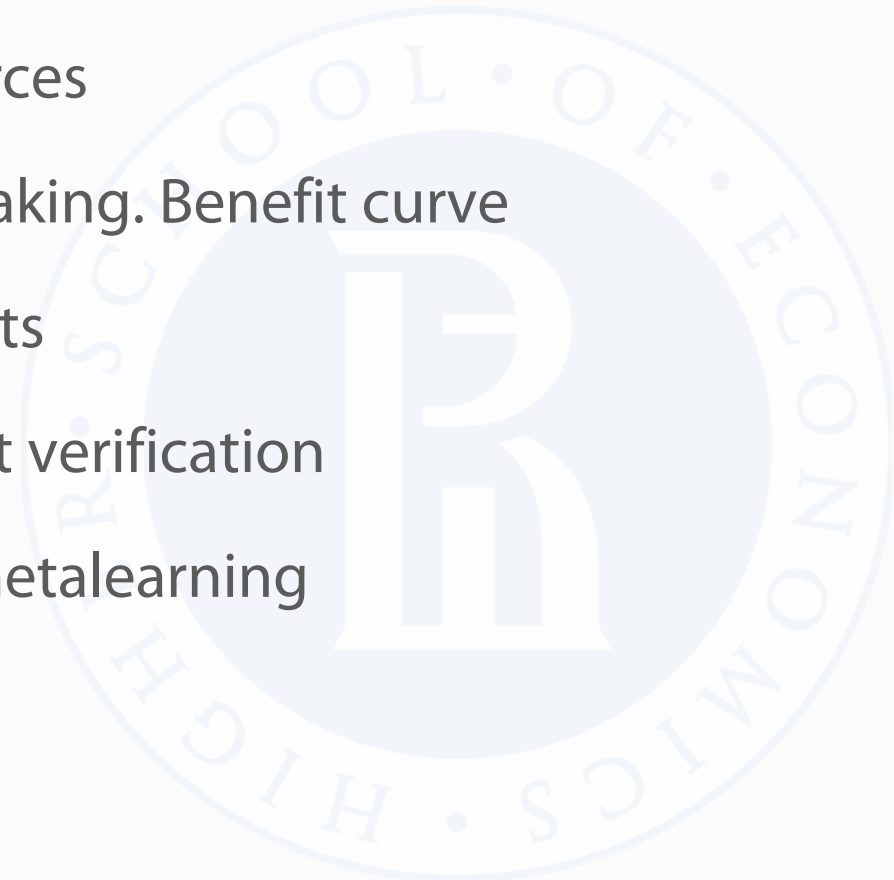


Project valuation



Course roadmap

1. Project valuation: valuation metrics, planning and rules
 - Project valuation: Net Present Value and other valuation criteria
 - Valuation planning
 - Expenses and income sources
2. Model quality and decision making. Benefit curve
3. Estimating model risk discounts
4. A/B testing and financial result verification
5. Unobservable model errors, metalearning



Project valuation: Net Present Value and other valuation criteria



Object of valuation

- First step of valuation process — a determination of an **object** we tend to assess



Object of valuation

- First step of valuation process — a determination of an object we tend to assess
- For projects / AI initiatives the object of valuation is a fair value of what we change or create



Object of valuation

- First step of valuation process — a determination of an object we tend to assess
- For projects / AI initiatives the object of valuation is a fair value of what we change or create
- Valuation means the analysis of a financial outcome we are going to achieve, changing current processes



Valuation period

- After object determination we need to **specify the valuation period** — a planning horizon of our assessment



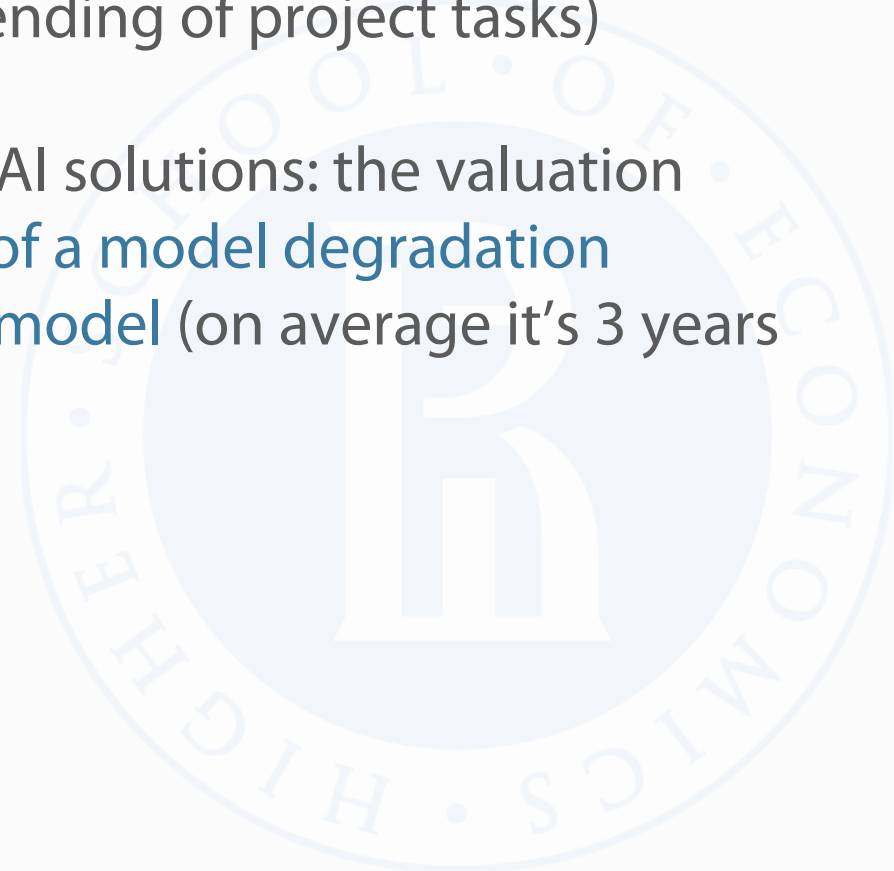
Valuation period

- After object determination we need to **specify the valuation period** — a planning horizon of our assessment
- The time of planning is connected with **a depreciation / amortization period of assets** that are needed to run the project (e.g. 5 years since ending of project tasks)



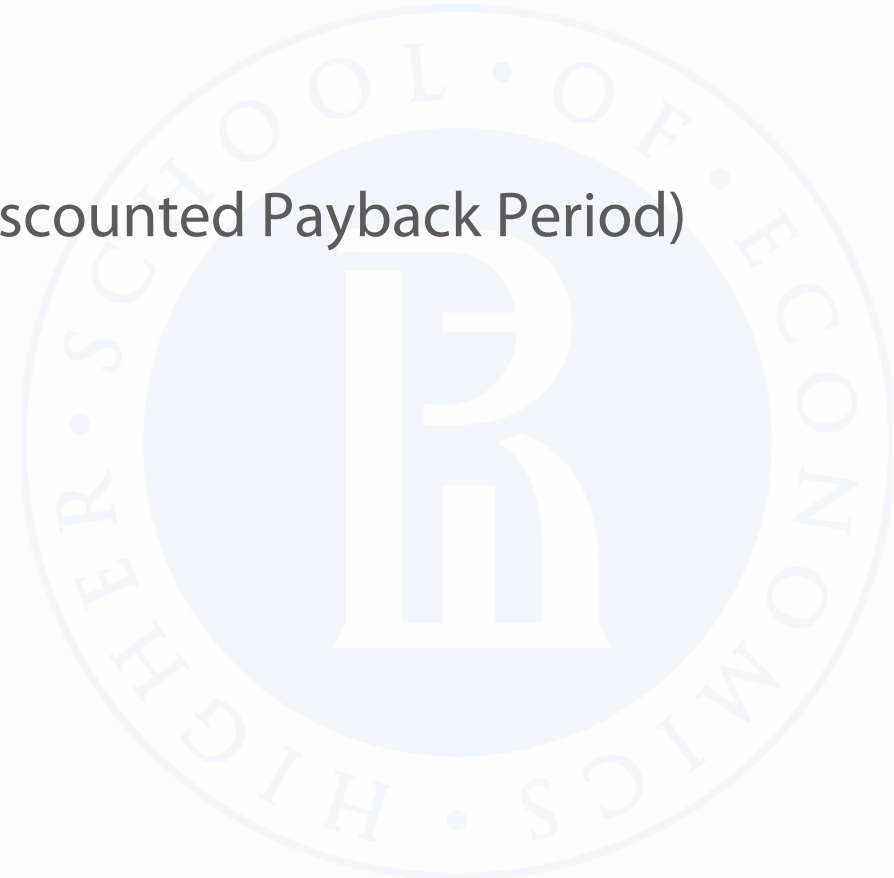
Valuation period

- After object determination we need to **specify the valuation period** — a planning horizon of our assessment
- The time of planning is connected with **a depreciation / amortization period of assets** that are needed to run the project (e.g. 5 years since ending of project tasks)
- The same principle is valid for AI solutions: the valuation period depends on **a forecast of a model degradation and a necessity to rebuild the model** (on average it's 3 years since creation)



Criteria of Project valuation

- There are different approaches to estimate the financial reasonability of our investments:
 - NPV (Net Present Value)
 - IRR (Initial Rate of Return)
 - PI (Profitability Index)
 - PP / DPP (Payback / Discounted Payback Period)



Criteria of Project valuation

- There are different approaches to estimate the financial reasonability of our investments:
 - NPV (Net Present Value)
 - IRR (Initial Rate of Return)
 - PI (Profitability Index)
 - PP / DPP (Payback / Discounted Payback Period)
- All approaches are applicable for project valuation, but have methodological limitations and answer different business questions

Criteria of Project valuation. NPV

$$NPV = \sum_{i=1}^N \left(\frac{CF_i}{(1+r)^{\frac{i}{12}}} \right)$$

NPV — Net present value — current value of the sum of future inflows and outflows

CF_i — cash inflows and outflows at time *i*

i — month of cash flow

N — total number of months for valuation, valuation period

r — discount rate, cost of capital

if **NPV** > 0

then **Project is profitable and may be accepted**

Criteria of Project valuation. IRR

$$NPV = \sum_{i=0}^N \left(\frac{CF_i}{(1 + IRR)^i} \right) = 0$$

IRR — Internal rate of return — expected future rate of return for which NPV is equal to 0

CF_i — cash inflows and outflows at time *i*

i — month of cash flow

N — total number of months for valuation, valuation period

if **IRR** > cost of capital

then **Project is profitable and may be accepted**

Criteria of Project valuation. PI

$$PI = 1 + \frac{NPV}{Total\ costs}$$

PI — Profitability index — created value per unit of costs considering the time value

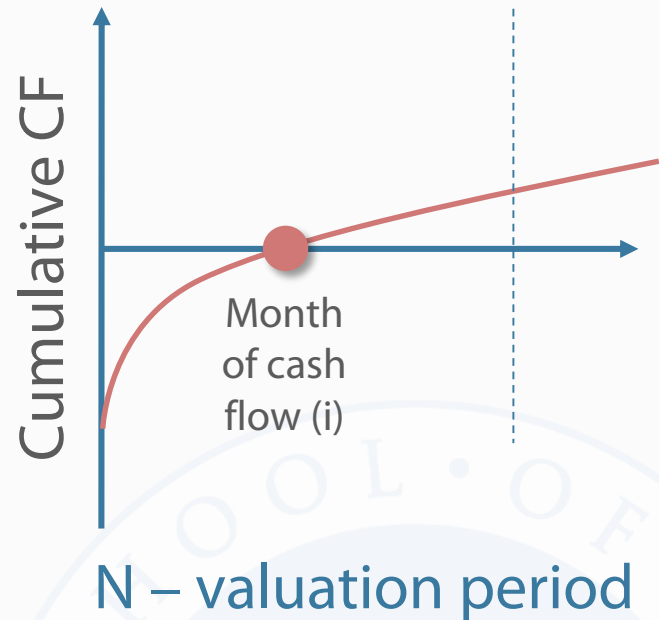
Total costs — sum of all operational (OpEx) and capital (CapEx) project expenditures

if **PI** > 1

then **Project is profitable and may be accepted**

Criteria of Project valuation. PP, DPP

PP — payback period — expected time to reach the break-even-point not taking into account the time value (cumulative cash flow is positive)



DPP — discounted payback period — expected time to reach the break-even-point taking into account the time value (cumulative discounted cash flow is positive)

if **PP or DPP** < valuation period
then **Project is profitable and may be accepted**

Criteria of Project valuation. Drawbacks

Example 1:

we have 2 alternatives to invest with following cash flows

Year	Project A, mln. USD	Project B, mln. USD
0	(15 000)	(15 000)
1	7 000	3 000
2	6 000	5 000
3	7 500	9 000
4	4 000	9 000

$$NPV = \sum_{i=0}^N \left(\frac{CF_i}{(1 + \textcolor{red}{r})^i} \right) = 0$$

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IRR	24.7%	21.5%

$$NPV = \sum_{i=0}^N \left(\frac{CF_i}{(1 + r)^i} \right) = 0$$

By IRR Approach Project A is more attractive

Criteria of Project valuation. Drawbacks

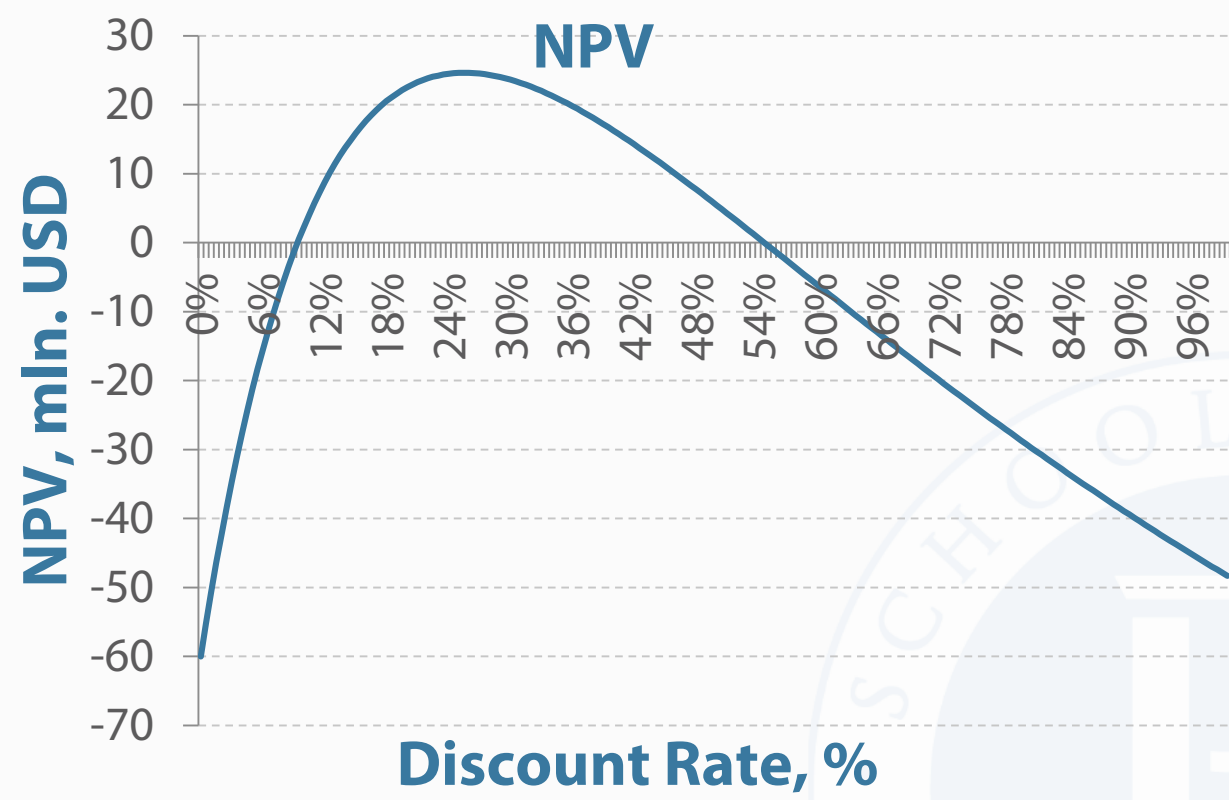
Example 2:

we have a project with several investments (in the beginning and in the 5th year). Let's solve equation for IRR

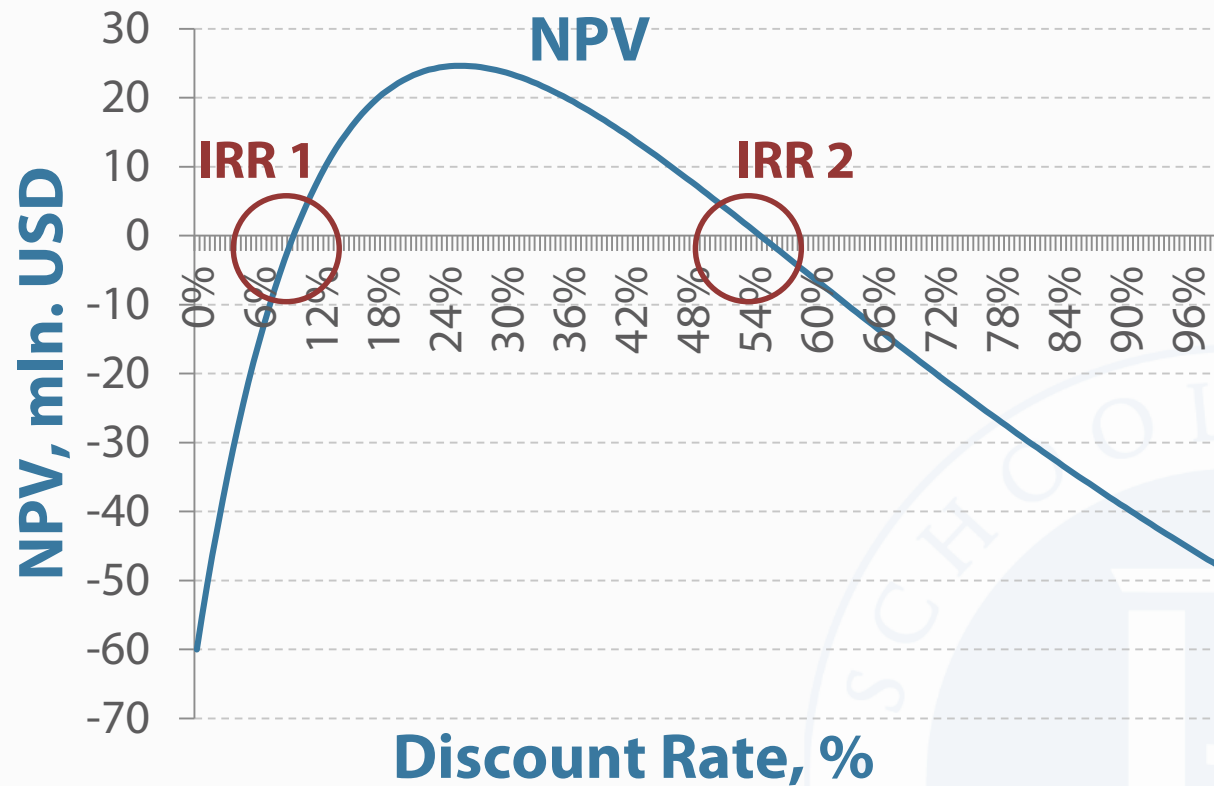
Year (i)	Cash Flow, mln. USD
0	(180)
1	150
2	170
3	180
4	100
5	(480)

$$NPV = \sum_{i=0}^N \left(\frac{CF_i}{(1 + \text{IRR})^i} \right) = 0$$

Criteria of Project valuation. Drawbacks



Criteria of Project valuation. Drawbacks



Project can have **multiple IRR** in case of several **negative cash flows**

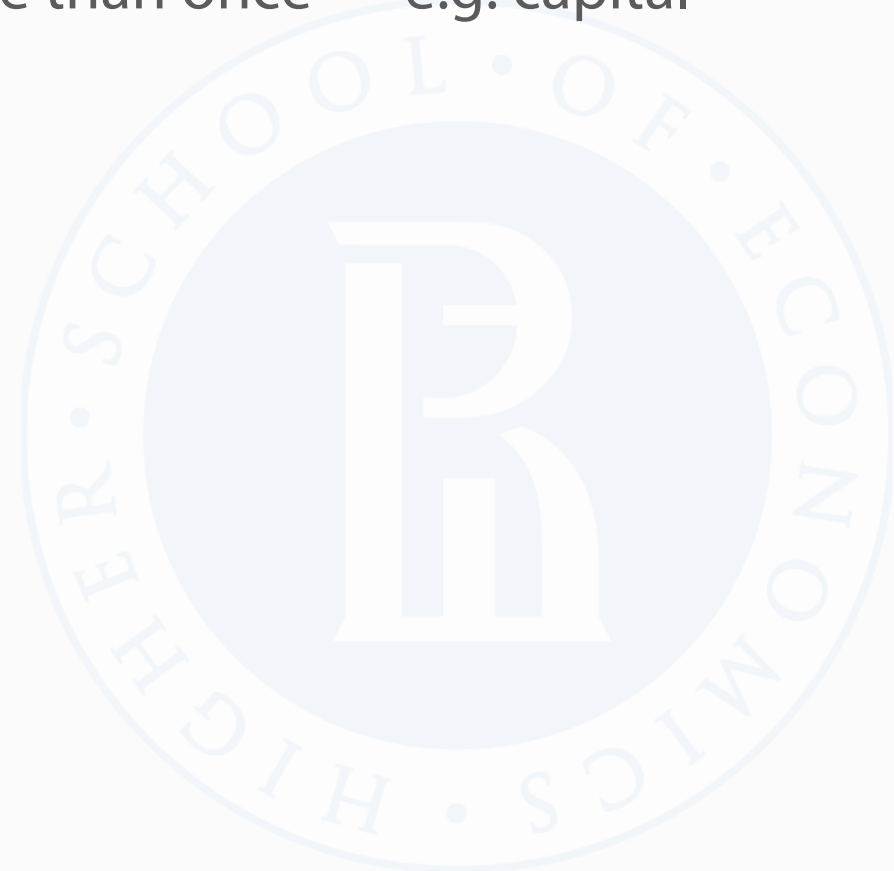
Criteria of Project valuation. Drawbacks

- *IRR / PP / DPP* have serious disadvantages that does not allow to choose the project with the highest absolute added economic value

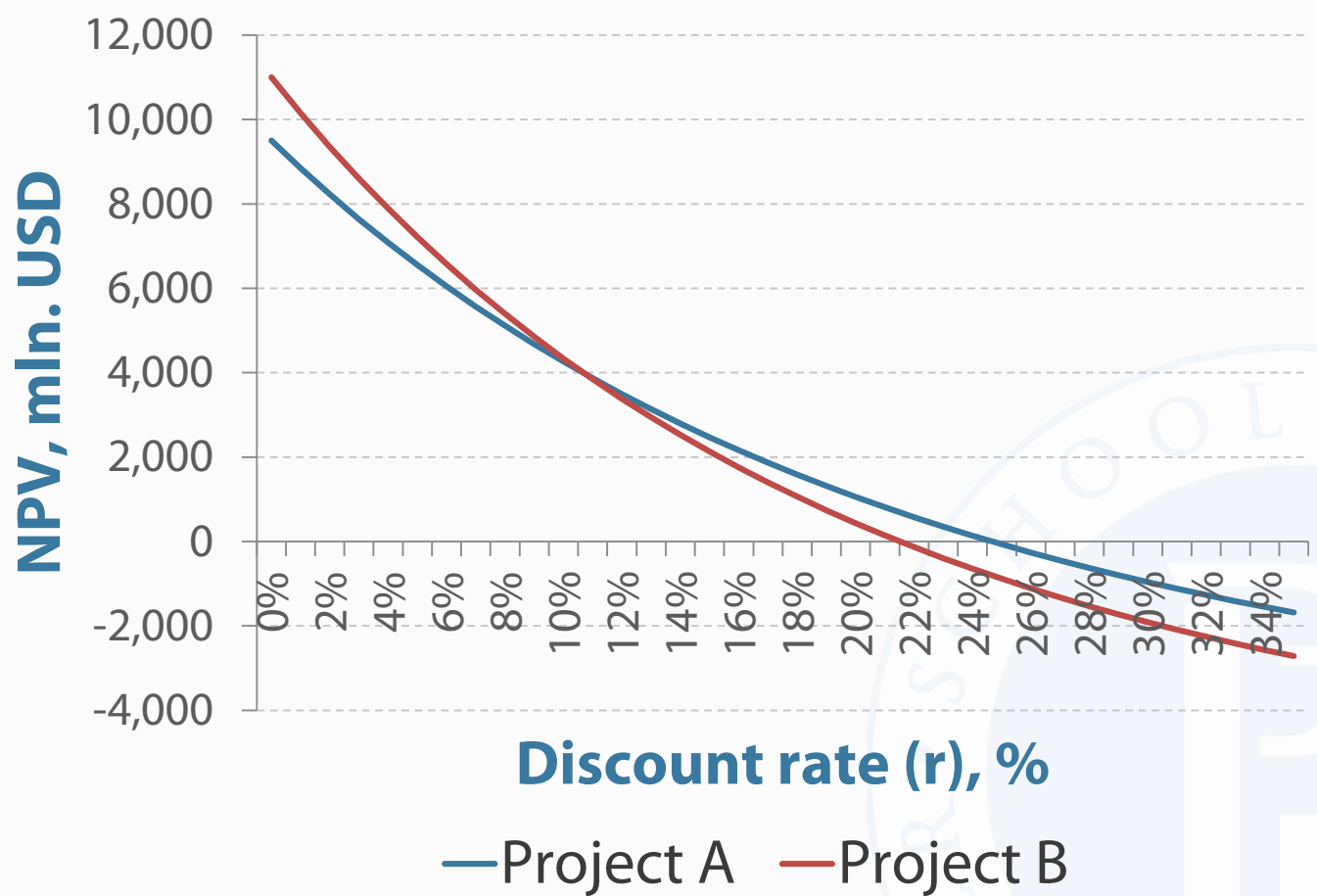


Criteria of Project valuation. Drawbacks

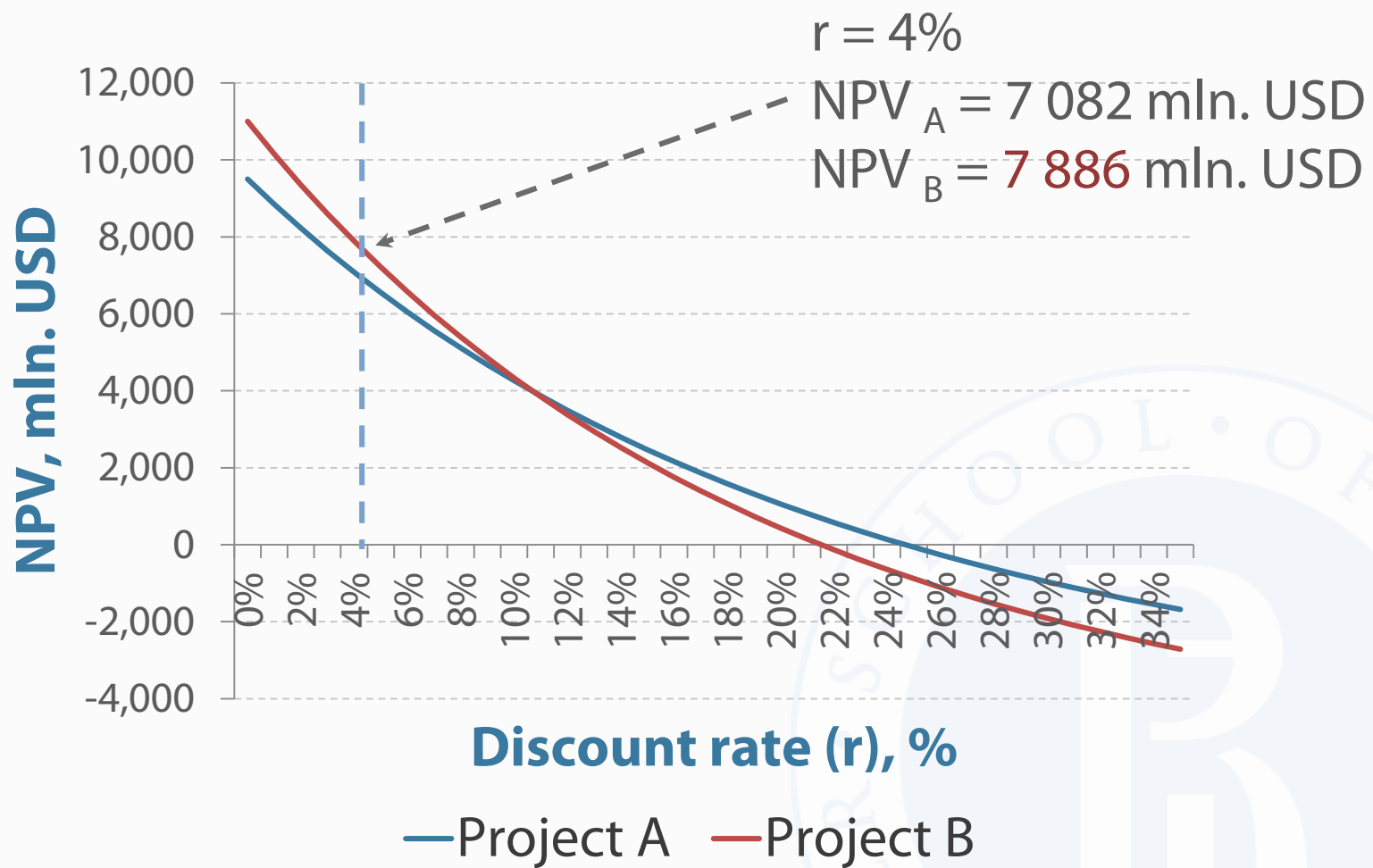
- *IRR / PP / DPP* have serious disadvantages that does not allow to choose the project with the highest absolute added economic value
- Project can have multiple *IRR / PP / DPP* (if the sign of the cash flow changes more than once — e.g. capital investments every year)



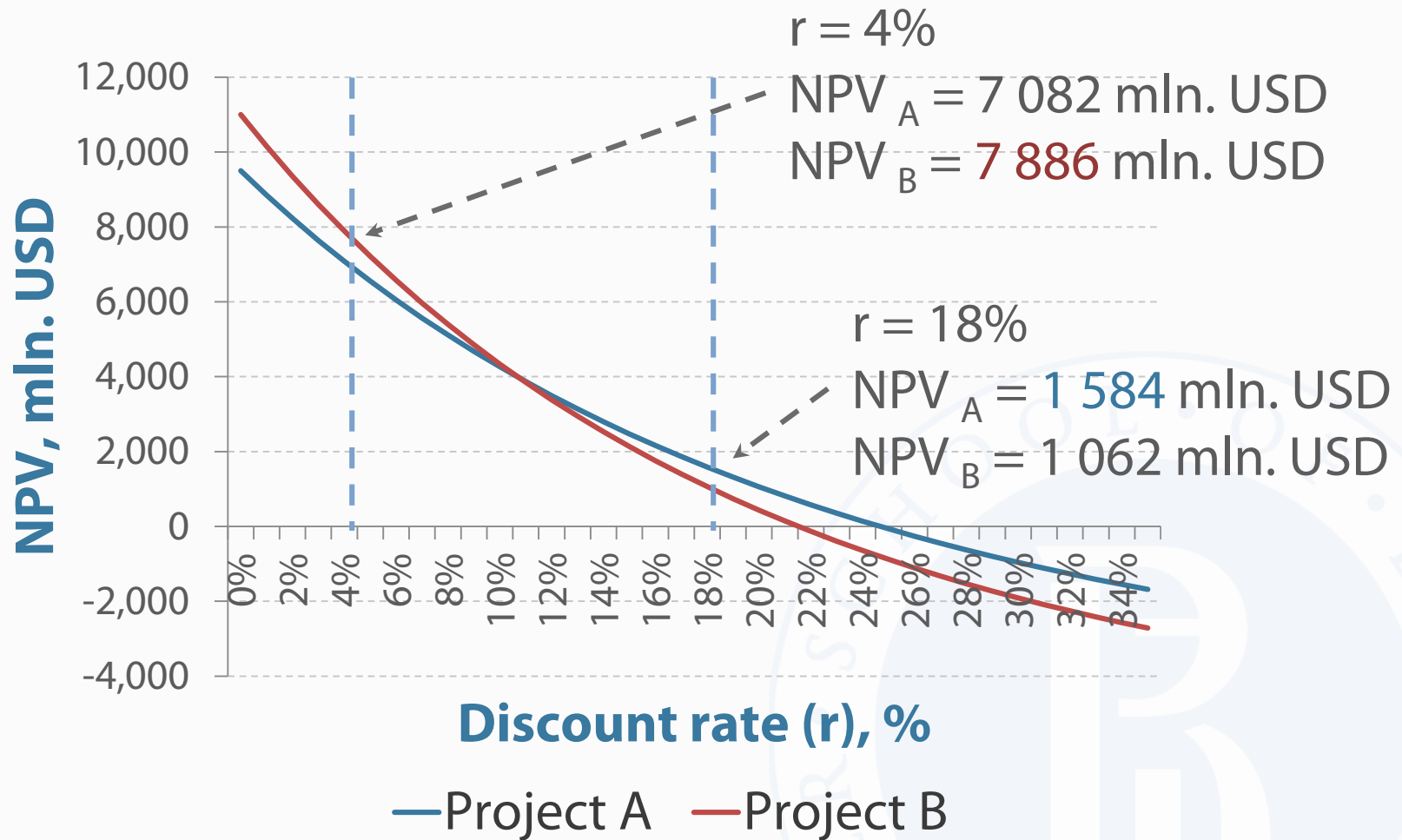
Criteria of Project valuation. Drawbacks



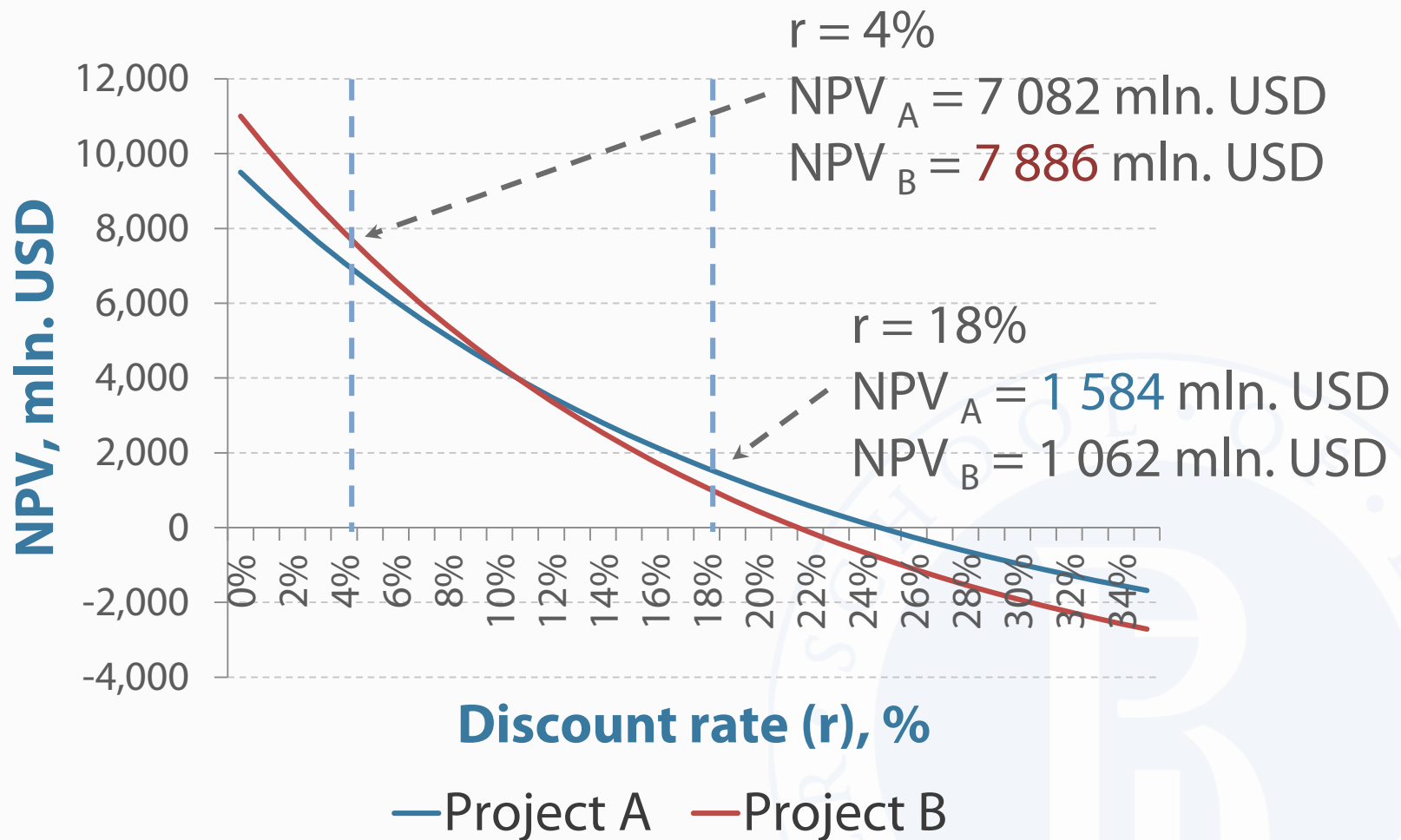
Criteria of Project valuation. Drawbacks



Criteria of Project valuation. Drawbacks



Criteria of Project valuation. Drawbacks



Decision based on **NPV approach** varies depending on the **discount rate** used.

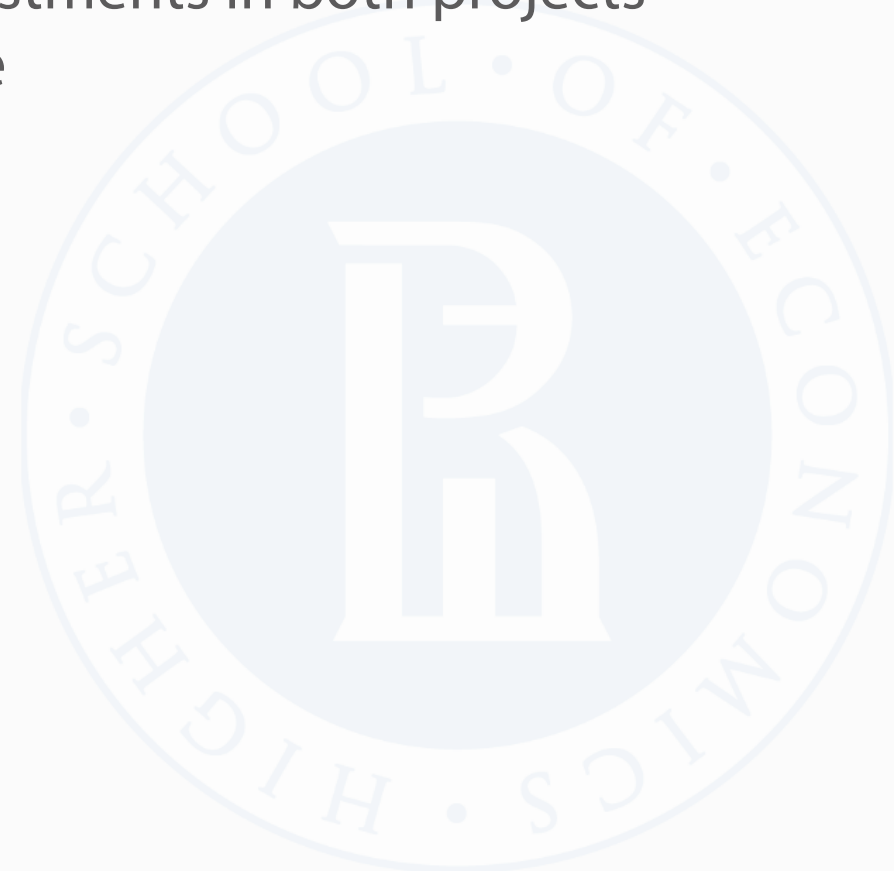
Criteria of Project valuation. Drawbacks

- NPV approach implies a possible difficulty in determining the required rate of return and forecasting cash flows (too pessimistic / optimistic forecast influences the decision)



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Criteria of Project valuation. Drawbacks

- NPV approach implies a possible difficulty in determining the required rate of return and forecasting cash flows (too pessimistic / optimistic forecast influences the decision)
- In order to make decision between mutually exclusive projects using NPV, total investments in both projects shouldn't be different in scale
- The decision based on *IRR / PP / DPP* approaches may differ from decision following NPV approach



Criteria of Project valuation. Drawbacks

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Taking into consideration all advantages and disadvantages of all approaches NPV method is considered to be the main in project valuation

Wrap-up

1. Among different approaches to make a financial decision about project (NPV, IRR, PI, PP, DPP) the **NPV method is considered to be the main** in a project / AI valuation



Wrap-up

1. Among different approaches to make a financial decision about project (NPV, IRR, PI, PP, DPP) the **NPV method is considered to be the main** in a project / AI valuation
2. Positive NPV value implies that allocated resources create positive added economic value



Valuation planning



Object determination

- The process of AI / DS models development and maintenance is equal to project management



Object determination

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- For ground breaking products based on AI solutions we have to **analyze and describe all inputs and outputs of a new process** that we are creating



Object determination

- The process of AI / DS models development and maintenance is equal to project management
- For ground breaking products based on AI solutions we have to **analyze and describe all inputs and outputs of a new process** that we are creating
- For AI solutions that improve current performance we have to **analyze and describe all changes in business processes** that are needed to implement the solution



Process analysis

In order to make the map of the project with all inputs and outputs the following questions must be analyzed:

1. What is the process / product we are going to change or create?



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6. Are there any benchmarks we can use for forecast?
7. What are the risks we may face?

Process analysis. Project profile example

Project name		Project leader	
Problem and solution description			
Aims and KPI			
Aim / KPI	Current value	Target value	Dates of control and monitoring
Project team	Project boundaries, process analysis	Expenses and income analysis	
Pilot / AB-test design description, roadmap			Key risks

6 Valuation Principles:

Objectivity principle

- In valuation process calculations, accounting and assumptions must be based on solid evidence, factual data and statistics
- Following expert forecast for future cash flows with no factual baseline creates the risk of wrong biased decision influencing the financial results



6 Valuation Principles:

Measurability principle

- All possible inflows (benefits) and outflows (costs) must be measurable
- The factors that we plan to influence must be assessed before and after project implementation
- All parameters of the project that are crucial for future benefits and risks must be fixed as KPI (Key performance indicators)



6 Valuation Principles:

Conservatism principle

- Valuation process implies an uncertainty situation about future cash flows when there are different possible outcomes that are equally likely
- In such situation expenses must be accounted at a highest possible level and income at a lowest possible level



6 Valuation Principles:

Completeness principle

In project valuation we have to **take into account all the incremental costs and benefits** that occur to achieve business goals of a project and maintain the process:

- costs on DS specialists, analytics,
- operational and capital expenditures,
- IT resources



6 Valuation Principles:

Materiality principle

- There is no need to take into account the effects that have small impact on financial results
- To define the materiality threshold we need to analyze the NPV sensitivity to positive and negative effects that we tend to evaluate more accurately



6 Valuation Principles:

Performance monitoring

- All essential parameters that determine the financial results must be fixed as KPI (Key performance indicators)
- KPI should be both financial (e.g. 10% growth of interest income) and non-financial (e.g. 8% growth of response rate in active sales) as we have specific parameters that project is going to influence



FCFE vs FCFF

- FCFF — Free Cash Flow to Firm
- FCFE — Free Cash Flow to Equity

Main differences	FCFF	FCFE
Value analysis	For all investors	For equity shareholders
Who prefers	Highly leveraged companies	Banks, companies with primary equity financing
Discount rate	Weighted Average Cost of Capital (WACC)	Cost of equity

FCFF shows **total investments** and is preferred to calculate PP / DPP

FCFE vs FCFF

$$\begin{aligned} FCFE &= \\ &= \text{Net Income} + \text{Depreciation \& Amortization} - \\ &\text{Long Term Investments} - \text{Working Capital Investment} + \\ &\text{Net Borrowing} \end{aligned}$$

$$\begin{aligned} FCFF &= \\ &= FCFE + \text{Interest} \cdot (1 - \text{Tax rate}) - \text{Net Borrowing} \end{aligned}$$



WACC

$$\begin{aligned} WACC \text{ for } FCFF &= \\ &= \left(\frac{Debt}{Debt + Equity} \cdot r_d \cdot (1 - Tax \text{ rate}) + \frac{Equity}{Debt + Equity} \cdot r_e \right) \end{aligned}$$

r_d — cost of debt (%)

r_e — cost of equity (%)

Debt — external source of financing, borrowings

Equity — internal financing, shareholders' funds



Cost of equity.

Capital Asset Pricing Model (CAPM)

$$r_e = \text{cost of equity} = r_{\text{risk_free}} + \beta \cdot \text{Market risk premium} + \text{Country risk premium} + \text{Size premium}$$

$r_{\text{risk_free}}$ — risk-free rate of interest (e.g. 10-years US treasury bonds)

Market risk premium — difference between market rate of return and risk-free rate

β — “beta”, the measure that shows the sensitivity of a stock with respect to the market in general

Sources for premiums and beta: Ibbotson, Bloomberg

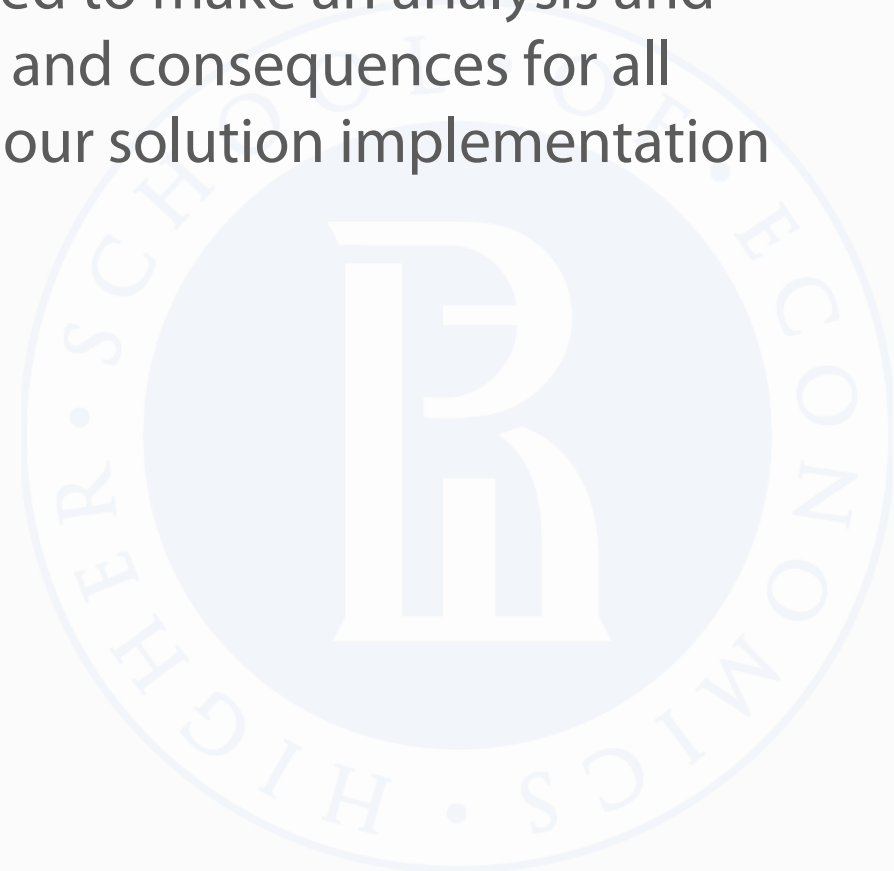
Wrap-up

1. There are **6 main principles** we have to follow in the valuation process to have a reliable estimate: objectivity, measurability, conservatism, completeness, materiality, performance monitoring



Wrap-up

1. There are **6 main principles** we have to follow in the valuation process to have a reliable estimate: objectivity, measurability, conservatism, completeness, materiality, performance monitoring
2. Before any estimations we need to make an analysis and define a map of possible risks and consequences for all current processes because of our solution implementation



Expenses and income sources



Expenses

For NPV calculating we have to take into consideration all resources that are needed to create the solution:

- Allocated current company resources,
- Increased costs / investments



Expenses

4 types of expenses:

1. Allocated current human resources
(total labor costs + indirect costs)



Expenses

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2. Allocated total cost of ownership (TCO) of current
IT resources (servers, licenses, maintenance costs)



Expenses

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1. Allocated current human resources
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2. Allocated total cost of ownership (TCO) of current IT resources (servers, licenses, maintenance costs)
3. Operational expenditures — new ongoing expenses
(OpEx, e.g. data purchase, consulting, marketing, growth of labor costs, electricity costs)

Expenses

4 types of expenses:

1. Allocated current human resources
(total labor costs + indirect costs)
2. Allocated total cost of ownership (TCO) of current IT resources (servers, licenses, maintenance costs)
3. Operational expenditures — new ongoing expenses (OpEx, e.g. data purchase, consulting, marketing, growth of labor costs, electricity costs)
4. Capital expenditures (CapEx, investments in long-term assets — buildings, equipment, vehicles, land)

Income

To evaluate a positive effect of a project / AI solution we need to define what is the source of a possible effect.



Income

To evaluate a positive effect of a project / AI solution we need to define what is the source of a possible effect.

There are 6 basic sources of income:

- Sales growth
- Operational costs cutting
- Operational risks cutting
- Losses reduction
- WACC reduction
- Liquidity management



Sales Growth

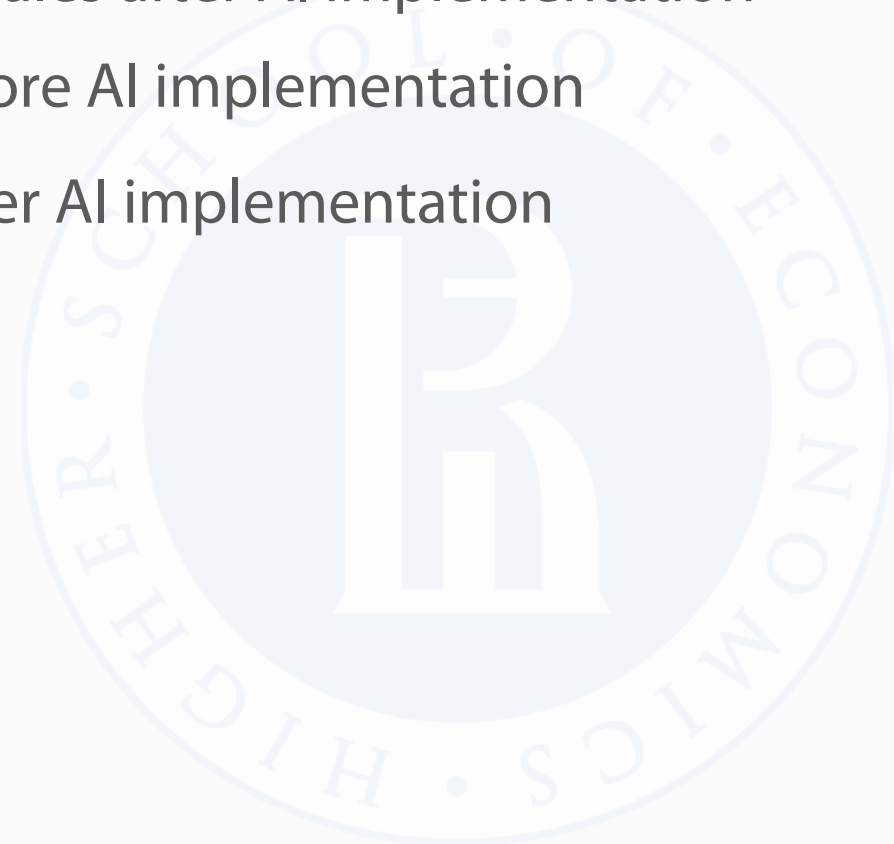
$$Effect = \overline{NPV_{new\ sales}} \cdot Q_{new\ sales} - \overline{NPV_{old\ sales}} \cdot Q_{old\ sales}$$

$\overline{NPV_{old\ sales}}$ — average NPV of sales before AI implementation

$\overline{NPV_{new\ sales}}$ — average NPV of sales after AI implementation

$Q_{old\ sales}$ — number of sales before AI implementation

$Q_{new\ sales}$ — number of sales after AI implementation



Sales Growth

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$Q_{old\ sales}$ — number of sales before AI implementation

$Q_{new\ sales}$ — number of sales after AI implementation

❗ Nota bene!

We have to analyze the sales change of all related substitutes to take into account the effect of cannibalization

Operational Costs / Risks / Losses cutting

$$Effect = Costs \& Losses_{new} - Costs \& Losses_{old}$$

Step 1: analyze the sources and drivers of costs and losses



Operational Costs / Risks / Losses cutting

$$Effect = Costs \& Losses_{new} - Costs \& Losses_{old}$$

Step 1: analyze the sources and drivers of costs and losses

Step 2: determine current indicators per operation / unit to control and verify our assumptions while piloting



Operational Costs / Risks / Losses cutting

$$Effect = Costs \& Losses_{new} - Costs \& Losses_{old}$$

Step 1: analyze the sources and drivers of costs and losses

Step 2: determine current indicators per operation / unit to control and verify our assumptions while piloting

Step 3: analyze and define possible long-term deferred effects concerning product features
(e.g. for long-term loans the valuation of final loss cutting / growth effect is possible only after at least 12 months after sale is made because of social and demographic factors)

WACC reduction

$$Effect = WACC_{new} - WACC_{old}$$

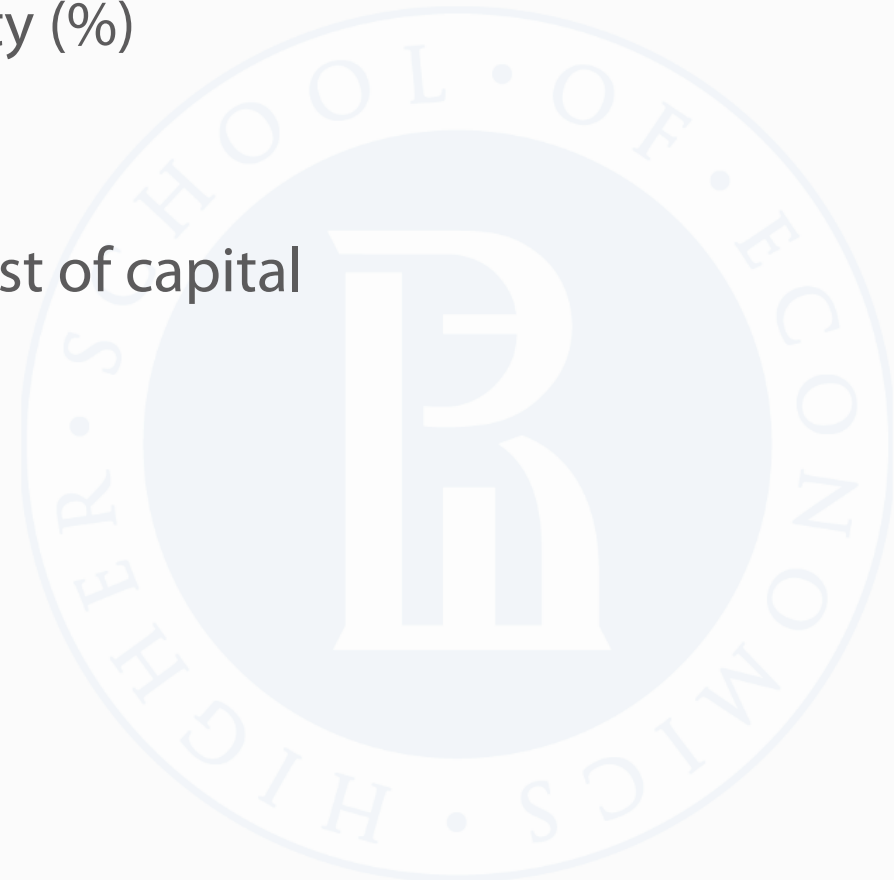
$$WACC = w_{debt} \cdot r_{debt} \cdot (1 - Tax) + w_{equity} \cdot r_{equity}$$

r — the cost of debt / equity (%)

w — the portion of a debt / equity (%)

Tax — profits tax (%)

$WACC$ — a weighted average cost of capital



WACC reduction

$$Effect = WACC_{new} - WACC_{old}$$

- The effect on WACC can be achieved through **using of cheaper sources of financing** (debt) instead of equity (shareholders' funds)
- This effect type is **essential for banks** as they have regulatory requirements for reserves and equity (adequacy ratios)



Liquidity management

$$Effect = Interest\ Income_{new} - Interest\ Income_{old} =$$

$$Free\ cash_{new} \cdot Interest\ rate_{new} \cdot \frac{Days\ of\ Deposit\ Term_{new}}{365} -$$

$$Free\ cash_{old} \cdot Interest\ rate_{old} \cdot \frac{Days\ of\ Deposit\ Term_{old}}{365}$$

Liquidity management effect implies the opportunity to have more **free cash** that can be turned into a time deposit for a set period of time

Wrap-up

1. Before making decision of creating and implementation of the AI solution **we have to determine the necessity** of current company resources to allocate to a project and possible increase in expenses



Wrap-up

1. Before making decision of creating and implementation of the AI solution **we have to determine the necessity** of current company resources to allocate to a project and possible increase in expenses
2. There are **4 types** of costs: human resource, IT resources, operational and capital expenses



Wrap-up

1. Before making decision of creating and implementation of the AI solution **we have to determine the necessity** of current company resources to allocate to a project and possible increase in expenses
2. There are **4 types** of costs: human resource, IT resources, operational and capital expenses
3. There are **6 basic sources** of income: sales growth, operational costs cutting, operational risks cutting, losses reduction, WACC reduction, liquidity management