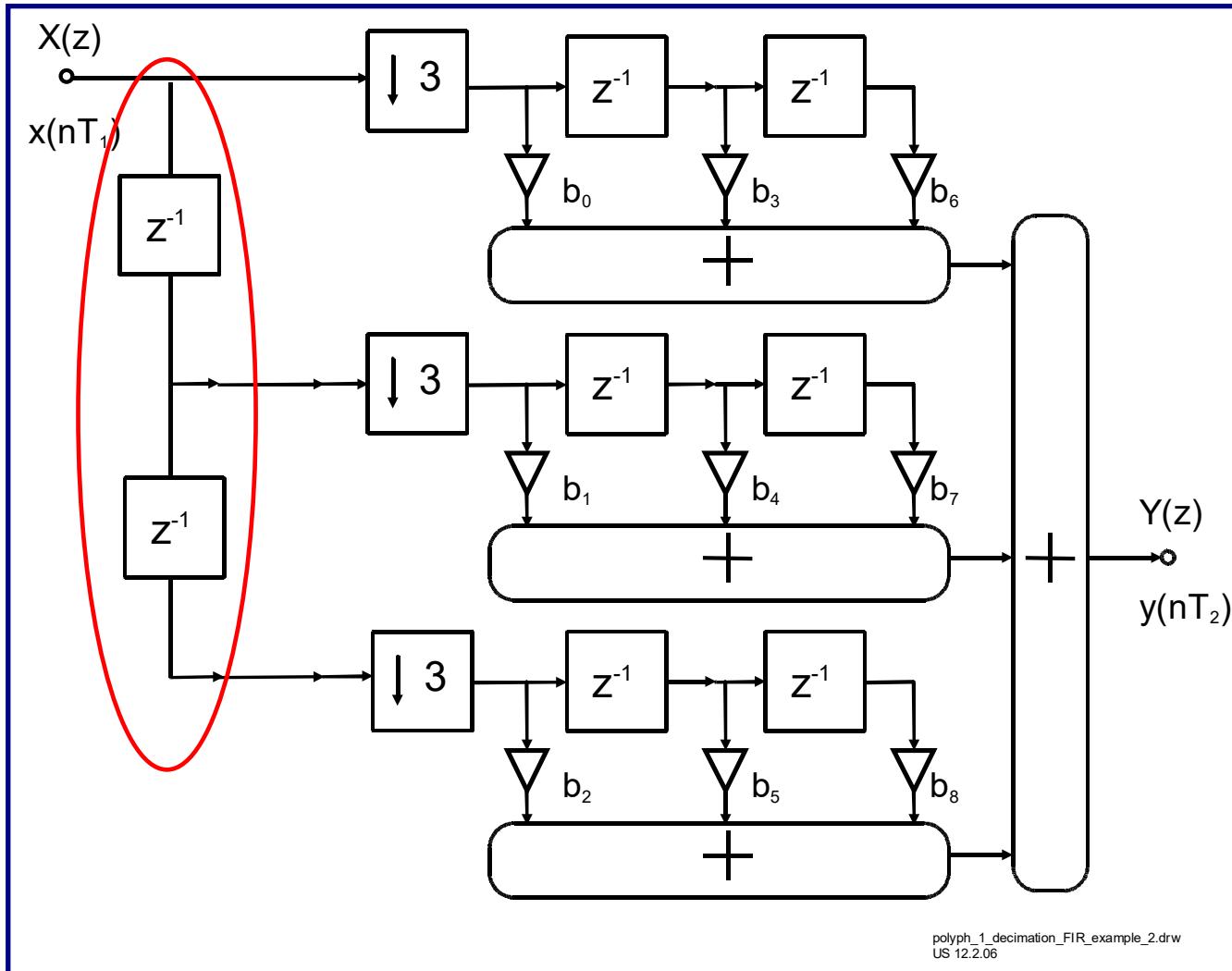


$$H_{3,0}(z) = b_0 + b_3 \cdot z^{-1} + b_6 \cdot z^{-2},$$

$$H_{3,1}(z) = b_1 + b_4 \cdot z^{-1} + b_7 \cdot z^{-2},$$

$$H_{3,2}(z) = b_2 + b_5 \cdot z^{-1} + b_8 \cdot z^{-2}$$

## Decimation by 3: b) final efficient structure for N=8 [7]



**Note:**  
different de-interleaver,  
**same behavior**

$$H_{3,0}(z) = b_0 + b_3 \cdot z^{-1} + b_6 \cdot z^{-2},$$

$$H_{3,1}(z) = b_1 + b_4 \cdot z^{-1} + b_7 \cdot z^{-2},$$

$$H_{3,2}(z) = b_2 + b_5 \cdot z^{-1} + b_8 \cdot z^{-2}$$

## Decimation by 3: b) MATLAB [8]

### MATLAB implementation:

- The delays are updated on Fs
- NO de-interleaver yet
- Quite Efficient decimation by 3, which can still be improved (see later)

```
% kernel from sim_L1_M3.m

MM=3;
% the coefficients
b_filt_b0_b3_usw = b_fir(1:MM:length(b_fir));
b_filt_b1_b4_usw = b_fir(2:MM:length(b_fir));
b_filt_b2_b5_usw = b_fir(3:MM:length(b_fir));

% the delays
H_filt_30_delays = zeros(1,length(b_filt_b0_b3_usw));
H_filt_31_delays = zeros(1,length(b_filt_b1_b4_usw));
H_filt_32_delays = zeros(1,length(b_filt_b2_b5_usw));

% filter x(n)
y=zeros(1,N_samp/MM);
mx=0;

% delays
D1 = 0;
D2 = 0;

%%%%%%%%%%%%%
for kx=1:N_samp

    if rem(kx-1,MM)==0 % shift filter delays, calculate output only one out of 3 times
        mx = mx + 1;
        H_filt_30_delays = [x(kx), H_filt_30_delays(1:length(H_filt_30_delays)-1)];
        H_filt_31_delays = [D1, H_filt_31_delays(1:length(H_filt_31_delays)-1)];
        H_filt_32_delays = [D2, H_filt_32_delays(1:length(H_filt_32_delays)-1)];

        y_part1(mx)= b_filt_b0_b3_usw * H_filt_30_delays';
        y_part2(mx)= b_filt_b1_b4_usw * H_filt_31_delays';
        y_part3(mx)= b_filt_b2_b5_usw * H_filt_32_delays';

        y(mx) = y_part1(mx) + y_part2(mx) + y_part3(mx);
    end

    D2 = D1;           % shift D1 and D2 always
    D1 = x(kx);
end
```

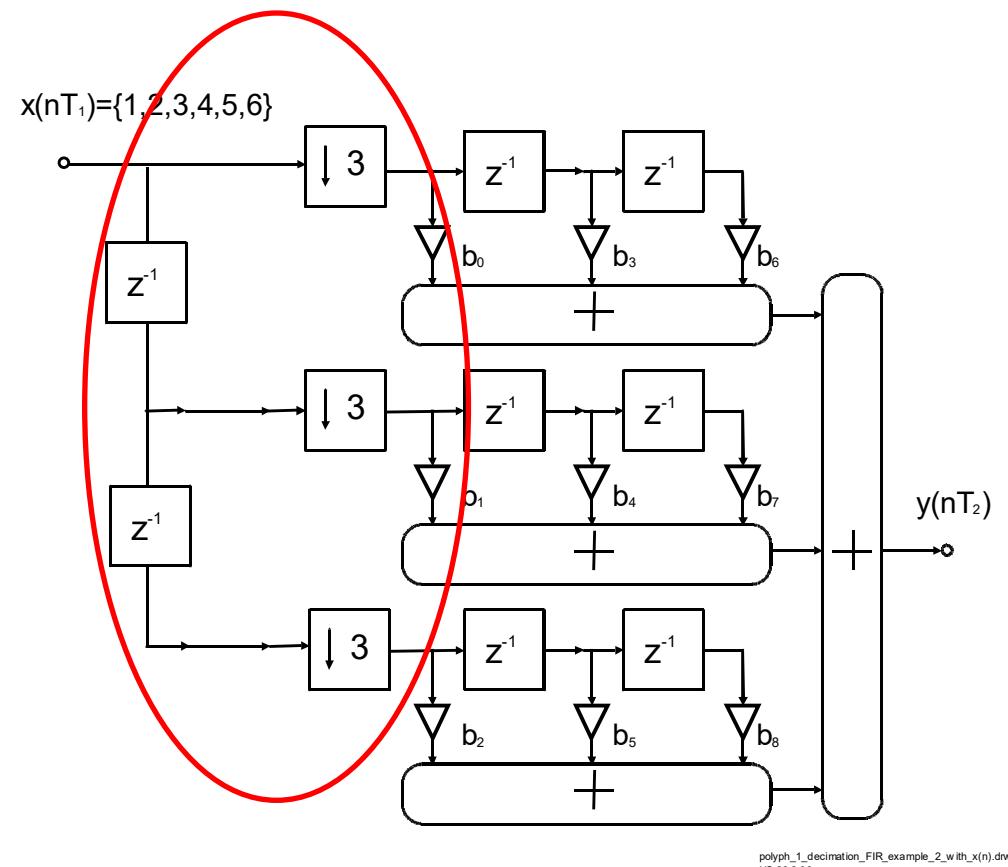
**Important remark: the MATLAB code contains the corrections (delays...) already.**

## Decimation by 3: b) how to program even more efficiently [1]

- Looking again at the signal-flow diagram it is clear that the computation of the decimation filter output signal can be implemented in various modes
  - Block mode:  
the filter output signal is computed in “one step”. This means that a large number of operations has to be carried out during this “one step”, while few operations (update of delays only ...) have to be carried out during other time instances. It should be mentioned that “block mode” requires additional delay elements for buffering...
  - SISO-mode (**Serial-In-Serial-Out**) mode:  
The DSP receives input-INTerrupts and output-INTerrupts depending upon the input- and output sampling frequencies and processes the samples on a serial basis. Example: for  $F_{s,in}=48$  kHz and  $F_{s,out}=16$  kHz, there is **one** sample at the output for every block of **three** samples at the input.
  - We will consider the SISO-mode (**Serial-In-Serial-Out**) mode in this lecture only. For block-mode, see ref. [1].
    - SISO-mode: very efficient implementation, steering of the circuit more complex
    - Block mode: less efficient (more RAM required), “simple” steering

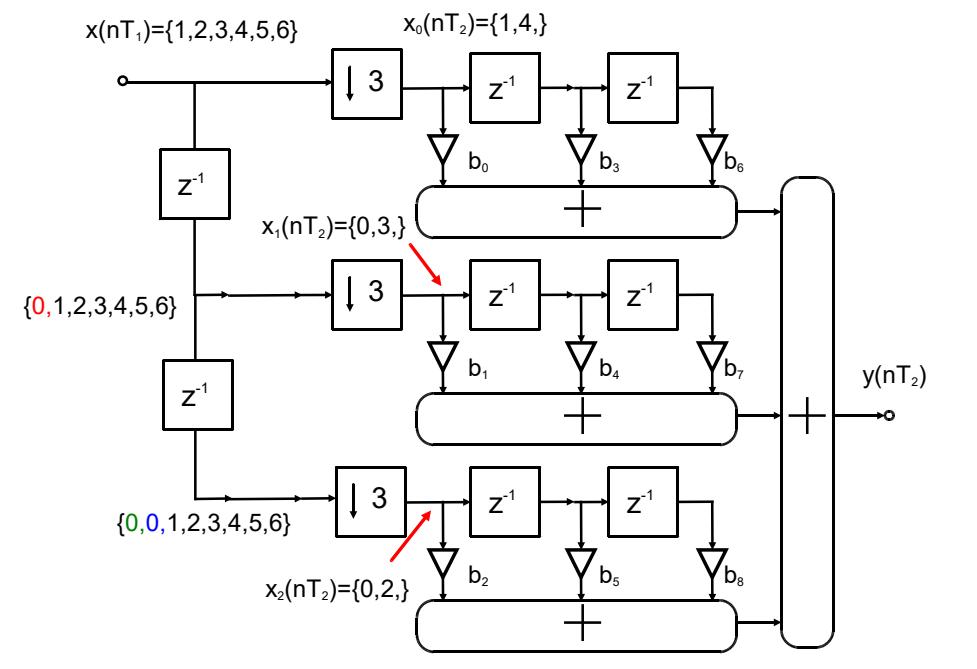
## Decimation by 3: b) how to program even more efficiently [2]

- We assume  $M=3$  and  $x(n)=\{1,2,3,4,5,6\}$ . In order to program efficiently, we distribute the computation of the filter output signal across three input samples.
- If  $n=0$ , compute the upper FIR filter, **save result**
- If  $n=1$ , compute the middle FIR filter, **add result to result obtained for  $n=0$ , save result**
- If  $n=2$ , compute the lower FIR filter, **add result to result obtained for  $n=1$ , output ready**
- It is however **not** right-away clear from the signal-flow diagram, how to distribute the computation for the delays and the three down-samplers on the input side



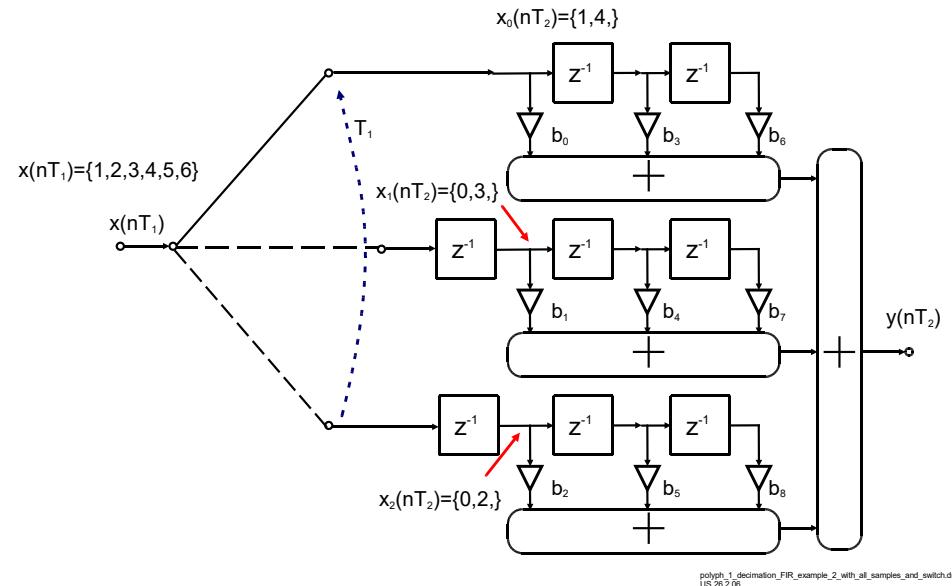
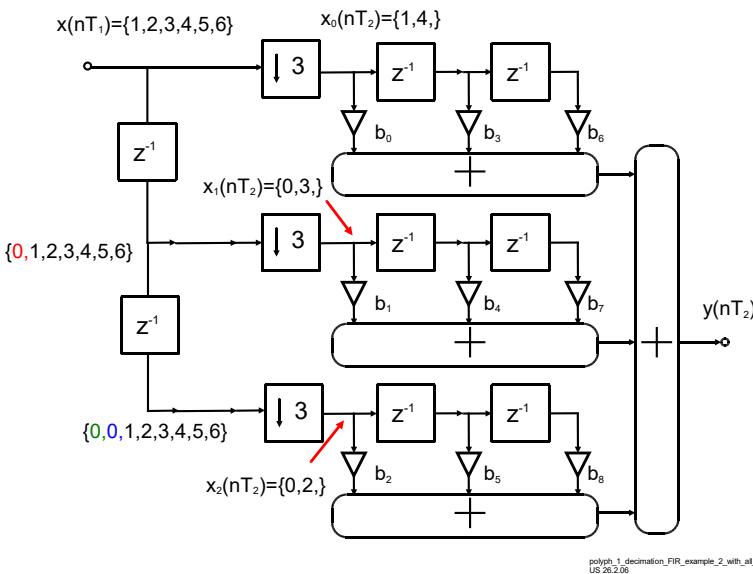
## Decimation by 3: b) how to program even more efficiently [3]

- How to distribute the computation for the delays and the three down-samplers on the input side:
  - One possibility is again **block processing**: updating all delays of the 3 FIR filters only every M samples, but: this is not efficient
- Better: use a **de-interleaver**, but do this carefully !!
  - Assume  $x(n)=\{1,2,3,4,5,6\}$
  - Note how  $x_0$ ,  $x_1$ ,  $x_2$  are obtained from the two delay elements and the down-samplers
  - This corresponds to a **de-interleaver** which rotates **anti-clock-wise**, plus a delay element except for  $x_0$


polyph\_1\_decimation\_FIR\_example\_2\_with\_all\_samples.dwg  
US 26.2.06

## Decimation by 3: b) how to program even more efficiently [4]

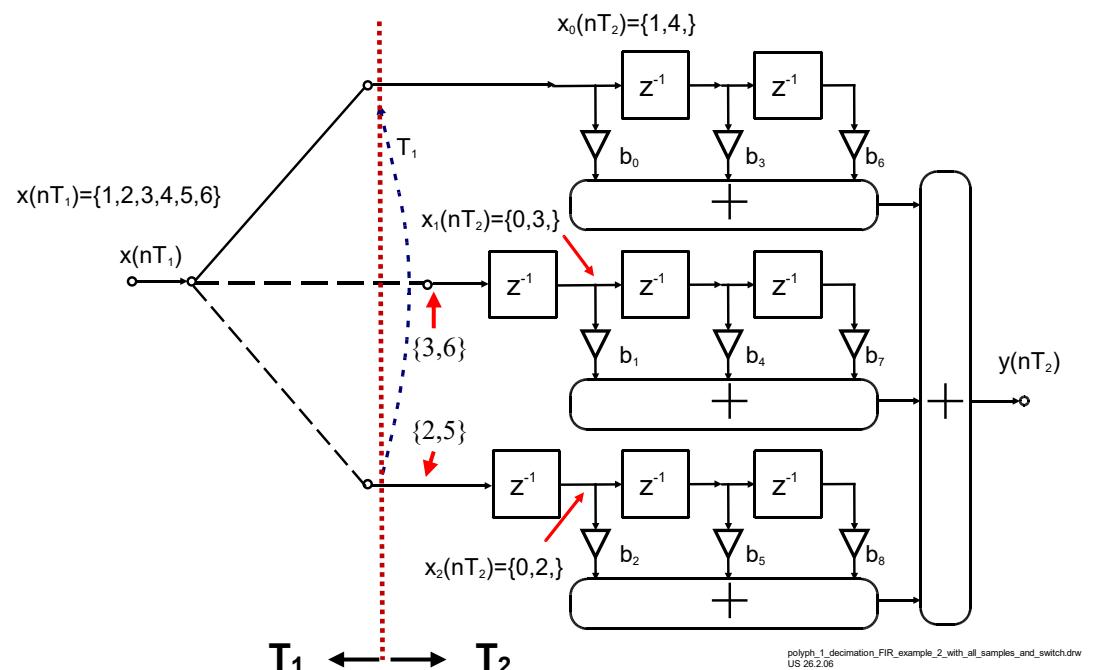
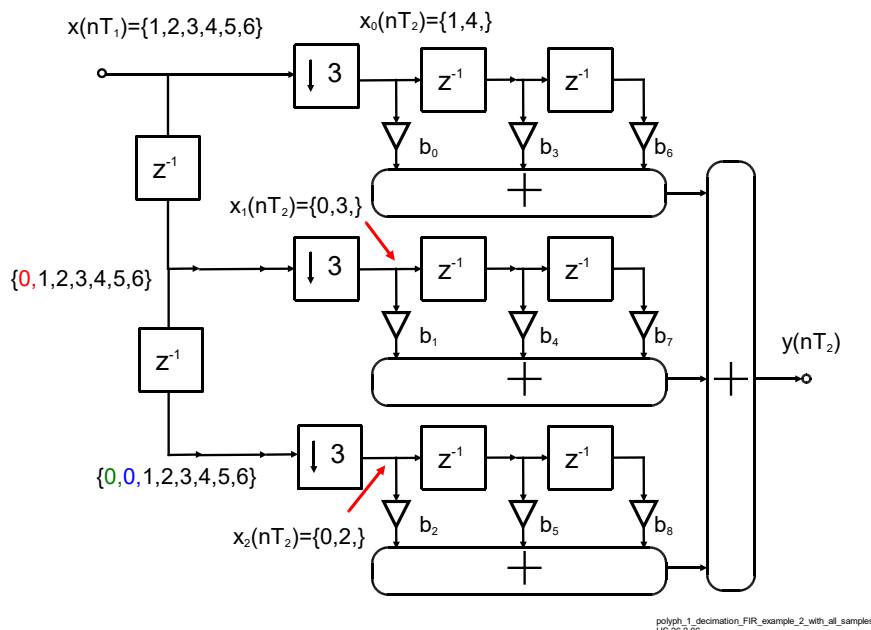
- These two signal-flow diagrams are **equivalent**.
- The computation of the FIR filter output signal is **equally distributed across M input samples** ⇒ **maximum efficiency**
  - The **upper** FIR filter is computed first for n=0 on the input INT side (3x larger !)
  - followed by the **lower** (!) FIR filter for n=1, add **upper** output and save,
  - followed by the **middle** (!) FIR filter for n=2, add **lower** output,  $y(nT_2)$  ready
  - Note : **lower** FIR filter computation is done before **middle** FIR filter computation



## Decimation by 3: how to program even more efficiently [5]

For M=3, three polyphase signals can be defined

- $x_0(m) = x(n) = \{x(0), x(3), x(6), \dots\} = \{1, 4, 7, \dots\}$ ,  $n=0, 3, 6, \dots$   $m=0, 1, 2, \dots$
- $x_1(m) = x(n - 1) = \{x(-1), x(2), x(5), \dots\} = \{?, 3, 6, \dots\}$  daher gilt  $n=3m$
- $x_2(m) = x(n - 2) = \{x(-2), x(1), x(4), \dots\} = \{?, 2, 5, \dots\}$



(Remark : see P.P.Vaidyanathan, "Multirate Systems and Filter Banks", 1993, pp. 131, Fig. 4.3-9 a, b, Göckler/Groth. S. 195)

# Decimation by 3: b) final, efficient MATLAB [5]

## A MATLAB example

```
% kernel from decimate_by_3_FIR_1_stage.m

% the coefficients
b_filt_b0_b3 = b_fir_remez(1:MM:length(b_fir_remez));
b_filt_b1_b4 = b_fir_remez(2:MM:length(b_fir_remez));
b_filt_b2_b5 = b_fir_remez(3:MM:length(b_fir_remez));

% the delays
H_filt_30_delays = zeros(1,length(b_filt_b0_b3));
H_filt_31_delays = zeros(1,length(b_filt_b1_b4));
H_filt_32_delays = zeros(1,length(b_filt_b2_b5));

% filter x(n)
y=zeros(1,N_samp/MM);
mx=0;

% delays
D1 = 0;
D2 = 0;

% switch rotates anti-clockwise (!!!)
for kx=1:N_samp

    if rem(kx-1,MM)==0
        mx=mx+1;
        H_filt_30_delays = [x(kx),
            H_filt_30_delays(1:length(H_filt_30_delays)-1)];
        y_part1(mx)= b_filt_b0_b3 * H_filt_30_delays';

    elseif rem(kx-1,MM)==1
        H_filt_32_delays = [D2,
            H_filt_32_delays(1:length(H_filt_32_delays)-1)];
        y_part3(mx)= b_filt_b2_b5 * H_filt_32_delays';
        D2 = x(kx);

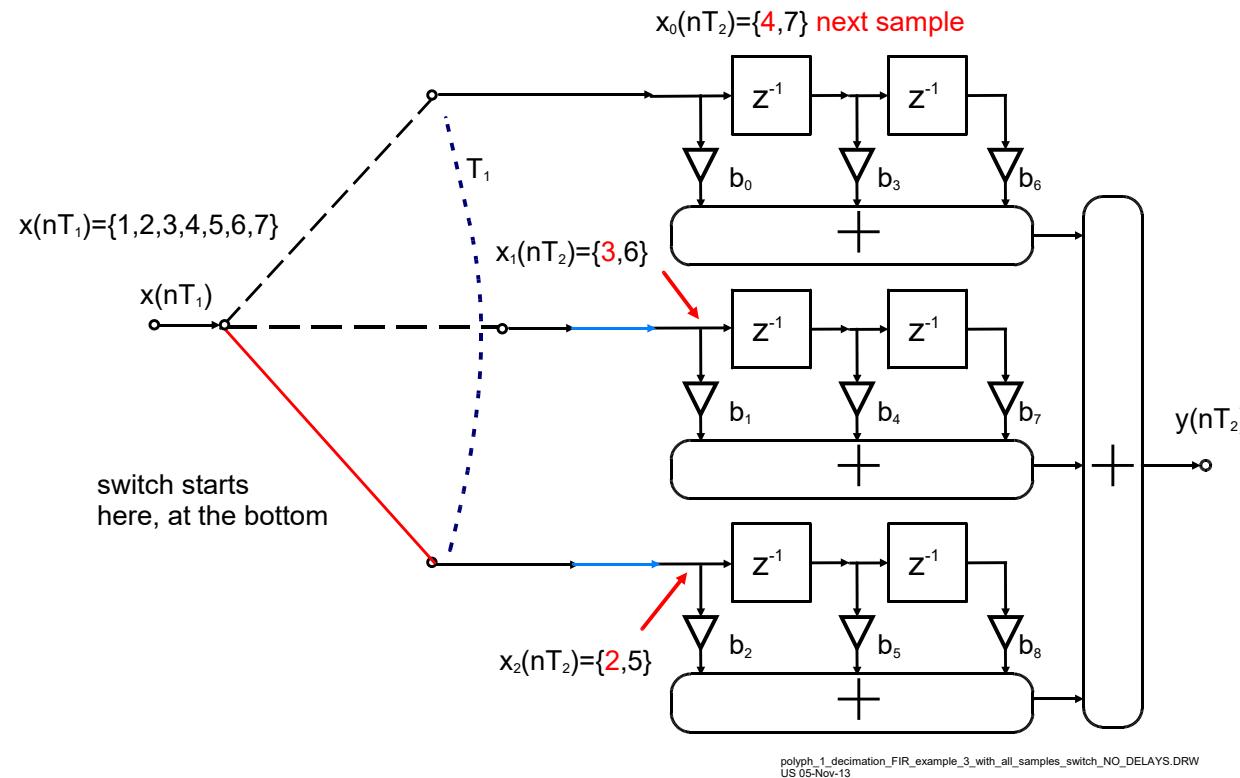
    elseif rem(kx-1,MM)==2
        H_filt_31_delays = [D1,
            H_filt_31_delays(1:length(H_filt_31_delays)-1)];
        y_part2(mx)= b_filt_b1_b4 * H_filt_31_delays';
        D1 = x(kx);

    % add them up
    y(mx) = y_part1(mx) + y_part2(mx) + y_part3(mx);

    end; % if
end; % for
```

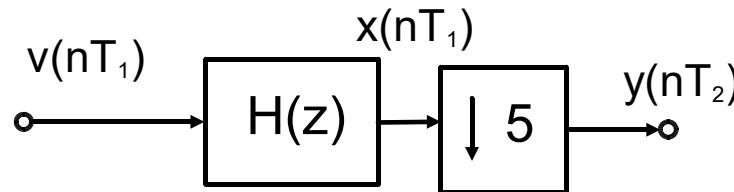
## Decimation by 3: how to program even more efficiently [6]

No additional delays in branch #1 ... are required if the switch starts at the bottom of the arrangement and for branch #0, the **next** input sample is used.  
 Then, the switch position inherently contains the delay from previous slides.



## Exercise: M=5 decimation, programming efficiently

A decimation filter for  $F_{s,in} = 36621.093750 \text{ Hz}$  to  $F_{s,out} = F_{s,in} / 5$ , thus  $M=5$  has to be implemented.



decimate\_by\_5.drw  
US 26.2.06

- Assume that the input  $x(n)=\{1,2,3,4,5,6,7,0,0,\dots\}$  and develop/draw the detailed signal-flow diagram for  $M=5$  with de-interleaver.
- Determine the polyphase components  $x_0, \dots, x_4$   
Write the MATLAB code for the filter specification:

$\delta_{\text{pass}}$  : 0.1,

$\delta_{\text{stop}}$  : 0.1, thus 20 dB stop-band attenuation,

$f_{\text{pass}}$  : 1000 Hz

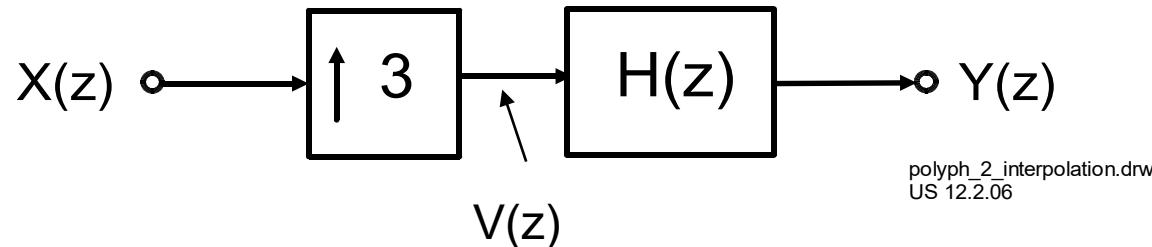
and test it with a 500 Hz sinus signal

(You may assume that the linear-phase FIR filter has 10 coefficients  $b_0, \dots, b_9$ )

decimate\_by\_5\_FIR\_1\_stage\_design\_example.h

## Interpolation by 3: efficient structure [1]

An interpolation filter with interpolation factor 3 (note:  $H(z)$  operates again on higher  $F_s$ )



- We assume (again) that  $H(z)$  is realized by using an FIR filter
- For demonstration purposes, we assume a filter degree of the filter,  $N=8$ .
- Thus

$$H(z) = Y(z)/V(z)$$

$$\begin{aligned} H(z) = & b_0 + b_1 \cdot z^{-1} + b_2 \cdot z^{-2} + b_3 \cdot z^{-3} + b_4 \cdot z^{-4} \dots \\ & + b_5 \cdot z^{-5} + b_6 \cdot z^{-6} + b_7 \cdot z^{-7} + b_8 \cdot z^{-8} \end{aligned}$$

## Interpolation by 3: efficient structure [2]

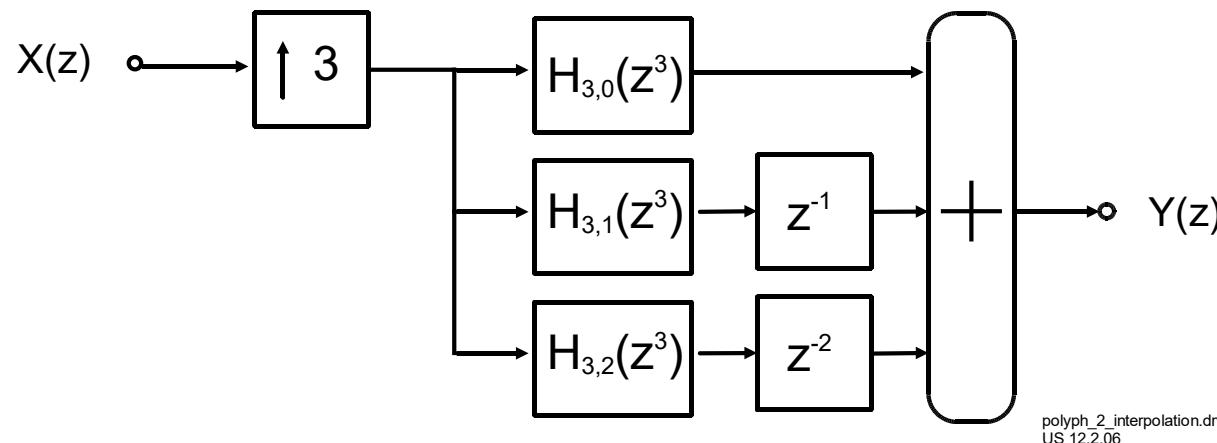
The polyphase decomposition for L=3 : (note : components are in  $z^3$ )

$$H(z) = H_{3,0}(z^3) + z^{-1} \cdot H_{3,1}(z^3) + z^{-2} \cdot H_{3,2}(z^3)$$

$$H_{3,0}(z^3) = b_0 + b_3 \cdot z^{-3} + b_6 \cdot z^{-6},$$

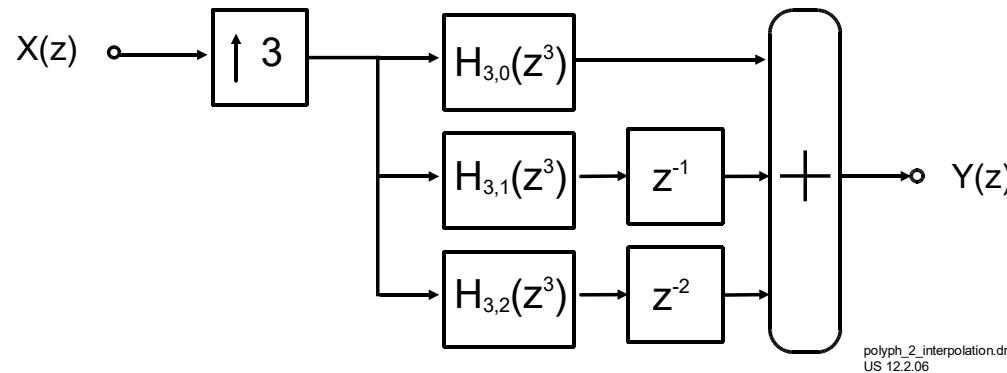
$$H_{3,1}(z^3) = b_1 + b_4 \cdot z^{-3} + b_7 \cdot z^{-6},$$

$$H_{3,2}(z^3) = b_2 + b_5 \cdot z^{-3} + b_8 \cdot z^{-6}$$

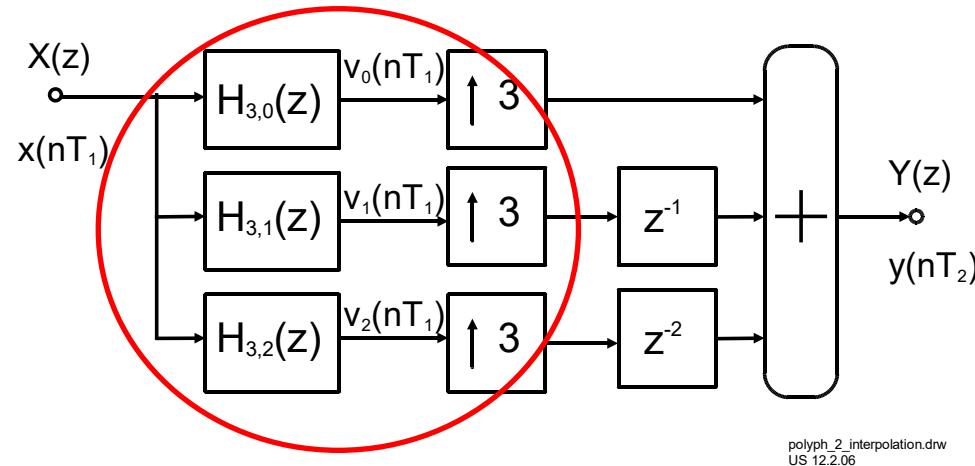


## Interpolation by 3: efficient structure [3]

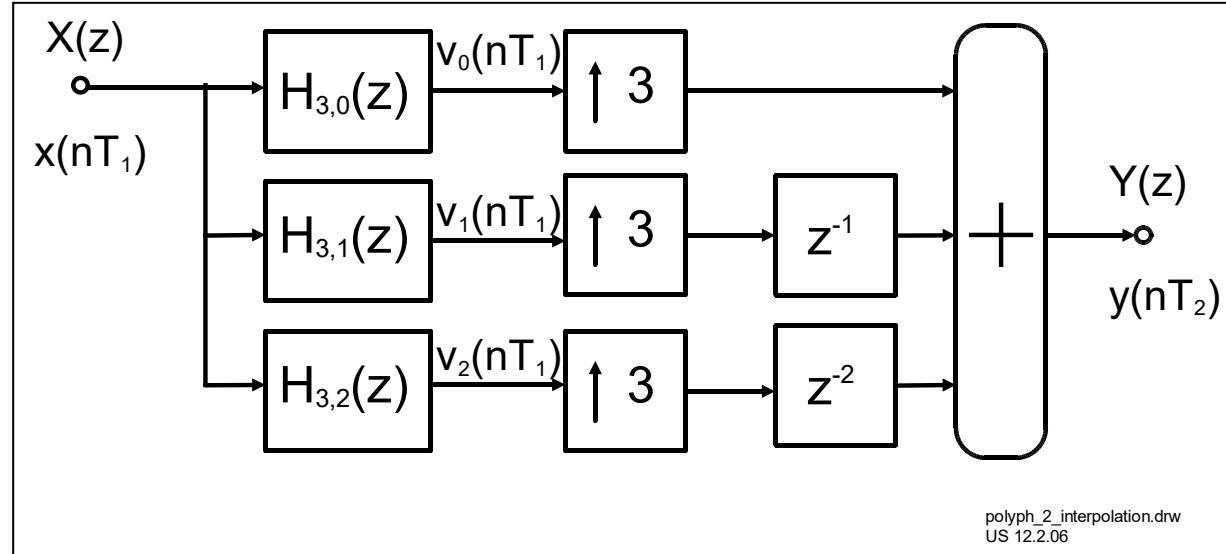
Again: Polyphase structure for interpolation (delays are on **output side**)



Using **second noble identity**, we obtain (note  $H(\cdot)$  is now in  $z$ , not  $z^3$  any more !!)



## Interpolation by 3: efficient structure [4]

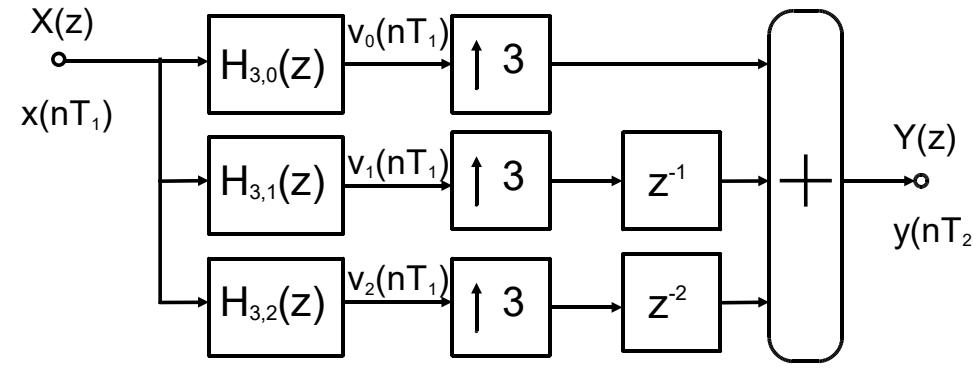


- Some **important** remarks for interpolation

- Interpolated samples of  $v_0[nT_1]$  are not delayed →  $[y_1, 0, 0]$
- Interpolated samples of  $v_1[nT_1]$  are delayed by  $T_2$  →  $[0, y_2, 0]$
- Interpolated samples of  $v_2[nT_1]$  are delayed by  $2^* T_2$  →  $[0, 0, y_3]$
- These sequences are added,
  - →  $[y_1, 0, 0] + [0, y_2, 0] + [0, 0, y_3] = [y_1, y_2, y_3]$

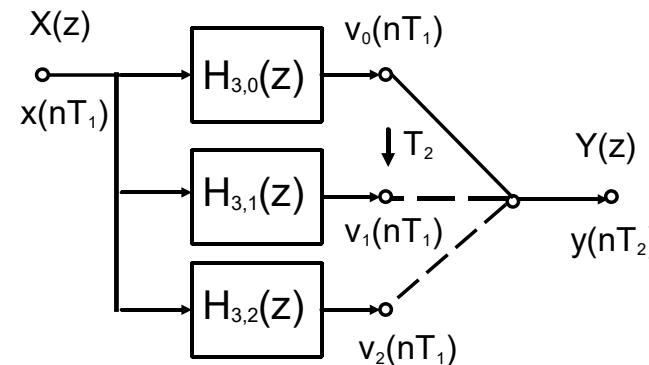
## Interpolation by 3: efficient structure [5]

Again the previous structure with  $H_{3,0}, H_{3,1}, H_{3,2}$  in z



polph\_2\_interpolation.drw  
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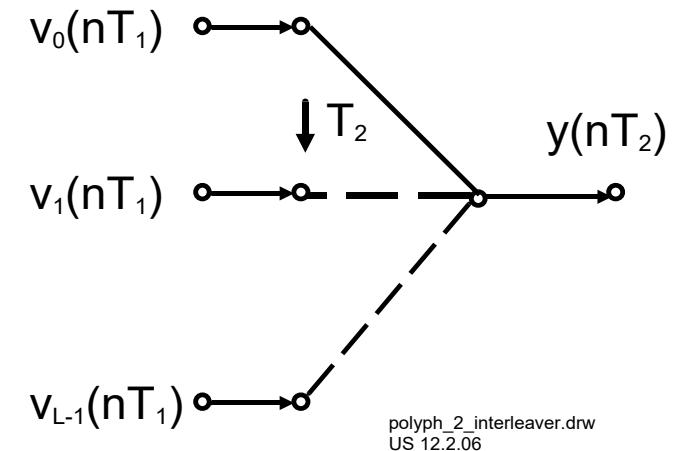
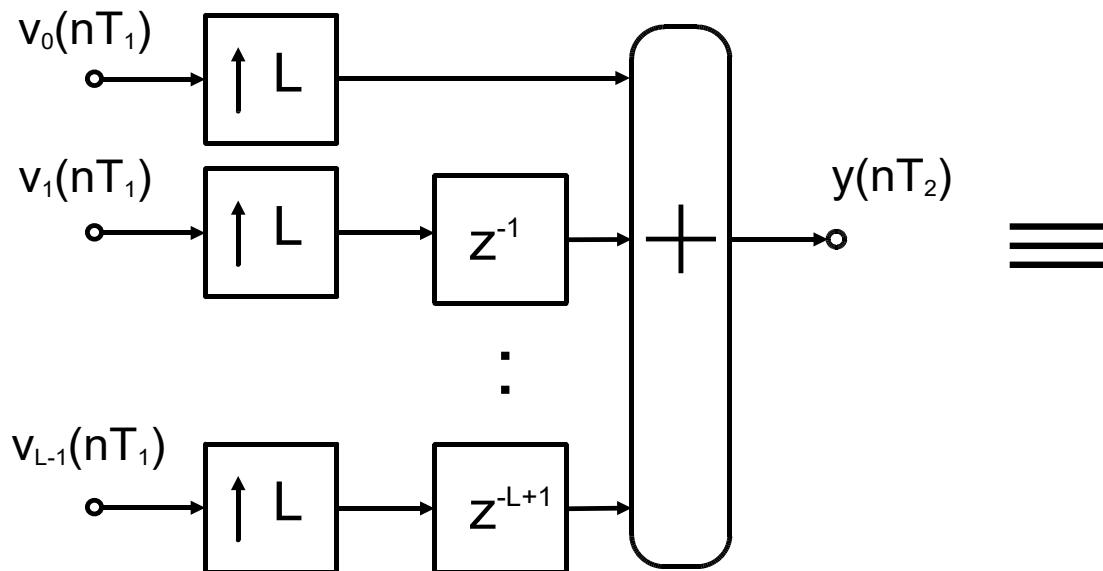
Using an interleaver instead, which rotates anti-clockwise with  $1/T_2$



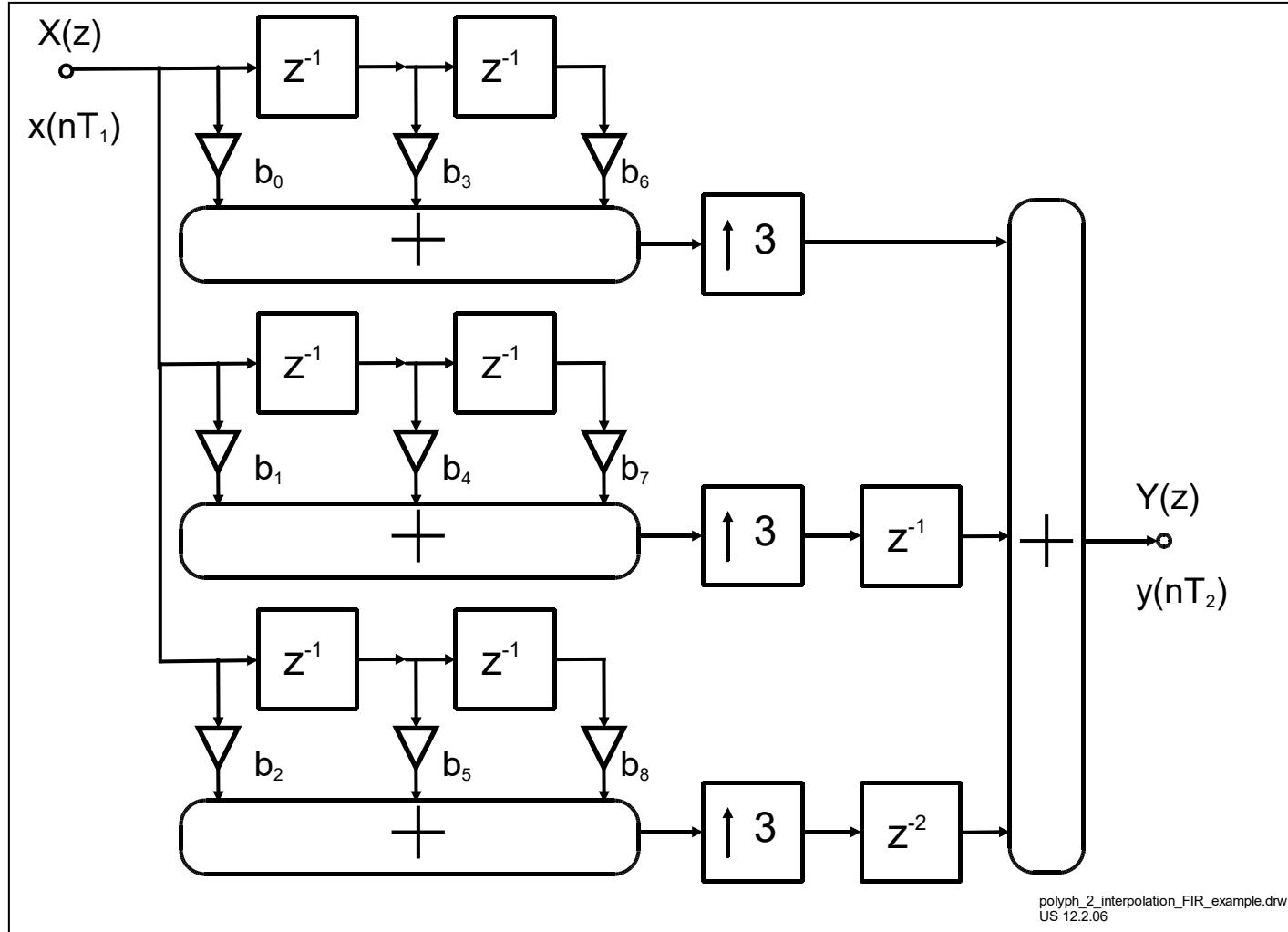
polph\_2\_interpolation.drw  
US 12.2.06

## General interleaver (for general L)

The switch rotates anti-clockwise with  $1/T_2$



## Interpolation by 3: final efficient structure for N=8 [6]

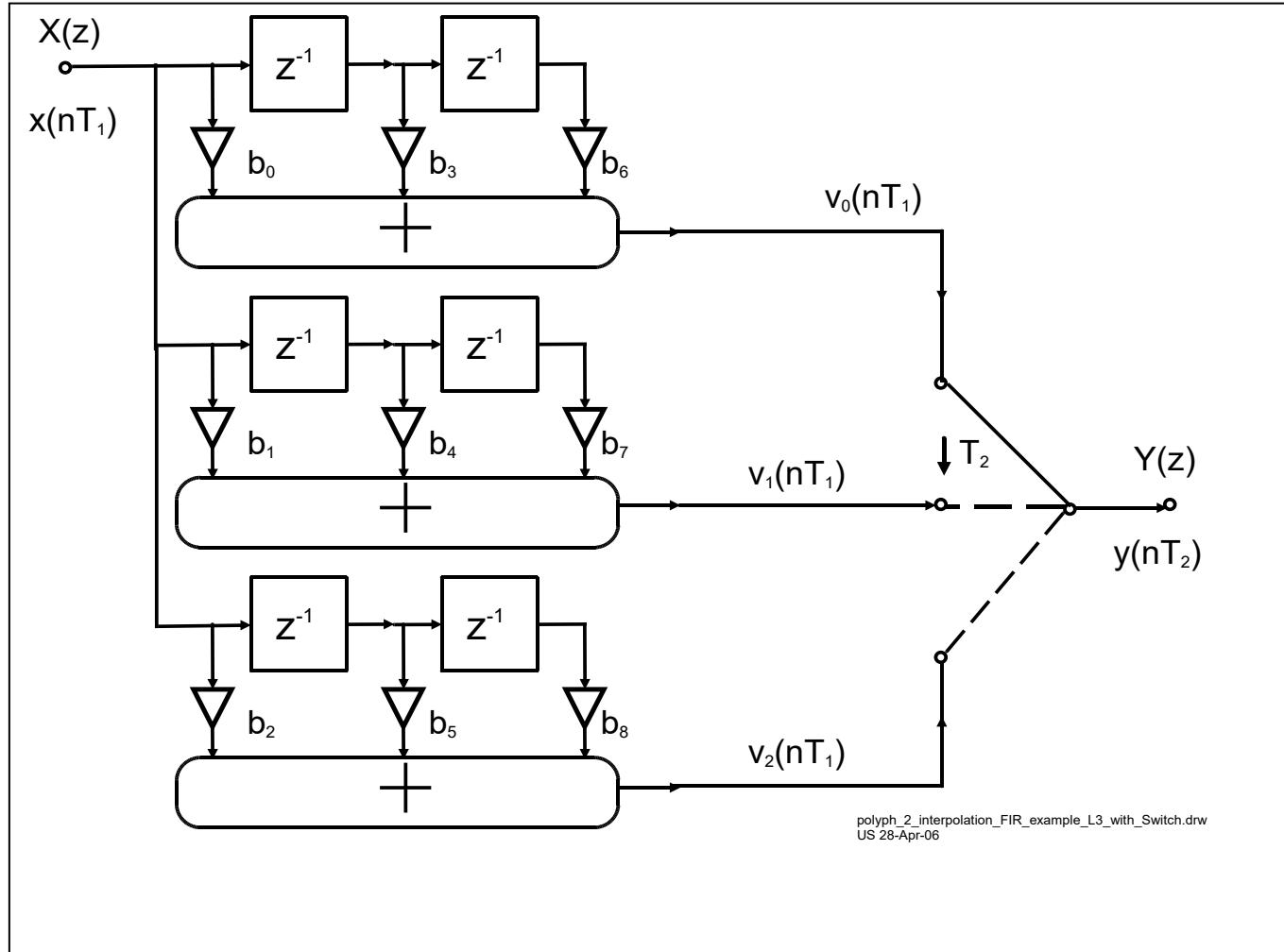


$$H_{3,0}(z) = b_0 + b_3 \cdot z^{-1} + b_6 \cdot z^{-2},$$

$$H_{3,1}(z) = b_1 + b_4 \cdot z^{-1} + b_7 \cdot z^{-2},$$

$$H_{3,2}(z) = b_2 + b_5 \cdot z^{-1} + b_8 \cdot z^{-2}$$

## Interpolation by 3: final efficient structure for N=8 [7]



- 1) The three **up-samplers** by 3 and the **delays** have been **replaced by a switch**.
- 2) The **switch** rotates anti-clockwise with  $1/T_2$

$$\begin{aligned}
 H_{3,0}(z) &= b_0 + b_3 \cdot z^{-1} + b_6 \cdot z^{-2}, \\
 H_{3,1}(z) &= b_1 + b_4 \cdot z^{-1} + b_7 \cdot z^{-2}, \\
 H_{3,2}(z) &= b_2 + b_5 \cdot z^{-1} + b_8 \cdot z^{-2}
 \end{aligned}$$

## Interpolation by 3: b) MATLAB [8]

### MATLAB implementation: Efficient interpolation by 3

```
% kernel from interpolate_by_3_FIR_1_stage.m

% the coefficients
b_filt_b0_b3 = b_fir_remez(1:LL:length(b_fir_remez));
b_filt_b1_b4 = b_fir_remez(2:LL:length(b_fir_remez));
b_filt_b2_b5 = b_fir_remez(3:LL:length(b_fir_remez));

% the delays
H_filt_30_delays = zeros(1,length(b_filt_b0_b3));
H_filt_31_delays = zeros(1,length(b_filt_b1_b4));
H_filt_32_delays = zeros(1,length(b_filt_b2_b5));

% filter x(n)
y=zeros(1,N_samp*LL);
mx=0;

for kx=1:N_samp
    mx=mx+1; % interpolate at kx
    H_filt_30_delays =
        [x(kx),H_filt_30_delays(1:length(H_filt_30_delays)-1)];
    y(mx) = b_filt_b0_b3 * H_filt_30_delays';

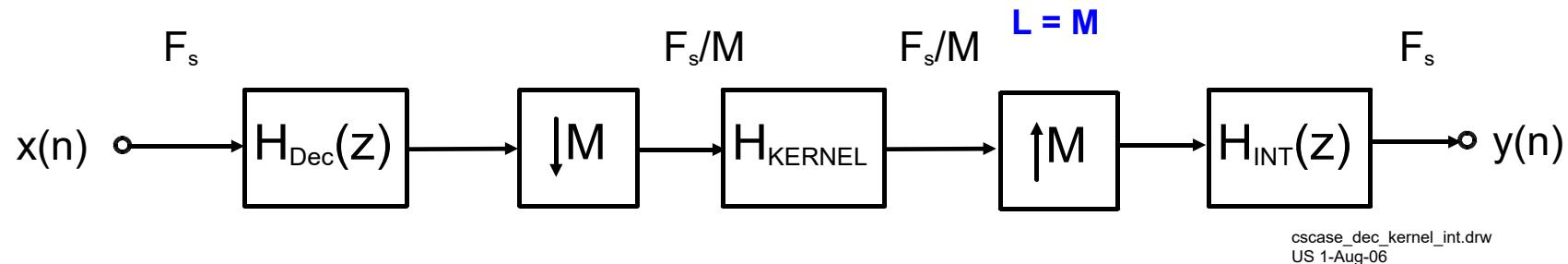
    mx=mx+1; % FIRST interpolated sample
    H_filt_31_delays =
        [x(kx),H_filt_31_delays(1:length(H_filt_31_delays)-1)];
    y(mx) = b_filt_b1_b4 * H_filt_31_delays';

    mx=mx+1; % SECOND interpolated sample
    H_filt_32_delays =
        [x(kx),H_filt_32_delays(1:length(H_filt_32_delays)-1)];
    y(mx) = b_filt_b2_b5 * H_filt_32_delays';

end; % for
```

## Multi-rate filters

- If the pass-band of a low-pass filter is rather small ( $\ll F_s/4$  or  $< F_s/4$ ) and the transition band is small, the concept of multi-rate filtering may be applied.



- Using FIR polyphase representation, all filters can be operated at the lower sampling frequency  $F_s/M$ , as done before.
- Multirate filters can be implemented more efficiently than “normal” filters with this specification
- Note that the signal at the output of the kernel filter is usually not sent to a DAC. Thus, multi-rate only appears “inside” the filter (McBsp0 is sufficient, McBsp1 DAC for control purposes only).

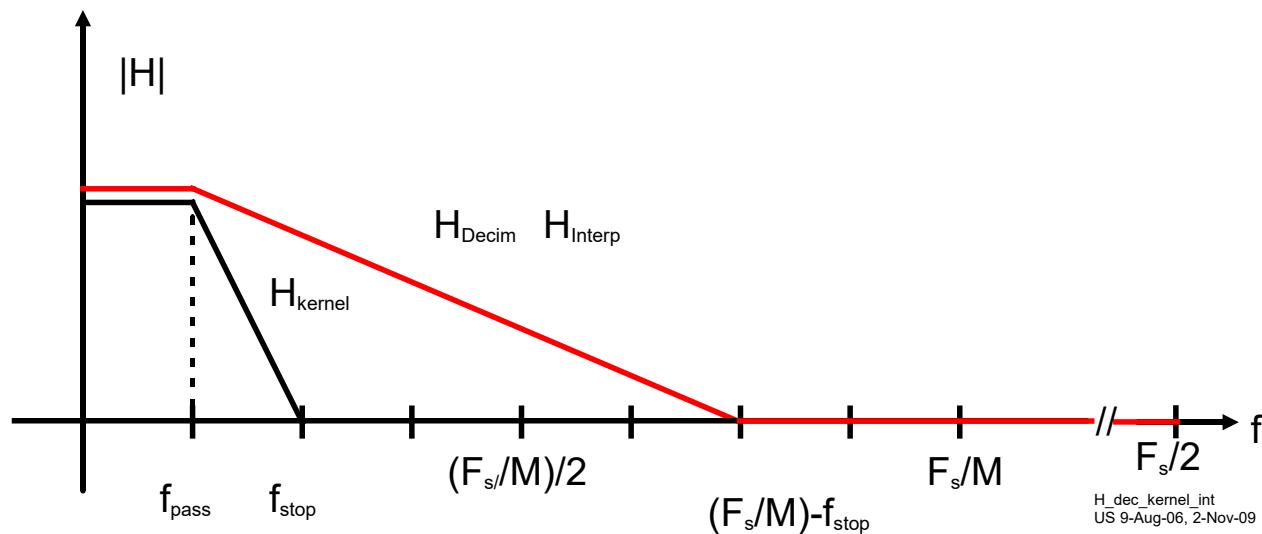
## Multirate filters

Desired:

FIR filter, small passband  $0..f_{\text{pass}}$ , small transition band  $f_{\text{pass}} .. f_{\text{stop}}$ , wide stop-band  $f_{\text{stop}}$

Instead:

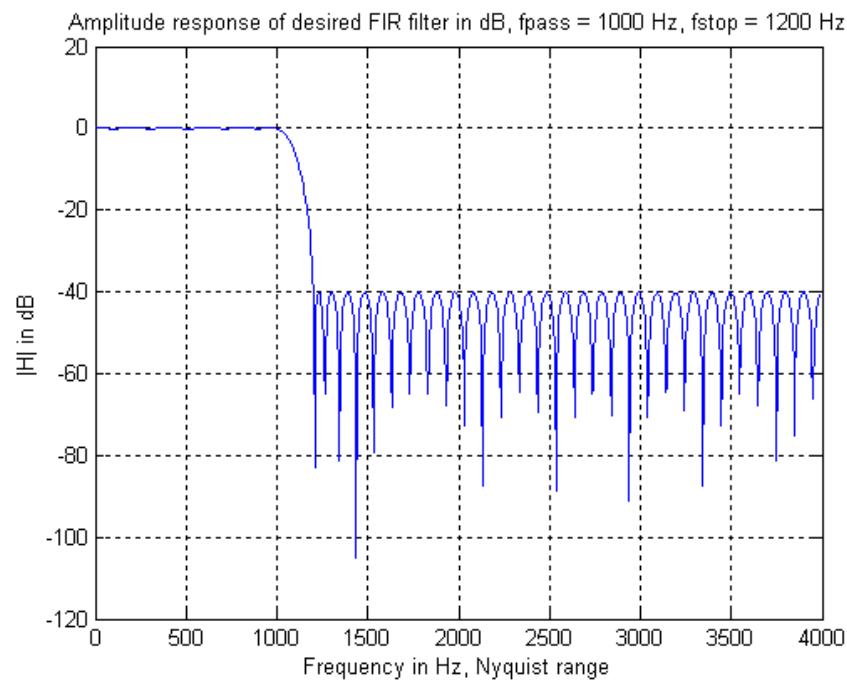
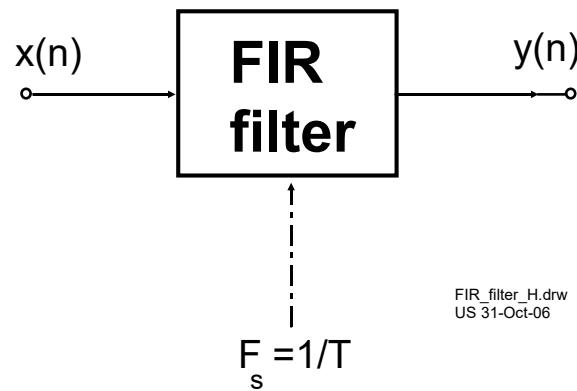
Use decimation, kernel and interpolation filter. No aliasing allowed in passband and transition band → specification to fulfill :



H\_dec\_kernel\_int  
US 9-Aug-06, 2-Nov-09

## Multirate filters, example for M=2 [1]

For  $F_s = 8 \text{ kHz}$ , it is desired to implement an FIR filter with transition band 1000 .. 1200 Hz.

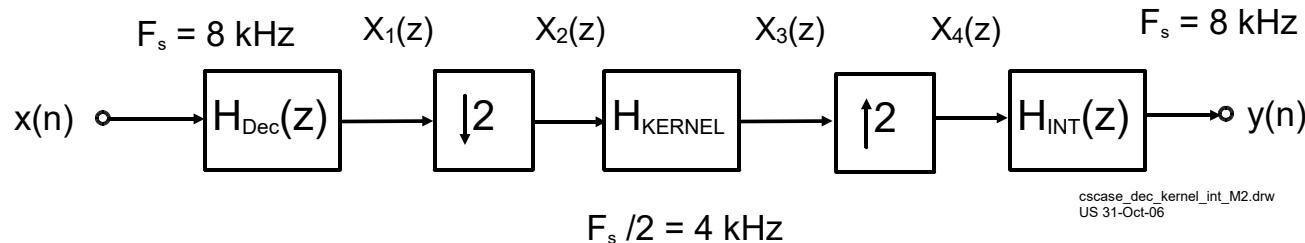


Since  $f_{\text{pass}} < F_s/4$ , a multi-rate filter is **always** advantageous compared to a “normal” FIR filter (requires less operations, without proof...)

`dec_kernel_int_M2_Bsp_Vorlesung.m`

## Multirate filters, example for M=2 [2]

We therefore replace the single filter arrangement by 3 cascaded filters, a **decimation filter**, a **kernel filter** and an **interpolation filter**



We have to analyze the required amplitude responses of the three filters in order to design these filters

$$X_1(z) = X(z) \cdot H_{Dec}(z) \quad X_2(z) = \frac{1}{2} \left[ X_1(z^{\frac{1}{2}}) + X_1(-z^{\frac{1}{2}}) \right] = \frac{1}{2} \left[ X(z^{\frac{1}{2}}) \cdot H_{Dec}(z^{\frac{1}{2}}) + X(-z^{\frac{1}{2}}) \cdot H_{Dec}(-z^{\frac{1}{2}}) \right]$$

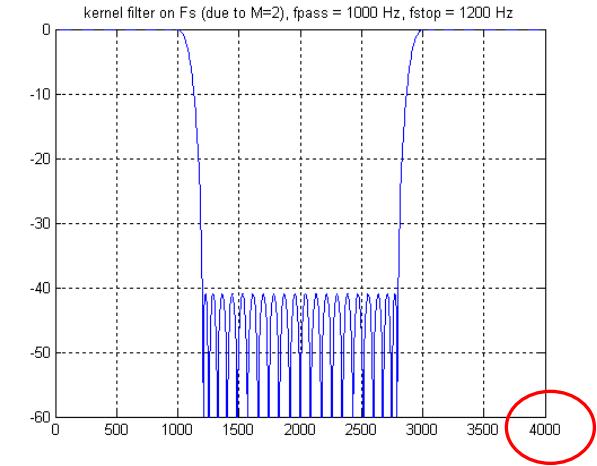
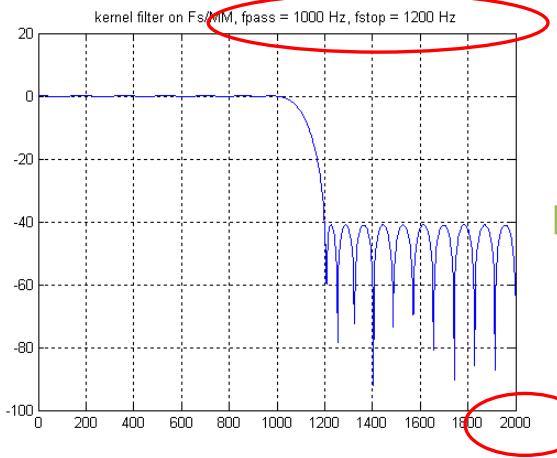
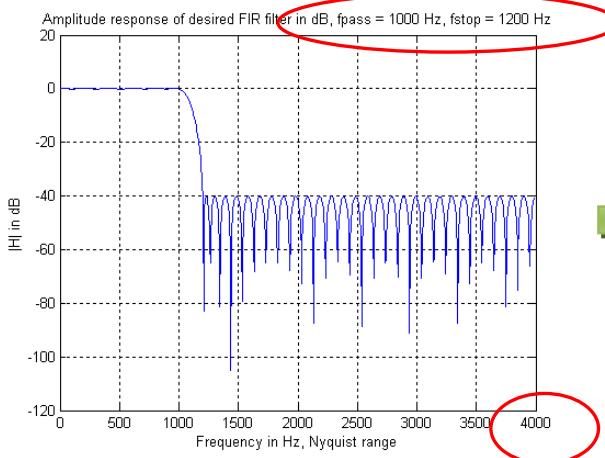
$$X_3(z) = \frac{1}{2} \left[ X(z^{\frac{1}{2}}) \cdot H_{Dec}(z^{\frac{1}{2}}) \cdot H_{Kernel}(z) + X(-z^{\frac{1}{2}}) \cdot H_{Dec}(-z^{\frac{1}{2}}) \cdot H_{Kernel}(z) \right]$$

$$X_4(z) = X_3(z^2) = \frac{1}{2} \left[ X(z) \cdot H_{Dec}(z) \cdot H_{Kernel}(z^2) + X(-z) \cdot H_{Dec}(-z) \cdot H_{Kernel}(z^2) \right]$$

$$Y(z) = \frac{1}{2} \left[ X(z) \cdot \boxed{H_{Dec}(z) \cdot H_{Kernel}(z^2) \cdot H_{Int}(z)} + X(-z) \cdot H_{Dec}(-z) \cdot H_{Kernel}(z^2) \cdot H_{Int}(z) \right]$$

**Required !**

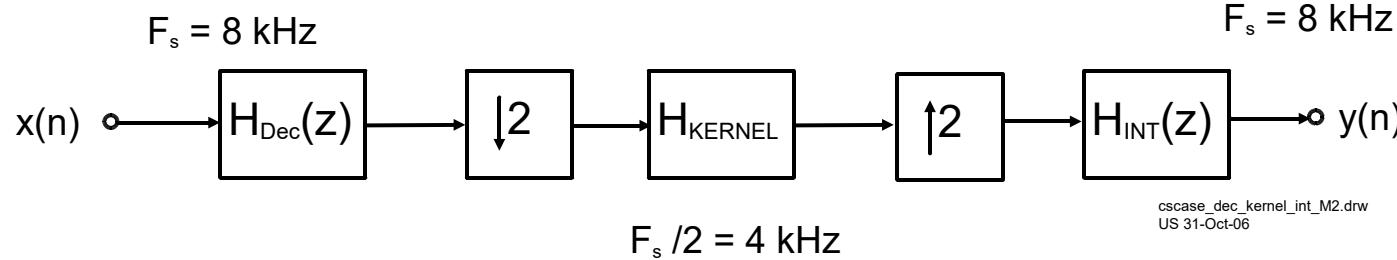
## Multirate filters, example for M=2 [3]



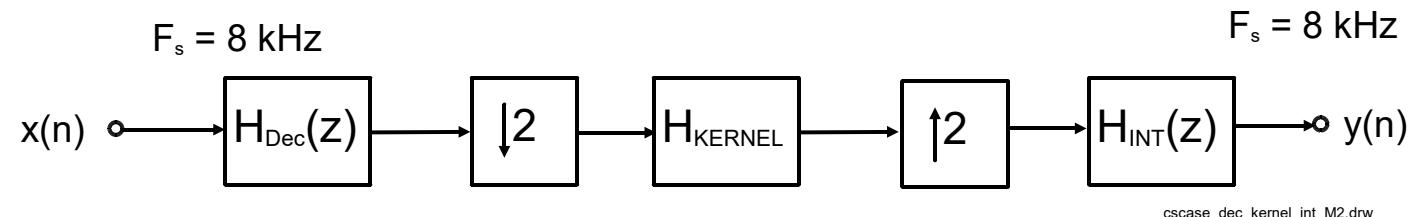
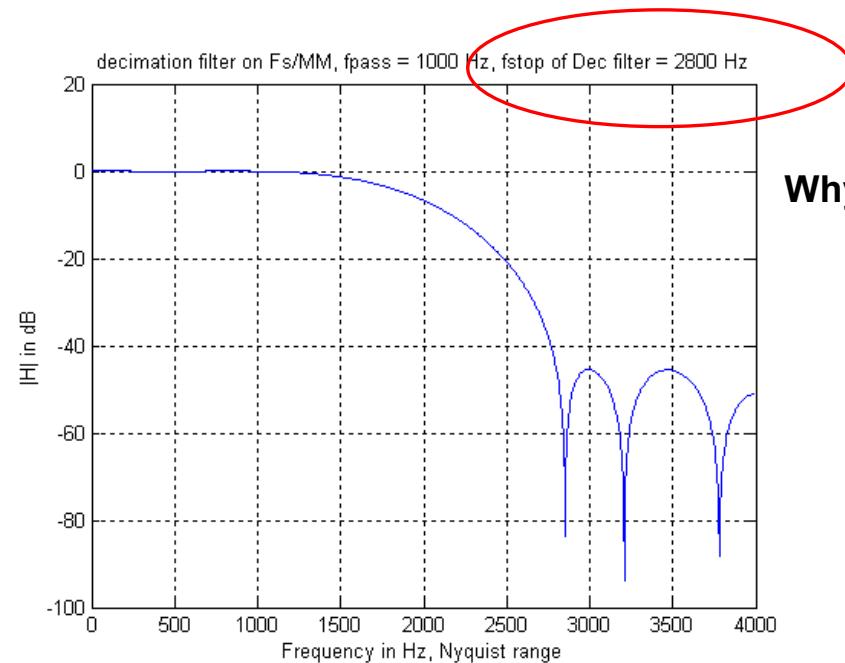
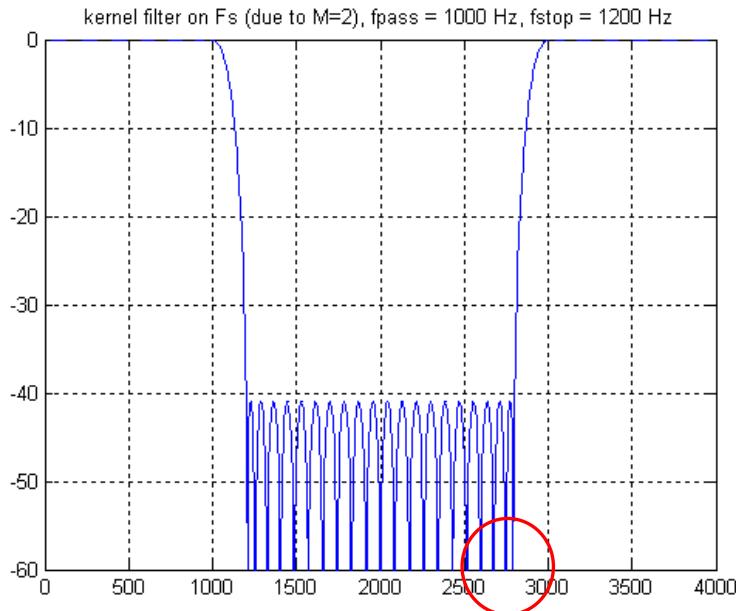
Desired FIR-Filter ( $F_s = 8$  kHz)  
( $N = 80$ )

FIR-Filter  $H_k(z)$  ( $F_s/2 = 4$  kHz)  
( $N = 45$ )

FIR-Filter  $H_k(z^2)$  ( $\rightarrow F_s = 8$  kHz)



## Multirate filters, example for M=2 [4]

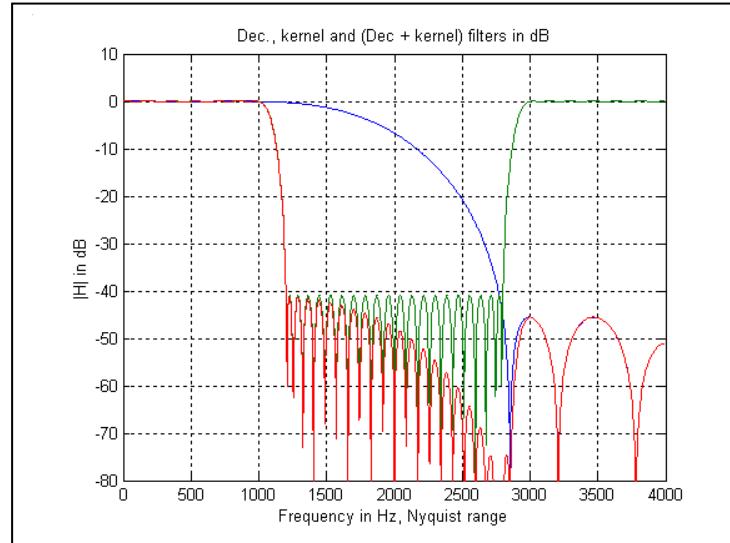


dec\_kernel\_int\_M2\_Bsp\_Vorlesung.m  
dec kernel int M2 Bsp Vorl sim.m

cscase\_dec\_kernel\_int\_M2.drw  
US 31-Oct-06

## Multirate filters, example for M=2 [5]

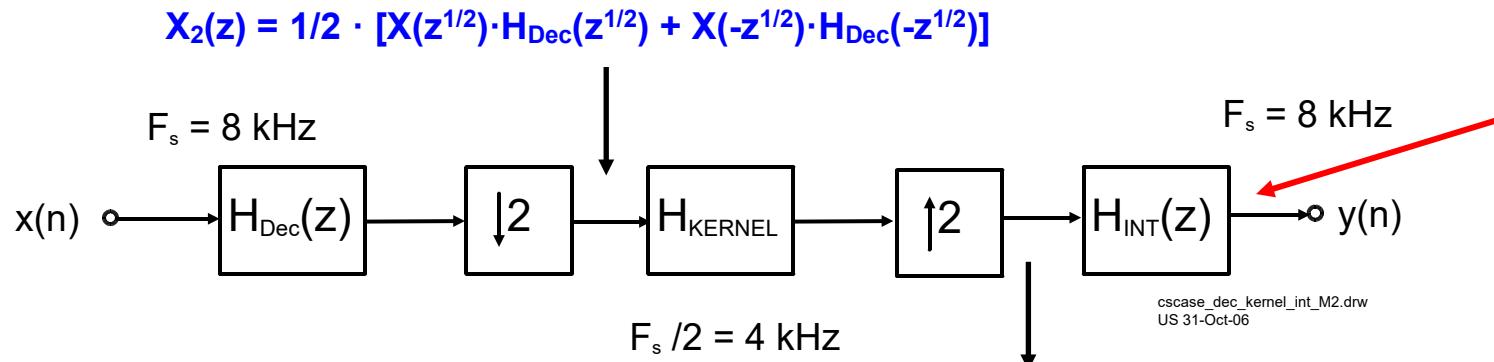
$H_{Dec}(z)$  -----  
 $H_{Kernel}(z^2)$  -----  
 $H_{Dec}(z) \cdot H_{Kernel}(z^2)$  -----



The decimation filter removes aliasing !!

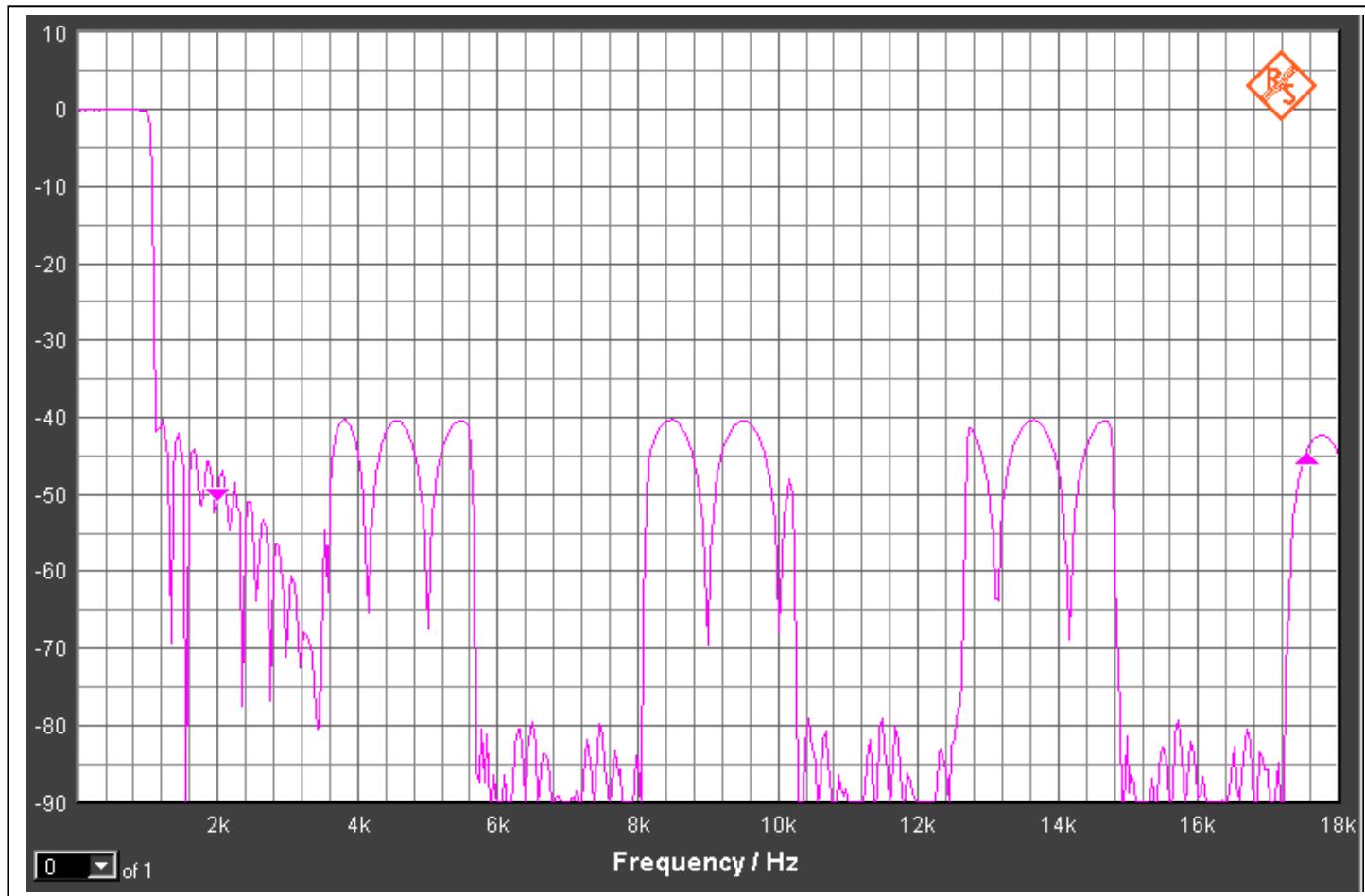
The kernel filter does actual filtering on  $F_s/M$  !!

The interpolation filter removes the images



$$X_4(z) = 1/2 \cdot [X(z) \cdot H_{Dec}(z) \cdot H_K(z^2) + X(-z) \cdot H_{Dec}(-z) \cdot H_K(z^2)]$$

## Multirate filters, example [6]

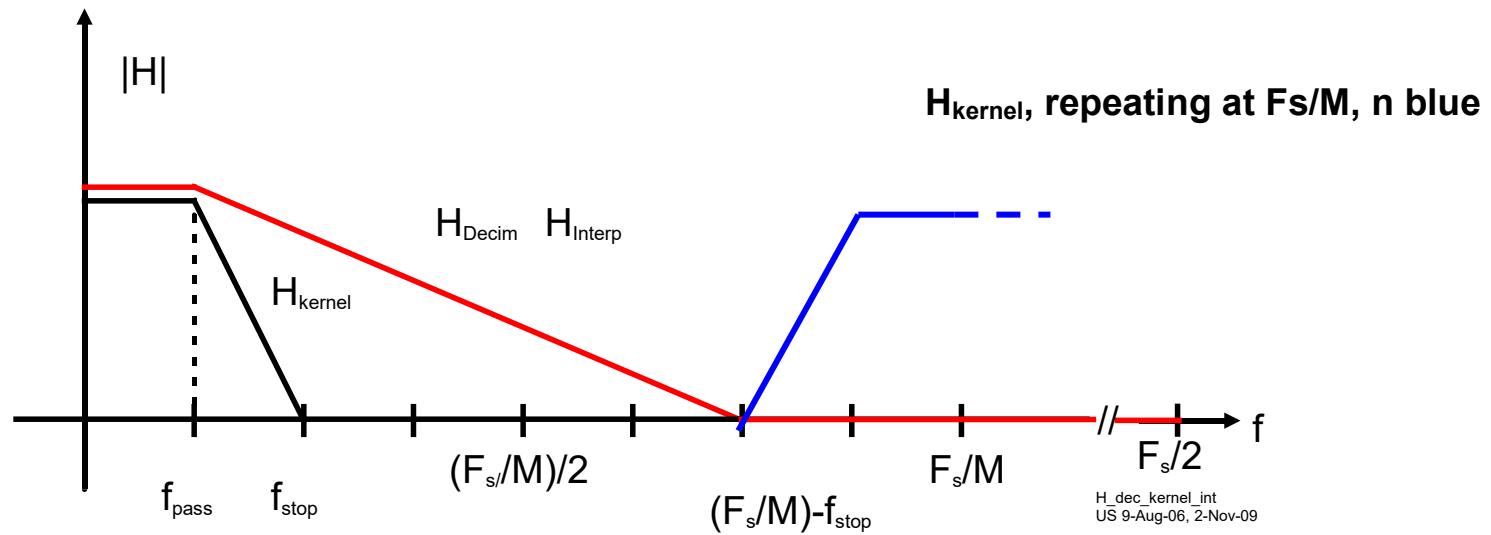


**Lab 3+4:**  
**Dec\_kernel\_int**

## Multirate filters, again :

**Normalized transition band of Dec/Int filters is:  $[(F_s/M - f_{stop}) - f_{pass}]/F_s$**

All three filters, (decimation, kernel and interpolation filter) operate at  $F_s/M$ , i.e. at the **lower sampling frequency !!**



## Multi-rate filters: Computational effort [1]

If  $b$  is the (normalized) bandwidth of the transition band,  $N_{FIR}$  is :

$$N_{FIR} \approx \frac{2}{3} \cdot \log_{10} \left( \frac{1}{10 \cdot \delta_{pass} \cdot \delta_{stop}} \right) \left( \frac{1}{b} \right)$$

$$b_{Dec,Int} = \left( \frac{(F_s / M - f_{stop}) - f_{pass}}{F_s} \right)$$

$$b_{kernel} = \left( \frac{f_{stop} - f_{pass}}{(F_s / M)} \right)$$

The effort “E” is equal to the “ $N_{FIR} * \text{sampling frequency}$ ”.  
 Since all filters operate at  $F_s/M$  and the ripple in the pass-band is equally distributed across the three filters  $\delta_{pass}/3$  :

$$\text{Effort for } H_{Dec}, H_{Int} \approx \frac{2}{3} \cdot \log_{10} \left( \frac{3}{10 \cdot \delta_{pass} \cdot \delta_{stop}} \right) \left( \frac{F_s}{(F_s / M - f_{stop}) - f_{pass}} \right) \cdot \left( \frac{F_s}{M} \right)$$

$$\text{Effort for } H_{kernel} \approx \frac{2}{3} \cdot \log_{10} \left( \frac{3}{10 \cdot \delta_{pass} \cdot \delta_{stop}} \right) \left( \frac{F_s / M}{f_{stop} - f_{pass}} \right) \cdot \left( \frac{F_s}{M} \right)$$

$$\text{Total effort is } E_{ges} \approx \frac{2}{3} \cdot \log_{10} \left( \frac{3}{10 \cdot \delta_{pass} \cdot \delta_{stop}} \right) \left( \frac{2 \cdot F_s}{F_s / M - f_{pass} - f_{stop}} + \frac{F_s / M}{f_{stop} - f_{pass}} \right) \cdot \left( \frac{F_s}{M} \right)$$

## Multi-rate filters: Computational effort [2]

Rewrite equation

$$\text{Total effort } E_{ges} \approx \frac{2}{3} \cdot \log_{10} \left( \frac{3}{10 \cdot \delta_{pass} \cdot \delta_{stop}} \right) \left( \frac{2 \cdot F_s}{F_s - M \cdot (f_{pass} + f_{stop})} + \frac{F_s}{M^2 (f_{stop} - f_{pass})} \right) \cdot F_s$$

Find  $E_{ges,\min}$  by taking 1st derivative, set to 0, get  $M_{\min}$  via MATLAB roots():

$$M^3 \min(f_{stop}^2 - f_{pass}^2) - M^2 \min(f_{pass} + f_{stop})^2 + M_{\min} \cdot 2 \cdot F_s (f_{pass} + f_{stop}) - F_s^2 = 0$$

The **multi-rate filters** can be **cascaded**, such that the kernel filter requires less and less effort:

**K** decimation filters, followed by the kernel filter, followed by **K** interpolation filters, thus : **multi-stage decimation/interpolation**.

## Multirate filters: Computational effort [3]

**Example:** Let  $F_s = 36621.093750$  Hz

**Filter specification:**

$\delta_{\text{pass}} = 0.01$ ,

$\delta_{\text{stop}} = 0.01$ , thus 40 dB stop-band attenuation,

$f_{\text{pass}} = 1000$  Hz

$f_{\text{stop}} = 1200$  Hz

we obtain for a “normal” FIR implementation  $N_{\text{FIR}} = 356$

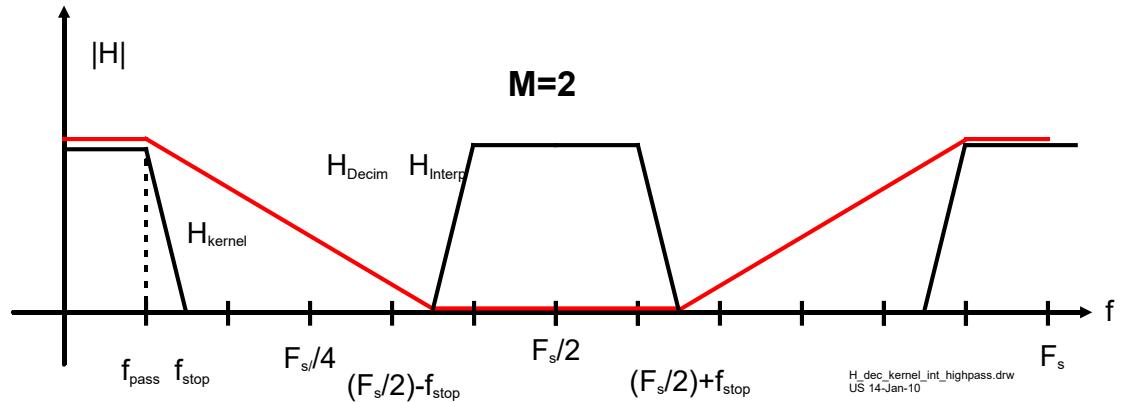
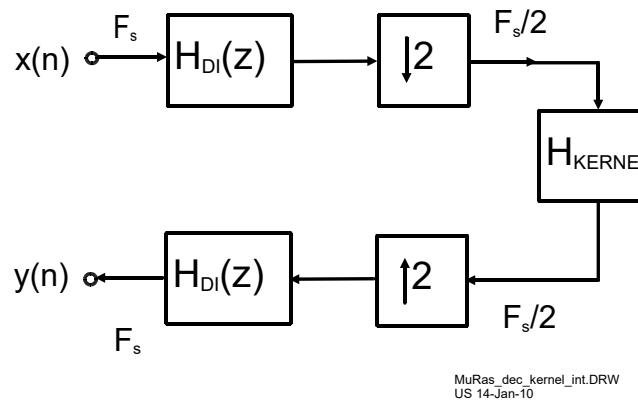
If we use instead of  $M_{\min} = 8.76$  (determined via MATLAB from equation above) the integer value  $M_{\min}=8$ , we obtain:

- 1) “normal”  $N_{\text{FIR}}$ , : FOPS = 13037109.38,
- 2) with two stages : FOPS = 569752.13,
- overhead of “normal” FIR-filter is 22.88 (!!)
- $N_{\text{FIR, kernel}}=52$ ,  $N_{\text{FIR, Dec, Int}} = 35$ ,  $f_{\text{stop, Dec, Int}} = 3377.64$  Hz

`dec_kernel_int_M8_Bsp_Vorlesung.m`

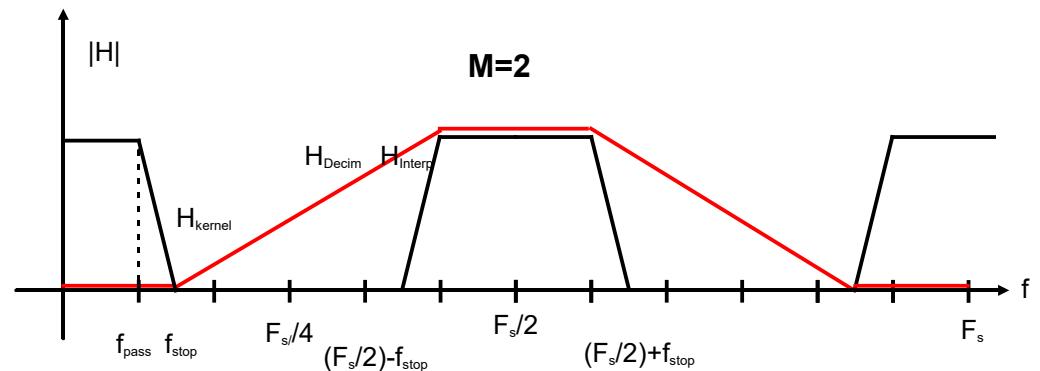
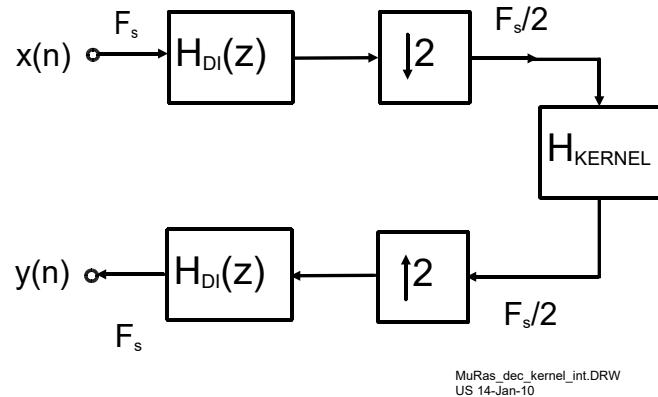
## Multirate Lowpass Filters

Usually, two identical (decimation and interpolation) low-pass filters and a low-pass kernel filter are used for the decimation and interpolation process.



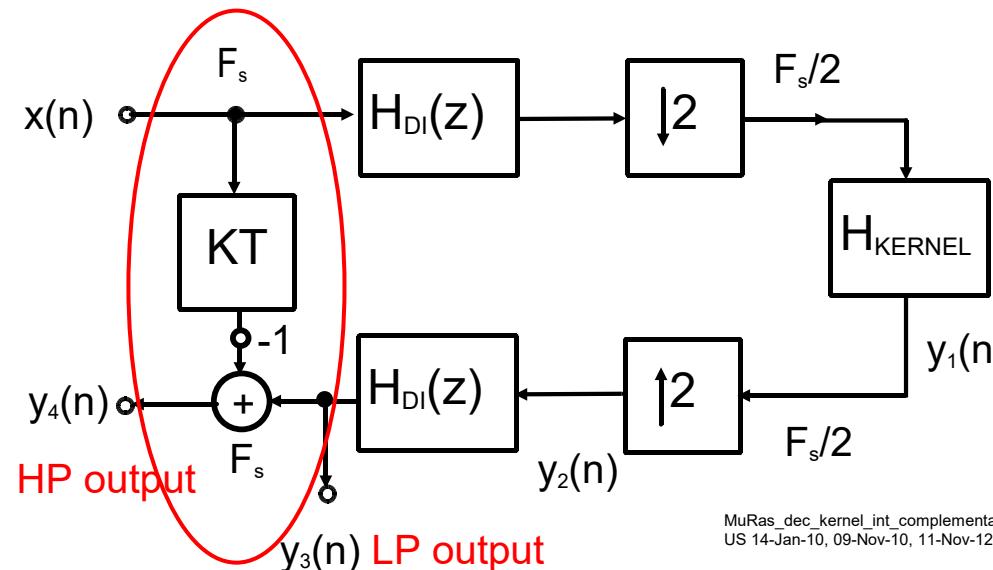
## Multirate Highpass Filters

If, instead, a high-pass filter for the decimation and interpolation filters and a low-pass kernel filter is used, a **high-pass** filter is obtained.



## Multirate Complementary Low-pass/High-pass Filters [1]

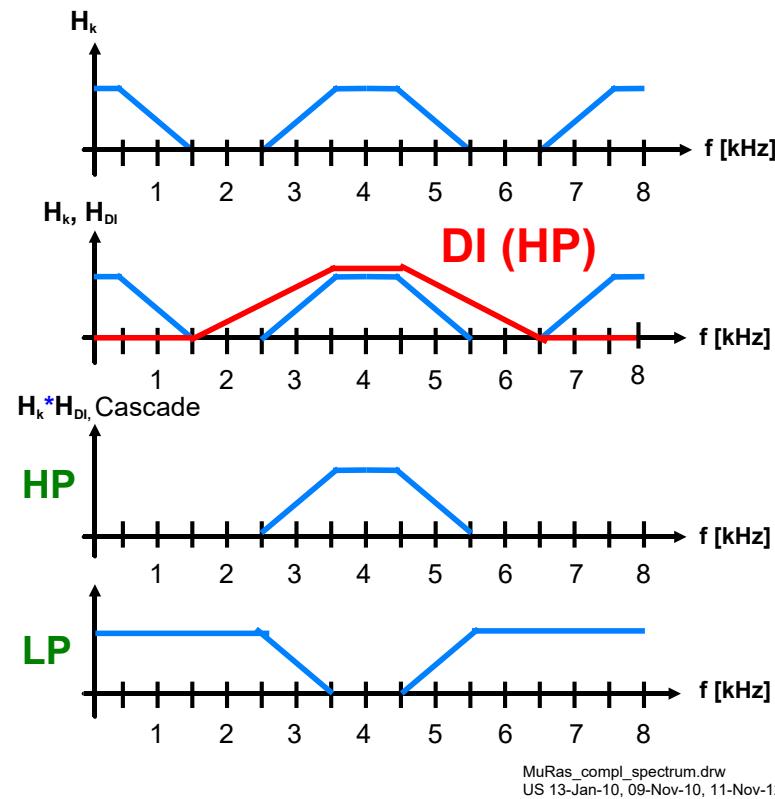
If the output of the highpass/lowpass filter is subtracted from a cascade of delays which compensates the delay of the filter, a lowpass/highpass branching filter is obtained. Note :  $y_4(n)$  is a high-pass filtered output signal, the output of the lower interpolation filter  $H_{DI}(z)$  is a low-pass filtered output  $y_3(n)$ , see next page. Assume  $F_s = 8 \text{ kHz}$ .  $H_{\text{Kernel}}$  filter operates on  $F_s = 4 \text{ kHz}$ .



MuRas\_dec\_kernel\_int\_complementary.DRW  
US 14-Jan-10, 09-Nov-10, 11-Nov-12, 24-Oct-14

## Multirate Complementary Low-pass/High-pass Filters [2]

If the output of the highpass/lowpass filter is subtracted from a delay which compensates the delay of the filter, a lowpass/highpass branching filter is obtained. Assume  $F_s = 8$  kHz.  $H_{\text{Kernel}}$  filter operates on  $F_s = 4$  kHz.

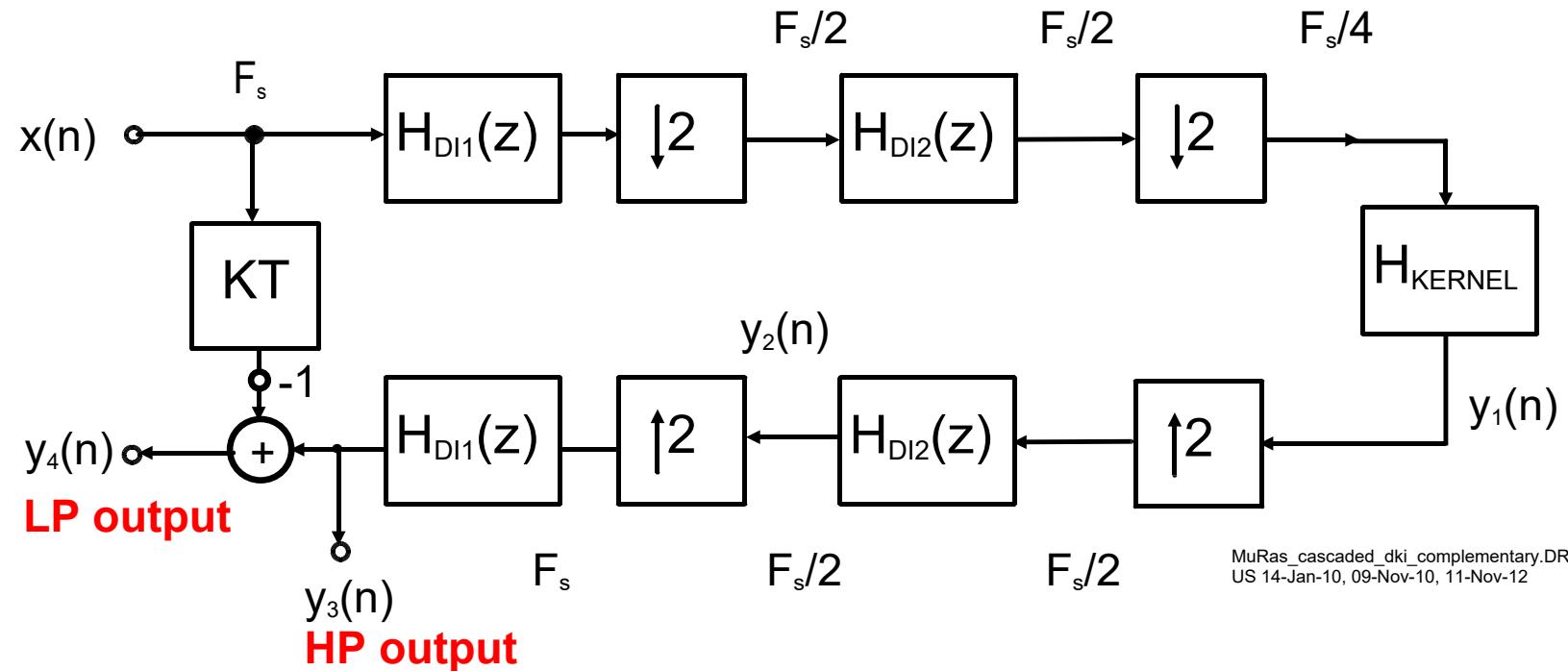


MuRas\_compl\_spectrum.drw  
US 13-Jan-10, 09-Nov-10, 11-Nov-12

## Multirate Cascaded Complementary Filters

If the several decimation filters (highpass/lowpass) are cascaded and the filter output(s) are subtracted from a delay chain which compensates the delay of the filter, a lowpass/highpass **branching** filter is obtained.

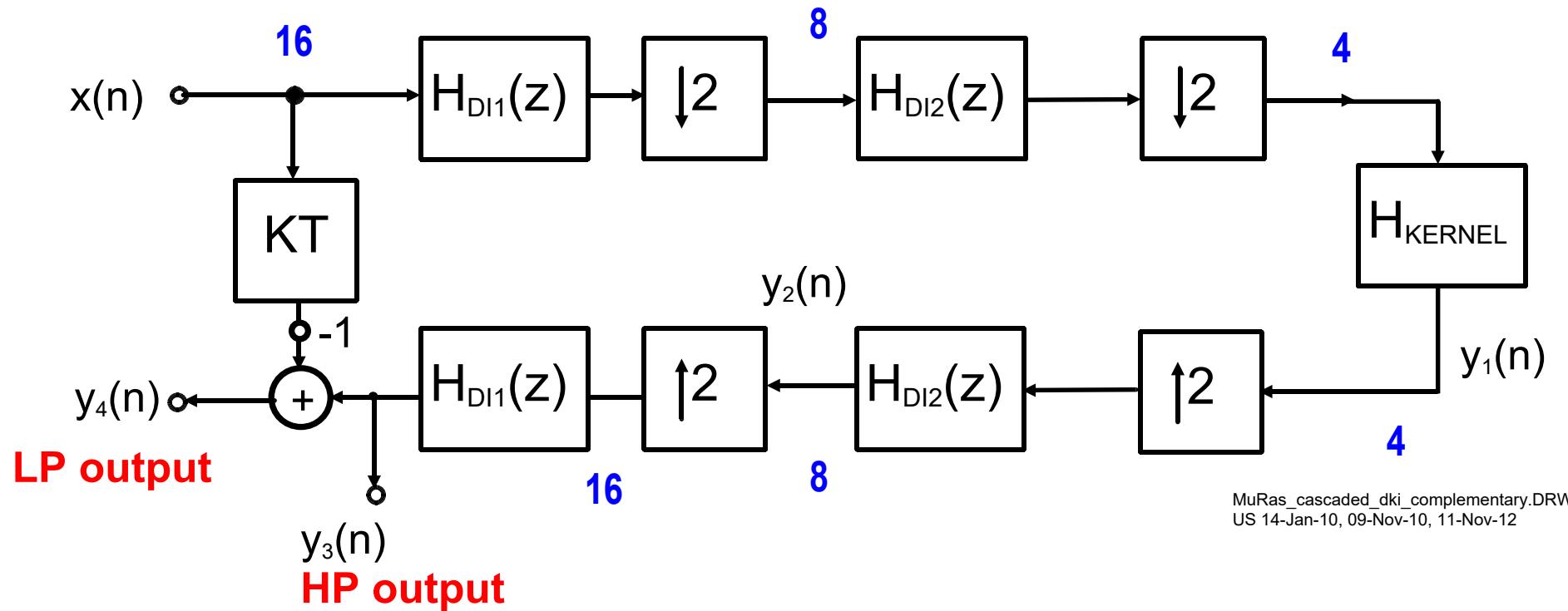
$H_{Kernel}$  filter operates on  $F_s/4$ , DI2 operates on  $F_s/2$  and DI1 operates on  $F_s$  !



MuRas\_cascaded\_dki\_complementary.DRW  
US 14-Jan-10, 09-Nov-10, 11-Nov-12

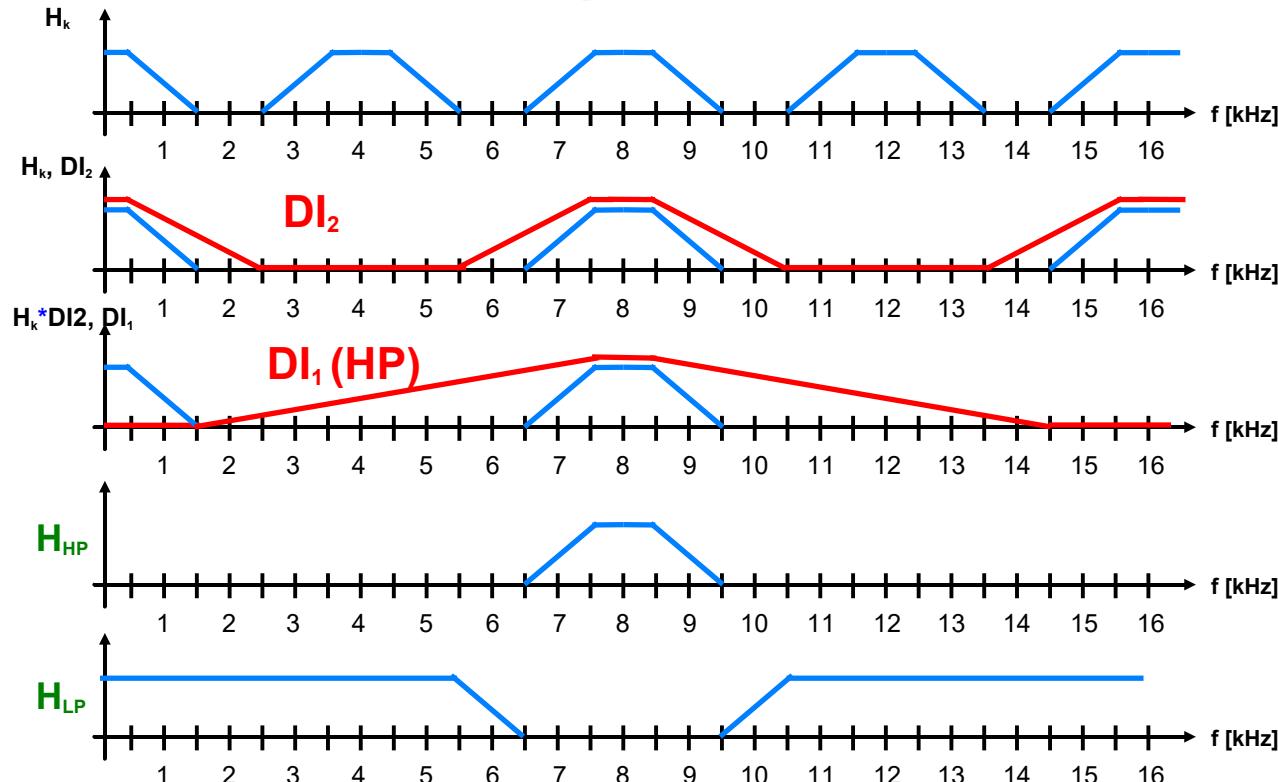
## Multirate Cascaded Complementary Filters

Assume that  $H_{Kernel}$  and  $DI2$  are lowpass filters and  $DI1$  is a high-pass filter  
 Assume  $F_s = 16$  kHz.  $H_{Kernel}$  filter operates on  $F_s = 4$  kHz.



## Multirate Cascaded Complementary Filters

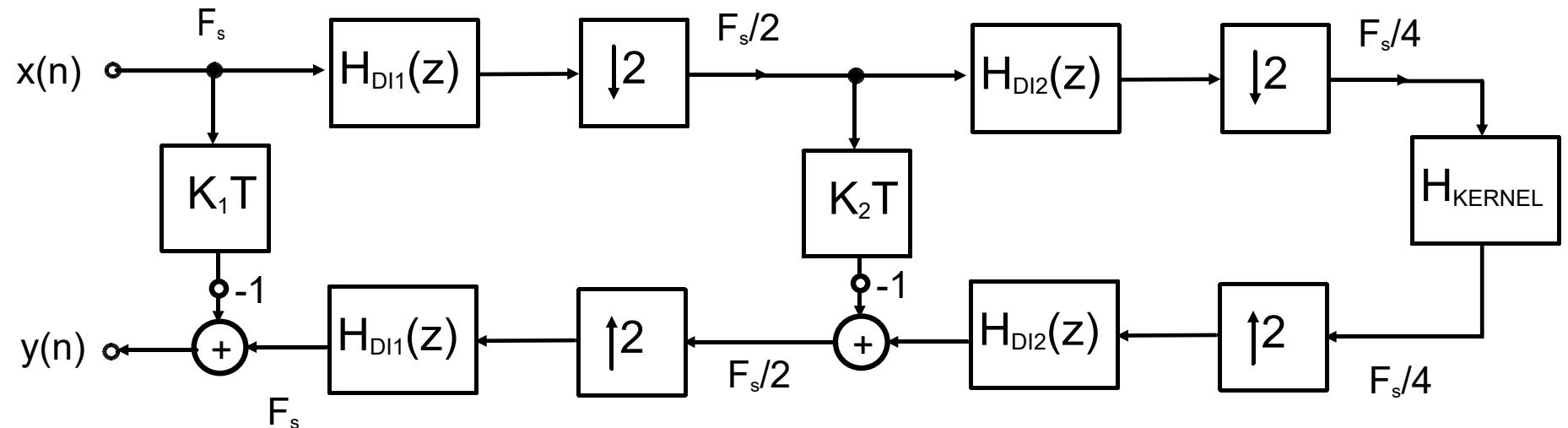
Assume that  $H_{Kernel}$  and  $DI_2$  are lowpass filters and  $DI_1$  is a high-pass filter  
 Assume  $F_s = 16$  kHz.  $H_{Kernel}$  filter operates on  $F_s = 4$  kHz.



MuRas\_cascaded\_compl\_spectrum.drw  
 US 13-Jan-10, 09-Nov-10, 11-Nov-12

## Multirate Cascaded Complementary Filters

This process can be repeated as often as desired. This way, arbitrary filter curves with steep flanks can be obtained.  
Depending upon the edge frequencies of the kernel filter, the complementary filter output has to be used (or not).



MuRas\_casc\_casc\_dec\_kernel\_int\_compl.DRW  
US 14-Jan-10