# Advanced Dynamical Systems Control 動的システム制御論#2

ver. 0.1

禁無断転載

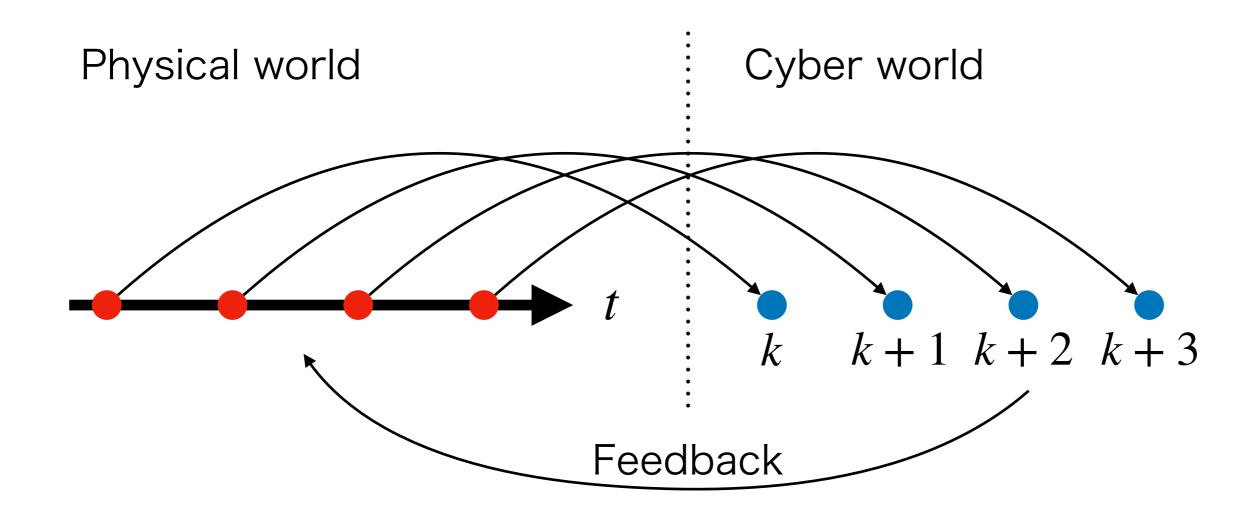
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#### Schedule 授業の予定

- Brief review of "modern control theory" 現代制御総復習
- Basic idea of sample-data control サンプル値制御理論の考え方
- Continuous-time systems and discrete-time systems
   連続時間システムと離散時間システム
- Stability of discrete-time linear systems 離散時間線形システムの安定性

- Multi-rate sampling systems
   マルチレートサンプリング系
- Design example of sample-data control systems
   サンプル値制御系の設計例
- Quantization errors and their solution 量子化誤差とその対策
- Implementation of sample-data systems
   サンプル値制御系の実装

#### Sample-data control

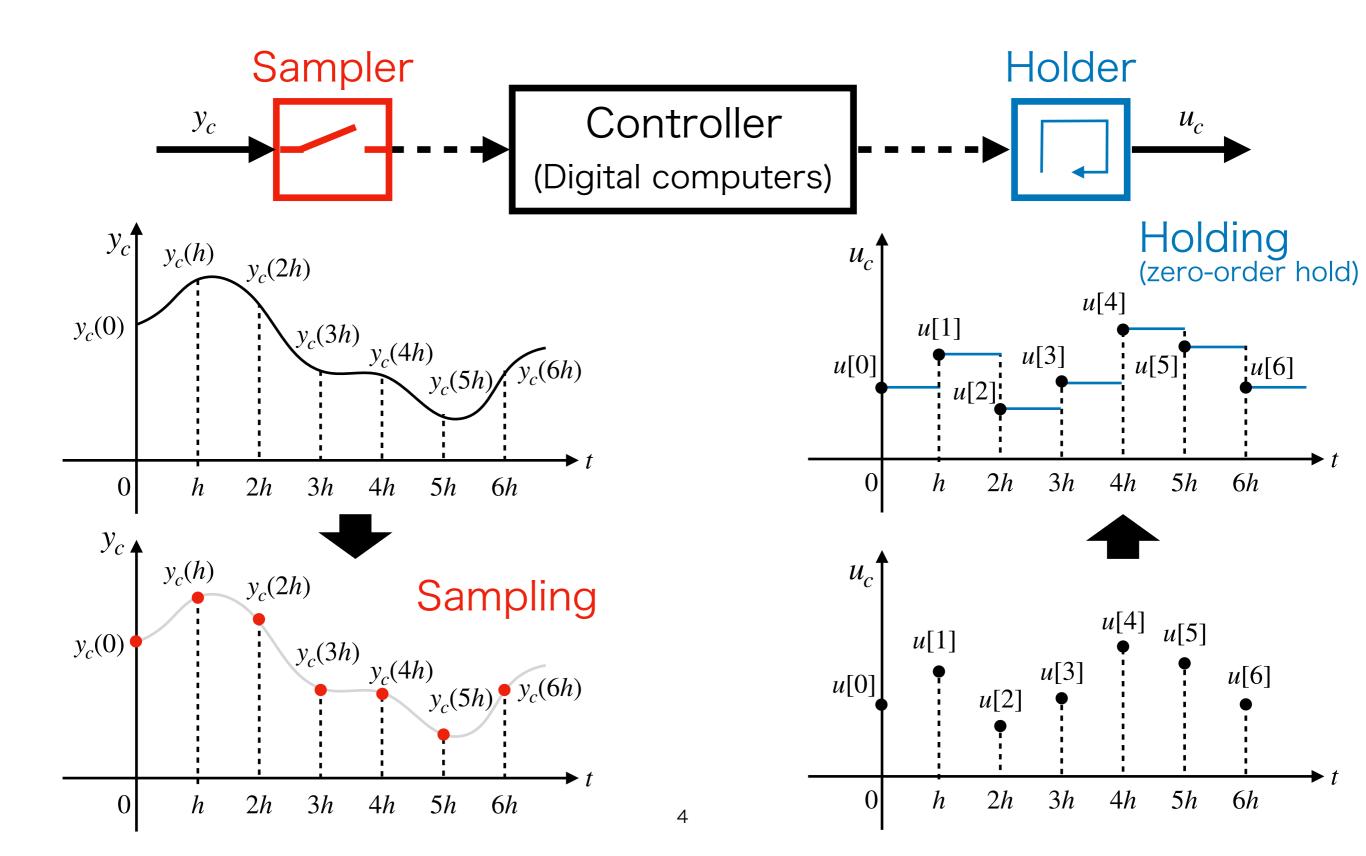


Continuous-time system

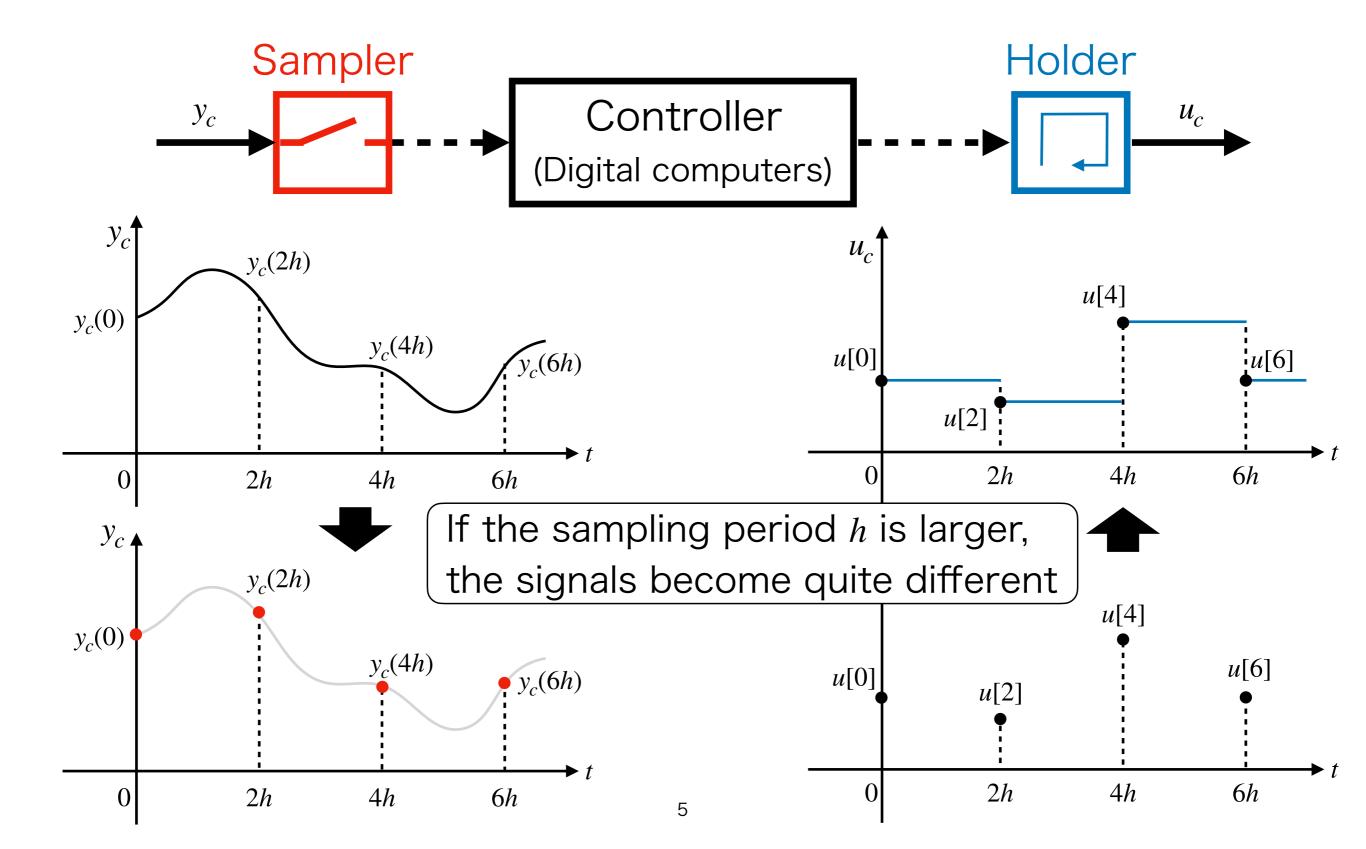
Discrete-time system

To sample data of physical phenomena and control it by calculating converted discrete data.

#### Sample-data control



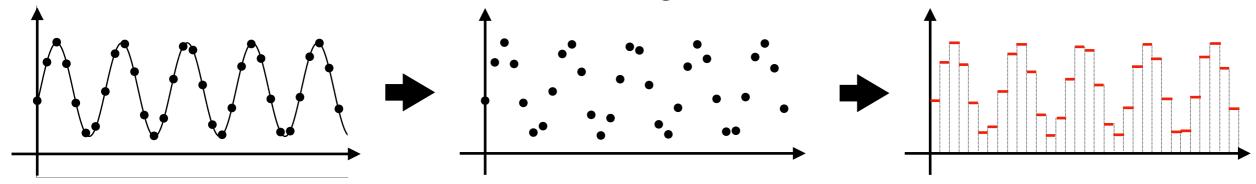
#### Sample-data control



# Sampling theorem

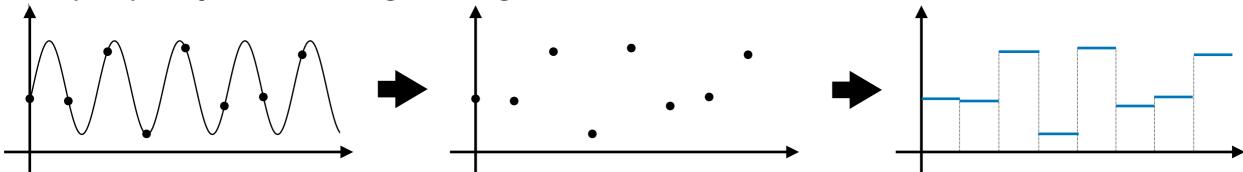
If sampling period h is small enough,

we can reconstruct almost the same signal in the discrete-time domain



If sampling period h is large,

the property of the original signal will be broken.



Nyquist frequency  $f_N$ : maximum frequency of reconstructable signal.

The sampling frequency should be more than twice as large as the original signal frequency.

If sampling period is h (sampling frequency is  $\frac{1}{h}$ ),  $f_N = \frac{1}{2h}$ .

# Continuous-time system vs Discrete-time system

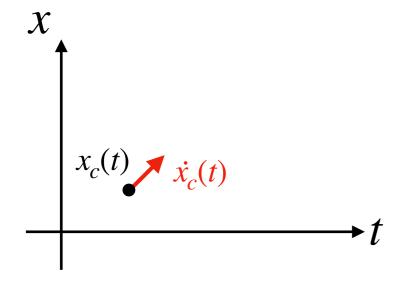
# Discrete-time linear system

The state-space forms are similar to each other, but the their meaning are little different

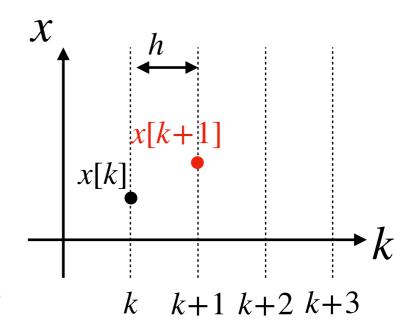
Continuous-time system

$$\dot{x_c}(t) = A_c x_c(t) + B_c u_c(t)$$

$$y_c(t) = C_c x_c(t) + D_c u_c(t)$$



Discrete-time system x[k+1] = Ax[k] + Bu[k] y[k] = Cx[k] + Du[k]



h: Sampling period

$$x[k] = x_c(th)$$

# Discrete-time linear system

Continuous-time system

$$\dot{x_c}(t) = A_c x_c(t) + B_c u_c(t)$$

$$x_{c}(t) = e^{A_{c}(t-t_{0})}x_{c}(t_{0}) + \int_{t_{0}}^{t} e^{A_{c}(t-\tau)}B_{c}u_{c}(\tau)d\tau$$

replace  $t \to th + h$  and  $t_0 \to th$ ,

$$x_c(th+h) = e^{A_c h} x_c(th) + \int_{th}^{th+h} e^{A_c(th+h-\tau)} B_c u_c(\tau) d\tau$$

In discrete-time systems, u(t) is fixed in a sampling period. So,

$$A = e^{A_c h} \quad B = \int_0^h e^{A_c \tau} B_c d\tau$$

for the discrete-time system x[k+1] = Ax[k] + Bu[k]

#### Example

Social systems are often expressed by discrete-time models Bank deposit model (extremely simplified)

· Interest rates: 0.1% per year

$$x[k+1] = \frac{0.1}{100 \times 12} x[k] + u[k]$$
 balance of this month deposit of this month

# Some properties of discrete-time system

# Stability

Continuous-time system

$$\dot{x_c}(t) = A_c x_c(t) + B_c u_c(t)$$



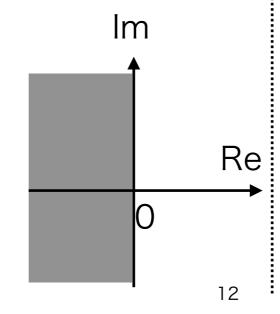
$$x_{c}(t) = e^{A_{c}t}x_{c}(0) + \int_{0}^{t} e^{A_{c}(t-\tau)}B_{c}u_{c}(\tau)d\tau$$

If 
$$u(t) \equiv 0$$
  

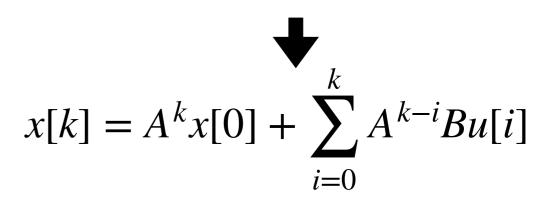
$$x_c(t) = e^{A_c t} x_c(0)$$

Stable  $\Leftrightarrow \lim_{t \to \infty} e^{A_c t} \to 0$ 

All the eigenvalues of  $A_c$  are on the left-half plane



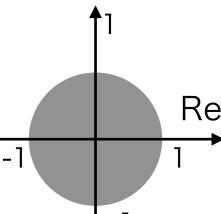
Discrete-time system x[k+1] = Ax[k] + Bu[k]



If 
$$u(t) \equiv 0$$
  
$$x[k] = A^k x[0]$$

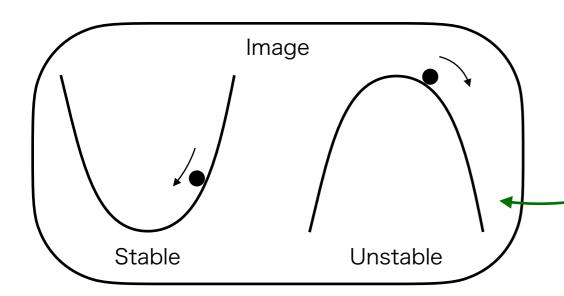
Stable  $\Leftrightarrow \lim_{k \to \infty} A^k \to 0$ 

All the eigenvalues of A are in the unit circle



# Stability

#### Lyapunov stability criterion

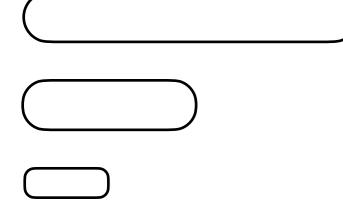


$$x[k+1] = Ax[k]$$

Lyapunov function candidate

$$P(x) = x^T P x$$

P: Positive definite  $(x^T P x > 0 \ (x \neq 0))$ 



$$P(x[k+1]) - P(x[k]) = x^{T}[k](A^{T}PA - P)x[k]$$

If positive definite matrices P, Q, which satisfy

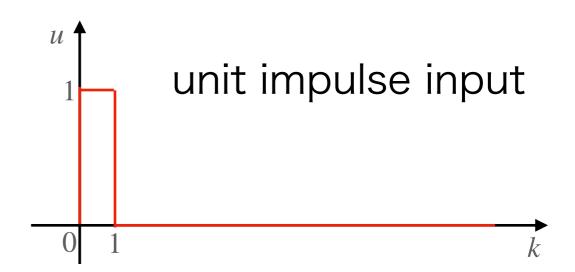
$$P = A^T P A + Q,$$

are exist, A is called **stable** 

#### Impulse response

$$x[k+1] = Ax[k] + Bu[k]$$
$$y[k] = Cx[k]$$

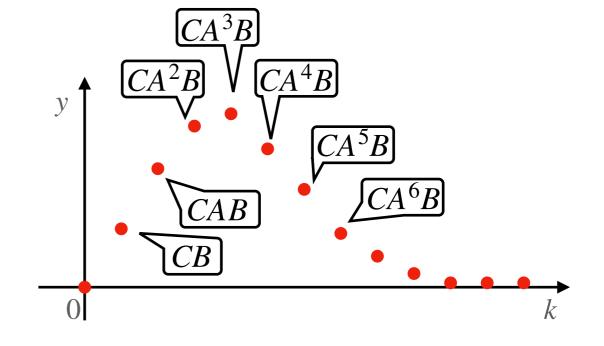
$$y[k] = CA^{k}x[0] + \sum_{i=0}^{k} CA^{k-i-1}Bu[i]$$



Impulse response matrix

Marcov parameter

If u is unit impulse input, the output is written by only the impulse response matrix

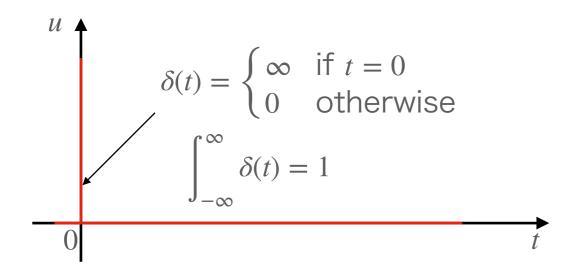


#### Impulse response

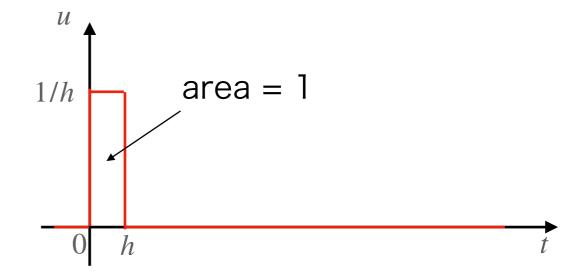
#### Note

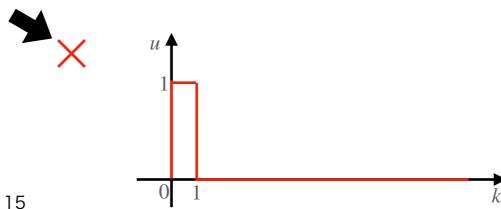
To obtain output which which corresponds to the impulse response in continuous-time system, the input should be a unit area pulse.

#### continuous-time



#### discrete-time





# Code Example

#### **MATLAB**

```
clear
A = [
    0 4;
    -6 -4;
    1;
B=[1;0];
C=[1 \ 0];
sys1=ss(A,B,C,0);
sys2=c2d(sys1,0.1);
sys3=c2d(sys1,1);
disp('Eigenvalues of A')
disp(eig(A))
disp('Absolute eigenvalues of A (h=0.1)')
disp(abs(eig(sys2.A)))
disp('Absolute eigenvalues of A (h=1)')
disp(abs(eig(sys3.A)))
markov2=zeros(1,51);
markov3=zeros(1,51);
for k=2:51
    markov2(k) = sys2.C*sys2.A^{(k-2)}*sys2.B;
    markov3(k) = sys3.C*sys3.A^(k-2)*sys3.B;
end
figure(1)
impulse(sys1,sys2,sys3,5)
hold on
% plot Markov parameter divided by sampling period
stairs((0:50).*0.1, markov2./0.1, 'Marker', 'o', 'LineStyle', 'none')
stairs((0:5), markov3(1:6), 'Marker', 'o', 'LineStyle', 'none')
grid on
legend('continuous','h=0.1','h=1',...
    'markov parameter (h=0.1)', 'markov parameter (h=1)')
hold off
```

#### Python (Jupyter Notebook)

```
# !pip install control
# %matplotlib inline
import numpy as np
from control.matlab import *
import matplotlib.pyplot as plt
A=' 0 4 : -6 -4 '
B=' 1 ; 0 '
C=' 1 0 '
sys1=ss(A,B,C,0)
print(sys1)
print(np.linalg.eigvals(sys1.A))
sys2=c2d(sys1,0.1)
sys3=c2d(sys1,1)
print(sys2)
print(abs(np.linalg.eigvals(sys2.A)))
print(sys3)
print(abs(np.linalg.eigvals(sys3.A)))
markov2=[]
markov3=[]
for k in range(50):
 markov2.append(sys2.C*np.linalg.matrix_power(sys2.A,k)*sys2.B)
 markov3.append(sys3.C*np.linalg.matrix_power(sys3.A,k)*sys3.B)
markov22=(np.array(markov2).reshape(-1))/0.1
markov33=(np.array(markov3).reshape(-1))
t1=np.arange(0,5,0.001)
t2=np.arange(0.5,0.1)
t3=np.arange(0,5,1)
y1,T1=impulse(sys1,t1)
y2,T2=impulse(sys2,t2)
y3,T3=impulse(sys3,t3)
fig, ax = plt.subplots()
ax.plot(T1,y1,label='continuous')
ax.plot(T2,y2,label='h=0.1')
ax.plot(T3,y3,label='h=1')
ax.plot(np.arange(0.1,5.1,0.1),markov22,linestyle='none',marker='o',label='markov parameter (h=0.1)')
```

ax.plot(np.arange(1,6,1),markov33[0:5],linestyle='none',marker='o',label='markov parameter (h=1)')

ax.legend()