# Summer School on Advanced Ultrasound Imaging

Part 1: Introduction to conventional velocity estimation

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# Outline

- Basic ultrasound and scattering from blood
- Model for ultrasound interaction with moving particles
- Physical effects and limitations in traditional velocity systems
- Color flow mapping phase shift (autocorrelation) approach
- Color flow mapping cross-correlation approach
- Stationary echo canceling
- Simulation of flow imaging systems





Triplex scan with B-mode image, color flow image, and spectral display. The square brackets indicate position and size of the range gate.



Doppler shift  

$$f_d = \frac{2v}{c} f_0$$

$$f_0 \text{ - Center frequency of transducer, } c \text{ - Speed of sound, } v \text{ - Blood velocity}$$
Effect of attenuation:  
Down-shift in center frequency:  

$$f_{mean} = f_0 - (\beta_1 B_r^2 f_0^2) z$$

 $B_r$  - Gaussian bandwidth,  $\beta_1$  - Attenuation coefficient [Np/Hz m] z - Depth







Time shift between emissions

$$t_s = \frac{2|v|\cos\theta}{c} T_{prf} = \frac{2v_z}{c} T_{prf}$$

**Received signals** 

$$y_1(t) = a \cdot e(t - \frac{2d}{c})$$
  
 $y_2(t) = a \cdot e(t - \frac{2d}{c} - t_s) = y_1(t - t_s)$ 

 $T_{prf}$  - Time between pulse emissions,  $v_z$  - Velocity along beam c - Speed of sound, e(t) - Emitted signal

Model for the received signals (single scatterer)

First emission:

$$r_0(t) = a \sin(2\pi f_0(t - \frac{2d}{c}))$$

Second emission:

$$r_1(t) = a \sin(2\pi f_0(t - \frac{2d}{c} - t_s))$$

i'th emission:

$$r_i(t) = a\sin(2\pi f_0(t - \frac{2d}{c} - t_s i))$$

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# Sampling at one depth

Measurement at one fixed time  $t_z$  or depth:

$$\phi = 2\pi f_0(t_z - \frac{2d}{c})$$

gives

$$r_i(t_x) = -a\sin(2\pi f_0 t_s i - \phi) = -a\sin(2\pi \frac{2v_z}{c}f_0 (T_{prf}i) - \phi)$$

### Frequency of sampled signal:

$$f_p = -\frac{2v_z}{c}f_0$$

 $T_{prf}$  - Time between pulse emissions,  $v_z$  - Velocity along beam, c - Speed of sound, i - Emission number  $f_0$  - Center frequency





# **Physical effects**

Down shift in center frequency due to attenuation:

$$\Delta f = \beta_1 B_r^2 f_0^2 d_0$$

Down shift in resulting pulsed wave spectrum:

$$\Delta f_{pw,att} = \frac{2v_z}{c} \cdot \beta_1 B_r^2 f_0^2 d_0,$$

Doppler shift from motion of blood during pulse interaction:

$$\Delta f_{pw,f_d} = \frac{2v_z}{c} \frac{2v_z}{c} f_0.$$

Non-linear components:

$$f_{\text{non-linear}} = \frac{2v_z}{c} f_{\text{har}}$$

Bias depends on whether  $|f_{\text{non-linear}}| > f_{prf}/2$  or not.















# Power density spectrum from scatterer distribution

Normalized power density:

$$G(f_d) = \begin{cases} \frac{2}{p_o \cdot f_{max} \left(1 - \frac{f_d}{f_{max}}\right)^{1 - \frac{2}{p_o}}} & \text{for } 0 < f_d < f_{max} \\ 0 & \text{else} \end{cases}$$
$$f_{max} = \frac{2v_0 f_0}{c} \cos(\theta).$$

Parabolic profile  $(p_0 = 2)$ :

$$G(f_d) = \frac{1}{f_{max}} \quad \text{for } 0 < f_d < f_{max}$$

 $\begin{array}{lll} r & \mbox{radial position} & R & \mbox{radius of vessel} \\ v_0 & \mbox{maximum velocity found at center of vessel} & \mbox{$\rho_p$} & \mbox{particle density} \\ v_1 & \mbox{velocity at the radial position $r_1$} & \mbox{$f_0$} & \mbox{ultrasound frequency} \\ \cos(\theta) & \mbox{angle between ultrasound beam and flow} \end{array}$ 

Examples of flow profiles and corresponding power density spectra Velocity profile for p\_= 6 Velocity profile for p\_= 2 Spectrum, p\_= 2 Spectrum, p\_= 6 Amplitude [dB] 0 00 in le e [dB] malized v mplitude alized 0.5 0 0.5 Radial distance 0.5 1 Normalized frequency (f/f max) -0.5 0 0.5 Radial distance 0.5 1 Iormalized frequency (f/f max) Velocity profile for p = 3 Spectrum, po= 3 Velocity profile for p = 100 Spectrum, po= Amplitude [dB] elocity Amplitude [dB] nalized <u>5</u>0.5 0.5 1 Normalized frequency (f/f max) 0.5 0 0.5 Radial distance -0.5 0 0.5 Radial distance 0.5 1 rmalized frequency (f/f max) Idealized velocity profiles and corresponding normalized power density spectra. Parabolic flow  $(p_o = 2)$  gives rectangular distribution of velocities and flat spectrum Plug flow ( $p_o 
ightarrow \infty$ ) the spectrum approaches a monochromatic shape, because nearly all scatterers are moving at the same velocity.







# Color flow mapping using phase shift estimation

Received demodulated signal:

$$r_{cfm}(i) = a \cdot \exp(-j(2\pi \frac{2v_z}{c}f_0 iT_{prf} + \phi_f))$$
  
=  $a \cdot \exp(-j\phi(t)) = x(i) + jy(i)$ 

Velocity estimation:

$$\frac{d\phi}{dt} = \frac{d\left(-2\pi\frac{2v_z}{c}f_0t + \phi\right)}{dt} = -2\pi\frac{2v_z}{c}f_0$$

Find the change is phase as a function of time gives quantity proportional to the velocity.

Realization

$$\tan(\Delta \phi) = \tan\left(\arctan\left(\frac{y(i)}{x(i)}\right) - \arctan\left(\frac{y(i-1)}{x(i-1)}\right)\right)$$
$$= \frac{\frac{y(i)}{x(i)} - \frac{y(i-1)}{x(i-1)}}{1 + \frac{y(i)}{x(i)} \cdot \frac{y(i-1)}{x(i-1)}}$$
$$= \frac{y(i) \cdot x(i-1) - y(i-1)x(i)}{x(i)x(i-1) + y(i)y(i-1)}$$

using that

$$\tan(A - B) = \frac{\tan(A) - \tan(B)}{1 + \tan(A)\tan(B)}$$

Then

$$\arctan\left(\frac{y(i)x(i-1) - y(i-1)x(i)}{x(i)x(i-1) + y(i)y(i-1)}\right) = -2\pi f_0 \frac{2v_z}{c} T_{prf}.$$
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# Color flow mapping using phase shift estimation

Using the complex autocorrelation:

$$R(m) = \lim_{N \to \infty} \frac{1}{2N+1} \sum_{i=-N}^{N} r_{cfm}^{*}(i) r_{cfm}(i+m),$$

Actual determination from the complex autocorrelation:

$$v_{z} = -\frac{cf_{prf}}{4\pi f_{0}} \arctan\left(\frac{\sum_{i=0}^{N_{c}-2} y(i+1)x(i) - x(i+1)y(i)}{\sum_{i=0}^{N_{c}-2} x(i+1)x(i) + y(i+1)y(i)}\right) = -\frac{cf_{prf}}{4\pi f_{0}} \arctan\left(\frac{\Im\{R(1)\}}{\Re\{R(1)\}}\right)$$

Corresponds to the mean angular frequency:

$$\bar{\omega} = \frac{\int_{-\infty}^{+\infty} \omega P(\omega) d\omega}{\int_{-\infty}^{+\infty} P(\omega) d\omega}$$

 $P(\omega)$  is the power density spectrum of the received, demodulated signal.

## Phase shift estimation with RF sample averaging

Averaging of RF samples:

$$v_{z} = -\frac{cf_{prf}}{4\pi f_{0}} \arctan \left( \frac{\sum_{\substack{n=0 \ i=0 \ N_{c}-2 \ N_{c}-2 \ N_{c}-2 \ N_{c}-2 \ N_{c}-1 \ N_{c}-2 \$$

- x(n,i) RF sample for time index n and emission number i (in-phase component)
- y(n,i) Quadrature component
- $f_{prf}$  Pulse repetition frequency
- $f_0$  Center frequency of transducer
- $N_s$  Number of samples for one pulse length
- $N_c$  Number of emissions
- *c* Speed of sound



Signal relation between received signals

$$r_{s2}(t) = r_{s1}(t - t_s)$$

**Cross-correlation yields** 

$$R_{12}(\tau) = \frac{1}{2T} \int_{T} r_{s1}(t) r_{s2}(t+\tau) dt = \frac{1}{2T} \int_{T} r_{s1}(t) r_{s1}(t-t_s+\tau) dt$$
  
=  $R_{11}(\tau-t_s)$   
 $R_{12}(\tau) = R_{pp}(\tau) * \sigma_s^2 \delta(\tau-t_s) = \sigma_s^2 R_{pp}(\tau-t_s)$ 

Global maximum at  $\tau - t_s = 0$ .

Velocity estimate is:

$$\hat{v}_z = \frac{c}{2} \frac{\hat{t}_s}{T_{prf}}.$$

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# Calculation of the cross-correlation

$$\hat{R}_{12d}(n, i_{seg}) = \frac{1}{N_s(N_c - 1)} \sum_{i=0}^{N_c - 2} \sum_{k=0}^{N_s - 1} r_{s_i}(k + i_{seg}N_s) r_{s_{i+1}}(k + i_{seg}N_s + n).$$

Largest detectable velocity:

$$v_{max} = \frac{l_g}{T_{prf}} = \frac{c}{2} N_s \frac{f_{prf}}{f_s}$$

Minimum velocity due to time quantization:

$$v_{min} = \frac{c}{2} \frac{f_{prf}}{f_s}$$

Interpolated peak by polynomial fit

$$n_{int} = n_m - \frac{\hat{R}_{12d}(n_m + 1) - \hat{R}_{12d}(n_m - 1)}{2(\hat{R}_{12d}(n_m + 1) - 2\hat{R}_{12d}(n_m) + \hat{R}_{12d}(n_m - 1))}$$

Interpolated estimate:

$$\hat{v}_{int} = \frac{c}{2} \frac{n_{int} f_{prf}}{f_s}$$

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# Reduction in signal-to-noise ratio due to filter $R_{\text{Snr}} = \frac{\text{snr}}{\text{snr}_{f}} = \frac{\sqrt{\frac{E[\{p(t) * s_{c}(t)\}^{2}]}{E[n^{2}(t)]}}}{\frac{1}{\sqrt{2}}\sqrt{\frac{E[\{p(t) * h(t; t_{s}) * s_{c}(t)\}^{2}]}{E[n^{2}(t)]}}}$ $= \sqrt{2}\sqrt{\frac{E[\{p(t) * s_{c}(t)\}^{2}]}{E[\{p(t) * h(t; t_{s}) * s_{c}(t)\}^{2}]}} = \sqrt{2}\sqrt{\frac{R_{p}(0)}{R_{p}(\tau) * R_{h}(\tau, t_{s})|_{\tau=0}}}.$

p(t) - Pulse, n(t) - Measurement noise,  $s_c(t)$  - Scattering signal  $h(t;t_s)$  - Impulse response of filter,  $R_p(\tau)$  - Autocorrelation of pulse,  $R_h(\tau,t_s)$  - Autocorrelation of filter



# Problems in current color flow imaging systems

- Frame rate is linked to number of lines in image
- More emissions gives lower frame rate
- Few emissions gives high standard deviation
- Only velocity along the ultrasound beam is found
- Stationary echo canceling is difficult due to few samples
- Slow moving flow is difficult to detect
- All these issues will be addressed in the lecture on SA flow imaging



# Simulation in Field II

Pulse-echo model:

$$p_r(\vec{r_1}, \vec{r_2}, t) = v_{pe}(t) \star f_m(\vec{r_1}) \star h_{pe}(\vec{r_1}, \vec{r_2}, t),$$

Neglect the Doppler effect and use:

$$\vec{r}_2(i+1) = \vec{r}_2(i) + T_{prf}\vec{v}(\vec{r}_2(i),t)$$

Scatterers are propagated between pulses according to their velocity

#### Field II: An Example: Flow simulation

path(path,'/home/jaj/programs/field\_II/m\_utilities');

% Example of using Field II by Joergen Arendt Jensen, May 26, 2015 % Start the system and initialize the path path(path,'/home/jaj/programs/field\_II/M\_files')

% Initialize the field system

field\_init

% Generate the transducer apertures for send and receive

f0=5e6; % Transducer center frequency [Hz] M=4; % Number of cycles in emitted pulse fs=100e6; % Sampling frequency [Hz] c=1540; % Speed of sound [m/s] lambda=c/f0; % Wavelength [m] pitch=lambda/2; % Pitch of transducer element\_height=5/1000; % Height of element [m] kerf=width/10; % Kerf [m] width=pitch-kerf; % Width of element focus=[0 0 60]/1000; % Fixed focal point [m]

```
N_elements=64;
                         % Number of physical elements
                         \% Number of shots to be processed
Nshoots=5000;
% Set the sampling frequency
set_sampling(fs);
% Generate aperture for emission
emit_aperture = xdc_linear_array (N_elements, width, element_height, kerf, 1, 1, focus);
% Set the impulse response and excitation of the emit aperture
impulse_response=sin(2*pi*f0*(0:1/fs:2/f0));
impulse_response=impulse_response.*hanning(max(size(impulse_response)));;
xdc_impulse (emit_aperture, impulse_response);
excitation=sin(2*pi*f0*(0:1/fs:M/f0));
xdc_excitation (emit_aperture, excitation);
% Generate aperture for reception
receive_aperture = xdc_linear_array (N_elements, width, element_height, kerf, 1, 1,focus)
% Set the impulse response for the receive aperture
```

```
xdc_impulse (receive_aperture, impulse_response);
%
    Set a Hanning apodization on the apertures
apo=hanning(N_elements)';
xdc_apodization (emit_aperture, 0, apo);
xdc_apodization (receive_aperture, 0, apo);
% Make the flow simulation
for i=1:Nshoots
  \%\, Generate the rotated and offset block of sample
  theta=45/180*pi;
  xnew=x*cos(theta)+z*sin(theta);
  znew=z*cos(theta)-x*sin(theta) + z_offset;
  scatterers=[xnew; y; znew;]';
  %
      Calculate the received response
  [v, t1]=calc_scat(emit_aperture, receive_aperture, scatterers, amp');
  % Store the result
```

```
image_data(1:max(size(v)),i)=v';
times(i) = t1;
% Propagate the scatterers and aliaze them
% to lie within the correct range
x1=x;
x=x + velocity*Tprf;
outside_range= (x > x_range/2);
x=x - x_range*outside_range;
end
```



### Spectogram for femoral artery based on Womerlsy-Evans' model

### Field II: CFM flow simulation

```
%
  This example shows how a linear array B-mode system scans an image
%
  when doing color flow mapping
%
\% This script assumes that the field_init procedure has been called
\% Here the field simulation is performed and the data is stored
%
  in rf-files; one for each rf-line done. The data must then
%
  subsequently be processed to yield the image. The data for the
%
   scatteres are read from the file pht_data.mat, so that the procedure
%
  can be started again or run for a number of workstations.
%
%
  Version 2.2 by Joergen Arendt Jensen, May 27, 2015
  Generate the transducer apertures for send and receive
%
f0=5e6;
                         %
                           Transducer center frequency [Hz]
fs=100e6;
                         % Sampling frequency [Hz]
c=1540;
                         % Speed of sound [m/s]
lambda=c/f0;
                         % Wavelength [m]
width=lambda;
                         % Width of element
element_height=5/1000;
                         % Height of element [m]
kerf=0.05/1000;
                         % Kerf [m]
                         % Fixed focal point [m]
focus=[0 0 70]/1000;
                         \% Number of physical elements
N_elements=196;
```

```
% Number of active elements in receive
rec_N_active=64;
                         % Number of active elements in transmit
xmit_N_active=64;
% Generate aperture for emission
xmit_aperture = xdc_linear_array (N_elements, width, ...
                   element_height, kerf, 1, 10,focus);
\% Set the impulse response and excitation of the xmit aperture
impulse_response=sin(2*pi*f0*(0:1/fs:2/f0));
impulse_response=impulse_response.*hanning(max(size(impulse_response)));
xdc_impulse (xmit_aperture, impulse_response);
excitation=sin(2*pi*f0*(0:1/fs:2/f0));
xdc_excitation (xmit_aperture, excitation);
% Generate aperture for reception
receive_aperture = xdc_linear_array (N_elements, width, ...
                       element_height, kerf, 1, 10,focus);
% Set the impulse response for the receive aperture
xdc_impulse (receive_aperture, impulse_response);
```

```
% Do for the number of CFM lines
Ncfm=10;
for k=1:Ncfm
  Load the computer phantom
%
  cmd=['load sim_flow/scat_',num2str(k),'.mat']
  eval(cmd)
  %
      Do linear array imaging
  no_lines=20;
                                  % Number of lines in image
  image_width=40/1000;
                                  % Size of image sector
                                % Increment for image
  d_x=image_width/(no_lines-1);
  \% Set the different focal zones for reception
  rec_zone_start=30/1000;
  rec_zone_stop=100/1000;
  rec_zone_size=10/1000;
  focal_zones_center=[rec_zone_start:rec_zone_size:rec_zone_stop]';
  focal_zones=focal_zones_center-0.5*rec_zone_size;
```

```
Nf=max(size(focal_zones));
focus_times=focal_zones/1540;
% Set a Hanning apodization on the receive aperture
% Dynamic opening aperture is used.
Fnumber=2.0;
rec_N_active_dyn=round(focal_zones_center./(Fnumber*(width+kerf)));
for ii=1:Nf
  if rec_N_active_dyn(ii)>rec_N_active
   rec_N_active_dyn(ii)=rec_N_active;
    end
 rec_N_pre_dyn(ii) = ceil(rec_N_active/2 - rec_N_active_dyn(ii)/2);
 rec_N_post_dyn(ii) = rec_N_active - rec_N_pre_dyn(ii) - ...
                               rec_N_active_dyn(ii);
 rec_apo=(ones(1,rec_N_active_dyn(ii)));
 rec_apo_matrix_sub(ii,:)=[zeros(1,rec_N_pre_dyn(ii)) rec_apo ...
                              zeros(1,rec_N_post_dyn(ii))];
  end
% Transmit focus
z_focus=40/1000;
```

```
%
   Set a Hanning apodization on the xmit aperture
xmit_apo=hanning(xmit_N_active)';
% Do imaging line by line
i_start=1;
x= -image_width/2 +(i_start-1)*d_x;
for i=i_start:no_lines
i
 %
     Set the focus for this direction
 xdc_center_focus (emit_aperture, [x 0 0]);
 xdc_focus (xmit_aperture, 0, [x 0 z_focus]);
 xdc_center_focus (receive_aperture, [x 0 0]);
 xdc_focus (receive_aperture, focus_times,
                [x*ones(Nf,1), zeros(Nf,1), focal_zones]);
 % Calculate the apodization
 xmit_N_pre = round(x/(width+kerf) + N_elements/2 - xmit_N_active/2);
 xmit_N_post = N_elements - xmit_N_pre - xmit_N_active;
  xmit_apo_vector=[zeros(1,xmit_N_pre) xmit_apo zeros(1,xmit_N_post)];
```

```
rec_N_pre(i) = round(x/(width+kerf) + N_elements/2 - rec_N_active/2);
rec_N_post(i) = N_elements - rec_N_pre(i) - rec_N_active;
rec_apo_matrix=[zeros(size(focus_times,1),rec_N_pre(i)) ...
                rec_apo_matrix_sub zeros(size(focus_times,1), ...
rec_N_post(i))];
xdc_apodization (xmit_aperture, 0, xmit_apo_vector);
xdc_apodization (receive_aperture, focus_times , rec_apo_matrix);
%
   Calculate the received response
[rf_data, tstart]=calc_scat(xmit_aperture, receive_aperture, ...
                            positions, amp);
% Store the result
cmd=['save sim_flow/rft',num2str(k),'l',num2str(i), ...
                  '.mat rf_data tstart']
eval(cmd)
% Steer in another direction
x = x + d_x;
```

```
end % Loop for lines
end % CFM loop
% Free space for apertures
xdc_free (xmit_aperture)
xdc_free (receive_aperture)
```



# Exercise on ultrasound RF flow data

Basic model, first emission:

$$r_1(t) = p(t) * s(t)$$

s(t) - Scatterer amplitudes (white, random, Gaussian)

Second emission:

$$r_2(t) = p(t) * s(t - t_s) = r_1(t - t_s)$$

Time shift  $t_s$ :

$$t_s = \frac{2v_z}{c}T_{prf}$$

$r_{1}(t)$	Received voltage signal	p(t)	Ultrasound pulse
*	Convolution	$v_z$	Axial blood velocity
С	Speed of sound	$T_{prf}$	Time between pulse emissions

# A simple interpretation - a collection of scatterers

 $\mathbf{y}_{\mathbf{x}} = \mathbf{y}_{\mathbf{x}} =$ 

Signal from a collection of scatterers crossing a beam from a concave transducer.

Collection of scatterers:

 $r_s(i) = -\sum_{k=1}^{N} a_k \sin(2\pi \frac{2v_z(k)}{c} f_0 T_{prf} i - \phi_k)$  $\phi_k = 2\pi f_0 \left( t_z - \frac{2d_k}{c} \right)$ 

k - Scatterer number

For a plug flow:

$$y_i(t) = p(t) * e(t - it_s) = y_0(t - it_s)$$
  
$$t_s = \frac{2v_z}{c} T_{prf}$$

For a sampled system:

$$y_i(n) = p(n) * e(n - i \cdot n_s) = y_0(n - i \cdot n_s)$$
  
$$n_s = \frac{2v_z}{c} T_{prf} f_s$$

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# Signal processing

- 1. Find ultrasound pulse (load from file)
- 2. Make scatterers
- 3. Generate a number of received RF signals
- 4. Study the generated signals
- 5. Compare with simulated and measured RF data
- 6. Make a function for velocity estimation using cross-correlation
- 7. Validate it on the simulated data and apply it to the femoral data

Signal relation between received signals

$$r_{s2}(t) = r_{s1}(t - t_s)$$

**Cross-correlation yields** 

$$R_{12}(\tau) = \frac{1}{2T} \int_{T} r_{s1}(t) r_{s2}(t+\tau) dt = \frac{1}{2T} \int_{T} r_{s1}(t) r_{s1}(t-t_s+\tau) dt$$
  
=  $R_{11}(\tau-t_s)$   
 $R_{12}(\tau) = R_{pp}(\tau) * \sigma_s^2 \delta(\tau-t_s) = \sigma_s^2 R_{pp}(\tau-t_s)$ 

Global maximum at  $\tau - t_s = 0$ .

Velocity estimate is:

$$\hat{v}_z = \frac{c}{2} \frac{\hat{t}_s}{T_{prf}}.$$

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Calculation of the cross-correlation

$$\hat{R}_{12d}(n, i_{seg}) = \frac{1}{N_s(N_c - 1)} \sum_{i=0}^{N_c - 2} \sum_{k=0}^{N_s - 1} r_{s_i}(k + i_{seg}N_s) r_{s_{i+1}}(k + i_{seg}N_s + n).$$

Interpolated peak by polynomial fit

$$n_{int} = n_m - \frac{\hat{R}_{12d}(n_m + 1) - \hat{R}_{12d}(n_m - 1)}{2(\hat{R}_{12d}(n_m + 1) - 2\hat{R}_{12d}(n_m) + \hat{R}_{12d}(n_m - 1))}$$

Interpolated estimate:

$$\hat{v}_{int} = \frac{c}{2} \frac{n_{int} f_{prf}}{f_s}.$$