### Innovation and Entrepreneurship Research Peak- Workshop

4<sup>th</sup> March 2025

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SMU

The focus of the entrepreneurship research peak is to <u>develop interdisciplinary collaboration</u> within the business school areas (and across SMU's schools) that leads to impactful academic research.

In addition, the research peak aims to galvanize faculty for tier II or III grant applications in the research area.

### Agenda

- Welcome
- Dr. Cheong Wei Yang, Vice Provost Strategic Research Partnerships, share on potential research opportunities with SSG Data.
- Prof. Reddi Kotha and Dr. Ge Xu introduce the release of the LKY Business Plan Competition data (11<sup>th</sup>Edition, 2023) to SMU researchers.
- Any other matters & Discussion

### Welcome

#### Hosts and invited speakers for the workshop

- Reddi Kotha, Professor of Strategy & Entrepreneurship, Innovation & Entrepreneurship Research Peak Lead, Associate Editor Academy of Management Journal
- Cheong Wei Yang, Vice Provost (Strategic Research Partnerships)
- Seonghoon Kim, Associate Professor of Economics; Deputy Director, Centre for Research on Successful Ageing (ROSA)
- Ge Xu, Innovation & Entrepreneurship Research Fellow

# Potential Research Opportunities with SSG Data

Dr. Cheong Wei Yang, Vice Provost Strategic Research Partnerships

| Research Objectives/Questions  |   |  |  |  |  |  |  |
|--|---|--|--|--|--|--|--|
| Phase 1: Establishing Correlations                                       | Phase 2: Randomised field experiments with SSG partners       |  |  |  |  |  |  |
| •Establish correlations by linking SSG admin data with earnings          | (e.g., SMU Academy)   |  |  |  |  |  |  |
| data from IRAS & CPF and survey data for non-tangible                    | •Establish causal relationships to refine programme delivery, |  |  |  |  |  |  |
| outcomes   | content and engagement strategies based on Phase 1 findings   |  |  |  |  |  |  |
| Measures   | •Use experimental data to validate and enhance ML-based       |  |  |  |  |  |  |
| <b>1.Employment and Income Effects</b> : Track job status, salary        | prediction model developed in Phase 1 to enhance course       |  |  |  |  |  |  |
| changes, CPF contributions and long-term earnings                        | recommendation and curation                                   |  |  |  |  |  |  |
| progression (IRAS & CPF data). Job retention and career                  | Resources requested by SMU to support the study               |  |  |  |  |  |  |
| mobility analyzed to assess long-term stability                          | •2 dedicated economics postdocs to work on Phase 1 and        |  |  |  |  |  |  |
| <b>2.Non-Tangible Outcomes</b> : Survey data on well-being, job          | establish the correlations.                                   |  |  |  |  |  |  |
| satisfaction and social engagement to capture self-reported              | •Support from SSG for the design, piloting, pre-testing, and  |  |  |  |  |  |  |
| changes post-training  | analysis of surveys   |  |  |  |  |  |  |
| <b>3.Programme Effectiveness</b> : Link SSG data on course type,         | •To work with SSG partners (e.g., SMU Academy) to deliver     |  |  |  |  |  |  |
| format and certification level with earnings data (IRAS & CPF)           | survey and introduce small nudges based on the correlations   |  |  |  |  |  |  |
| and survey responses   | found in Phase 1  |  |  |  |  |  |  |
| <b>4.Return on Investment (ROI)</b> : Earnings growth (IRAS & CPF)       |   |  |  |  |  |  |  |
| compared against programme costs (SSG data), stratified by               |   |  |  |  |  |  |  |
| individual characteristics, work arrangements and age groups             |   |  |  |  |  |  |  |
| <b>5.Training Modalities</b> : Evaluate impact of online, hybrid and in- |   |  |  |  |  |  |  |
| person training formats by linking SSG programme data with               |   |  |  |  |  |  |  |
| employment/income trends (IRAS & CPF) and survey                         |   |  |  |  |  |  |  |
| engagement measures  |   |  |  |  |  |  |  |

#### SSG's inputs

SSG supports this EOI with the following inputs:

#### Strategic Planning Division (SPD) Research Office and Economics Office

•Focus on **Measures 2, 3 and 5**, as 1 and 4 will come from the findings of the MTI/DOS landscape study which will be available later this year

•Consider assessing impact based on specific programme outcomes and comparing cost-effectiveness to provide a comprehensive review

•Consider incorporating enterprise outcomes (e.g., productivity, employee retention, operational efficiency, cost savings, growth and profitability)

#### **Quality Management Division (QMD)**

•Measure 1: Consider reduction of unemployment duration in addition to job retention and career mobility
•Measure 2: Consider in-course metrics (assessment scores, dropout rates, curriculum alignment scores); Explore correlations between course quality/curriculum characteristics and learner outcomes
•Measure 3: For survey, consider target audience that is not on payroll (e.g. type of learners, quality of programme)
•Elaborate on the nudges introduced in Phase 2

#### Planning & Programmes Division (PPD)

Lines of inquiry to include:

•Effects of funding levels and type (supply-side vs. demand-side) on outcomes (Does higher funding or provision of demand- or supply-side yields better outcomes?)

•Effects of TP-types (i.e., IHLs vs. private CET Centres vs. other private TPs) on training outcomes

### LKY Business Plan Data

Professor Reddi Kotha, School of Business

Dr. Ge Xu, Post Doctoral Fellow Innovation & Entrepreneurship

### Project 1: Causal Effects of BPC Finalist

A Method to Estimate Within Business Plan Competition Causal Effects on Deep-Tech Start-ups Selected to the Finals of the Competition

Ge Xu, Prof. Seonghoon Kim, Prof. Reddi Kotha

### Judge panels

Judge evaluation 612 start-ups Evaluated by 183 judges in 44 panels

HHP, Human Health & Potential (10 panels)
M&E, Media & Entertainment (3 panels)
MTC, Manufacturing, Trade & Connectivity (4 panels)
SNDE, Smart Nation & Digital Economy (8 panels)
USS, Urban Solutions & Sustainability (19 panels)

- Each panel consists of 3 to 7 judges to evaluate 5 to 21 start-ups
- Each judge was provided with a notional investment pool of **one million SGD** to allocate among the startups in their panel, simulating real-world investment decisions
- Rank each start-up by average judge score

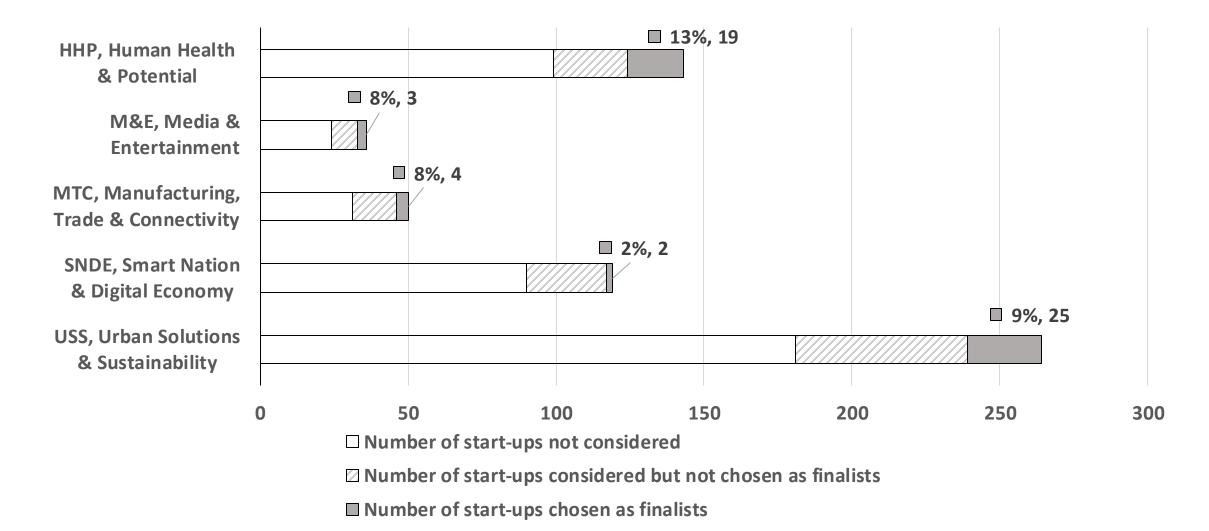


#### Finalist 53 start-ups from 30 panels

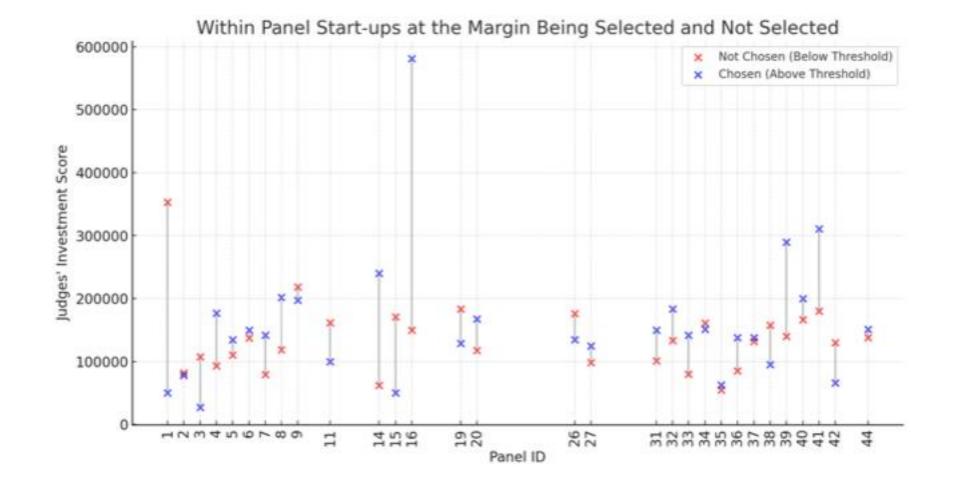
Union of the two lists:

- Top ranking start-ups by average judge score within each panel (typically top 3)
- Top 150 among all start-ups ranked by average judge score
- An expertise committee from the competition organizer team reviewed the consideration list to select the finalist winners
- Visit SMU for one week
- Social and networking events (finalist start-ups, mentors from SMU IIE, judges, sponsors...)
- In person pitching to judges for final ranking

### Judge panels and start-ups selection



#### Within Panel Start-ups at the Margin Being Selected and Not Selected



### Performance estimation with different versions of the DV

|   | OLS                  |               |            |                          |                      | Threshold models (in small samples) |            |                          |  |
|---|----------------------|---------------|------------|--------------------------|----------------------|-------------------------------------|------------|--------------------------|--|
| DV: VC investment after the competition                     | Whether the start-up | VC investment | Log(VC     | Whether VC<br>investment | Whether the start-up | VC investment                       | Log(VC     | Whether VC<br>investment |  |
|   | received VC          | received (in  | investment | received is over         | received VC          | received (in                        | investment | received is over         |  |
|   | investment           | \$1M USD)     | received)  | \$1M USD                 | investment           | \$1M USD)                           | received)  | \$1M USD                 |  |
|   | (1)                  | (2)           | (3)        | (4)                      | (5)                  | (6)                                 | (7)        | (8)                      |  |
| Whether the start-up is a finalist winner                   | 0.166***             | 0.654**       | 1.874**    | 0.135**                  | 0.20**               | 0.61*                               | 1.99**     | 0.13**                   |  |
|   | (0.062)              | (0.285)       | (0.808)    | (0.053)                  | (0.09)               | (0.33)                              | (0.97)     | (0.06)                   |  |
| Panel dummy (M&E)   | -0.056**             | -0.135        | -0.506*    | -0.032*                  | -0.04                | 0.36                                | 0.92       | 0.06                     |  |
|   | (0.024)              | (0.087)       | (0.274)    | (0.018)                  | (0.12)               | (0.57)                              | (1.52)     | (0.10)                   |  |
| Panel dummy (MTC)   | 0.159***             | 0.175         | 1.262*     | 0.058                    | 0.35*                | 1.07                                | 3.09       | 0.20                     |  |
|   | (0.059)              | (0.138)       | (0.678)    | (0.041)                  | (0.18)               | (0.86)                              | (2.37)     | (0.15)                   |  |
| Panel dummy (SNDE)  | 0.023                | 0.037         | 0.311      | 0.009                    | 0.04                 | 0.66                                | 1.79*      | 0.12*                    |  |
|   | (0.031)              | (0.094)       | (0.308)    | (0.019)                  | (0.11)               | (0.44)                              | (1.04)     | (0.07)                   |  |
| Panel dummy (USS)   | 0.015                | 0.098         | 0.483      | 0.021                    | 0.02                 | 0.69                                | 2.02*      | 0.13*                    |  |
|   | (0.026)              | (0.092)       | (0.297)    | (0.019)                  | (0.11)               | (0.45)                              | (1.08)     | (0.07)                   |  |
| Early stage dummy   | -0.017               | -0.045        | -0.112     | 0.006                    | 0.07                 | 0.19                                | 0.56       | 0.04                     |  |
|   | (0.029)              | (0.142)       | (0.357)    | (0.021)                  | (0.07)               | (0.27)                              | (0.73)     | (0.05)                   |  |
| VC investment received before the competition (in \$1M USD) | 0.025                | 0.085         | 0.451**    | 0.032**                  | -0.03*               | -0.04                               | -0.20      | -0.01                    |  |
|   | (0.016)              | (0.054)       | (0.216)    | (0.015)                  | (0.02)               | (0.06)                              | (0.20)     | (0.01)                   |  |
| Number of team members                                      | -0.005               | -0.026**      | -0.026     | -0.004*                  | -0.03**              | -0.08*                              | -0.23*     | -0.02*                   |  |
|   | (0.004)              | (0.012)       | (0.048)    | (0.002)                  | (0.01)               | (0.04)                              | (0.12)     | (0.01)                   |  |
| Average team member age                                     | 0.006**              | -0.001        | 0.039*     | 0.002                    | 0.00                 | -0.02                               | -0.04      | -0.00                    |  |
|   | (0.003)              | (0.005)       | (0.023)    | (0.001)                  | (0.00)               | (0.02)                              | (0.04)     | (0.00)                   |  |
| Share of female team members                                | -0.044               | -0.253***     | -0.958***  | -0.054***                | -0.08                | -0.35                               | -1.32      | -0.09                    |  |
|   | (0.028)              | (0.092)       | (0.296)    | (0.017)                  | (0.09)               | (0.33)                              | (1.06)     | (0.07)                   |  |
| Share of team members with doctoral degree                  | -0.027               | -0.024        | -0.372     | -0.009                   | 0.05                 | 1.03                                | 2.35       | 0.15                     |  |
|   | (0.042)              | (0.157)       | (0.435)    | (0.027)                  | (0.14)               | (0.73)                              | (1.54)     | (0.10)                   |  |
| Constant  | -0.076               | 0.222         | -0.425     | -0.012                   |                      |                                     |            |                          |  |
|   | (0.073)              | (0.217)       | (0.644)    | (0.038)                  |                      |                                     |            |                          |  |
| Observations  | 611                  | 611           | 611        | 611                      | 60                   | 60                                  | 60         | 60                       |  |
| R-squared   | 0.109                | 0.068         | 0.100      | 0.115                    | 0.31                 | 0.28                                | 0.30       | 0.30                     |  |
| Mean of Dep. Var  | 0.077                | 0.148         | 0.729      | 0.038                    | 0.117                | 0.326                               | 1.013      | 0.067                    |  |

## Project 2: Al versus judges on power-law-type decision-making

Prof. Reddi Kotha, Ge Xu, Prof. Niloofar Abolfathi, Prof. Dimo Dimov, Prof. Lingxiao Jiang

#### • Overlap Between Human Judges and the AI Tool (used by competition organizer)

- Analyze the lack of overlap in evaluations

– Examine how the AI tool's ratings are less selective, clustering high ratings more tightly than human judges

#### • Predictive Power Comparison (Human Judges, AI Tool and ChatGPT)

Compare the predictive power of the AI tool with that of human judges—against subsequent
 VC funding and the AI tool's ratings

 Use ChatGPT to assign scores to startups based on their suitability for the competition, analyze the overlap between ChatGPT's rankings and other evaluations

#### • AI Tool Analysis

– Discuss observations that suggest the suitability of AI tools (ChatGPT and AI Tool used by the competition organizer) for power-law-type decision-making

### Project 3: Advisors and startup fundraising

Prof. Niloofar Abolfathi

Advisors and startup fundraising: Examining the role of advisors in startups evaluations and fundraising success.

- What's the effect of having advisors on startup fundraising?
- What are the mechanisms and contingencies through which advisors can help funding raising startup?
- Conducted a field experiment exploring these questions

### Any other Matters?

### Thank you! See you next time!